

Cover letter

Six years ago, our research group began studying the impact of planetary orbital variations on Earth's temperature changes. Three years ago, we submitted our research findings ("Evaluation and prediction of the Effects of Planetary Orbital Variations to Earth's Temperature Changes") to Nature/Science, but it did not receive sufficient attention from the editors. Subsequently, we submitted the paper to other professional journals, and over 50 experts from around the world were invited by the editors to review the paper. However, only two experts from different journals accepted the review and provided highly positive feedback. The majority of the experts did not give any feedback due to unfamiliarity with the field. Due to the lack of sufficient review comments, we ultimately submitted the paper to the International Journal of Digital Earth last year. Despite struggling to find suitable reviewers for six months after submission, our research group had an in-depth discussion with the journal's editors, thoroughly explaining the theoretical innovations and technical approach of our study, and received strong affirmation from the editors. **After multiple rounds of inviting international experts to review the paper, and receiving highly positive feedback, the paper was finally accepted in March 2025 and published in the electronic version in April. The paper is attached for your guidance.**

We hope this research (Cao M., Mao K., Sayed M. Bateni, Chen J.M., Heggy E., Jong-Seong Kug, Shen X.Y., Evaluation and prediction of the effects of planetary orbital variations to earth's temperature changes, International Journal of Digital Earth, 2025, 18,1, 2487058, DOI: <https://doi.org/10.1080/17538947.2025.2487058>) will catch your attention, as it has significant implications for advancing climate change research by considering the impact of planetary orbital variations. In the meantime, we have also conducted in-depth research on how planetary orbital variations affect atmospheric water vapor changes, and we have completed relevant work (Xu L., Mao K., Sayed M., Cao M, Dube T., Guo Z., Abiodun B., Yuan Z., Maaza M., Influence and Prediction of Planetary Orbital Changes on Earth's Atmospheric Water Vapor Variations, EarthArXiv, 2025, 1,1-49. DOI: <https://doi.org/10.31223/X5CM69>). This research is crucial for a deeper understanding of atmospheric water vapor variation patterns, revealing and quantifying the impact of planetary orbital variations on atmospheric water vapor changes, and advancing climate change research.

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Evaluation and prediction of the effects of planetary orbital variations to earth's temperature changes

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ABSTRACT

The influence of planetary orbital changes on Earth's temperature has been poorly quantified and subject to speculation. Here, we delineated the effects of greenhouse gases and planetary orbital changes on Earth's temperature and forecasted the latter. Our results indicate that Earth's revolution around the Sun and its rotation explain ~75.36% and 15.91% of Earth's temperature variations in one year, while the Moon's revolution around the Earth and other planet motions account for 8.26% and 0.26%, respectively. Orbital forcings contributed ~11.5% global warming since 1837 and will continue to warm the Earth by ~0.13 °C from 2020 to 2027. However, orbital forcings may contribute to ~0.25 °C cooling of Earth from 2027 to 2050, but this effect remains insufficient to offset the warming caused by CO₂

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1. Introduction

Changes in Earth's temperature (i.e. global mean surface air temperature) play a vital role in the survival and development of human beings and other organisms (Blöschl et al. 2017; Carleton and Solomon 2016; Kump 2018; Laufkötter, Zscheischler, and Thomas 2020). Earth's temperature has risen by approximately 1.37 and 0.86 °C since 1836 and 1979, respectively, mostly attributed to the increase in greenhouse gases (Fletcher, Mikaloff, and Schaefer 2019; Lacis et al. 2010; Lashof and Ahuja 1990; Levitus et al. 2001). Six separate assessment reports from the United Nations Intergovernmental Panel on Climate Change (IPCC) during the last decades concluded that global warming is mainly driven by greenhouse gas emissions due to human activities (IPCC Cambridge University Press, 2001; IPCC Cambridge University Press, 1990; IPCC Cambridge University Press, 1996; IPCC Cambridge University Press, 2007; IPCC Cambridge University Press, 2013; IPCC

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Cambridge University Press, 2021). The annual mean concentrations of greenhouse gases in the atmosphere have risen monotonically since 1836, while Earth's temperature records show significant fluctuations over the same period. Additionally, the rise in Earth's temperature over the past years appears to be part of a long-term warming that began before the industrial era in the seventeenth century (Bradley and Jonest 1993). Paleoclimate data from various sources (e.g. ice cores, deep-sea sediments, tree rings, pollen, corals, and glaciers) demonstrate preindustrial temperature oscillations (Briffa et al. 1990; Guiot et al. 1989; Marsicek et al. 2018; Raymo et al. 1998). Taken together, these observations imply that the cause of warming is more complex than the influence of increasing greenhouse gases alone.

Orbital forcings have been important drivers of temperature variation throughout Earth's evolution as they impact heat transfer from the sun to the Earth (Cionco, Kudryavtsev, and Soon 2021; Cionco and Compagnucci 2012; Gribbin 1973; Milankovitch 1969). While these orbital changes are minor and account for a few centimeters per year (Lainey et al. 2020; Maeder and Gueorguiev 2021; Williams 2000), their effect over the last 185 years on the changes in global temperature can be examined if we successfully eliminate the residual anthropogenic signal. Unlike the steady increase in greenhouse gas concentrations in the atmosphere over the past 185 years that has continuously increased Earth's temperature, the effect of planetary orbits on Earth's temperature may be complex (Li 2005; Lin and Qian 2019; Yasuda 2018). The external gravitational forces acting on the Earth during its revolution around the Sun vary due to planetary geometry, ultimately perturbing the orbital geometry of Earth (Hinnov 2013; Scafetta 2010). Some basic parameters related to Earth's motion, such as eccentricity, axial tilt and the precession of equinoxes, vary with time, resulting in considerable impact on the spatial and temporal distribution of solar irradiation at the Earth's surface and therefore changing its temperature (Condon and Schmidt 1975; Hays, Imbrie, and Shackleton 1976; Mitchell et al. 2021). For example, Earth's temperature has different cycles of approximately 100,000, 40,000, 20,000, 2100–2500, 1200–1800, 200, and 50–70 years, which are in phase with the cycles of gravitational perturbations induced by celestial bodies in the solar system, primarily Jupiter, Earth's Moon, Uranus, Neptune and Saturn (Friis-Christensen and Lassen 1991; Hays, Imbrie, and Shackleton 1976; Lassen and Friis-Christensen 1995; Scafetta 2010; Scafetta 2016; Scafetta et al. 2016; Wang et al. 2012). Therefore, if orbital forcing has positively contributed to Earth's warming over the past 185 years, it would have exacerbated Earth's warming. Conversely, if the contribution has been negative, it would have partially masked anthropogenic warming, affecting the overall patterns of temperature changes. While existing studies have highlighted that the Earth's climate system is modulated by a number of astrodynamical phenomena (Berger, Loutre, and Laskar 1992; Zhang et al. 2015; 2021), they have not quantified the effects of the changes in planetary orbits on the Earth's temperature changes.

In this study, we developed a conceptual framework to investigate the effects of different planetary orbits on Earth's temperature changes from 1836 to 2020 across different time scales. For this purpose, we first estimated the influence of greenhouse gases and solar radiation on Earth's temperature and built several mathematical models (see Section 2.3) that quantify the contribution of different planetary orbital variations to Earth's intra-annual temperature changes. A conceptual diagram showing the effects of different orbits on Earth's intra-annual temperature is shown in Figure 1. The Earth's rotation and the Moon's revolution around the Earth affect the temperature on the daily and lunar sidereal periods, respectively. Their influence on Earth's intra-annual temperature is represented by the sinusoidal-like function f_1 and the irregularly changing function f_2 , respectively (see Figure 1). Considering only the Earth-Sun system, the influence of Earth's revolution around the Sun on Earth's intra-annual temperature can be represented by the function f_3 in Figure 1. The curves f_1 , f_2 , and f_3 are superimposed to find the simultaneous effects of Earth's rotation, the Moon's revolution around Earth, and Earth's revolution around the Sun on Earth's temperature during each year.

The motions of the other seven major planets in the solar system (namely, Mercury, Mars, Jupiter, Saturn, Neptune, Venus, and Uranus) have a subtle impact on the Earth's temperature on intra-

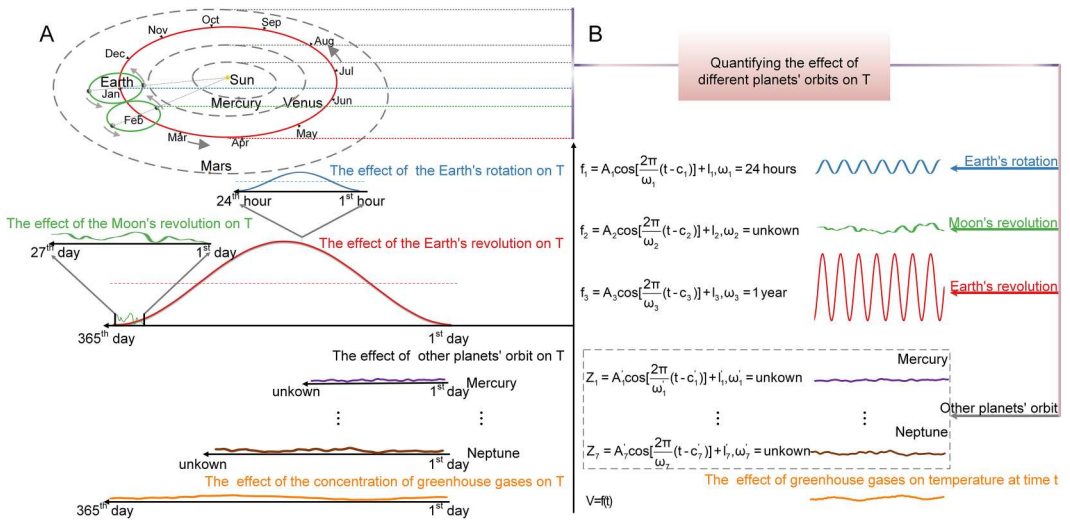


Figure 1. A simplified diagram showing the effects of different planetary orbits on Earth's temperature T (i.e. global mean surface temperature), which consists of two parts: (A) Physical part, based on our knowledge of the separation between the Sun and the Earth and (B) the part deriving from the proposed mathematical method to quantify the effect of different planetary orbits on (A) and hence on Earth's temperature.

annual, interannual and longer time scales, as shown by the functions $Z_1 \dots Z_7$ in Figure 1. Mathematically speaking, their influence on Earth's temperature can be taken into account by superimposing the functions $Z_1 \dots Z_7$ on the curves $f_1 \dots f_3$. Furthermore, we quantified the respective impacts of planetary orbital changes and CO_2 concentrations (the dominant greenhouse gas) on Earth's temperature changes on interannual and longer time scales by developing a robust mathematical model (see Section 2.4). In addition, a hybrid model (see Section 2.5) was developed based on the long short-term memory (LSTM) and spectral domain approaches to forecast the effects of planetary orbits on Earth's temperature. This study advances our understanding of the influence of planetary orbits and CO_2 concentrations on Earth's temperature over a wide range of time scales from hours to years. This understanding is of great importance for analyzing future climate change and assessing climate change mitigation policies and sustainable development practices.

2. Materials and methods

2.1. Materials

In this study, hourly near-surface air temperature data ($0.25^\circ \times 0.25^\circ$) from 1979 to 2020 over the globe are obtained from the ERA5 dataset generated by the European Centre for Medium-Range Weather Forecasts (ECMWF). ERA5 is one of the most utilized datasets for climate studies (Graham, Hudson, and Maturilli 2019). The utilized global temperature data are generated by combining simulated and observed temperature data all over the world (Hersbach et al. 2020). The daily, sidereal monthly, and annual mean temperatures are calculated using hourly data. The ERA5 dataset is available from 1979 and thus does not allow us to analyze changes in Earth's temperature on an interannual scale. To expand the temporal coverage of global temperature data, the daily mean temperature data from the NOAA-CIRES-DOE Twentieth Century Reanalysis version 3 (20CR V3) dataset were used for 1836–2015. Unlike the ERA5 dataset, which assimilates upper-air and satellite data, the 20CRV3 dataset assimilates only conventional near-surface observations (due to the lack of early satellite observations) to estimate temperature (Slivinski et al. 2019). To keep the two datasets consistent, the ERA5 data were treated as a reference benchmark, and a linear regression matching technique was

used to adjust the 20CR Version 3 data (Cao et al. 2021). The hourly, daily and sidereal monthly temperature data (1979–2020) derived from the ERA5 dataset were used to analyze and quantify the impact of different astronomical mechanisms on the Earth's temperature during a year. The annual mean temperature data (1836–2020) derived from both ERA5 and 20CRV3 were used to investigate the influence of the motion of all planets in the solar system on the Earth's temperature.

Daily atmospheric CO₂ concentration data from 1979 to 2020 were downloaded from the Scripps Institution of Oceanography archive (https://scrippsco2.ucsd.edu/data/atmospheric_co2/index.html). This dataset was generated by averaging in situ and flask CO₂ measurements from sampling stations. The sidereal monthly CO₂ concentrations (1979–2020) were derived from daily CO₂ data. The yearly atmospheric CO₂ records from 1836 to 2020 were also provided by the Scripps Institution of Oceanography. This dataset is mainly based on ice core data and the annual average of direct observations. The daily and yearly motions of the solar system objects were obtained from the NASA Jet Propulsion Laboratory (JPL) ephemeris during 1979–2020 and 1836–2020, respectively (<https://ssd.jpl.nasa.gov/horizons/app.html>). The NASA JPL ephemeris provides the distance and velocity of the Earth relative to the Sun and the Moon, the distance and velocity of the center of mass of the Earth-Moon system relative to the Sun, and lunar declination. The 1979–2020 daily lunar phase information was obtained from the Fourmilab Switzerland website (<http://www.fourmilab.ch/earthview/pacalc.html>). The daily LOD (daily length of day) data were obtained from the Earth's orientation parameters provided by the International Earth Rotation (IERS) Rapid Service/Prediction Centre at the U.S. Naval Observatory (<https://www.iers.org/IERS/EN/DataProducts/EarthOrientationData/eop.html>).

2.2. The physical response of Earth's temperature to different astronomical forcings

2.2.1. The impact of the Earth's rotation on its temperature

Since the amplitude of the solar-induced temperature signal is negligible during Earth's rotation (Eddy, Gilliland, and Hoyt 1982), the quasi-sinusoidal diurnal variation (Supplementary Figure S1) in Earth's temperature (T) is mainly due to the uneven distribution of land and sea on the Earth's surface. For each point on Earth, the incoming solar irradiation and outgoing longwave radiation changes during the day are mainly due to Earth's rotation, causing the diurnal cycle of temperature.

In this study, vernal equinoxes during the study period (1979–2020) were chosen for analyzing global hourly temperatures (UTC time). We found large variations in global temperature from 4 am to 5 am, 7 am to 8 am, 4 pm to 5 pm and 9 pm to 10 pm. Figure 2 shows the global distribution of the temperature difference between 4 am and 5 am, 7 am and 8 am, 4 pm and 5 pm, and 9 pm and 10 pm. The Earth's rotation highly affects the land surface temperature, while the near-surface ocean temperature barely changes in the two consecutive hours. In Figure 2, the warming (red color) of the land surface occurs from 5 am to 2 pm, while cooling (blue color) occurs from 2 pm to 5 am of the next day. Figure 3 indicates the globally averaged mean temperature difference between two consecutive UTC times on the vernal equinoxes during 1979–2020. The average global temperature varies significantly during 4 am – 5 am, 7 am – 8 am, 4 pm – 5 pm, and 9 pm – 10 pm. The globally averaged temperature change reaches its peak positive value between 7 am and 8 am (Figure 3) because a large area (i.e. the entire African continent and the central and western parts of Eurasia) experiences warming (Figure 2(B)). On the other hand, the globally averaged temperature change reaches its peak negative value between 9 pm and 10 pm (Figure 3) because most of the land on Earth undergoes cooling, except for northeastern Eurasia, southern Australia and northwestern North America (Figure 2(D)).

2.2.2. The impact of the Moon on Earth's temperature

Figure 4(A) shows the change in the global daily temperature from 1979 to 2020. Earth's temperature in each year generally rises until it reaches its maximum around the middle of the year and then

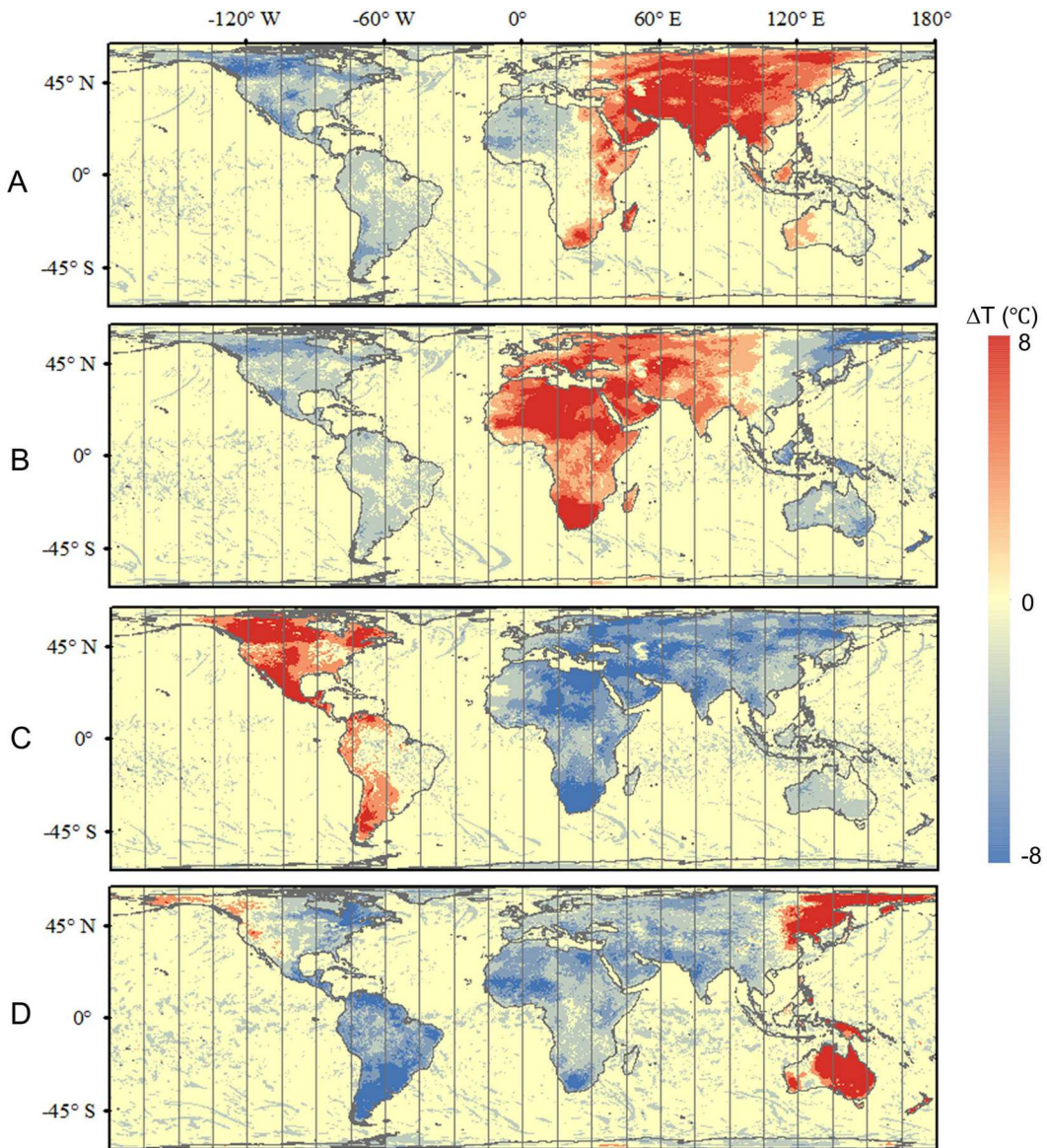


Figure 2. The mean temperature difference between two consecutive UTC times ((A) 5 and 4 UTC [T (at 5 UTC) – T (at 4 UTC)], (B) 8 and 7 UTC [T (at 8 UTC) – T (at 7 UTC)], (C) 17 and 16 UTC [T (at 17 UTC) – T (at 16 UTC)], and (D) 22 and 21 UTC [T (at 22 UTC) – T (at 21 UTC)]) on the vernal equinoxes from 1979 to 2020.

falls, which is mainly caused by the Earth's revolution around the Sun. This regular rising and falling pattern in temperature is accompanied by slight irregular fluctuations. We believe that these slight irregular fluctuations are mainly due to changes in lunar forcing exerted on Earth.

Lunar tides and their cycles are well known and clearly observed in ocean records (McKinnell and Crawford 2007). The lunar tidal cycles (generated by the gravitational effect of the Moon on Earth) may partially regulate ocean currents, thereby altering Earth's temperature (Keeling and Timothy 1997). The alternating asymmetric change in lunar gravitational forcing on the solid Earth and the ocean causes the periodic oscillation of crustal stress, which triggers local natural disasters and affects temperature changes locally and even globally (Mauk and Johnston 1973; Mauk and Kienle 1973; Stroup et al. 2007). Additionally, the periodic change in lunar gravitational forcing

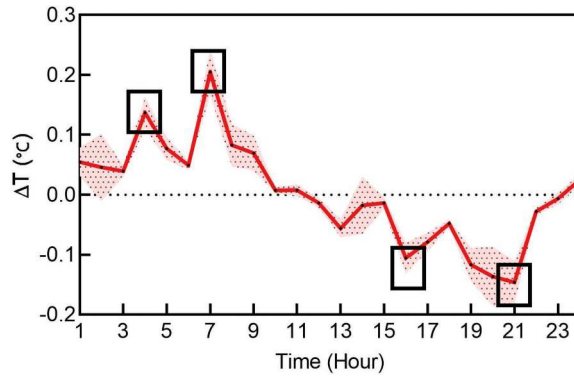


Figure 3. The spatially averaged mean temperature difference over the period 1979–2020 between two adjacent UTC times.

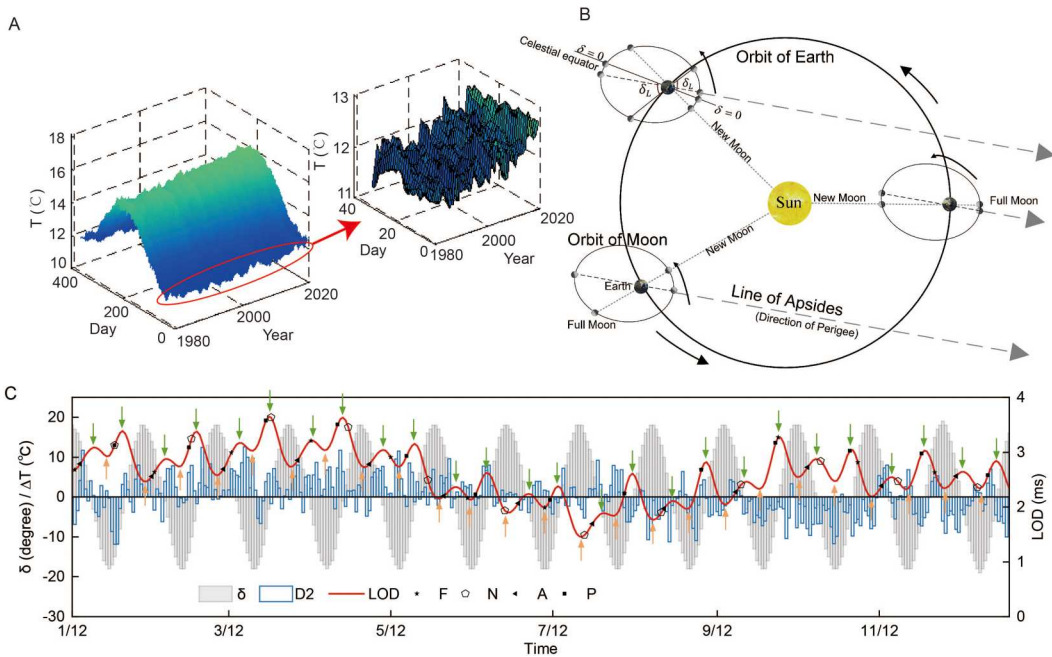


Figure 4. (A) Changes in the global daily temperature during 1979–2020. (B) A schematic diagram of the Moon orbiting the Earth in an orbit tilted to the celestial equator, which also depicts the lunar declination, lunar phase and the distance of the Moon from the Earth.

on Earth's atmosphere triggers the 27.3-day and 13.6-day atmospheric oscillatory systems and affects weather changes (Li 2005). Moreover, Earth's temperature is affected by reflection and infrared emission from the Moon (Balling and Cervený 1995; Gee 1999). All change periodically during the Moon's orbit around the Earth. (C) The temporal variation of lunar declination, distance between the Moon and the Earth, LOD and temperature difference (D2) of two consecutive days from January 1979 to December 1979. The orange and green arrows represent the days on which the lunar declination (δ) is maximum and zero (i.e. the Moon is on the celestial equator), respectively. In astronomy, lunar declination is defined as the angle between the Moon's apparent path (north or south of the celestial sphere) and the celestial equator.

By analyzing variations in daily lunar declination (δ), the distance between the Moon and the Earth, and the Earth's rotation from 1979 to 2020, we found further evidence of the Moon's effect

on daily Earth's temperature. In this study, the daily length of day (LOD) values were used as a measure of the Earth's angular velocity, which was calculated as the difference between the astronomically determined duration of the day and 86,400 SI seconds. In astronomy, δ is defined as the angle between the Moon's apparent path north or south of the celestial sphere and the celestial equator. Figure 4(B) schematically depicts the Moon orbiting the Earth in an orbit tilted toward the celestial equator. Figure 4(C) shows the temporal variations in δ , the temperature difference (D2) of two consecutive days and the LOD for 13 sidereal months from 1979 to 2020 (42 years). The variations in D2 and LOD show that both have the same rising and falling trends, implying that the rotation of the Earth affects the variation in daily Earth temperature. On the other hand, it was shown in Section 2.2.1 that Earth's rotation strongly affects the diurnal variation in Earth's temperature. Thus, if the rate of Earth's rotation changes regularly with the Moon's motion, it can further attest that the Moon can indirectly affect daily global temperature fluctuations by affecting the Earth's rotation.

The Moon revolves every ~ 27.32 days in its elliptical orbit, which is known as the sidereal month. The change in LOD over the study period (1979–2020) consists of two primary oscillations: 27.3-day and 13.6-day oscillations, which correspond to the lunar sidereal period (Figure 4(C)). The maximum (green arrows) LOD occurs when the Moon is on the celestial equator ($\delta = 0$). In contrast, the minimum (orange arrows) occurs when the extreme lunar declinations appear in the northern or southern hemisphere ($\delta = \delta_L$) (Figs. 4B and 4C). Generally, changes in lunar declination are approximately one day earlier than those of LOD. Additionally, we found that the rising and falling of LOD happen over 5–9 days and not necessarily a quarter of a sidereal month (Figure 4(C)). All the short (13 days) and long (14–15 days) LOD cycles contain the Moon's perigee (P) and apogee (A), respectively. Theoretically, the Moon moves slower and faster near the apogee and perigee, respectively, which implies that LOD cycles with the apogee are slightly longer than those with the perigee. These findings show that lunar declination and the variable velocity of the Moon around the Earth affect Earth's LOD. Meanwhile, all cycles with the perigee (P) have a higher peak than the adjacent cycles with the apogee (A), implying that the Moon's distance from the Earth affects the LOD. The LOD cycle with the highest peak arises when the perigee (P) is located near the peak and closer in time to new or full moons. All of the above findings clearly indicate that the lunar revolution around Earth is an important cause of daily variations in Earth's temperature.

2.2.3. The impact of the Earth's revolution on Earth's temperature

Figure 5 evaluates the effects of the Sun-Earth distance and the declination of the Sun on Earth's temperature. It is found that Earth's temperature is positively correlated with both the Sun-Earth distance and the Sun's declination, with R^2 values of 0.914 and 0.786, respectively. This occurs because the distance-induced temperature signal is insignificant compared to that of solar declination, leading to a positive correlation between Earth's temperature and its distance from the Sun.

As noted in Section 2.2.1, Earth's temperature change is largely attributed to land's temperature change. The solar declination is positive from April to September, and the Sun's rays are directly over the northern hemisphere where larger land areas exist, causing the land to absorb more solar radiation and show a higher temperature. Once the solar declination reaches its maximum value, the solar radiation absorbed by the land approaches its peak, and the global temperature reaches a high of 16.15 °C. From October to March, the solar declination is negative, and the Sun's rays shine directly on the southern hemisphere, where smaller land areas exist. Hence, the land and the whole of Earth absorb less solar radiation and exhibits relatively lower temperatures. That is why Earth's temperature is highly correlated with solar declination (Figure 5).

Earth absorbs more solar radiation and has a higher temperature when it is closer to the Sun. However, due to the low eccentricity of Earth's orbit, the Sun-Earth distance at aphelion is only 1.033 times larger than that at perihelion. The power of sunlight incident on Earth's surface is inversely proportional to the square of the Sun-Earth distance (Eddy, Gilliland, and Hoyt 1982; Willson 2014). Therefore, the solar power reaching Earth's surface at perihelion is only 6.8% higher than at aphelion.

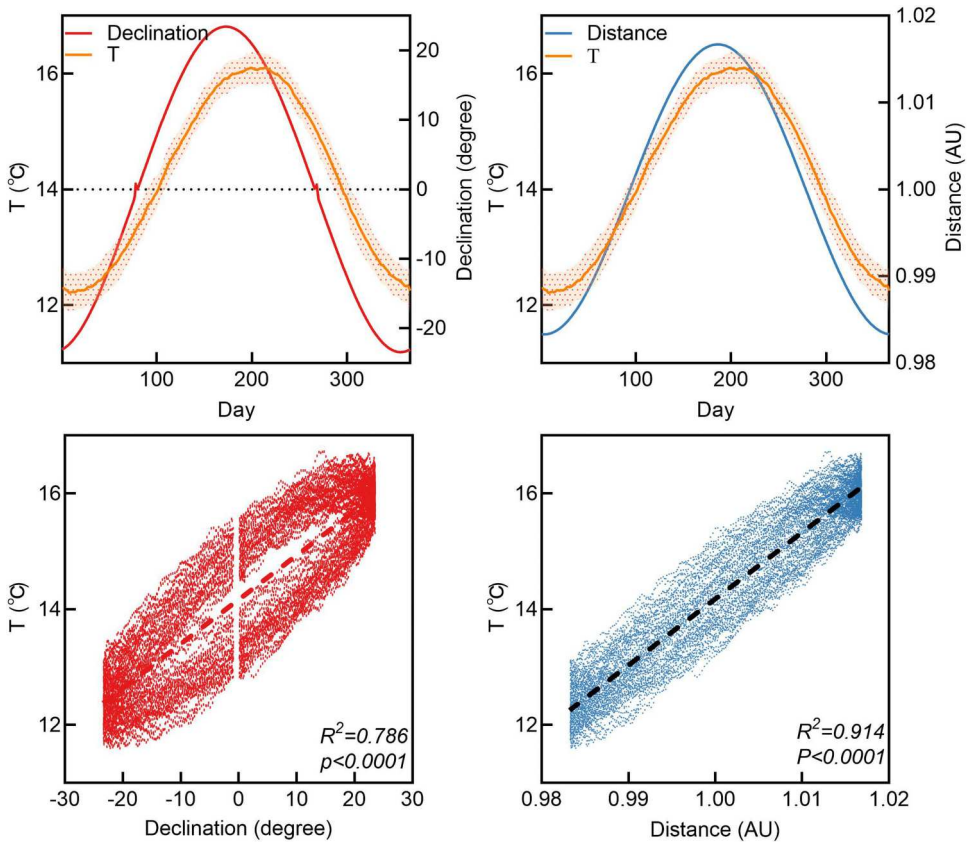


Figure 5. (Top row) Comparison of daily Earth's temperature data averaged over the period 1979–2020 with the solar declination (left column) and the Earth-Sun distance (right column). Orange bands represent the standard deviation of the daily Earth's temperature during the study period. (Bottom row) Scatterplot of the daily Earth's temperature data from 1979 to 2020 versus the solar declination and Sun-Earth distance.

The effect of the Sun-Earth distance on Earth's temperature is insignificant compared to that of solar declination, leading to an inconsistency between Earth's temperature and the Earth-Sun distance.

2.2.4. The impact of the motion of different planets on Earth's temperature

Planetary motion directly and/or indirectly drives Earth's climate change on secular, millennial, and larger timescales (Eddy 1976; Scafetta 2010; Westerhold et al. 2020). Here, we performed a Fourier transform analysis of the annual mean temperature from 1836 to 2020 (185 years). The results showed that global temperature has fluctuations in approximately 3.5, 9.1, 12.19, 18.28, 20.14, 29.92 and 61.2 years after 1836, which correspond to both the short-term oscillations of Earth's rotation and astronomical cycles (Supplementary Table S1). This also implies that planetary motion may indirectly influence interannual temperature by affecting Earth's orbit and velocity.

2.3. Quantifying the intra-annual contribution of planetary orbits to changes in Earth's temperature

2.3.1. Model specification

The temporal variations in Earth's temperature are mainly driven by its revolution and rotation. These variations also differ from cycle to cycle (including diurnal and annual cycles) due to changes in the positions of the Moon and planets relative to Earth. To quantify the contribution of different

planetary orbits to Earth's temperature, we developed a function describing the influence of different orbits on Earth's temperature over time. We performed a Fourier transform analysis of the hourly temperature records for each year, which showed that (1) the amplitude to range ratio (A/R) of the first few harmonic terms is nearly constant over the entire annual range, and (2) the sum of A/R for the 24-h and 365-d terms exceeds 0.87. The range (R) in the Section 2.3 refer to the difference of the maximum and minimum hourly temperatures in a year, $T_{max} - T_{min}$, unless otherwise indicated.

It is evident that the variations in Earth's temperature during a year are mainly dependent on the rotation and revolution of the Earth. The departure from 0.87 is indicative of the influence of other factors on the variation in Earth's temperature. This suggests that (1) a curve, $X(t)$, can be used to derive the annual variation in temperature, whose duration depends on the temporal variability of the Earth's revolution, and (2) the annual cycle curve ($X(t)$) can consist of a series of functions describing the effect of different orbits on Earth's temperature perturbations:

$$X(t) = f_1(t) + f_2(t) + f_3(t) + Z(t), \quad (1)$$

where $X(t)$ represents influence of all planetary orbits on the change in Earth's temperature at time t . $X(t)$ was then determined by the summation of four functions, i.e. f_1 , f_2 , f_3 , and Z . $f_1(t)$, $f_2(t)$ and $f_3(t)$ represent the influences of Earth's rotation, lunar revolution and Earth's revolution on Earth's temperature changes at time t , respectively. $Z(t)$ denotes the effects of the orbits of the other seven planets (namely, Mercury, Mars, Jupiter, Saturn, Neptune, Venus and Uranus) in the solar system on the change in Earth's temperature at time t .

The motion of Earth (i.e. rotation and revolution) and its impact on Earth's temperature are all periodic (Sections 2.2.1 and 2.2.3). The Fourier transform analysis of hourly temperature data revealed that the amplitudes of the harmonic terms corresponding to the rotation and revolution period times are nearly constant. Thus, functions composed of harmonic terms can be used to describe the effects of Earth's rotation and Earth's revolution on changes in Earth's temperature during a year.

$$f_1(t) = E_m^n \cos \left[\frac{2\pi}{\omega_1} (t_l - h_m^n) \right] + r_m^n, \quad (2)$$

$$f_3(t) = A_3 \cos \left[\frac{2\pi}{\omega_3} (t - c) \right] + q, \quad (3)$$

where t_l represents the t_l -th hour of the m th day of the n th sidereal month, and t is the hour of the year. E_m^n and A_3 are the harmonic amplitudes (which can be obtained by a Fourier transform analysis), r_m^n and q are the exponential terms, and h_m^n and c are the optional phase shifts for $f_1(t)$ and $f_3(t)$, respectively. To improve the convergence of $f_1(t)$ and $f_3(t)$, an empirical knowledge about the hours of their motion is needed. The widths ω_1 and ω_3 in the cosine terms are determined by the hours in which they complete their periodic motions.

Given the physical continuity of Earth's temperature, the influence functions of Earth's rotation and revolution on the temperature (i.e. $f_1(t)$ and $f_3(t)$) are presumed to be continuous in all instances, including the junction time between two diurnal cycles (t_p) and the junction time between two consecutive years (t_0). Herein, we evaluate the continuity of the influence functions of the Earth's rotation ($f_1(t)$) and Earth's revolution ($f_3(t)$). $f_1(t)$ for days m and $m+1$ can be expressed as:

$$f_1^m(t) = E_m^n \cos \left[\frac{2\pi}{\omega_1} (t_l - h_m^n) \right] + r_m^n, \quad (4)$$

$$f_1^{m+1}(t) = E_{m+1}^n \cos \left[\frac{2\pi}{\omega_1} (t_l - h_{m+1}^n) \right] + r_{m+1}^n, \quad (5)$$

For $f_1(t)$ to be continuous at the junction time between two diurnal cycles (t_0), the following two constraints should be fulfilled:

$$f_1^m(t)|_{t=t_0} = f_1^{m+1}(t)|_{t=t_0}, \quad (6)$$

$$\left(\frac{\partial f_1^m(t)}{\partial t}\right)|_{t=t_0} = \left(\frac{\partial f_1^{m+1}(t)}{\partial t}\right)|_{t=t_0}, \quad (7)$$

Substituting Equations (4) and (5) into (6) and their derivatives into (7) leads to:

$$E_{m+1}^n = \frac{E_m^n \sin\left[\frac{2\pi}{\omega_1}(t_0 - h_m^n)\right]}{\sin\left[\frac{2\pi}{\omega_1}(t_0 - h_{m+1}^n)\right]}, \quad (8)$$

$$r_{m+1}^n = E_m^n \cos\left[\frac{2\pi}{\omega_1}(t_0 - h_m^n)\right] + r_m^n - E_{m+1}^n \cos\left[\frac{2\pi}{\omega_1}(t_0 - h_{m+1}^n)\right], \quad (9)$$

Equation (8) allows us to obtain E_{m+1}^n in terms of E_m^n . Similarly, Equation (9) relates r_{m+1}^n to r_m^n . A multiday continuous $f_1(t)$ model can be obtained by substituting (8) and (9) into (5). The total number of free parameters in the function $f_1(t)$ for Day m ($m \geq 2$) is $m + 1$ (i.e. r for the first day and h_1^n to h_m^n), and these free parameters are estimated with the Levenberg–Marquardt minimization algorithm with a universal global optimization scheme (Göttsche and Olesen 2009). E and r for each day (except the first day) are calculated from (8) and (9), respectively.

Analogously, the function $f_3(t)$ must be continuous in all instances, including the junction time between two consecutive years (t_0). $f_3(t)$ for years i and $i + 1$ can be expressed as:

$$f_3^i(t) = A_3^i \cos\left[\frac{2\pi}{\omega_3^i}(t - c^i)\right] + q^i, \quad (10)$$

$$f_3^{i+1}(t) = A_3^{i+1} \cos\left[\frac{2\pi}{\omega_3^{i+1}}(t - c^{i+1})\right] + q^{i+1}, \quad (11)$$

For $f_3(t)$ to be continuous at the junction time between two annual cycles (t_0), the following two constraints should be fulfilled:

$$f_3^i(t)|_{t=t_0} = f_3^{i+1}(t)|_{t=t_0}, \quad (12)$$

$$\left(\frac{\partial f_3^i(t)}{\partial t}\right)|_{t=t_0} = \left(\frac{\partial f_3^{i+1}(t)}{\partial t}\right)|_{t=t_0}, \quad (13)$$

Substituting Equations (10) and (11) into (12) and their derivatives into (13) leads to:

$$A_3^{i+1} = \frac{A_3^i \sin\left[\frac{2\pi}{\omega_3^i}(t_0 - c^i)\right]}{\sin\left[\frac{2\pi}{\omega_3^{i+1}}(t_0 - c^{i+1})\right]}, \quad (14)$$

$$q^{i+1} = A_3^i \cos\left[\frac{2\pi}{\omega_3^i}(t_0 - c^i)\right] + q^i - A_3^{i+1} \cos\left[\frac{2\pi}{\omega_3^{i+1}}(t_0 - c^{i+1})\right], \quad (15)$$

A multiyear continuous $f_3(t)$ model can be obtained by substituting (14) and (15) into (11). The total number of free parameters in the function $f_3(t)$ for year i ($i \geq 2$) is $i + 1$ (i.e. q for the first year and c^1 to c^i), and these free parameters are estimated with the Levenberg – Marquardt

minimization algorithm with a universal global optimization scheme (Göttsche and Olesen 2009). A_3 and q for each year (except for the first year) are calculated from (14) and (15), respectively.

In each sidereal month, the Moon affects Earth's temperature by different physical processes, namely, the gravitational force, lunar phase changes, orbital oscillations, reflections, and infrared emissions from the Moon's surface. It is worth mentioning that these processes have different cycles. In addition, the Earth-Moon system moves around the Sun, while the Moon orbits the Earth. Such a complex system induces different feedback in the Earth system. Therefore, the influence of the Moon's orbit on Earth's temperature is irregular and varies among revolution periods, which makes it extremely difficult to find an appropriate function to express the influence of the Moon on Earth's temperature.

As explained in Sections 2.2.2 and 2.2.3, temperature changes in two successive days are mainly driven by the revolution of the Earth and Moon. Therefore, the temperature difference ($D2$) between two subsequent days can be inferred by taking the derivative of the sum of the functions that describe the influence of the revolution of the Earth and Moon on Earth's temperature change, i.e. $D2 = \frac{d(f_2 + f_3)}{dt}$. It is evident that the influence of the Moon's orbit on Earth's temperature (f_2) can be calculated by subtracting the influence of Earth's revolution (see Equation (3)) from the antiderivative function (F) of $D2$ as follows:

$$F(t) = \frac{d}{dt} \left[\int (f_2(t) + f_3(t)) dt \right] + C = \int D2(t) dt + C, \quad (16)$$

$$f_2(t_s) = F_n(t_s) - \left[A_3 \cos \left[\frac{2\pi}{\omega_3} (t - c) \right] + q \right], \quad (17)$$

where C is a constant, n represents the n -th sidereal month, and t_s represents the t_s -th hour of the n -th sidereal month.

The influence ($Z(t)$) of the seven planets on Earth's temperature can be determined by a physical function that depends on the orbits of the planets and their positions. However, it is difficult to build such a function because the physical mechanisms that relate the motion of a single planet to Earth's temperature still need to be further investigated, even though the movement of each planet can be strictly calculated. In addition, the lack of sufficient data and the complexity of the physical processes linking the Earth's temperature to the entire planetary system limit the determination of this function (Scafetta 2010).

On the other hand, the impact of Earth's revolution, the lunar revolution and Earth's rotation on Earth's temperature occur periodically on a subannual timescale, and their cumulative effects on Earth's temperature changes are roughly similar in each cycle. The effect of solar forcing and the change in CO_2 concentration in two consecutive years on Earth's temperature is negligible, and the seven planetary orbits mainly affect Earth's temperature on interannual or even longer time scales (Eddy, Gilliland, and Hoyt 1982; Milankovitch 1969; Scafetta 2010). Hence, it is hypothesized that changes in Earth's temperature between two consecutive years arise from the abovementioned seven planets in the solar system. Having said that, $Z(t)$ for year i can be calculated by taking the difference of Earth's temperatures in that year and the previous year as follows:

$$Z(t)^i = MT^i - MT^{i-1}, \quad (18)$$

where MT^i and MT^{i-1} are the mean temperatures of the Earth in years i and $i - 1$, respectively.

This study assumes that the contribution of different orbits to the annual Earth's temperature perturbations is equal to the annual temperature variation caused by different orbits divided by the maximum annual temperature variation. Therefore, the contributions of Earth's rotation and revolution to fluctuations of Earth's temperature in one year are calculated by dividing the magnitude of intra-annual temperature variations caused by each of them by the highest annual

temperature change (see Equations 19–20).

$$g_1^i = \frac{1}{h} \sum_{n=1}^k \sum_{m=1}^j \frac{(E_m^n)}{T_{\max}^i - T_{\min}^i}, \quad (19)$$

$$g_3^i = \frac{A_3^i}{T_{\max}^i - T_{\min}^i}, \quad (20)$$

where g_1^i and g_3^i are the contributions of Earth's rotation and revolution to annual Earth temperature variation in year i , respectively. k is the number of sidereal months in year i , j is the number of days in the n -th sidereal month, and h is the total number of days in year i . T_{\max}^i and T_{\min}^i are the maximum and minimum hourly temperatures of year i , respectively.

The contribution of lunar revolution to fluctuations of Earth's temperature in one year are calculated by dividing the magnitude of intra-annual temperature variations caused by lunar revolution by the highest annual temperature change.

$$g_2^i = \frac{1}{k} \sum_{n=1}^k \frac{(f_{2\max}^n - f_{2\min}^n)}{T_{\max}^i - T_{\min}^i}, \quad (21)$$

where g_2^i is the contribution of the lunar revolution to annual Earth's temperature variation in year i and k is the number of sidereal months in year i . $f_{2\max}^n$ and $f_{2\min}^n$ are the maximum and minimum f_2 (the influence of the Moon's orbit on Earth's temperature) in the sidereal month n , respectively.

The contribution (g_z) of the orbits of other planets in the solar system to changes in the Earth's temperature during a year is given by.

$$g_z^i = \frac{Z(t)^i}{T_{\max}^i - T_{\min}^i}, \quad (22)$$

where g_z^i is the contribution in year i of the orbits of other planets in the solar system to the change in Earth's temperature during a year.

2.3.2. Inferencing the model parameters of Section 2.3.1 utilizing historical temperature data

$f_1(t)$ quantifies the influence of Earth's rotation on its temperature variation in a year. Building on Section 2.2.1 above, the quasi-sinusoidal diurnal variation in Earth's temperature is mainly due to its rotation. We calculated the temperature difference (D1) of two consecutive hours for each day from 1979 to 2020. A remarkable agreement is found between the D1 values of two consecutive days. For example, the D1 values for January 1 and 2 from 1979 to 2020 are shown in [Figure 6](#). These results indicate that the variation in D1 is mainly determined by the rotation of the Earth. Therefore, the changes in D1 can be used to quantify the impact of Earth's rotation on the global temperature in consecutive hours, which can be inferred by taking the derivative of the function $f_1(t)$. The derivative of $f_1(t)$ is fitted to the time series of D1 by using the Levenberg – Marquardt scheme to determine its unknown parameters.

$f_2(t)$ quantifies the influence of the lunar revolution on Earth's temperature variations in a year. The changes in CO₂ concentration for two consecutive days have almost no effect on Earth's temperature. Thus, we can determine the change in Earth's temperature over two consecutive days (due to the motion of the Moon) by using Equations (16) – (18). To eliminate the impact of large variations in CO₂ concentration in two successive days on temperature, we utilized only D2 values for days in which the CO₂ concentration was relatively stable.

The changes in Earth's temperature each year can be attributed to variations in solar radiation absorbed by the land and the speed of Earth's rotation, which are induced by Earth's revolution to a certain extent (see Section 2.2.3 above for details). Thus, intra-annual temperature changes can be used to

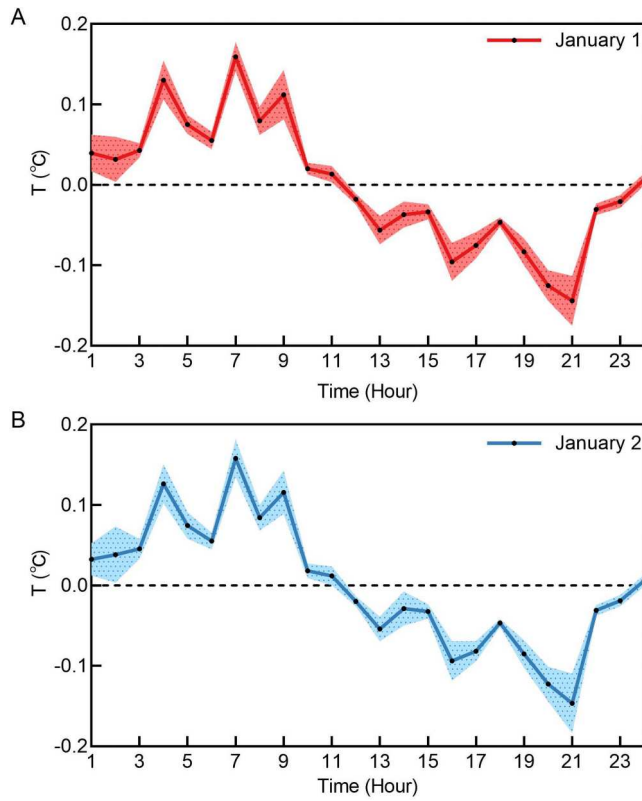


Figure 6. The temperature difference (D1) of two consecutive hours on January 1 and 2 from 1979 to 2020. The red and blue bands represent the standard deviation of the temperature difference data of two consecutive hours on January 1 and January 2, respectively, during the study period.

quantify the contribution of Earth's revolution to temperature. Additionally, the results of the Section 2.2.2 show that the influence of the Moon's movement on intra-annual temperature changes is not negligible. Since the Moon orbits Earth once per sidereal month, we can reasonably assume that the Moon's effect on Earth's temperature changes is approximately similar each month. The sidereal monthly Earth temperature averaged over the study period (1979–2020) is compared with the corresponding solar declination (Figure 7(A)). Figure 7(B) shows the scatterplot of the mean sidereal monthly Earth temperature versus the corresponding solar declination for each sidereal month during the study period. It was found that solar declination had a stronger correlation with the mean sidereal monthly temperature (with an R^2 of 0.928) than the daily temperature (with an R^2 of 0.786 (Figure 5)). This further suggest that the variation in mean sidereal monthly temperature is driven by Earth's revolution.

The CO_2 concentration in two successive sidereal months is almost constant. Therefore, the temperature difference of consecutive sidereal months (D3) can be used to quantify the impact of the Earth's revolution on temperature. To further exclude the influence of CO_2 on temperature, we used only the D3 values of sidereal months with stabilized CO_2 concentrations. The function $f_3(t)$ quantifies the influence of Earth's revolution on its temperature variation in a year, whereas D3 can be inferred by taking the derivative of the function $f_3(t)$. It is evident that the derivative of $f_3(t)$ can be fitted to the time series of D3 by using the Levenberg – Marquardt scheme to obtain its unknown parameters.

$Z(t)$ quantifies the influence of all planets in the solar system on the intra-annual variations in Earth's temperature. To eliminate the influence of CO_2 changes on variations in Earth's temperature, we considered the temperature difference between two successive years in which the CO_2 concentration remained nearly unchanged.

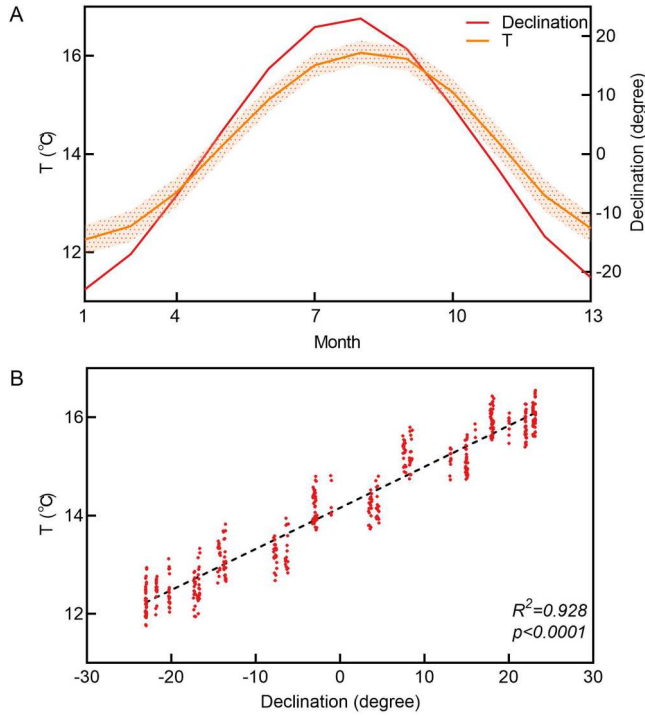


Figure 7. (A) Comparison of sidereal monthly Earth's temperature data averaged over the period 1979–2020 with solar declination. The orange band represents the standard deviation of sidereal monthly Earth's temperature data during the study period. (B) Scatterplot of sidereal monthly Earth temperature data versus solar declination during the study period.

2.4. Quantifying the contribution of planetary orbits to changes in Earth's temperature on an interannual scale

2.4.1. Model specification

In this study, the variation in Earth's temperature at various time intervals can be defined by.

$$T_{i+s} - T_i = P_{i+s,i} + V_{i+s,i}, \quad (23)$$

where $T_{i+s} - T_i$ is the temperature difference between years $i + s$ and i , and $P_{i+s,i}$ and $V_{i+s,i}$ are the effects of planetary orbits and greenhouse gases on changes in Earth's temperature between years $i + s$ and i , respectively.

Ample physical evidence shows that CO_2 is the most important gas for controlling Earth's temperature (Lacis et al. 2010). On the other hand, it is difficult to obtain the records of other greenhouse gases before 1979. Hence, we equate Earth's temperature change caused by other greenhouse gases with the effect of CO_2 . Equation (23) can be rewritten as 24 based on the near-linear relationship between CO_2 and Earth's temperature change (Figure SPM.10; IPCC Cambridge University Press, 2021).

$$T_{i+s} - T_i = P_{i+s,i} + dV_{i+s,i} \times \nu, \quad (24)$$

where $dV_{i+s,i}$ is the difference in CO_2 concentration between years $i + s$ and i . ν is the value of the Earth's temperature change caused by 1 ppm CO_2 .

If the effect (ν) resulting from a 1 ppm CO_2 concentration change on Earth's temperature is obtained, we can accurately quantify the effect of planetary orbits on Earth's temperature change using Equation (24). The estimates from Equation(18) suggest that the effect of planetary orbits (Z) on Earth's temperature in different years is irregular. Therefore, it is assumed that the effects of the planet's orbit on Earth's temperature at various time intervals ($P_{i+s,i}$) can be equal to the

mean (\bar{Z}) derived from Z during the study period (1836–2020).

$$\bar{Z} = \frac{\sum_{i=1}^n |Z_i|}{n}, \quad (25)$$

$$P_{i+s,i} = \bar{Z}, \quad (26)$$

where Z_i denotes the effect of planetary orbits on Earth's temperature change between years $i + 1$ and i , which can be obtained from Equation (18). n is the number of Z_i . Then, we can calculate the effect ($v_{i+s, i}$) of 1 ppm CO₂ on temperature at various time intervals by

$$v_{i+s, i} = \frac{T_{i+s} - T_i - \bar{Z}}{dV_{i+s, i}} \quad (s \in [2, 184], i \in [1836, 2020 - s]), \quad (27)$$

To further improve the estimation accuracy, the mean (\bar{v}) of $v_{i+s, i}$ is utilized to approximate the effect (v) of a 1 ppm increase in CO₂ concentration on global temperature change. In this way, we obtain the effect of a unit change in CO₂ concentration on Earth's temperature, and then the effect of planetary orbits on Earth's temperature ($P_{i+s,i}$) between years $i + s$ and i can be obtained via

$$P_{i+s,i} = T_{i+s} - T_i - dV_{i+s, i} \times \bar{v}, \quad (28)$$

where \bar{v} is the optimal approximation of the real effect of 1 ppm CO₂ on global temperature change, which is obtained by calculating the average value of all $v_{i+s, i}$.

2.4.2. Model validation

Figure 8(A) shows that Earth's temperature has increased since 1836 (red line). The upward trend in Earth's temperature from 1836 to the present can be approximated by fitting a quadratic function to Earth's temperature records. We can then approximately remove this upward trend using the quadratic fit function, which is shown by the histogram in Figure 8(A). It can be seen that the histogram has two large and clear sinusoidal-like cycles during 1836–1964. Each of them has a period of approximately 61 years and a peak-to-trough amplitude of approximately 0.30–0.35 °C. In fact, there was a small change in greenhouse gas concentrations before the 1910s, and anthropogenic emissions also did not show any 61-year cycles before the 1940s (Hansen et al. 2007). Thus, the 61-year cycle temperature change should be caused by changes in the planet's orbit. Furthermore, the histogram was smoothed (black line) and shifted by 61 (red line) and $2 \times 61 = 122$ (blue line) years (see Figure 8(B)). A shift of 61 years was chosen to be consistent with the highest temperature period in Table S1. Figure 8(B) shows that the oscillations of Earth's detrended temperature among the 1850–1910, 1910–1970 and 1970–2020 periods (each period consisting of 60 years) are fairly similar, and the Pearson correlation coefficient of detrended temperatures among the three periods ranges from 0.74 to 0.86. It is evident that the 61-year cycle temperature change in Figure 8(B) is caused by planetary orbital changes. Therefore, Earth's detrended temperature in Figure 8(A) can represent the impact of the planet's orbit on Earth's temperature change. In addition, the evident strong symmetry between the 1880–1920 and 1940–1980 periods indicates that the data in Figure 8(A) before 1920 and 1940–1980 are more representative of the impact of the planet's orbit on Earth's temperature change.

We converted the Earth's detrended temperatures in Figure 8(A) to the effect of planetary orbits on Earth's temperature changes in different years using 1836 as the benchmark. This can be done by subtracting the detrended temperatures of Earth in 1836 from Earth's detrended temperature records, which is shown with the blue line in Figure 9. Then, we compared the result with that of our model. The comparison shows that the results of both approaches are consistent during the study period, and they almost completely coincide before 1900. Moreover, a remarkable coincidence of the two curves is found from 1940 to 1980, which also corresponds to the more representative detrended temperatures. Furthermore, our results exhibit a quantitative concordance with the subtraction of the black line from the red line in Figure 4 of Hennessy's study (Hennessy et al. 2004).

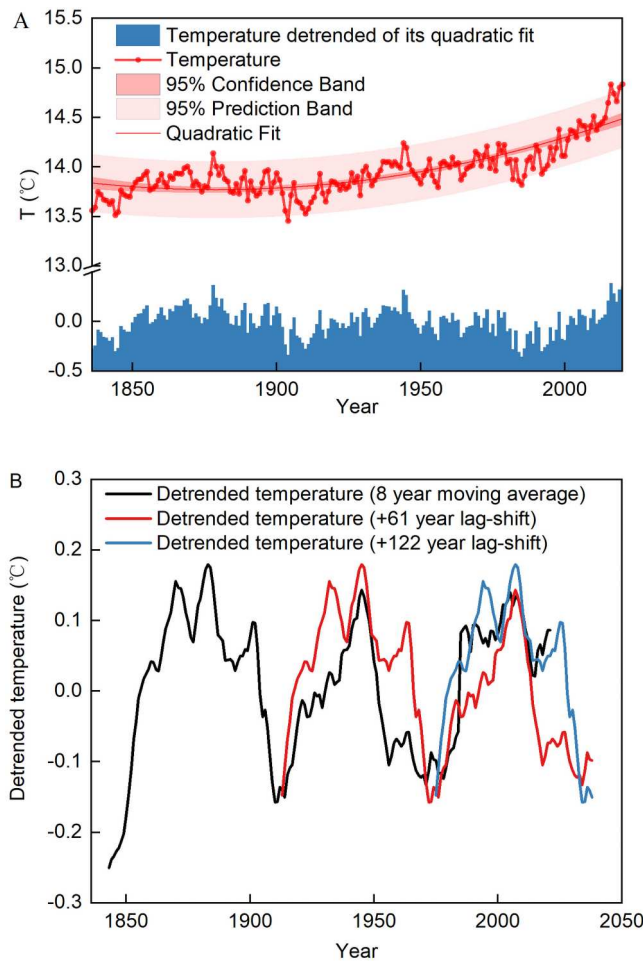


Figure 8. (A) Earth's temperature record and the detrended temperature of its quadratic fit; (B) eight-year moving average of the detrended temperature of its quadratic fit and plotted against itself shifted by 61 and 122 years.

These outcomes show that the estimates of the effect of planetary orbits on Earth's temperature changes from our model have high confidence.

2.5. Forecasting the effect of planetary orbits on Earth's temperature from 2021 to 2050

To predict the effect (P) of planetary orbit changes on Earth's temperature, we constructed a hybrid forecast model based on long short-term memory (LSTM) (Xiao et al. 2019; Zhong, Hu, and Zhou

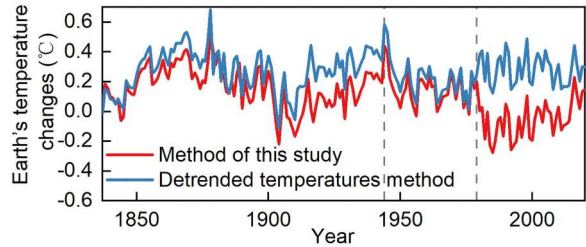


Figure 9. The effect of planetary orbits on global temperature changes in different years (using 1836 as the benchmark) based on the detrended temperature method and the method of this study.

2019) and the spectral domain approach (Ghil et al. 2002), which can overcome the deficiency that LSTM based on the recursive strategy is very sensitive to the accumulation of errors with the forecast horizon. The hybrid forecast model uses the P reconstructed by the spectral domain method as the input value of the LSTM method and waveform change feature of the predicted P value (2020–2050) determined by the spectral domain approach to improve the accuracy of LSTM model P forecasting from 2021 to 2050.

2.5.1. Reconstructing and forecasting P using the spectral domain method

Since P exhibits significant fluctuations (Figure 9), it can be reconstructed and forecasted reliably if its phases and frequencies are accurately determined. Based on harmonic approximation theory (i.e. harmonic approximation models can simulate partial periodic time series (Scafetta 2021; Wang et al. 2020)), we developed a harmonic approximation model for reconstructing and forecasting P using all statistically relevant oscillations that could be identified from its historical time series. The spectral domain approach can determine the periodic components embedded in a time series by computing the associated periods, amplitudes, and phases, and these individual periodic components can be combined to reconstruct and predict the future evolution of the time series. Thus, the relevant oscillations (i.e. periodic components) can be extracted using spectral analysis methods to build a harmonic approximation model. In this study, fast Fourier transform (FFT) and multitaper (MTM) methods were used to identify spurious spectral peaks and extract periodic components of the P time series. It is worth mentioning that if the FFT spectral peaks were not verified by the MTM, they were excluded from the harmonic modeling of the P time series.

Based on the identified significant peaks of the P time series and information from the FFT and MTM decompositions (Supplementary Figure S2), the associated periodic components were reconstructed in the time domain using the harmonic approximation model. The combination of oscillatory signals (\hat{P}) is written in continuous time as.

$$\hat{P}_t = U + \sum_{m=1}^M A_m \sin(2\pi f_m(t - 1836) + \phi_m), \quad (29)$$

where f , A , and ϕ are the frequency, amplitude, and phase of the sine wave, respectively. t is the year, and M is the number of extracted significant peaks. U is set to 0.0567 and 0.0713 when the FFT and MTM frequencies are used, respectively.

2.5.2. Forecasting P based on the LSTM method

LSTM is a recurrent neural network that is capable of learning long-term dependencies between samples in a sequence by updating states based on both the inputs for the current time step and network states of what was output in the prior time step methods (Supplementary Text). This capability makes LSTM a suitable method for predicting P .

The hyperparameters of LSTM (e.g. the number of layers and the number of neurons in each layer) should be tuned to improve its performance. In this study, 10% of the data from the training dataset are selected randomly to tune the hyperparameters of LSTM via the Bayesian optimization method (Cao et al. 2023). We tested different numbers (from 1 to 5) of LSTM layers and combined the one, two, and three dense layers (also called the fully connected layers). Finally, we chose 4 layers (two LSTM layers and two dense layers) with 64, 32, 64 and 1 neurons. Meanwhile, we performed batch normalization after each hidden layer of the network. The best performance was obtained for a mini-batch size of 32. The mean square error (MSE) was used as the loss function. The Adam, RMSprop, AdaGrad, Nesterovs, SGD and Adadelat schemes were tested, and finally, the Adam scheme was adopted as the optimizer. Furthermore, the number of epochs and the length of historical input data (timestep) affect P predictions. Through extensive experimentation, we found that the optimal configuration was 300 epochs and a timestep of 53 years, ensuring the highest predictive accuracy (Supplementary Figure S4).

2.5.3. Hybrid forecast model based on LSTM and the spectral domain approach

Figure 10 shows the architecture of the proposed hybrid forecast model based on LSTM and the spectral domain approach. We chose a rolling prediction scheme for the hybrid forecast model. In this scheme, the spectral domain method is initially applied to reconstruct P from 1837 to 2020 and predict P from 2021 to 2050. Next, the LSTM model is trained to find a pattern between P at time t_i and the input sequence values of its 53 preceding moments at times t_{i-1} , t_{i-2} , and t_{i-53} (also called a time window) using input sequence $[P, \hat{P}^F, \hat{P}^M]$, where P is the historical values during 1837–2020, and \hat{P}^F and \hat{P}^M are the P values during 1837–2020 from the FFT and MTM methods, respectively. The future prediction is performed based on the input sequence values in its preceding 53 moments using the identified patterns. Then, their predictions on each horizon are combined through averaging to produce the final prediction. The final prediction is used as the latest element of the input sequence to update the sequence, which is further used to predict one more year ahead P . By repeating this process, k -year predictions can be achieved. Finally, we predicted P from 2021 to 2050.

3. Results

3.1. The physical response of Earth's temperature to different astronomical forcings

Our analysis (see Section 2.2) reveals that Earth's temperature variation over different time scales is related to changes in Earth's motion (its revolution and rotation) and, to a lesser extent, to the other planetary motions. Since the amplitude of the solar-induced temperature signal is negligible during Earth's rotation (Eddy, Gilliland, and Hoyt 1982), variations in Earth's surface albedo influence the amount of solar radiation absorbed throughout the day, resulting in a quasi-sinusoidal diurnal temperature variation. The change in Earth's temperature in two successive hours is primarily due to the variations in the land temperature (see Section 2.2.1 for further details). By analyzing the temporal variations in daily lunar declination, Earth-Moon distance, Earth's temperature and Earth's rotation data from 1979 to 2020, it is found that lunar declination and Moon-Earth distance can indirectly influence Earth's temperature by affecting the speed of Earth's rotation (see Section

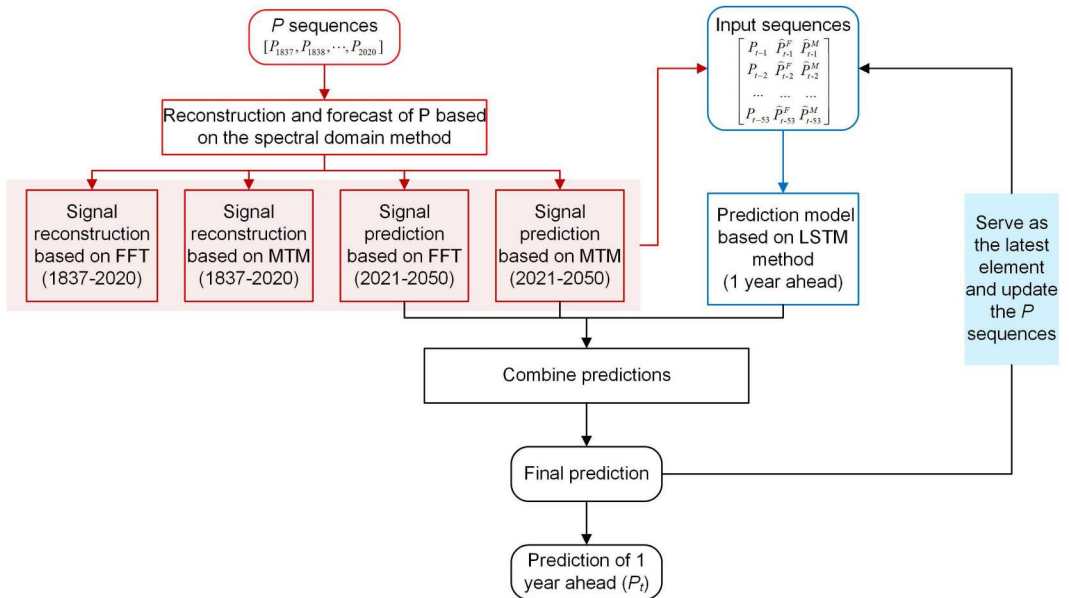


Figure 10. The architecture of the proposed hybrid forecast model based on the LSTM and spectral domain approaches for predicting P . FFT and MTM denote the fast Fourier transform and multitaper methods, respectively.

2.2.2 for more information). Additionally, the slow periodic changes in the solar declination and, to a much lesser extent, the Sun-Earth distance mainly cause seasonal and latitudinal variations in insolation, leading to changes in Earth's temperature during a year (see Section 2.2.3). In addition, the up and down swings of the Sun's position relative to the equatorial plane (caused by the revolution of the Earth) triggers the seasonal variation of Earth's rotation in each year (weak deceleration (72 days), strong acceleration (110 days), strong deceleration (109 days), and weak acceleration (66 days)), which also contributes to oscillations of the temperature difference between two successive days. The Fourier transform analysis of the annual mean Earth's temperature from 1836 to 2020 also shows that planetary motion may have influenced interannual variations in Earth's temperature by affecting Earth's orbit and velocity (see Section 2.2.4).

3.2. Contribution of planetary orbits to changes in Earth's temperature during the year

The parameters of developed mathematical model (Section 2.3) are inferred using historical temperature data to determine the contribution of planetary orbits to Earth's intra-annual temperature changes. Figure 11(A) shows that the orbital forcings (i.e. Earth's revolution around the Sun, Earth's rotation, the Moon's revolution around the Earth and other planet motions) explain $\sim 99.79\%$ of the temperature variation during the year (1979–2020), while the contribution attributable to other factors (e.g. changes in greenhouse gas concentrations, other human drivers due to aerosols, ozone and land-use change) is only approximately 0.21%. Earth's revolution, Earth's rotation, the Moon's

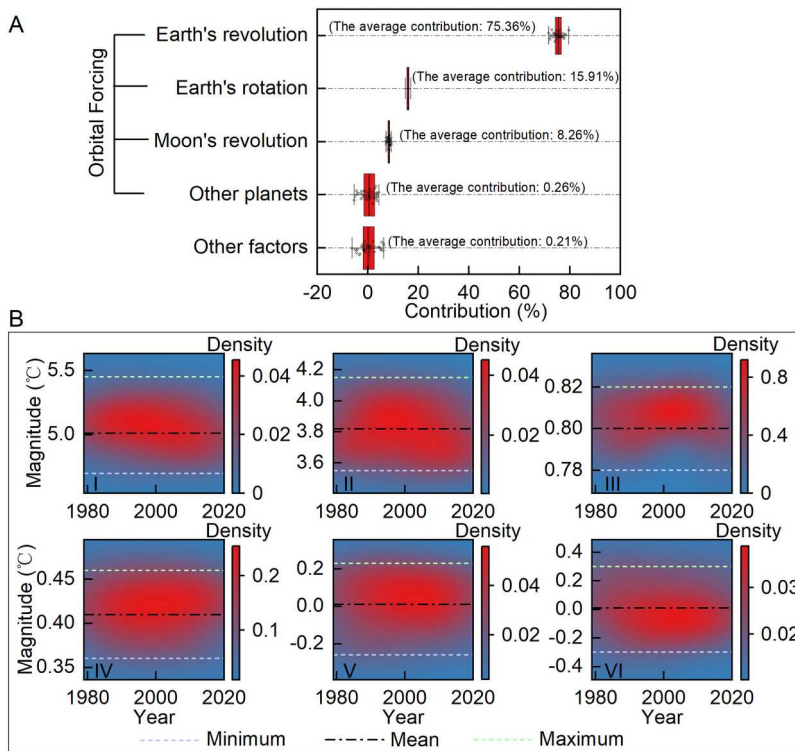


Figure 11. (A) Boxplot of the contributions of various planetary orbits and other factors (e.g. changes in greenhouse gas concentrations, other human-related drivers including aerosols, ozone and land-use change) to hourly changes in Earth's temperature during the year (boxplot: middle line, median; box, interquartile range (IQR); whiskers, 1.5xIQR). (B) The magnitude of the annual Earth's temperature variations in response to (II) Earth's revolution, (III) Earth's rotation, (IV) Moon's revolution, (V) other planets, and (VI) other factors from 1979 to 2020, and (I) is the observed maximum Earth's annual temperature change over the period 1979–2020. The Earth's temperature changes in each plot are color coded based on their kernel density. The dashed blue, black, and green colors represent the minimum, mean, and maximum of Earth's temperature changes.

revolution, and other planet motions contribute $\sim 75.36\%$, 15.91% , 8.26% and 0.26% to the intra-annual Earth's temperature change during 1979–2020, respectively (Figure 11(A)). Figure 11(B) shows annual variations in Earth's temperature due to different orbital forcings and other factors from 1979 to 2020. In this figure, temperature changes are color coded based on their kernel density. The observed maximum annual temperature change (i.e. the difference in the maximum and minimum hourly temperatures in that year) from 1979 to 2020 is approximately $4.73\text{--}5.46\text{ }^{\circ}\text{C}$, with a mean of $5.06\text{ }^{\circ}\text{C}$. The ranges of temperature variations induced by the Earth's revolution, Earth's rotation, the Moon's revolution, and the motion of the planets are $3.56\text{--}4.15$, $0.78\text{--}0.82$, $0.36\text{--}0.47$, and $-0.25\text{--}0.23\text{ }^{\circ}\text{C}$, respectively, with means of 3.81 , 0.81 , 0.41 and $0.01\text{ }^{\circ}\text{C}$ (Figure 11(B)). The total temperature changes due to other factors (e.g. changes in greenhouse gas concentrations, other human-related drivers including aerosols, ozone and land-use change) are $\sim 0.01\text{ }^{\circ}\text{C}$ (Figure 11(B)).

Based on the mathematical model developed by us, every 26.8° of the Earth's orbit around the Sun (i.e. approximately one sidereal month), 15° of the Earth's rotation (i.e. approximately one hour), and 13.2° of the lunar revolution around the Earth (i.e. approximately one day) cause the Earth's temperature to vary over the ranges of -1.295 to 1.163 , -0.404 to 0.3 , and -0.192 to $0.221\text{ }^{\circ}\text{C}$ with means of 0.634 , 0.069 , and $0.041\text{ }^{\circ}\text{C}$, respectively.

3.3. Contribution of planetary orbits to changes in Earth's temperature on interannual and longer time scale

We quantified changes in Earth's temperature induced by planetary orbits and CO_2 concentrations from 1837 to 2020 relative to year 1836 (Figure 12; see Section 2.4). Furthermore, we developed a hybrid forecast model based on LSTM and a spectral domain approach to forecast the effect of planetary orbits on Earth's temperature over 2021–2050 using historical values over 1837–2020 (Figure 12; see Section 2.5). Six conclusions can be drawn from this figure: (1) the influence of planetary orbits on Earth's temperature during 1837–2020 can be characterized by sinusoidal-like cycles of ~ 60 years, with a peak-to-trough amplitude of approximately $0.25\text{--}0.3\text{ }^{\circ}\text{C}$; (2) these cycles show a general declining trend from 1837 to 2050, implying that the warming effect of planetary orbits on the Earth's temperature is gradually decreasing; (3) planetary orbits warmed the Earth during 1840–1870, 1903–1945, and 1980 – present by ~ 0.27 , 0.19 , and $0.14\text{ }^{\circ}\text{C}$, respectively. On the other hand, they had an overall cooling effect during 1870–1903 and 1945–1980 of approximately 0.33 and $0.29\text{ }^{\circ}\text{C}$, respectively. This suggests that several oscillations in the global temperature data since 1836 are mainly caused by planetary orbital changes; (4) planetary orbits will generally cause the global temperature to increase by $\sim 0.13\text{ }^{\circ}\text{C}$ from 2020 to 2027 and decrease

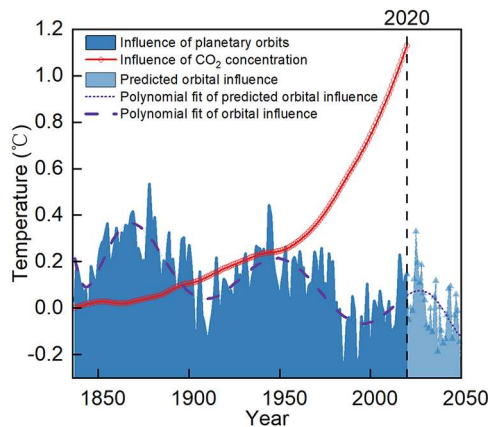


Figure 12. Earth's temperature changes due to changes in planetary orbits and CO_2 concentrations from 1837 to 2050 relative to 1836.

by ~ 0.25 °C from 2027 to 2050; (5) the warming effect of CO₂ was gradual before ~ 1950 , but it became rapid after ~ 1950 ; and (6) the increasing speed of CO₂ and the warming effect of Earth caused by it are higher than the impact of the change of the planetary orbits, and the temperature of the Earth will continue to rise in the future.

It should be noted that in the process of quantifying the effects of different planetary orbits (i.e. Earth's rotation, the Moon's revolution around Earth, Earth's revolution around the Sun and the common motion of the seven major planets) on changes in Earth's temperature, our model assumes that the effect of total solar radiative on Earth's temperature remains constant for two consecutive hours, two consecutive days, two consecutive sidereal months and two consecutive years, which can help us remove the effect of solar forcing change on Earth's temperature change (see Section 2.3). Early measurements of solar radiation lacked continuous high accuracy, which may have led to some solar-induced temperature changes being included in our estimates. However, it is crucial to note that the variation in solar radiation is at most 0.5% and approximately 0.1% over a few days and years, respectively. Consequently, the impact of these variations on consecutive changes in Earth's temperature is deemed negligible (Eddy, Gilliland, and Hoyt 1982). Therefore, this has little effect on our results, and we take the average of these consecutive estimates as the final estimate, which further reduces the error of the model estimate.

Furthermore, our analysis indicates that orbital forcings may trigger a cooling of approximately 0.25 °C over the next 30 years. However, this cooling effect remains smaller than the projected warming caused by anthropogenic CO₂ emissions, which is estimated to range between 0.3 and 1.0 °C over the same period, depending on future emission pathways and climate feedbacks (IPCC Cambridge University Press, 2013; IPCC Cambridge University Press, 2021; Rogelj, Meinshausen, and Knutti 2012; Rogelj et al. 2016). While our study highlights the potential influence of orbital forcings on Earth's temperature, it also underscores that such mechanisms are insufficient to counteract the warming driven by human activities. This study provides a systematic perspective on Earth's temperature variations and offers insights for predicting future climate trends.

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Disclosure statement

No potential conflict of interest was reported by the authors.

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Author contributions

KM designed the research. MC, KM, Bateni, JC, and Heggy contributed to the results analysis. All authors discussed the results and contributed to the writing of the paper.

Data availability statement

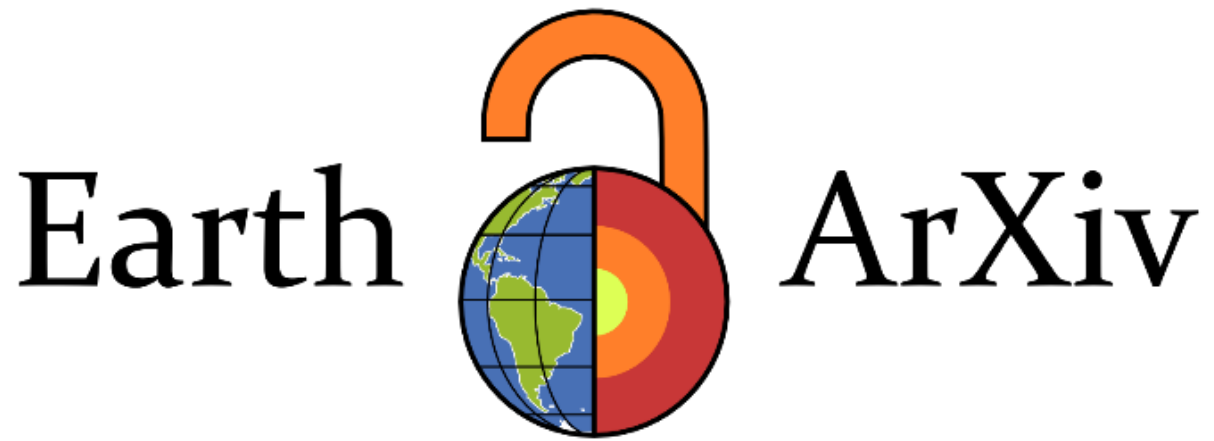
The data that support the findings of this study are openly available. Temperature data can be obtained from the website of the Climate Data Store (<https://cds.climate.copernicus.eu/cdsapp#!/dataset/reanalysis-era5-single-levels-monthly-means>). Daily atmospheric CO₂ concentration data were downloaded from the Scripps Institution of Oceanography archive (https://scrippsco2.ucsd.edu/data/atmospheric_co2/index.html). Daily lunar phase information was obtained from the Fourmilab Switzerland website (<http://www.fourmilab.ch/earthview/pacalc.html>). The daily LOD data were obtained from the Earth's orientation parameters provided by the International Earth Rotation (IERS) Rapid Service/Prediction Centre at the U.S. Naval Observatory (<https://www.iers.org/IERS/EN/DataProducts/EarthOrientationData/eop.html>). All codes are available at <https://doi.org/10.5281/z.enodo.7045240>.

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Evaluation and prediction of the Effects of Planetary Orbital Variations to Earth's Temperature Changes

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Declarations:

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Cover letter

Three years ago, we completed our research work on " Evaluation and prediction of the Effects of Planetary Orbital Variations to Earth's Temperature Changes", and then we submitted the paper to the journal Science, and later it was submitted to the journal Nature. We told the editors that this work is very valuable and meaningful, and will comprehensively promote our consideration of the impact of planet orbits in climate change research. They conducted multiple reviews and discussions, and finally suggested that we submit the paper to a professional journal. After we switched to several professional journals, the editors still couldn't find suitable reviewers. The reason is that the research direction we are currently conducting is a completely new direction. Although the editors invited over 50 reviewers from around the world, two of them gave high praise. Although few others gave negative reviews, they did not provide further comments or refuse to review this paper.

Although a little previous analyses have been conducted, this original work will comprehensively open up how we consider the impact of planetary orbit changes in climate change research, which will make this research a milestone. **Therefore, we have decided not to wait anymore because EarthArXiv provides a great platform for showcasing research that is highly innovative and difficult to recognize at the moment, promoting progress and communication in new research directions. In addition, we also conducted another original research "Influence and Prediction of Planetary Orbital Changes on Earth's Atmospheric Water Vapor Variations" . These two papers are as follows, and please provide guidance from you. Many thanks for them and for you.**

1. Cao M., Mao K., Sayed M. B., Chen J., Heggy E., Kug J., Shen X., Evaluation and prediction of the Effects of Planetary Orbital Variations to Earth's Temperature Changes, EarthArXiv, 2024, 12, DOI: <https://doi.org/10.31223/X52T56> .
2. Xu L., Mao K., Sayed M., Cao M, Dube T., Guo Z., Abiodun B., Yuan Z., Maaza M., Influence and Prediction of Planetary Orbital Changes on Earth's Atmospheric Water Vapor Variations, EarthArXiv, 2025, 1, DOI: <https://doi.org/10.31223/X5CM69> .

Keywords: Planetary Orbital Variations, Earth's Temperature Changes, Climate Change

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Evaluation and prediction of the Effects of Planetary Orbital Variations to Earth's Temperature Changes

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Abstract: Existing climate studies mainly assessed the effect of greenhouse gases and aerosols, among other forcings on Earth's temperature. None of them has not evaluated the effect of the planetary orbital changes on Earth's temperature. Here, we deconvolved the effects of greenhouse gases and planetary orbital changes on Earth's temperature and to forecast the latter at different time scales. Our results suggest that Earth's revolution and rotation prompted ~75.4% and 15.9% of the observed Earth's intra-annual temperature changes, while Moon's revolution and other planet motions accounted for 8.3% and 0.3%, respectively. Planetary orbits contributed to ~11.5% of global warming since 1837 and will continue to warm the Earth by ~0.13 °C from 2020 to 2027. However, planetary orbits may trigger ~0.25 °C of Earth's cooling from 2027 to 2050, which is still below the impact of CO₂ and will not be enough to reverse the warming trend in the short term. **The changes in Earth's temperature are determined by the orbital changes of planets and the impact of human activities. The changes in planetary orbits are beyond human control, so studying the impact of planetary orbit changes on Earth's temperature changes is crucial for the long-term development of humanity. This study has opened up a new research direction for climate change and is of milestone significance.**

Main Text: Changes in Earth's temperature (i.e., the average global temperature) govern the evolution of its climatic, biological and hydrologic conditions, which in turn define the planet habitability for both humans and organisms¹⁻⁴. Earth's temperature has risen by approximately 1.37 °C and 0.86 °C since 1836 and 1979, respectively, mostly attributed to the increase in greenhouse gases⁵⁻⁸. Six separate assessment reports from the United Nations (UN) Intergovernmental Panel on Climate Change (IPCC) during the last decades concluded that global warming is mainly driven by greenhouse gas emissions due to human activities⁹⁻¹⁴. Only the fifth and sixth IPCC reports quantified the human-induced contribution to the observed temperature change using long-term observational datasets and improved climate models.

The concentration of greenhouse gases in the atmosphere has risen monotonically since 1836, while Earth's temperature records show significant oscillations over the same period. Additionally,

the rise in Earth's temperature appears to be part of a long-term warming that began before the industrial era in the 17th century^{15,16}. Moreover, paleoclimate data from various sources (e.g., ice cores, deep-sea sediments, tree rings, pollen, corals and glaciers) demonstrate preindustrial temperature oscillations¹⁷⁻²². Taken together, these observations imply that the drivers of global warming are complex and that other factors can modulate the greenhouse gas effect.

Planetary orbital changes have been important drivers of temperature variation throughout Earth's evolution as they impact heat transfer from the sun to the upper atmosphere²³⁻²⁶. While these orbital changes are minor and account for a few centimeters per year^{23,24,26-28}, their integrated effect over the last 185 years on the changes in global temperature can be examined if we successfully deconvolve the augmentation caused by greenhouse gases. Unlike the steady increase in greenhouse gas concentrations in the atmosphere over the past 185 years that has continuously increased Earth's temperature, the effect of planetary orbits on Earth's temperature is complex. The external gravitational forces acting on the Earth during its revolution vary due to planetary geometry, ultimately perturbing the orbital geometry of Earth²⁶⁻²⁸. Some basic parameters of Earth's orbit, such as eccentricity, axial tilt, and the precession of equinoxes, vary cyclically, resulting in complex interactions among various components of the Earth's system and therefore periodically changes Earth's temperature^{27,29-31}. For example, Earth's temperature has different cycles of approximately 100000, 40000, 20000, 2100–2500, 1200–1800, 200, and 50–70 years, which are in phase with the cycles of gravitational perturbations induced by planets of the solar system, primarily Jupiter, Moon, Uranus, Neptune and Saturn^{28,31-36}. Therefore, their positive contribution can exacerbate anthropogenic warming of Earth. In contrast, a negative contribution of planetary orbits to Earth's temperature can attenuate human-induced warming for a short time-scale, causing oscillations in Earth's temperature. While existing studies have highlighted that the Earth's climate system is modulated by a number of astrodynamical phenomena³⁷⁻³⁹, they did not quantify the effect of the changes in planetary orbits on the Earth's temperature changes.

To address this deficiency in comprehensive assessment of Earth's temperature variation, we developed a conceptual framework to investigate the effect of different planetary orbits on Earth's temperature change from 1836 to 2020 for different time scales. For this purpose, we first eliminated the influence of greenhouse gases on the Earth's temperature and built several mathematical models that quantify the contribution of different planetary orbital variations to Earth's intra-annual temperature changes. A conceptual diagram showing the effect of different orbits on the Earth's intra-annual temperature is shown in Fig. 1. The Earth's rotation and the Moon's revolution around the Earth affect the temperature on the daily and lunar sidereal periods, respectively. Their influence on the Earth's intra-annual temperature is represented by the sinusoidal-like function f_1 and the irregularly changing function f_2 , respectively (see Fig. 1). Considering only the Earth-Sun system, the influence of the Earth's revolution around the Sun on the Earth's intra-annual temperature can be represented by the function f_3 in Fig. 1. The curves f_1 , f_2 , and f_3 are superimposed to find the simultaneous effects of Earth's rotation, Moon's revolution around Earth, and Earth's revolution around the Sun on Earth's temperature during each year.

The motions of the other seven major planets in the solar system (namely, Mercury, Mars, Jupiter, Saturn, Neptune, Venus and Uranus) have a subtle impact on the Earth's temperature on intra-annual and interannual time scales, as shown by the functions Z_1 – Z_7 in Fig. 1. Mathematically speaking, their influence on the Earth's temperature can be taken into account by superimposing the functions Z_1 – Z_7 on the curves f_1 – f_3 . Furthermore, we quantified the respective impacts of planetary orbital changes and CO₂ concentrations (the dominant greenhouse gas) on Earth's temperature changes on an interannual time scale by developing a robust mathematical model. In

addition, a hybrid model was developed based on the long short-term memory (LSTM) and spectral domain approaches to forecast the effect of planetary orbits on Earth's temperature. This study advances our understanding of the influence of planetary orbits and CO₂ concentrations on Earth's temperature over a wide range of time scales from hours to years. This understanding is of great importance for analyzing future climate change and assessing climate change mitigation policies and sustainable development practices.

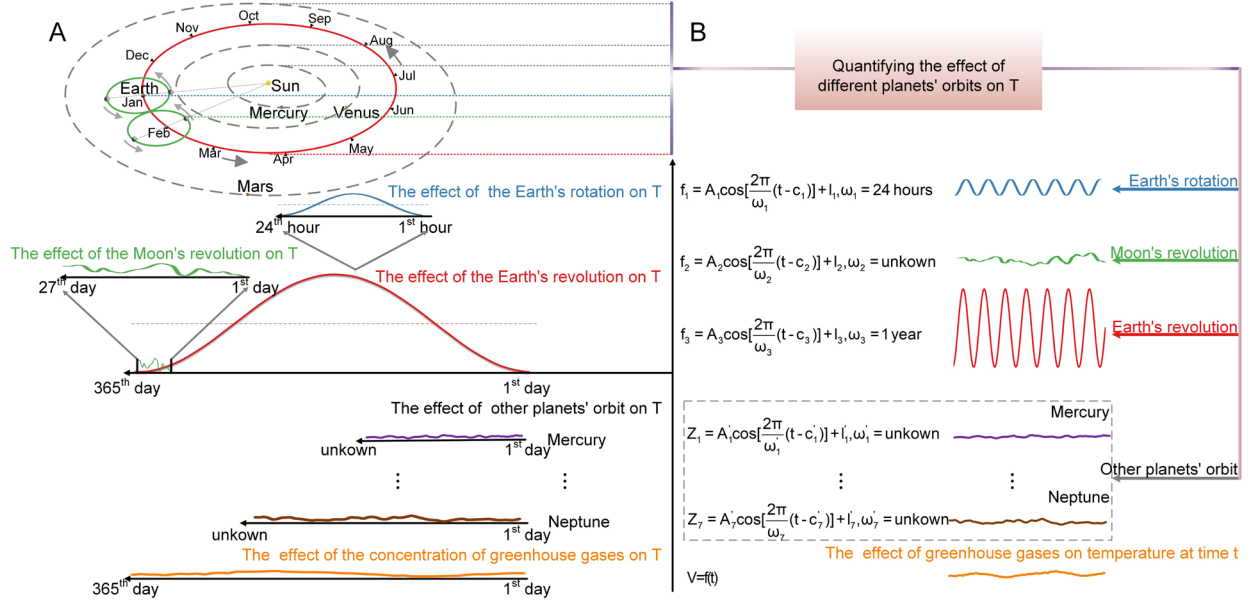


Fig. 1. A simplified diagram showing the effects of different planetary orbits on the Earth's temperature (T), which consists of two parts: (A) Physical based on our knowledge of the separation between the sun and the earth (B) the proposed mathematical method to quantify the effect of different planetary orbits on (A) and hence on the Earth's temperature.

Results

The physical response of Earth's temperature to different orbits

Our analyses reveal that the Earth's temperature variation over different time scales is related to the Earth's motion state (its revolution and rotation) and, to a lesser extent, the other planets' orbital motions. Since the variation of the solar-induced temperature is negligible during each Earth's rotation⁴⁰, the quasi-sinusoidal diurnal variation in Earth's temperature (Supplementary Fig. S1) is mainly due to the uneven distribution of land and sea on the Earth's surface causing a difference in surface albedo. The change in the Earth's temperature in two successive hours is due to the variations in the land temperature (see Section 1.1 in the Supplementary Materials for further details). By analyzing the temporal variations in daily lunar declination (δ), Earth-Moon distance, Earth's temperature and Earth's rotation data from 1979 to 2020 (Supplementary Fig. S4), it is found that lunar declination and Moon-Earth distance can indirectly influence Earth's temperature by affecting the speed of Earth's rotation (see Section 1.2 in the Supplementary Materials for more information). Additionally, the slow periodic changes in the solar declination and, to a much lesser extent, the Sun-Earth distance mainly cause seasonal and latitudinal variations in insolation, leading to changes in the Earth's temperature during a year (see Section 1.3 in the Supplementary Materials). In addition, the up and down swing of the Sun's position relative to the equatorial plane (caused by the revolution of the Earth) triggers the seasonal variation of the Earth's rotation in

each year (weak deceleration (72 days), strong acceleration (110 days), strong deceleration (109 days), and weak acceleration (66 days)), which also contributes to oscillations of the temperature difference between two successive days (Supplementary Fig. S4C). The Fourier transform analysis (Supplementary Table S1) of the annual mean Earth's temperature from 1836 to 2020 also shows that planetary motion may have indirectly impacted the interannual Earth's temperature by affecting Earth's orbit and velocity (Supplementary Section 1.4).

Contribution of planetary orbits to changes in Earth's temperature during the year

The developed mathematical model (see Section 1 in Methods) is merged with historical temperature data to determine the contribution of planetary orbits to Earth's intra-annual temperature changes. Fig. 2A shows that the orbital forcings (i.e., Earth's revolution around the Sun, Earth's rotation, Moon's revolution around the Earth and other planet motions) cause $\sim 99.79\%$ of the temperature change during the year (1979–2020), while the contribution attributable to other factors (e.g., changes in greenhouse gas concentrations, other human drivers due to aerosols, ozone and land-use change) is only approximately 0.21%. Earth's revolution, Earth's rotation, the Moon's revolution, and other planet motions contribute $\sim 75.36\%$, 15.91%, 8.26% and 0.26% to the intra-annual Earth's temperature change during 1979–2020, respectively (Fig. 2A). Fig. 2B shows the annual Earth's temperature variations due to different orbital forcings and other factors from 1979 to 2020. In this figure, temperature changes are color coded based on their kernel density. The observed maximum annual temperature change (i.e., the difference in the maximum and minimum hourly temperatures in that year) from 1979 to 2020 is approximately 4.73–5.46 °C, with a mean of 5.06 °C. The ranges of temperature variations induced by the Earth's revolution, Earth's rotation, the Moon's revolution, and the motion of the planets are 3.56–4.15, 0.78–0.82, 0.36–0.47, and -0.25–0.23 °C, respectively, with means of 3.81, 0.81, 0.41 and 0.01 °C (Fig. 2B). The total temperature changes due to other factors (e.g., changes in greenhouse gas concentrations, other human-related drivers including aerosols, ozone and land-use change) are ~ 0.01 °C (Fig. 2B).

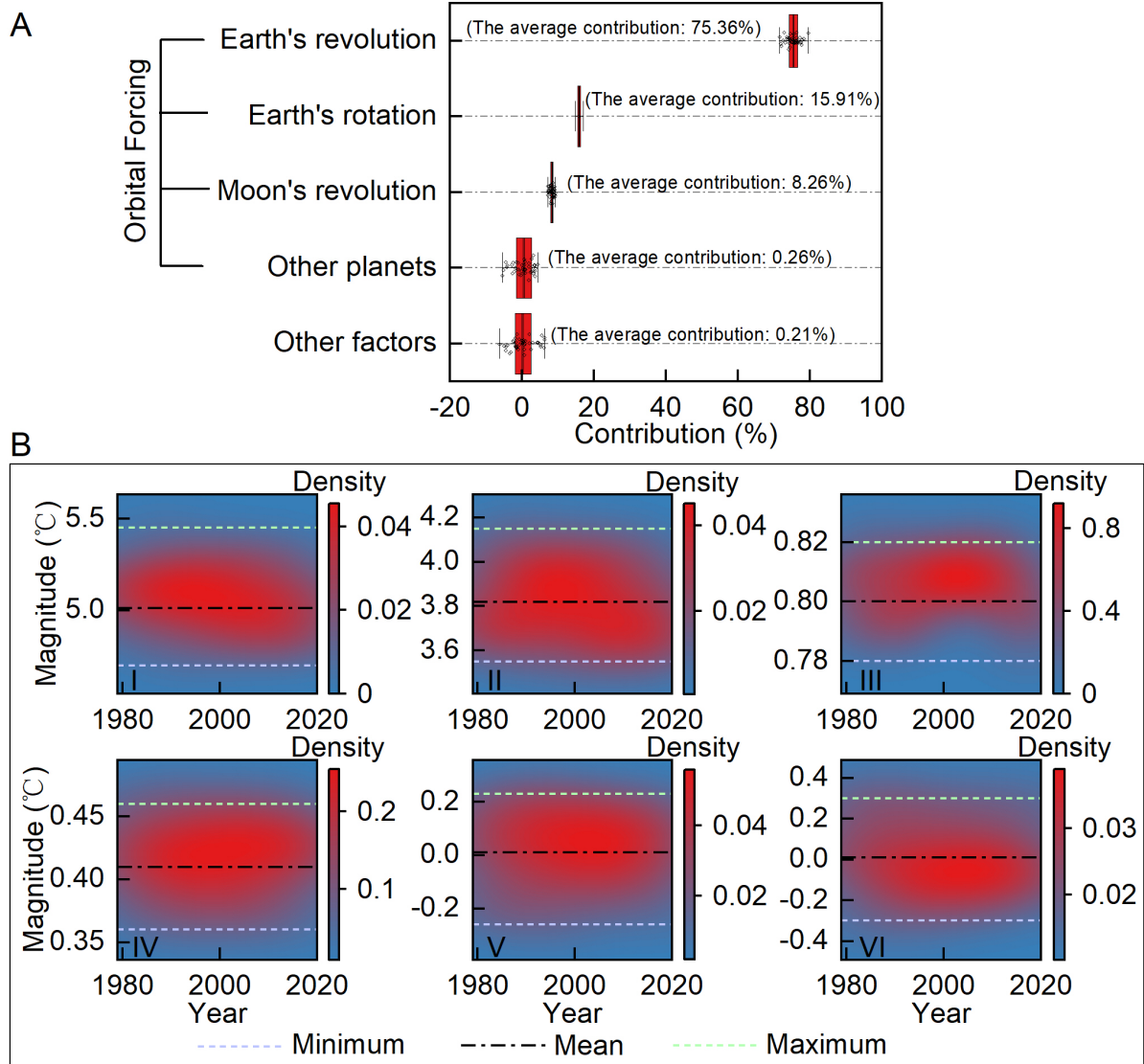


Fig. 2. (A) Boxplot of the contributions of various planetary orbits and other factors (e.g., changes in greenhouse gas concentrations, other human-related drivers including aerosols, ozone and land-use change) to the Earth's intra-annual temperature changes during 1979–2020 (boxplot: middle line, median; box, interquartile range (IQR); whiskers, 1.5xIQR). (B) The magnitude of the annual Earth's temperature variations in response to (II) Earth's revolution, (III) Earth's rotation, (IV) Moon's revolution, (V) other planets, and (VI) other factors from 1979 to 2020, and (I) is the observed maximum Earth's annual temperature change over the period 1979–2020. The Earth's temperature changes in each plot are color coded based on their kernel density. The dashed blue, black, and green colors represent the minimum, mean, and maximum of Earth's temperature changes.

Based on our developed mathematical model, every 26.8° of the Earth's orbit around the Sun (i.e., approximately one sidereal month), 15° of the Earth's rotation (i.e., approximately one hour), and 13.2° of the lunar revolution around the Earth (i.e., approximately one day) cause the Earth's temperature to vary over the ranges of -1.295 – 1.163 , -0.404 – 0.3 , and -0.192 – 0.221°C with means of 0.634 , 0.069 , and 0.041°C , respectively.

Contribution of planetary orbits to changes in Earth's temperature on an interannual scale

We quantified the contribution of planetary orbits and CO₂ concentrations to Earth's temperature changes from 1837 to 2020 using the year 1836 as the benchmark (Fig. 3A). The contribution of planetary orbits to the interannual variations in Earth's temperature was dominant (more than 50%) before 1920, with the highest value of 97.6% in 1837. On the other hand, interannual changes in the Earth's temperature were mainly controlled by the increase in CO₂ concentration after 1920, especially in the last two decades. Notably, the contribution of CO₂ to Earth's warming from 2000–2020 was approximately 86% (see Section 2 in Methods).

Figure 3B compares the influence of planetary orbits on the Earth's temperature with that of the CO₂ concentration from 1837 to 2020. We developed a hybrid forecast model based on LSTM and a spectral domain approach to forecast the effect of planetary orbits on Earth's temperature over 2021–2050 using historical values over 1837–2020 (Fig. 3B; see Section 3 in Methods). Five conclusions can be drawn from this figure: (1) the influence of planetary orbits on the Earth's temperature during 1837–2020 can be characterized by sinusoidal-like cycles of ~60 years, with a peak-to-trough amplitude of approximately 0.25–0.3 °C; (2) These cycles show a general declining trend from 1837 to 2050, implying that planetary orbits have a cooling effect on the Earth over more than two centuries; (3) Planetary orbits generally warmed up the Earth during 1840–1870, 1903–1945, and 1980–present by ~0.27, 0.19, and 0.14 °C, respectively. On the other hand, they had an overall cooling effect during 1870–1903 and 1945–1980 of approximately 0.33 and 0.29 °C, respectively; (4) Planetary orbits will generally cause the global temperature to increase by ~0.13 °C from 2020 to 2027 and decrease by ~0.25 °C from 2027 to 2050; and (5) The warming effect of CO₂ was gradual (almost linear) before ~1950, but it became rapid (almost exponential) after ~1950.

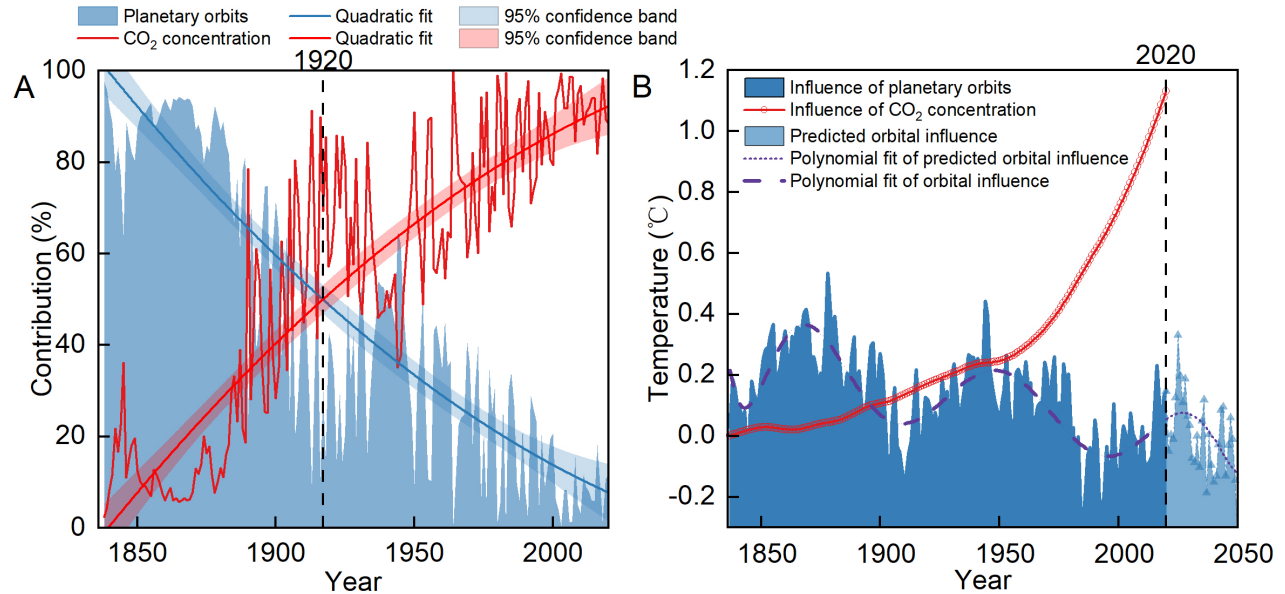


Fig. 3. (A) The contribution of planetary orbits and CO₂ concentrations to Earth's temperature changes from 1837 to 2020 using 1836 as the benchmark. (B) Earth's temperature changes due to changes in planetary orbits and CO₂ concentrations from 1837 to 2020 and values of Earth's

temperature change from 2020 to 2050 obtained using the forecast model developed based on the LSTM and spectral domain methods.

It should be noted that in the process of quantifying the effects of different planetary orbits (i.e., Earth's rotation, lunar revolution, Earth's revolution and the common motion of the seven major planets) on changes in Earth's temperature, our model assumes that the effect of total solar radiative output on Earth's temperature remains constant for two consecutive hours, two consecutive days, two consecutive sidereal months and two consecutive years, which can help us remove the effect of solar forcing change on Earth's temperature change. Although the lack of successive accurate measurements of solar radiation in the early days will inevitably lead to partial inclusion of solar-induced temperature changes in our estimates, variation of solar radiation is at most 0.5% and ~0.1% in a few days and a few years, respectively, so their effects on successive changes in Earth's temperature are very small⁴⁰. Therefore, this has little effect on our model, and we take the average of these consecutive estimates as the final estimate, which further reduces the error of the model estimate.

Furthermore, according to the CO₂-induced temperature change trend in Fig. 3B, if human beings do not take appropriate measures, the Earth's temperature will rise by approximately 0.43 °C (based on the impact of CO₂ on the Earth's temperature from 1837 to 2020) or even by 1.2 °C (based on the impact of CO₂ on the Earth's temperature from 1950 to 2020) over the next 30 years. In addition, temperature projections by the end of the 21st century under four RCPs (i.e., RCP2.6, RCP4.5, RCP6.0 and RCP8.5) and five illustrative scenarios (i.e., SSP1-1.9, SSP1-2.6, SSP2-4.5, SSP3-7.0 and SSP5-8.5) show that global surface temperature will continue to increase until at least mid-century^{12,13}. Among them, the warming rate is the largest under the highest emission scenario (i.e., RCP8.5 and SSP5-8.5), which is projected to warm at a rate greater than 0.3 °C per decade in 2020-2100^{12,13,41}. Even under the very low emissions scenario considered (RCP2.6 and SSP1-1.9), a further warming of about 0.15 °C per decade would be expected over the next three decades (2020-2050)^{12,13,42}. While our results suggest that the planet's orbit will trigger a maximum cooling of the Earth by approximately 0.32 °C over the next 30 years, it will not be enough to reverse the warming trend. This research and analysis can help us more systematically understand Earth's temperature change and develop carbon reduction measures, thereby helping humanity effectively control temperature change to below 2 °C or even 1.5 °C in the 21st century. **The changes in Earth's temperature are determined by the orbital changes of planets and the impact of human activities. The changes in planetary orbits are beyond human control, so studying the impact of planetary orbit changes on Earth's temperature changes is crucial for the long-term development of humanity. This study has opened up a new research direction for climate change and is of milestone significance.**

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Methods:

1) Quantifying the intra-annual contribution of planetary orbits to changes in Earth's temperature

1.1) Model specification

The temporal variations in Earth's temperature are mainly driven by the Earth's revolution and rotation. The temporal variations in Earth's temperature also differ from cycle to cycle (including diurnal and annual cycles) due to the changes in the position of the Moon and other planets relative to the Earth. To quantify the contribution of different planetary orbits to the Earth's temperature, we developed a function describing the influence of different orbits on the Earth's temperature over time. We performed a Fourier series analysis of the hourly temperature records, which showed that 1) the amplitude to range ratio (A/R) of the first few harmonic terms is nearly constant over the entire annual range, and 2) the sum of A/R for the 24'-h and 365'-d terms exceeds 0.87.

It is evident that the variations in the Earth's temperature during a year are mainly dependent on the rotation and revolution of the Earth. The departure from 0.87 is indicative of the influence of other factors on the variation in Earth's temperature. This suggests that (1) a unit curve, $X(t)$, can be used to derive the annual variation in temperature, whose duration depends on the temporal variability of the Earth's revolution, and (2) the annual cycle unit curve ($X(t)$) can consist of a series of functions describing the effect of different orbits on the Earth's temperature perturbations.

$$X(t) = f_1(t) + f_2(t) + f_3(t) + Z(t) \quad (1)$$

where $X(t)$ represents the transformed influence of all planetary orbits on the change in Earth's temperature at time t . The transformed influence is the influence value divided by the range, and the ranges in the section refer to the difference of the maximum and minimum hourly temperatures in a year, $T_{max} - T_{min}$, unless otherwise indicated. $X(t)$ was then determined by the summation of four functions, i.e., f_1 , f_2 , f_3 , and Z . $f_1(t)$, $f_2(t)$ and $f_3(t)$ represent the transformed influence of Earth's rotation, lunar revolution and Earth's revolution on Earth's temperature changes at time t , respectively. $Z(t)$ denotes the transformed effect of the orbits of the other seven planets (namely, Mercury, Mars, Jupiter, Saturn, Neptune, Venus and Uranus) in the solar system on the change in the Earth's temperature at time t .

$f_1(t)$ and $f_3(t)$ can be obtained by dividing the influence of Earth's rotation and revolution on Earth's temperature on shorter time scales within the annual temperature cycle by the range. The motion of the Earth (i.e., rotation and revolution) and its impact on the Earth's temperature are all periodic. The Fourier series analysis of hourly temperature data revealed that the amplitudes of the harmonic terms corresponding to the rotation and revolution period times are nearly constant. Thus, functions composed of harmonic terms can be used to describe the effects of Earth's rotation and Earth's revolution on changes in Earth's temperature during a year.

$$f_1(t) = \frac{E_m^n}{T_{max}-T_{min}} \cos \left[\frac{2\pi}{\omega_1} (t_l - h_m^n) \right] + \frac{r_m^n}{T_{max}-T_{min}} \quad (2)$$

$$f_3(t) = \frac{A_3}{T_{max}-T_{min}} \cos \left[\frac{2\pi}{\omega_3} (t - c) \right] + \frac{q}{T_{max}-T_{min}} \quad (3)$$

where t_l represents the t_l -th hour of the m th day of the n th sidereal month, and t is the hour of the year. E_m^n and A_3 are the harmonic amplitudes (which can be obtained by a Fourier series analysis), r_m^n and q are the exponential terms, and h_m^n and c are the optional phase shifts for $f_1(t)$ and $f_3(t)$, respectively. To improve the convergence of $f_1(t)$ and $f_3(t)$, *a priori* knowledge about the hours

of their motion is needed. The widths ω_1 and ω_3 in the cosine terms are determined by the hours in which they complete their periodic motions.

Given the physical continuity of Earth's temperature, the influence functions of Earth's rotation and revolution on the temperature (i.e., $f_1(t)$ and $f_3(t)$) are presumed to be continuous in all instances, including the junction time between two diurnal cycles (t_{l^0}) and the junction time between two consecutive years (t_0). Herein, we evaluate the continuity of the influence functions of the Earth's rotation ($f_1(t)$) and Earth's revolution ($f_3(t)$). $f_1(t)$ for Days m and $m+1$ can be expressed as:

$$f_1^m(t) = \frac{E_m^n}{T_{max}-T_{min}} \cos \left[\frac{2\pi}{\omega_1} (t_l - h_m^n) \right] + \frac{r_m^n}{T_{max}-T_{min}} \quad (4)$$

$$f_1^{m+1}(t) = \frac{E_{m+1}^n}{T_{max}-T_{min}} \cos \left[\frac{2\pi}{\omega_1} (t_l - h_{m+1}^n) \right] + \frac{r_{m+1}^n}{T_{max}-T_{min}} \quad (5)$$

For $f_1(t)$ to be continuous at the junction time between two diurnal cycles (t_{l^0}), the following two constraints should be fulfilled:

$$f_1^m(t)|_{t=t_{l^0}} = f_1^{m+1}(t)|_{t=t_{l^0}} \quad (6)$$

$$\left(\frac{\partial f_1^m(t)}{\partial t} \right) |_{t=t_{l^0}} = \left(\frac{\partial f_1^{m+1}(t)}{\partial t} \right) |_{t=t_{l^0}} \quad (7)$$

Substituting Equations (4) and (5) into (6) and their derivatives into (7) leads to:

$$E_{m+1}^n = \frac{E_m^n \sin \left[\frac{2\pi}{\omega_1} (t_{l^0} - h_m^n) \right]}{\sin \left[\frac{2\pi}{\omega_1} (t_{l^0} - h_{m+1}^n) \right]} \quad (8)$$

$$r_{m+1}^n = E_m^n \cos \left[\frac{2\pi}{\omega_1} (t_{l^0} - h_m^n) \right] + r_m^n - E_{m+1}^n \cos \left[\frac{2\pi}{\omega_1} (t_{l^0} - h_{m+1}^n) \right] \quad (9)$$

Equation (8) allows us to obtain E_{m+1}^n in terms of E_m^n . Similarly, Equation (9) relates r_{m+1}^n to r_m^n . A multiday continuous $f_1(t)$ model can be obtained by substituting (8) and (9) into (5). The total number of free parameters in the function $f_1(t)$ for Day m ($m \geq 2$) is $m+1$ (i.e., r for the first day and h_1^n to h_m^n), and these free parameters are estimated with the Levenberg–Marquardt minimization algorithm with a universal global optimization scheme⁴³. E and r for each day (except the first day) are calculated from (8) and (9), respectively.

Analogously, the function $f_3(t)$ must be continuous in all instances, including the junction time between two consecutive years (t_0). $f_3(t)$ for years i and $i+1$ can be expressed as:

$$f_3^i(t) = \frac{A_3^i}{T_{max}^i - T_{min}^i} \cos \left[\frac{2\pi}{\omega_3^i} (t - c^i) \right] + \frac{q^i}{T_{max}^i - T_{min}^i} \quad (10)$$

$$f_3^{i+1}(t) = \frac{A_3^{i+1}}{T_{max}^{i+1} - T_{min}^{i+1}} \cos \left[\frac{2\pi}{\omega_3^{i+1}} (t - c^{i+1}) \right] + \frac{q^{i+1}}{T_{max}^{i+1} - T_{min}^{i+1}} \quad (11)$$

For $f_3(t)$ to be continuous at the junction time between two annual cycles (t_0), the following two constraints should be fulfilled:

$$f_3^i(t)|_{t=t_0} = f_3^{i+1}(t)|_{t=t_0} \quad (12)$$

$$\left(\frac{\partial f_3^i(t)}{\partial t} \right) |_{t=t_0} = \left(\frac{\partial f_3^{i+1}(t)}{\partial t} \right) |_{t=t_0} \quad (13)$$

Substituting Equations (10) and (11) into (12) and their derivatives into (13) leads to:

$$A_3^{i+1} = \frac{A_3^i \sin \left[\frac{2\pi}{\omega_3^i} (t_0 - c^i) \right]}{\sin \left[\frac{2\pi}{\omega_3^{i+1}} (t_0 - c^{i+1}) \right]} \quad (14)$$

$$q^{i+1} = A_3^i \cos \left[\frac{2\pi}{\omega_3^i} (t_0 - c^i) \right] + q^i - A_3^{i+1} \cos \left[\frac{2\pi}{\omega_3^{i+1}} (t_0 - c^{i+1}) \right] \quad (15)$$

A multiyear continuous $f_3(t)$ model can be obtained by substituting (14) and (15) into (11). The total number of free parameters in the function $f_3(t)$ for year i ($i \geq 2$) is $i+1$ (i.e., q for the first year and c^1 to c^i), and these free parameters are estimated with the Levenberg–Marquardt minimization algorithm with a universal global optimization scheme⁴³. A_3 and q for each year (except the first year) are calculated from (14) and (15), respectively.

$f_2(t)$ is obtained by dividing the influence of the lunar revolution on the Earth's temperature by the range. In each sidereal month, the Moon affects the Earth's temperature by different physical processes, namely, the magnetic force, lunar phase changes, orbital oscillations, reflections, and infrared emissions from the Moon's surface. It is worth mentioning that these processes have different cycles. In addition, the Earth-Moon system moves around the Sun, while the Moon orbits the Earth. Such a complex system induces different feedbacks in the Earth system. Therefore, the influence of the Moon's orbit on the Earth's temperature is irregular and varies among revolution periods, which makes it extremely difficult to find an appropriate function to express the influence of the Moon on the Earth's temperature.

As explained in Supplementary Sections 1.2 and 1.3, the temperature changes in two successive days are mainly driven by the revolution of the Earth and Moon. Therefore, the temperature difference (D2) between two subsequent days can be inferred by taking the derivative of the sum of the functions that describe the influence of the revolution of the Earth and Moon on the Earth's temperature change, i.e., $D2 = \frac{d(f_2+f_3)}{dt}$. It is evident that the influence of the Moon's orbit on the Earth's temperature (y) can be calculated by subtracting the influence of Earth's revolution (see Equation 3) from the antiderivative function (F) of $D2$ as follows:

$$F(t) = \frac{d}{dt} \left[\int (f_2(t) + f_3(t)) dt \right] + C = \int D2(t) dt + C \quad (16)$$

$$y_n(t_s) = F_n(t_s) - [A_3 \cos \left[\frac{2\pi}{\omega_3} (t - c) \right] + q] \quad (17)$$

where C is a constant, n represents the n -th sidereal month, and t_s represents the t_s -th hour of the n -th sidereal month.

The function $f_2(t)$ for the n -th sidereal month of the i -th year is calculated by dividing the influence of the Moon's orbit on the Earth's temperature (y) by the range:

$$f_2(t)_n^i = \frac{y_n(t_s)}{T_{max} - T_{min}} \quad (18)$$

$Z(t)$ can be calculated by dividing the influence of the abovementioned seven planets in the solar system on Earth's temperature during a year by the range. The influence of the seven planets on Earth's temperature can be determined by a physical function that depends on the orbits of the planets and their positions. However, it is difficult to build such a function because the physical mechanisms that relate the motion of a single planet to Earth's temperature still need to be further investigated, even though the movement of each planet can be strictly calculated. In addition, the lack of sufficient data and the complexity of the physical processes linking the Earth's temperature to the entire planetary system limit the determination of this function²⁸.

On the other hand, the impacts of the Earth's revolution, lunar revolution and Earth's rotation on Earth's temperature occur periodically on a subannual timescale, and their cumulative effects on Earth's temperature changes are roughly similar in each cycle. The effect of solar forcing and the

change in CO₂ concentration in two consecutive years on Earth's temperature is negligible, and seven planetary orbits mainly affect Earth's temperature on interannual or even longer time scales^{27,28,40}. Hence, it is hypothesized that changes in the Earth's temperature between two consecutive years arise from the abovementioned seven planets in the solar system. Having said that, $Z(t)$ for year i can be calculated by normalizing the difference of Earth's temperatures in that year and the previous year by the difference of the maximum and minimum hourly temperatures in that year as follows:

$$Z(t)^i = \frac{MT^i - MT^{i-1}}{(T_{max}^i - T_{min}^i)} \quad (19)$$

where MT^i and MT^{i-1} are the mean temperatures of the Earth in years i and $i - 1$, respectively. T_{max}^i and T_{min}^i are the maximum and minimum hourly temperatures of year i , respectively.

This study defines that the contribution of different orbits to the annual Earth's temperature perturbations is equal to the annual temperature variation caused by different orbits divided by the maximum annual temperature variation. Therefore, the contributions of Earth's rotation and revolution to the intra-annual fluctuation of Earth's temperature are calculated by dividing the magnitude of intra-annual temperature variations caused by each of them by the highest annual temperature change (see Eqs. 20–21).

$$g_1^i = \frac{\frac{1}{h} \sum_{n=1}^k \sum_{m=1}^j (E_m^n)}{T_{max}^i - T_{min}^i} \quad (20)$$

$$g_3^i = \frac{A_3^i}{T_{max}^i - T_{min}^i} \quad (21)$$

where g_1^i and g_3^i are the contributions of Earth's rotation and revolution to the annual Earth temperature variation in year i , respectively. k is the number of sidereal months in year i , j is the number of days in the n -th sidereal month, and h is the total number of days in year i .

The normalized intra-annual temperature variation caused by lunar revolution is given by

$$g_2^i = \frac{\frac{1}{k} \sum_{n=1}^k (y_{max}^n - y_{min}^n)}{ET_{max}^i - ET_{min}^i} \quad (22)$$

where g_2^i is the contribution of the lunar revolution to the annual Earth's temperature variation in year i and k is the number of sidereal months in year i . y_{max}^n and y_{min}^n are the maximum and minimum y (the influence of the Moon's orbit on the Earth's temperature) in the sidereal month n , respectively.

The contribution (g_z) of the orbits of other planets in the solar system to the changes in the Earth's temperature during a year is numerically equal to the transformed influence ($Z(t)$).

$$g_z^i = Z(t)^i \quad (23)$$

where g_z^i is the contribution in year i of the orbits of other planets in the solar system to the change in the Earth's temperature during a year.

1.2) Combination of the model from Section 1.1 and historical temperature data

$f_1(t)$ quantifies the influence of Earth's rotation on its intra-annual temperature variation. Building on Section 1.1 of the Supplementary Materials, the quasi-sinusoidal diurnal variation in Earth's temperature (Supplementary Fig. S1) is mainly due to its rotation. We calculated the temperature difference (D1) of two consecutive hours for each day from 1979 to 2020. A remarkable agreement is found between the D1 values of two consecutive days. For example, the D1 values for January 1 and 2 from 1979-2020 are shown in Extended Data Fig. 1. These results indicate that the variation

in D1 is mainly determined by the rotation of the Earth. Therefore, the changes in D1 can be used to quantify the impact of Earth's rotation on the global temperature in consecutive hours, which can be inferred by taking the derivative of the function $f_1(t)$. The derivative of $f_1(t)$ is fitted to the time series of D1 by using the Levenberg–Marquardt scheme to obtain its unknown parameters.

$f_2(t)$ quantifies the influence of the lunar revolution on the intra-annual Earth's temperature variations. The changes in CO₂ concentration for two consecutive days have almost no effect on the Earth's temperature. Thus, we can determine the change in Earth's temperature over two consecutive days (due the motion of the Moon) by using Equations (16) – (18). To eliminate the impact of large variations in CO₂ concentration in two successive days on temperature, we utilized only D2 values for days in which the CO₂ concentration was relatively stable.

The changes in the Earth's temperature during each year can be attributed to the variations in solar radiation absorbed by the land and the speed of the Earth's rotation, which are induced by the Earth's revolution to a certain extent (Supplementary Section 1.3). Thus, the intra-annual temperature change can be used to quantify the contribution of the Earth's revolution to the temperature. Additionally, the results of the Supplementary Materials (Section 1.2) show that the influence of the Moon's movement on the intra-annual temperature changes is not negligible. Since the Moon orbits the Earth once per sidereal month, we can reasonably assume that the Moon's effect on Earth's temperature changes is approximately similar in each month. The sidereal monthly Earth's temperature averaged over the study period (1979–2020) is compared with the corresponding solar declination (Extended Data Fig. 2A). Extended Data Fig. 2B shows the scatterplot of the mean sidereal monthly Earth's temperature versus the corresponding solar declination for each sidereal month during the study period. It was found that the solar declination had a stronger correlation with the mean sidereal monthly temperature (with an R^2 of 0.928) than the daily temperature (with an R^2 of 0.786 (Supplementary Fig. S5)). This further suggest that the variation in the mean sidereal monthly temperature is driven by Earth's revolution.

The CO₂ concentration in two successive sidereal months is almost constant. Therefore, the temperature difference of consecutive sidereal months (D3) can be used to quantify the impact of the Earth's revolution on temperature. To further exclude the influence of CO₂ on temperature, we used only the D3 values of sidereal months with stabilized CO₂ concentrations. The function $f_3(t)$ quantifies the influence of Earth's revolution on the intra-annual variations in Earth's temperature, whereas D3 can be inferred by taking the derivative of the function $f_3(t)$. It is evident that the derivative of $f_3(t)$ can be fitted to the time series of D3 by using the Levenberg–Marquardt scheme to obtain its unknown parameters.

$Z(t)$ quantifies the influence of all planets in the solar system on the intra-annual variations in Earth's temperature. To eliminate the influence of CO₂ changes on variations in the Earth's temperature, we considered the temperature difference of two successive years in which the CO₂ concentration was almost unchanged.

2) Quantifying the contribution of planetary orbits to changes in Earth's temperature on an interannual scale

In this study, the variation in Earth's temperature at various time intervals can be defined by Equation 24:

$$T_{i+s} - T_i = P_{i+s,i} + V_{i+s,i} \quad (24)$$

where $T_{i+s} - T_i$ is the temperature difference between years $i+s$ and i , and $P_{i+s,i}$ and $V_{i+s,i}$ are the effects of planetary orbits and greenhouse gases on changes in Earth's temperature between years $i+s$ and i , respectively.

Ample physical evidence shows that CO₂ is the most important gas for controlling Earth's temperature⁶. On the other hand, it is difficult to obtain the records of other greenhouse gases before 1979. Hence, we equate Earth's temperature change caused by other greenhouses with the effect of CO₂. Equation 24 can be rewritten as 25 based on the near-linear relationship between CO₂ and Earth's temperature change¹³.

$$T_{i+s} - T_i = P_{i+s,i} + dV_{i+s,i} \times v \quad (25)$$

where $dV_{i+s,i}$ is the difference in CO₂ concentration between years $i+s$ and i . v is the value of the Earth's temperature change caused by 1 ppm CO₂.

If the effect of a unit change in CO₂ concentration (v) on the Earth's temperature is obtained, we can accurately quantify the effect of planetary orbits on Earth's temperature change using Equation 25. The estimates from Equation 19 show that the effect of planetary orbits (Z) on the Earth's temperature in different years is small and irregular, ranging from -0.3 °C to 0.26 °C (Extended Data Fig.3). Therefore, it is assumed that the effects of the planet's orbit on the Earth's temperature at various time intervals ($P_{i+s,i}$) can be equal to the mean (\bar{Z}) derived from Z during the study period (1836–2020).

$$\bar{Z} = \frac{\sum_{i=1}^n |Z_i|}{n} \quad (26)$$

$$P_{i+s,i} = \bar{Z} \quad (27)$$

where Z_i denotes the effect of planetary orbits on Earth's temperature change between years $i+1$ and i , which can be obtained from Equation 19. n is the number of Z_i . Then, we can calculate the effect ($v_{i+s,i}$) of 1 ppm CO₂ on temperature at various time intervals by Equation 28.

$$v_{i+s,i} = \frac{T_{i+s} - T_i - \bar{Z}}{dV_{i+s,i}} \quad (s \in [2, 184], i \in [1836, 2020 - s]) \quad (28)$$

To further improve the estimation accuracy, the mean (\bar{v}) of $v_{i+s,i}$ is utilized to approximate the effect (v) of a 1 ppm increase in CO₂ concentration on the global temperature change. In this way, we obtain the effect of a unit change in CO₂ concentration on the Earth's temperature, and then the effect of planetary orbits on the Earth's temperature ($P_{i+s,i}$) between years $i+s$ and i can be obtained via

$$P_{i+s,i} = T_{i+s} - T_i - dV_{i+s,i} \times \bar{v} \quad (29)$$

where \bar{v} is the optimal approximation of the real effect of 1 ppm CO₂ on global temperature change, which is obtained by calculating the average value of all $v_{i+s,i}$.

Finally, the contribution of planetary orbitals (I_o) and CO₂ (I_c) to Earth's temperature change can be obtained by

$$I_o = \frac{|P_{i+s,i}|}{|P_{i+s,i}| + dV_{i+s,i} \times \bar{v}} \quad (30)$$

$$I_c = 1 - I_o \quad (31)$$

Based on the mathematical model, we can quantify the contribution of planetary orbits to changes in Earth's temperature on an inter-annual scale. Robustness tests of the model show that the estimates of the effect of planetary orbits on the Earth's temperature changes from our model have high confidence (Supplementary Section 3).

3) Forecasting the effect of planetary orbits on Earth's temperature from 2021–2050

To further predict the effect of planetary orbit changes (P) on the Earth's temperature, we constructed a hybrid forecast model based on long short-term memory (LSTM)^{44,45} and spectral domain approaches (i.e., Fast Fourier transform (FFT) and multitaper (MTM) methods)⁴⁶, which can overcome the defect that LSTM based on the recursive strategy is very sensitive to the accumulation of errors with the forecasting horizon. The hybrid forecast model uses the P reconstructed by the spectral domain method as the input value of the LSTM method and waveform change feature of the predicted P value (2020-2050) determined by the spectral domain approach to improve the accuracy of LSTM model P forecasting from 2021–2050.

Extended Data Fig. 4 shows the architecture of the proposed hybrid forecast model based on LSTM and the spectral domain approach. We chose a rolling prediction scheme for the hybrid forecast model. In this scheme, the spectral domain method is initially applied to reconstruct P from 1837 to 2020 and predict P from 2021 to 2050 (Supplementary Section 4). Next, the LSTM model (Supplementary Section 5) is trained to find a pattern between the P at time t_i and the input sequence values of its 53 preceding moments at times t_{i-1} , t_{i-2} , and t_{i-53} (also called a time window) using input sequence $[P, \hat{P}^F, \hat{P}^M]$, where P is the historical P values during 1837–2020, and \hat{P}^F and \hat{P}^M are the P values during 1837–2020 from the FFT and MTM methods, respectively. The future prediction is determined based on the input sequence values in its preceding 53 moments using the identified patterns. Then, their predictions on each horizon are combined to produce the final prediction. The final prediction is used as the latest element of the input sequence to update the sequence, which is further used to predict one more year ahead P . By repeating this process, k-year-ahead predictions can be achieved. Finally, we predicted the P from 2021 to 2050, as shown in Fig. 3B.

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10 **Author contributions:** KM designed the research. MC and KM developed the methodology. MC, KM, Bateni, JMC, Heggy, JSK and XS contributed to the results analysis and discussion. MC, KM, Bateni, JC and Heggy drafted the manuscript, and all authors revised the manuscript.

Competing interests: The authors declare no competing financial interests.

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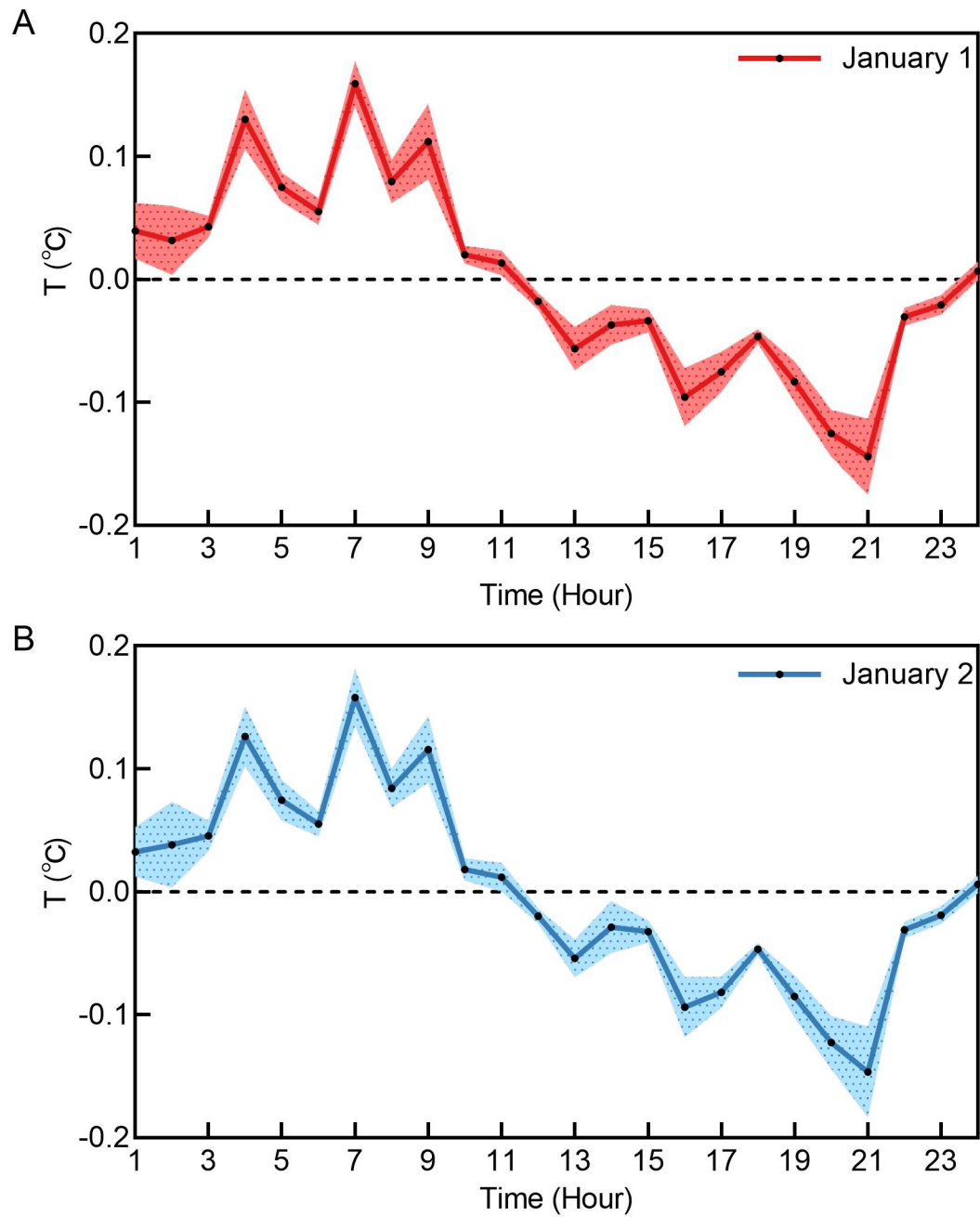
15 **Supplementary Materials**

Supplementary Text

Figs. S1 to S10

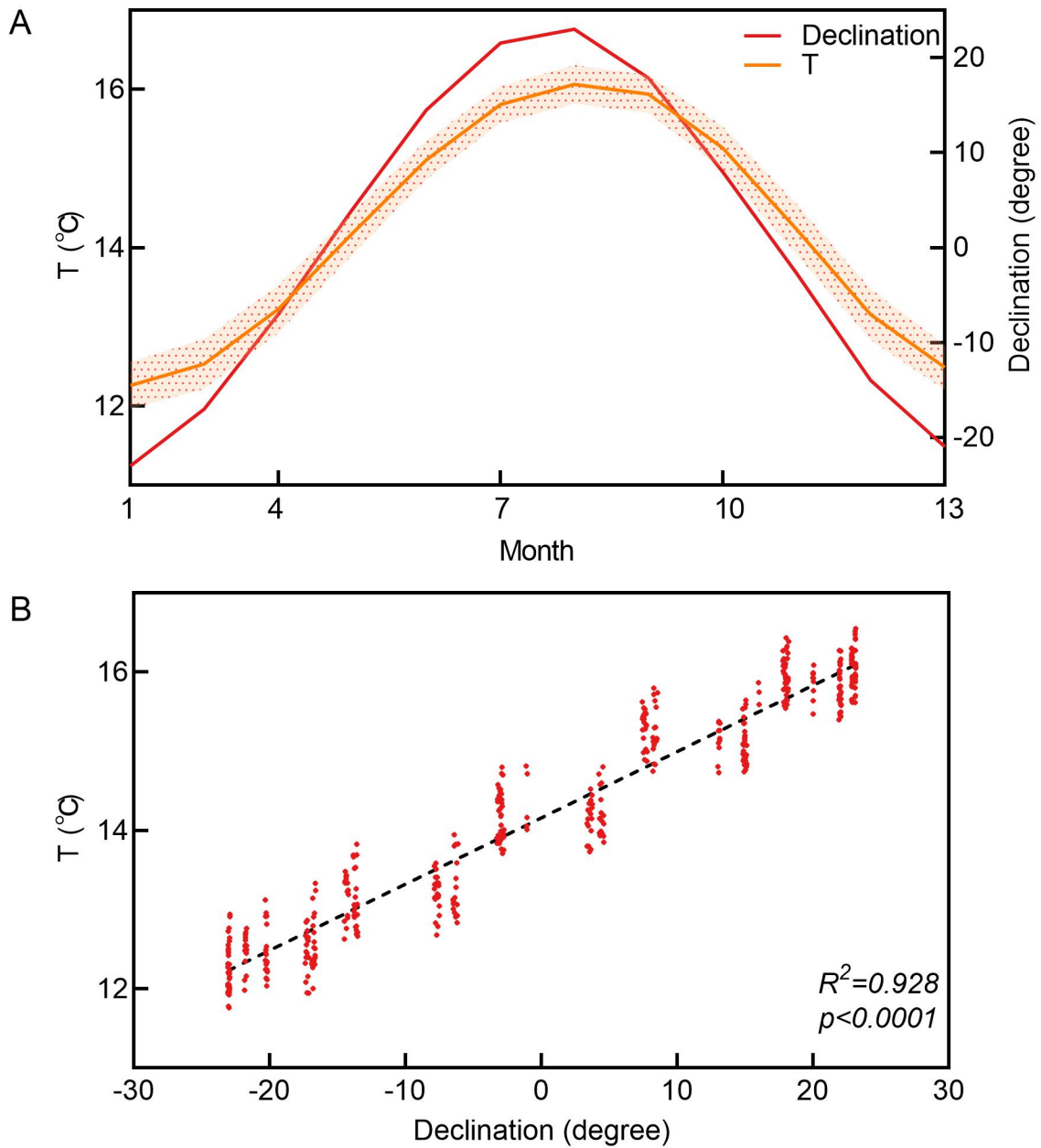
Tables S1

References



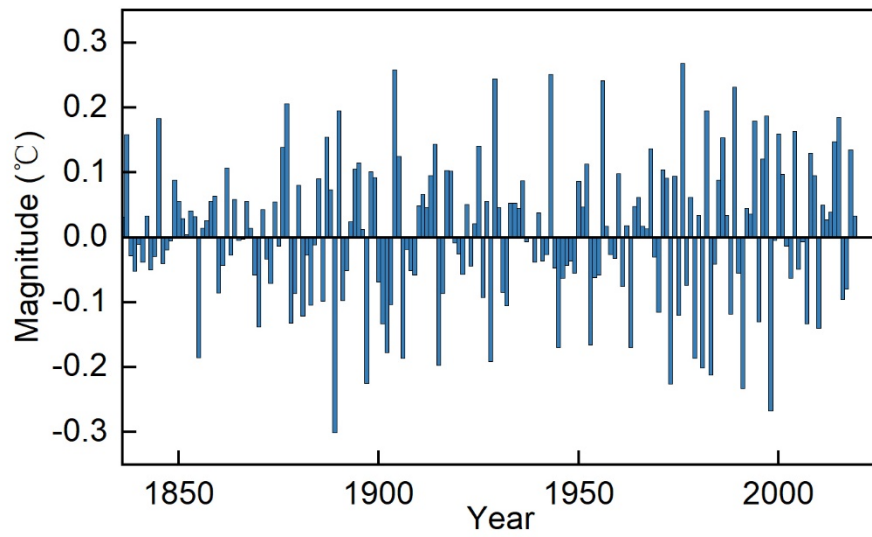
Extended Data Fig. 1.

The temperature difference (D1) of two consecutive hours on January 1 and 2 from 1979–2020. The red and blue bands represent the standard deviation of the temperature difference data of two consecutive hours on January 1 and January 2, respectively, during the study period



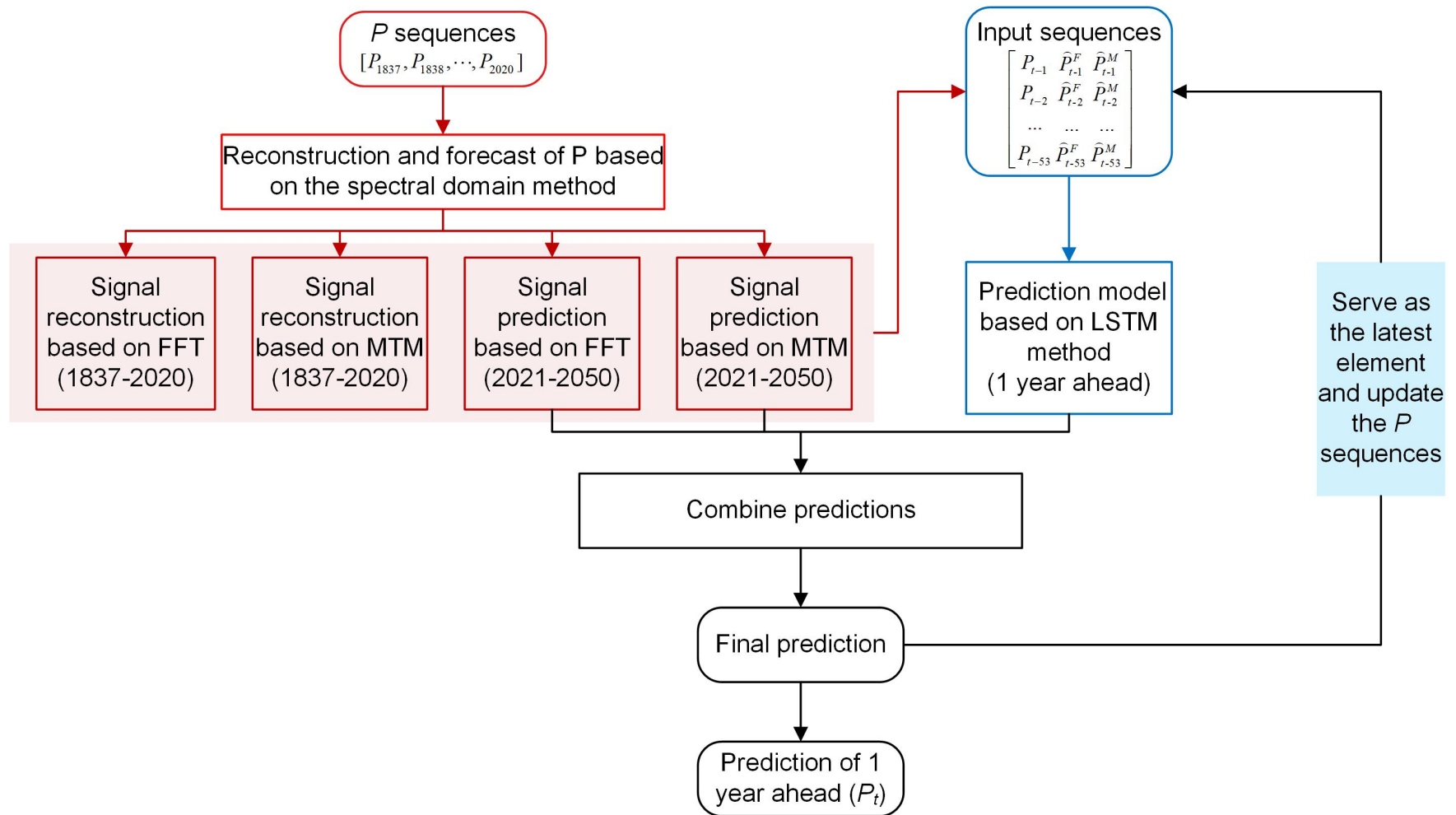
Extended Data Fig. 2.

(A) Comparison of sidereal monthly Earth's temperature data averaged over the period 1979–2020 with solar declination. The orange band represents the standard deviation of sidereal monthly Earth's temperature data during the study period. (B) Scatterplot of sidereal monthly Earth temperature data versus solar declination during the study period.



Extended Data Fig. 3.

The effect of planetary orbits on changes in Earth's temperature for two consecutive years.



Extended Data Fig. 4.

The architecture of the proposed hybrid forecast model based on the LSTM and spectral domain approaches for predicting P . FFT and MTM denote the fast Fourier transform and multitaper methods, respectively.

Supplementary Materials for

Evaluation and prediction of the Effects of Planetary Orbital Variations to Earth's Temperature Changes

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Supplementary text Sections S1 to S5 on pages 2-7.

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Tables S1 on page 20.

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Supplementary Text

1 The physical response of Earth's temperature to different orbits

1.1) The impact of the Earth's rotation on its temperature

Since the amplitude of the solar-induced temperature signal is negligible during the Earth's rotation¹, the quasi-sinusoidal diurnal variation (Fig. S1) in Earth's temperature (T) is mainly due to the uneven distribution of land and sea on the Earth's surface. For each point on Earth, the incoming solar radiation and outgoing longwave radiation changes during the day are mainly due to the Earth's rotation, causing the diurnal cycle of temperature. In this study, vernal equinoxes during the study period (1979–2020) were chosen for analyzing global hourly temperatures. We found large variations in the global temperature from 4 a.m. to 5 a.m., 7 a.m. to 8 a.m., 4 p.m. to 5 p.m. and 9 p.m. to 10 p.m. Fig. S2 shows the global distribution of the temperature difference between 4 a.m. and 5 a.m., 7 a.m. and 8 a.m., 4 p.m. and 5 p.m., and 9 p.m. and 10 p.m. The Earth's rotation highly affects the land surface temperature (LST), while the near-surface ocean temperature barely changes in the two consecutive hours. In Fig. S2, the warming (red color) of the land surface occurs from 5 a.m. to 2 p.m., while cooling (blue color) occurs from 2 p.m. to 5 a.m. of the next day. Fig. S3 indicates the globally averaged mean temperature difference between two consecutive UTC times on the vernal equinoxes during 1979–2020. The average global temperature varies significantly during 4 a.m. – 5 a.m., 7 a.m. – 8 a.m., 4 p.m. – 5 p.m., and 9 p.m. – 10 p.m. The globally averaged temperature change reaches its peak positive value between 7 a.m. and 8 a.m. (Fig. S3) because a large area (i.e., the entire African continent and the central and western parts of Eurasia) experiences warming (Fig. S2B). On the other hand, the globally averaged temperature change finds its peak negative value between 9 p.m. and 10 p.m. (Fig. S3) because most of the land on Earth undergoes cooling, except for northeastern Eurasia, southern Australia and northwestern North America (Fig. S2D).

1.2) The impact of the Moon on Earth's temperature

Fig. S4A shows the change in the global daily temperature from 1979 to 2020. The Earth's temperature in each year generally rises until it reaches its maximum around the middle of the year and then falls, which is mainly caused by the Earth's revolution around the Sun. This regular rising and falling pattern in the temperature is accompanied by slight irregular temperature fluctuations. We believe that these slight irregular fluctuations are mainly due to the changes in lunar forcing exerted on Earth.

Lunar tides and their cycles are well known and clearly observed in ocean records². The lunar tidal cycles (which are generated by the gravitational effect of the Moon on Earth) may partially regulate ocean currents, thereby altering Earth's temperature³. The alternating asymmetric change in lunar gravitational forcing on the solid Earth and the ocean causes the periodic oscillation of crustal stress, which triggers local natural disasters and affects temperature changes locally and even globally⁴⁻⁶. Additionally, the periodic change in the lunar gravitational forcing on the Earth's atmosphere triggers the 27.3-day and 13.6-day atmospheric oscillatory systems and affects weather changes⁷. Moreover, the Earth's temperature is affected by reflection and infrared emission from the Moon^{8,9}.

By analyzing variations in daily lunar declination (δ), the distance between the Moon and the Earth, and the Earth's rotation from 1979 to 2020, we found further evidence of the effect of the Moon on the daily Earth's temperature. In this study, the daily length of day (LOD) values were used as

a measure of the angular velocity of the Earth, which was calculated as the difference between the astronomically determined duration of the day and 86400 SI seconds. In astronomy, δ is defined as the angle between the Moon's apparent path north or south of the celestial sphere and the celestial equator. Fig. S4B schematically depicts the Moon orbiting the Earth in an orbit tilted toward the celestial equator. Fig. S4C shows the temporal variations in δ , the temperature difference (D2) of two consecutive days and the LOD for 13 sidereal months from 1979–2020 (42 years). The variations in D2 and LOD show that they both have the same rising and falling trends, implying that the rotation of the Earth affects the variation in daily Earth's temperature. On the other hand, it was shown in Section 1.1 that Earth's rotation strongly affects the diurnal variation in Earth's temperature. Thus, if the rate of Earth's rotation changes regularly with the Moon's motion, it can further attest that the Moon can indirectly affect the daily global temperature fluctuations by affecting the Earth's rotation.

The Moon revolves every ~ 27.32 days in its elliptical orbit, which is known as the sidereal month. The change in LOD over the study period (i.e., 1979–2020) consists of two primary oscillations, namely, 27.3-day and 13.6-day oscillations, which correspond to the lunar sidereal period (Fig. S4C). The maximum (green arrows) LOD occurs when the Moon is on the celestial equator ($\delta = 0$). In contrast, the minimum (orange arrows) occurs when the extreme lunar declinations appear in the northern or southern hemisphere ($\delta = \delta_L$) (Figs. S4B and 4C). Generally, changes in the lunar declination are approximately one day earlier than those of LOD. Additionally, we found that the rising and falling of LOD happen over 5 to 9 days and not necessarily a quarter of a sidereal month (Fig. S4C). All the short (13 days) and long (14–15 days) LOD cycles contain the Moon's perigee (P) and apogee (A), respectively. Theoretically, the Moon moves slower and faster near the apogee and perigee, respectively, which implies that LOD cycles with the apogee are slightly longer than those with the perigee. These findings show that lunar declination and the variable velocity of the Moon around the Earth affect the Earth's LOD. Meanwhile, all cycles with the perigee (P) have a higher peak than the adjacent cycles with the apogee (A), implying that the Moon's distance from the Earth affects the LOD. The LOD cycle with the highest peak arises when the perigee (P) is located near the peak and closer in time to new or full moons. All of the above findings clearly indicate that the lunar revolution around Earth is an important cause of daily variations in Earth's temperature.

1.3) The impact of the Earth's revolution on the Earth's temperature

Fig. S5 evaluates the effects of the Sun-Earth distance and the declination of the Sun on the Earth's temperature. It is found that the Earth's temperature is positively correlated with the Sun-Earth distance and the Sun's declination, with correlation coefficients (R^2) of 0.914 and 0.786, respectively. This happens because the distance-induced temperature signal is insignificant compared to that of solar declination, leading to a positive correlation between the Earth's temperature and its distance from the sun.

As noted in Section 1.1, Earth's temperature change is largely attributed to land's temperature change. The solar declination is positive from April to September, and the Sun's rays are directly over the northern hemisphere where larger land areas exist, causing the land to absorb more solar radiation and show a higher temperature. Once the solar declination reaches its maximum value, the solar radiation absorbed by the land approaches its peak, and the global temperature reaches a high value of 16.15 °C. From October to March, the solar declination is negative, and the Sun's rays shine directly on the southern hemisphere, where smaller land areas exist. Hence, the land

absorbs less solar radiation and exhibits a relatively lower temperature. That is why the Earth's temperature is highly correlated with solar declination (Fig. S5).

The Earth absorbs more solar radiation and has a higher temperature when it is closer to the Sun. However, due to the low eccentricity of the Earth's orbit, the Sun-Earth distance at the aphelion is only 1.033 times larger than that at the perihelion. The power of sunlight incident on the Earth's surface is inversely proportional to the square of the Sun-Earth distance^{1,10}. Therefore, the sunlight power that reaches the Earth's surface at the perihelion is only 6.8% higher than that at the aphelion. The effect of the Sun-Earth distance on the Earth's temperature is insignificant compared to that of solar declination, leading to an inconsistency between the Earth's temperature and the Earth-Sun distance.

1.4) The impact of the motion of different planets on the Earth's temperature

Planetary motion directly and/or indirectly drives Earth's climate change on secular, millennium, and larger timescales¹¹⁻¹³. Here, we performed a Fourier transform analysis of the annual mean temperature from 1836 to 2020 (185 years). The results showed that the global temperature has fluctuations in approximately 3.5, 9.1, 12.19, 18.28, 20.14, 29.92 and 61.2 years after 1836, which correspond to both the short-term oscillations of Earth's rotation and astronomical cycles (Table S1). This also implies that planetary motion may indirectly influence the interannual Earth's temperature by affecting the Earth's orbit and velocity.

2 Materials

In this study, hourly near-surface air temperature data ($0.25^{\circ} \times 0.25^{\circ}$) from 1979–2020 over the globe are obtained from the ERA5 dataset generated by the European Centre for Medium-Range Weather Forecasts (ECMWF). ERA5 is one of the most utilized datasets for climate studies¹⁴. The utilized global temperature data are generated by combining simulated and observed temperature data all over the world¹⁵. The daily, sidereal monthly, and annual mean temperatures are calculated using hourly data. The ERA5 dataset is available from 1979 and thus does not allow us to analyze changes in Earth's temperature on an interannual scale. To expand the temporal coverage of global temperature data, the daily mean temperature data from the NOAA-CIRES-DOE Twentieth Century Reanalysis version 3 (20CR V3) dataset were used for 1836–2015. Unlike the ERA5 dataset, which assimilates upper-air and satellite data, the 20CRV3 dataset assimilates only conventional near-surface observations (due to the lack of early satellite observations) to estimate temperature¹⁶. To keep the two datasets consistent, the ERA5 data were treated as a reference benchmark, and a linear regression matching technique was used to adjust the 20CR Version 3 data. The hourly, daily and sidereal monthly temperature data (1979–2020) derived from the ERA5 dataset were used to analyze and quantify the impact of different astronomical mechanisms on the Earth's temperature during a year. The annual mean temperature data (1836–2020) derived from both ERA5 and 20CRV3 were used to investigate the influence of the motion of all planets in the solar system on the Earth's temperature.

Daily atmospheric CO₂ concentration data from 1979 to 2020 were downloaded from the Scripps Institution of Oceanography archive (https://scrippsco2.ucsd.edu/data/atmospheric_co2/index.html). This dataset was generated by averaging in situ and flask CO₂ measurements from sampling stations. The sidereal monthly CO₂ concentrations (1979–2020) were derived from daily CO₂ data. The yearly atmospheric CO₂ records from 1836–2020 were also provided by the Scripps Institution of Oceanography. This dataset is mainly based on ice core data and the annual average of direct observations. The daily and yearly motions of the solar system objects were obtained from the

NASA Jet Propulsion Laboratory (JPL) ephemeris during 1979–2020 and 1836–2020, respectively (<https://ssd.jpl.nasa.gov/horizons/app.html>). The NASA JPL ephemeris provides the distance and velocity of the Earth relative to the Sun and the Moon, the distance and velocity of the center of mass of the Earth-Moon system relative to the Sun, and lunar declination. The 1979–2020 daily lunar phase information was obtained from the Fourmilab Switzerland website (<http://www.fourmilab.ch/earthview/pacalc.html>). The daily LOD data were obtained from the Earth’s orientation parameters provided by the International Earth Rotation (IERS) Rapid Service/Prediction Centre at the U.S. Naval Observatory (<https://www.iers.org/IERS/EN/DataProducts/EarthOrientationData/eop.html>).

3 Robustness tests of methods

Fig. S6 A shows that Earth’s temperature has increased since 1836 (red line). The upward trend in the Earth’s temperature from 1836 to the present can be approximated by fitting a quadratic function to the Earth’s temperature records. We can then approximately remove this upward trend using the quadratic fit function, which is shown by the histogram in Fig. S6 A. It can be seen that the histogram has two large and clear sinusoidal-like cycles during 1836–1964. Each of them has a period of approximately 61 years and a peak-to-trough amplitude of approximately 0.30–0.35 °C. In fact, there was a small change in greenhouse gas concentrations before the 1910s, and anthropogenic emissions also did not show any 61-year cycles before the 1940s¹⁷. Thus, the 61-year cycle temperature change should be caused by changes in the planet’s orbit. Furthermore, the histogram was smoothed (black line) and shifted by 61 (red line) and $2 \times 61 = 122$ (blue line) years (see Fig. S6B). A shift of 61 years was chosen to be consistent with the highest temperature period in Table S1. Fig. S6B shows that the oscillations of Earth’s detrended temperature among the 1850–1910, 1910–1970 and 1970–2020 periods (each period consists of 60 years) are fairly similar, and the Pearson coefficient of detrended temperatures among the three periods ranges from 0.74 to 0.86. It is evident that the 61-year cycle temperature change in Fig. S6B is caused by planetary orbital changes. Therefore, the Earth’s detrended temperature in Fig. S6 A can represent the impact of the planet’s orbit on the Earth’s temperature change. In addition, the evident strong symmetry between the 1880–1920 and 1940–1980 periods indicates that the data in Fig. S6A before 1920 and 1940–1980 are more representative of the impact of the planet’s orbit on the Earth’s temperature change.

We converted the Earth’s detrended temperatures in Fig. S6A to the effect of planetary orbits on the Earth’s temperature changes in different years using 1836 as the benchmark. This can be done by subtracting the 1836 Earth’s detrended temperatures from the Earth’s detrended temperature records, which is shown with the blue line in Fig. S7. Then, we compared the result with that of our model (Fig. S7). The comparison shows that the results of both approaches are consistent during the study period, and they almost completely coincide before 1900. Moreover, a remarkable coincidence of the two curves is found from 1940–1980, which also corresponds to the more representative detrended temperatures in Fig. S6A. These outcomes show that the estimates of the effect of planetary orbits on the Earth’s temperature changes from our model have high confidence.

4 Reconstructing and forecasting P using the spectral domain method

Since the effects of different planetary orbits on the Earth’s temperature change exhibit obvious periodicity, there are significant fluctuations in P (Fig. 3B of Main Text). Thus, P can be reconstructed and forecasted reliably if its phases and frequencies are accurately determined. Based on harmonic approximation theory (i.e., harmonic approximation models can simulate

partial periodic time series^{18,19}), we developed a harmonic approximation model for reconstructing and forecasting P using all statistically relevant oscillations that could be identified from its historical time series. The spectral domain approach can determine the periodic components embedded in a time series by computing the associated periods, amplitudes, and phases, and these individual periodic components can be combined to reconstruct and predict the future evolution of the time series. Thus, the relevant oscillations (i.e., periodic components) can be extracted using spectral analysis methods to build a harmonic approximation model. In this study, fast Fourier transform (FFT) and multitaper (MTM) methods were used to identify spurious spectral peaks and extract periodic components of P time series. It is worth mentioning that if the FFT spectral peaks were not verified by the MTM, they were excluded from the harmonic modeling of the P time series.

Based on the identified significant peaks of the P time series and information from the FFT and MTM decompositions, the associated periodic components were reconstructed in the time domain using the harmonic approximation model. The combination of oscillatory signals (\hat{P}) is written in continuous time as

$$\hat{P}_t = U + \sum_{m=1}^M A_m \sin(2\pi f_m(t - 1836) + \phi_m) \quad (1)$$

where f , A , and ϕ are the frequency, amplitude, and phase of the sine wave, respectively. t is the year, and M is the number of extracted significant peaks. U is set to 0.0567 and 0.0713 when the FFT and MTM frequencies are used, respectively.

Figs. S8 A and B show reconstructed P values from Equation 1 based on the information from the FFT and MTM decompositions, respectively. In addition, the periodic components obtained from the FFT and MTM spectral peak frequencies are shown in the same figure. It is evident that both approaches can reproduce the oscillations in P well, and thus, both methods can be used to predict P .

5 Forecasting P based on the LSTM method

LSTM is a recurrent neural network that is capable of learning long-term dependencies between samples in a sequence by updating states based on both the inputs for the current time step and network states of what was output in the prior time step. LSTM has the form of repeating modules of a neural network, and the repeating module is composed of four interactive parts, including a memory cell C , a forget gate f_t , an input gate i_t , and an output gate O_t (Fig. S9).

As illustrated in the second repeating module in Fig. S9, P_t is used as the input vector of LSTM in which the gates f_t , i_t , and O_t as well as the candidate cell state C'_t are all controlled by (P_t, h_{t-1}) . f_t and i_t are then used to update the cell state C_t . O_t determines how much information is propagated to time step $t+1$. These gates are comprised of a sigmoid fully connected neural network layer and a pointwise multiplication operation. The working mechanism of the gates and information flow can be represented as follows:

$$f_t = \sigma(W_f \cdot [h_{t-1}, P_t] + b_f) \quad (2)$$

$$i_t = \sigma(W_i \cdot [h_{t-1}, P_t] + b_i) \quad (3)$$

$$C'_t = \tanh(W_c \cdot [h_{t-1}, P_t] + b_c) \quad (4)$$

$$C_t = f_t \odot C_{t-1} + i_t \odot C'_t \quad (5)$$

$$O_t = \sigma(W_o \cdot [h_{t-1}, P_t] + b_o) \quad (6)$$

$$h_t = O_t \odot \tanh(C_t) \quad (7)$$

where the transformations σ from inputs to i , f , and O all use sigmoid functions. W and b contain the corresponding network weights and bias parameters, respectively. h is the hidden state. The operation \odot is elementwise multiplication (Hadamard product), and $\tanh(l)$ is the hyperbolic tangent function, which operates piecewise on each element of the vector l .

The hyperparameters of LSTM (e.g., the number of layers and the number of neurons in each layer) should be tuned to improve its performance. In this study, 10% of the data from the training dataset are selected randomly to tune the hyperparameters of LSTM via the Bayesian optimization method. We tested different numbers (from 1 to 5) of LSTM layers and combined the one, two, and three dense layers (also called the fully connected layers). Finally, we chose 4 layers (two LSTM layers and two dense layers) with 64, 32, 64 and 1 neurons. Meanwhile, we performed batch normalization after each hidden layer of the network. The best performance was obtained for a mini-batch size of 32. The mean square error (MSE) was used as the loss function. The Adam, RMSprop, AdaGrad, Nesterovs, SGD and Adadelata schemes were tested, and finally, the Adam scheme was adopted as the optimizer.

In addition to the hyperparameters of LSTM, the number of epochs and length of historical input data (timestep) affect P predictions. Fig. S10A shows that the magnitude of the loss function varies with the number of epochs in the LSTM model. It can be seen that the loss function remains almost constant for the epoch number of 300. Fig. S10B demonstrates the variations in the determination coefficient (R^2), the mean absolute error (MAE) and the root mean square error (RMSE) with timestep. The optimal timestep is set to 53, which means that we use the previous 53 years' input sequence to predict the 54th years' P .

Figures

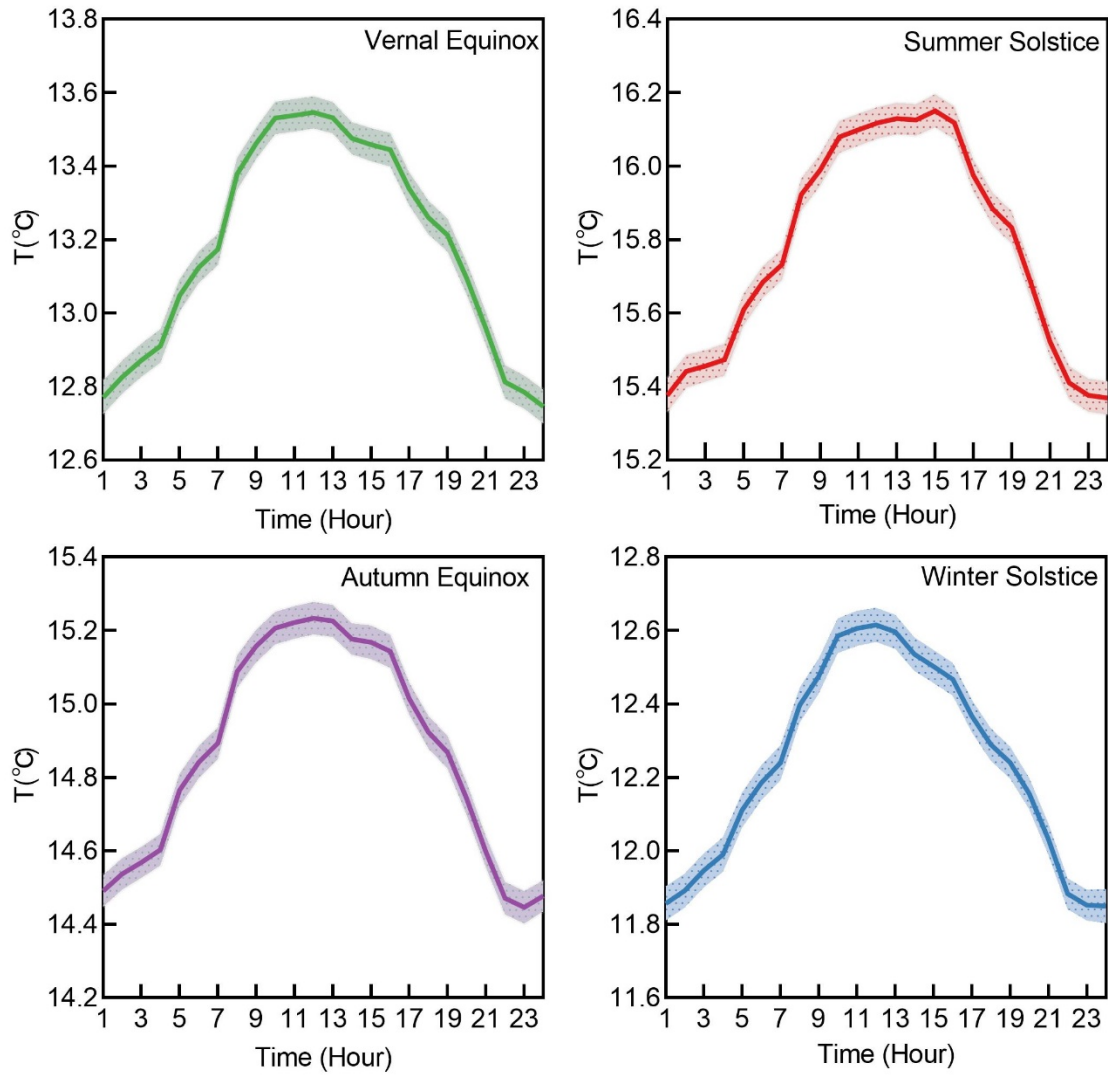


Fig. S1.

Diurnal cycle of Earth's temperature during the vernal equinox, summer solstice, autumn equinox and winter solstice during the study period. The band around each curve is the standard deviation of the temperature time series.

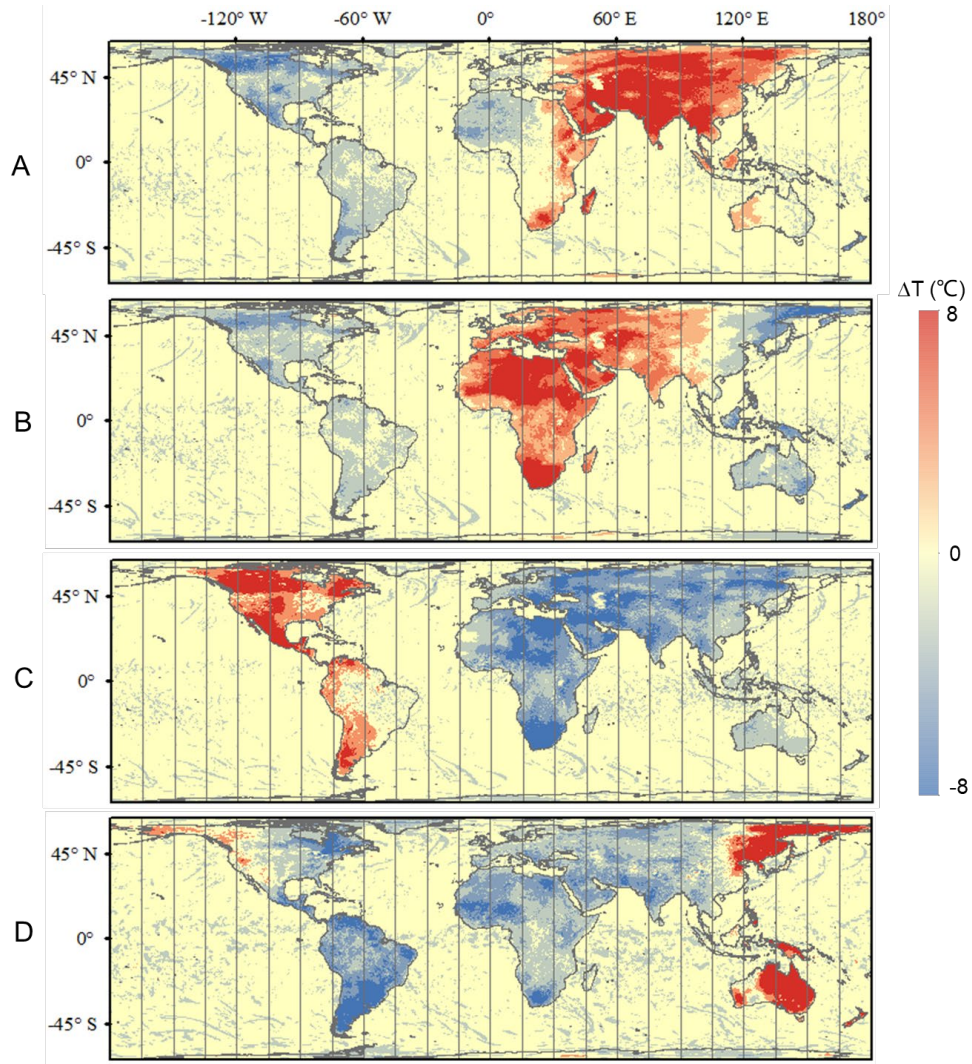


Fig. S2.

The mean temperature difference between two consecutive UTC times ((**A**) 5 and 4 UTC [T (at 5 UTC) – T (at 4 UTC)], (**B**) 8 and 7 UTC [T (at 8 UTC) – T (at 7 UTC)], (**C**) 17 and 16 UTC [T (at 17 UTC) – T (at 16 UTC)], and (**D**) 22 and 21 UTC [T (at 22 UTC) – T (at 21 UTC)]) on the vernal equinoxes from 1979-2020.

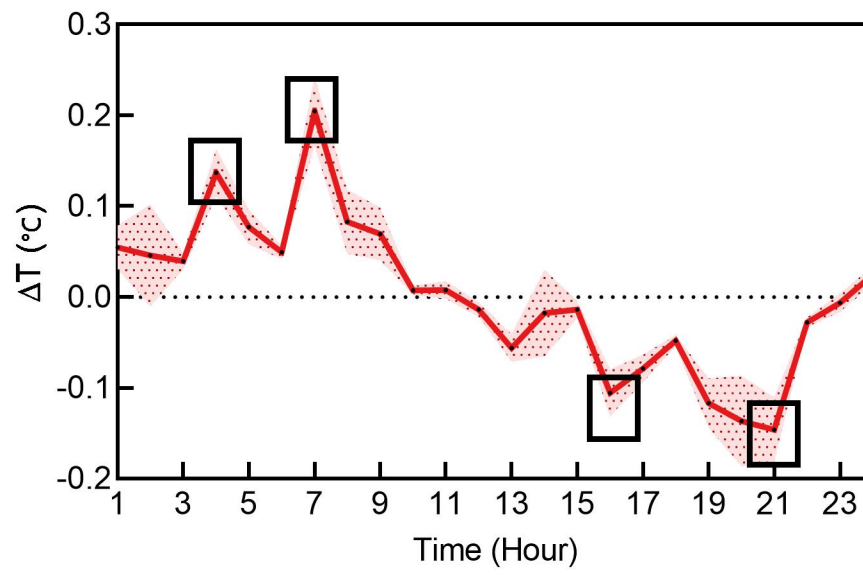


Fig. S3.

The spatially averaged mean temperature difference over the period 1979–2020 between two adjacent UTC times.

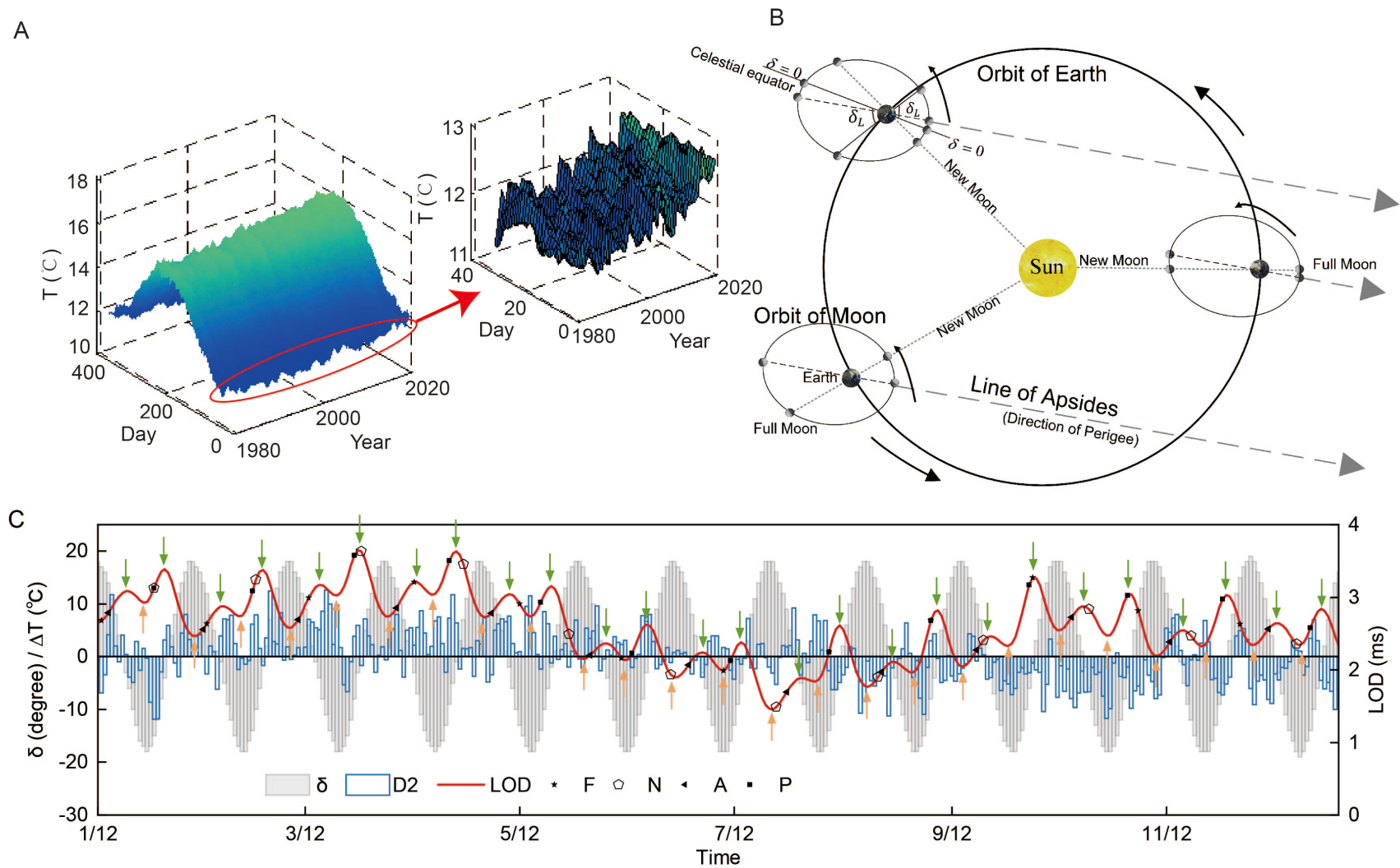


Fig. S4.

(A) Changes in the global daily temperature during 1979–2020. (B) A schematic diagram of the Moon orbiting the Earth in an orbit tilted to the celestial equator, which also depicts that the lunar declination, lunar phase and the distance of the Moon from the Earth all

change periodically during the Moon's orbit around the Earth. (C) The temporal variation of lunar declination, distance between the Moon and the Earth, LOD and temperature difference (D2) of two consecutive days from January 1979 to December 1979. The orange and green arrows represent the days on which the lunar declination (δ) is maximum and zero (i.e., the Moon is on the celestial equator), respectively. In astronomy, lunar declination is defined as the angle between the Moon's apparent path (north or south of the celestial sphere) and the celestial equator.

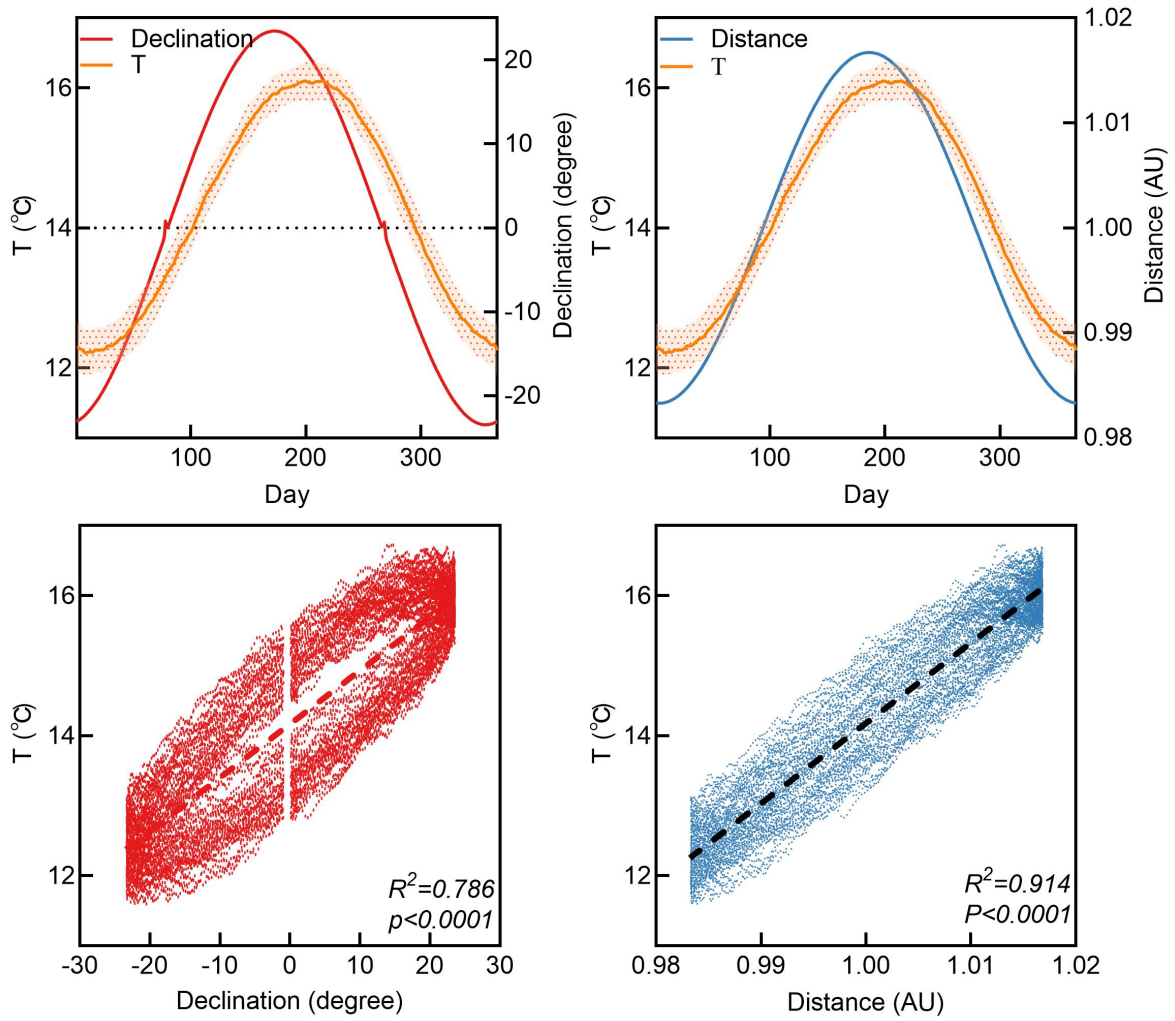


Fig. S5.

(Top row) Comparison of daily Earth's temperature data averaged over the period 1979–2020 with the solar declination (left column) and the Earth-Sun distance (right column). Orange bands represent the standard deviation of the daily Earth's temperature during the study period. (Bottom row) Scatterplot of the daily Earth's temperature data from 1979 to 2020 versus the solar declination and Sun-Earth distance.

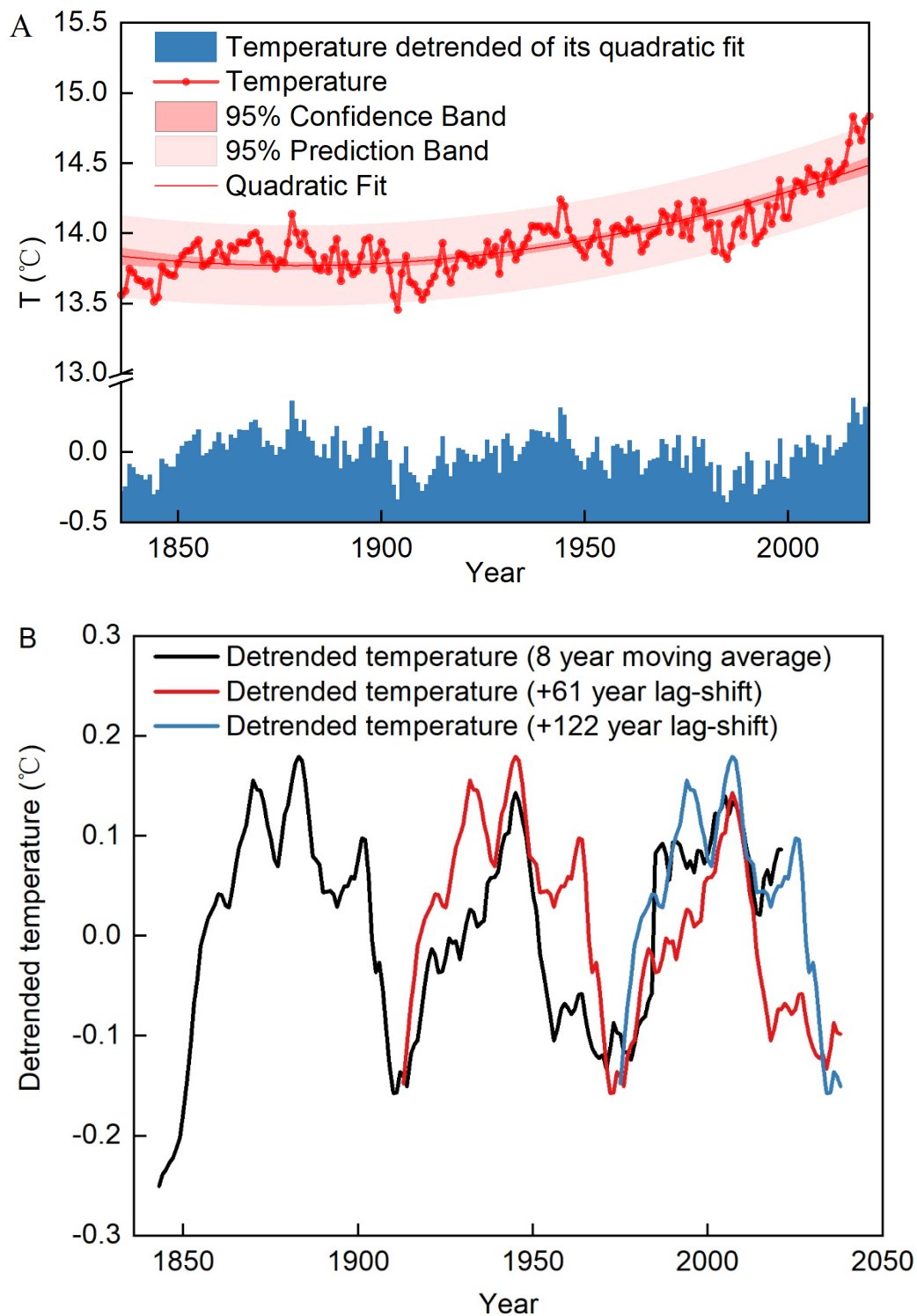


Fig. S6.

(A) Earth's temperature record and the detrended temperature of its quadratic fit; (B) eight-year moving average of the detrended temperature of its quadratic fit and plotted against itself shifted by 61 and 122 years.

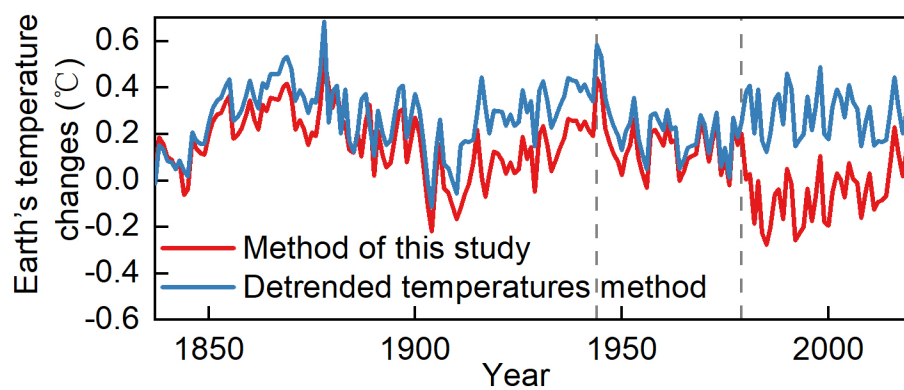


Fig. S7.

The effect of planetary orbits on global temperature changes in different years (using 1836 as the benchmark) based on the detrended temperatures method and the method of this study.

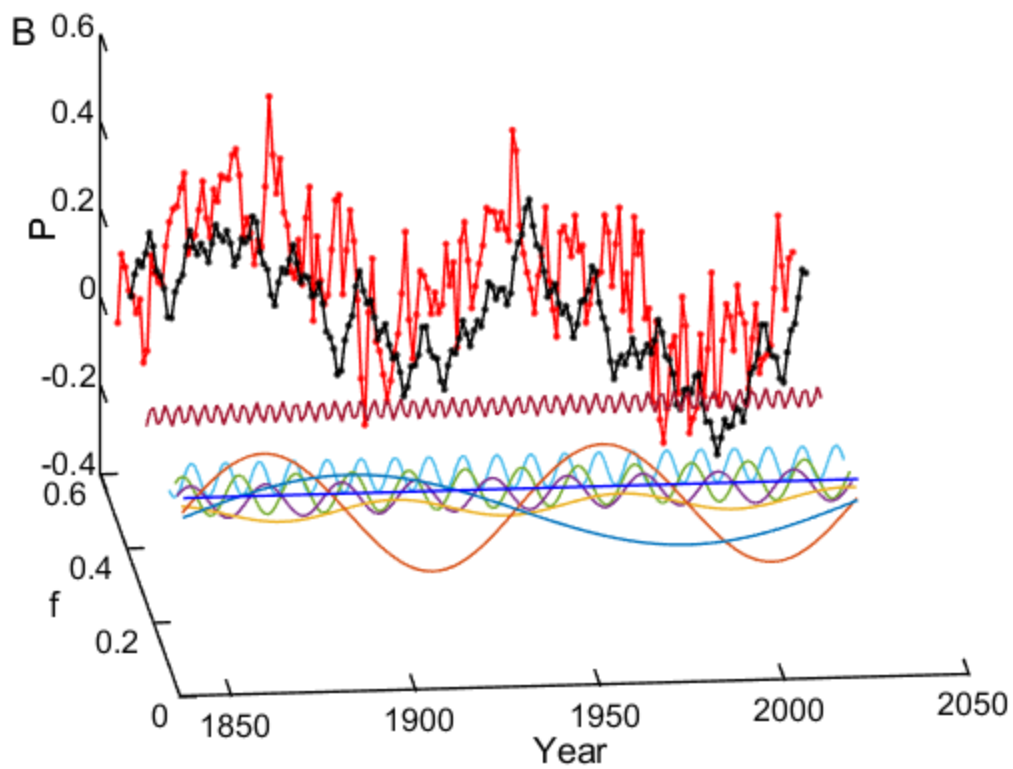
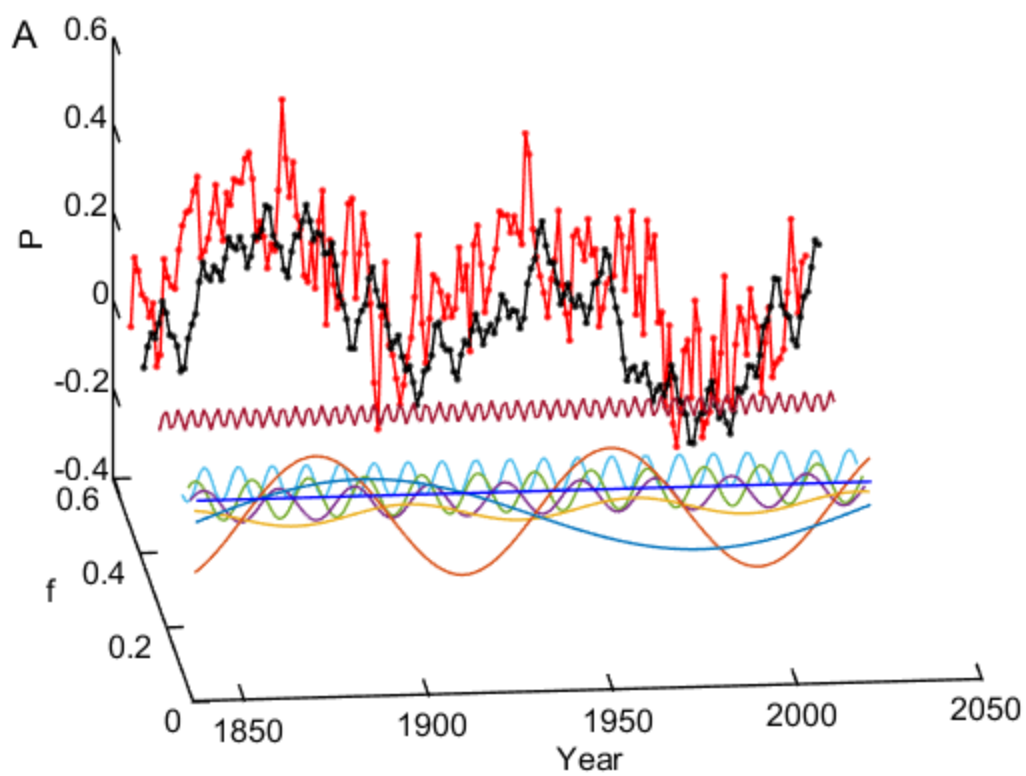


Fig. S8.

The effect of planetary orbits (P) on the Earth's temperature from 1837–2020 from the model of the methods section (red solid line with marker) and Equation (1) (black solid line with marker) using (A) the information from the FFT decomposition and (B) the information from the MTM decomposition. The remaining solid lines in A and B represent the periodic components obtained based on FFT and MTM spectral peak frequencies, respectively.

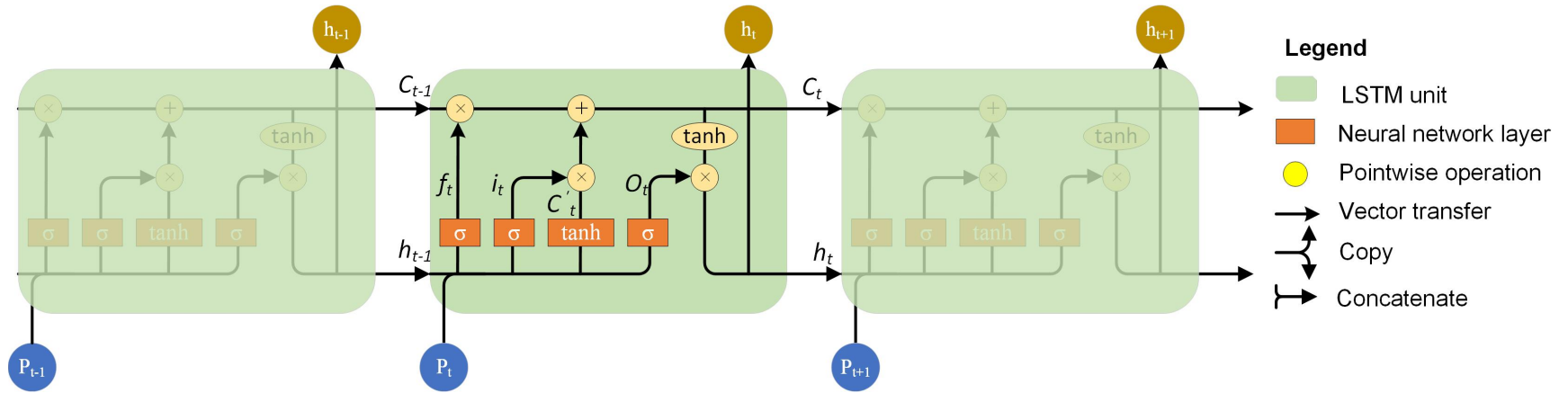


Fig. S9.
Structure of LSTM.

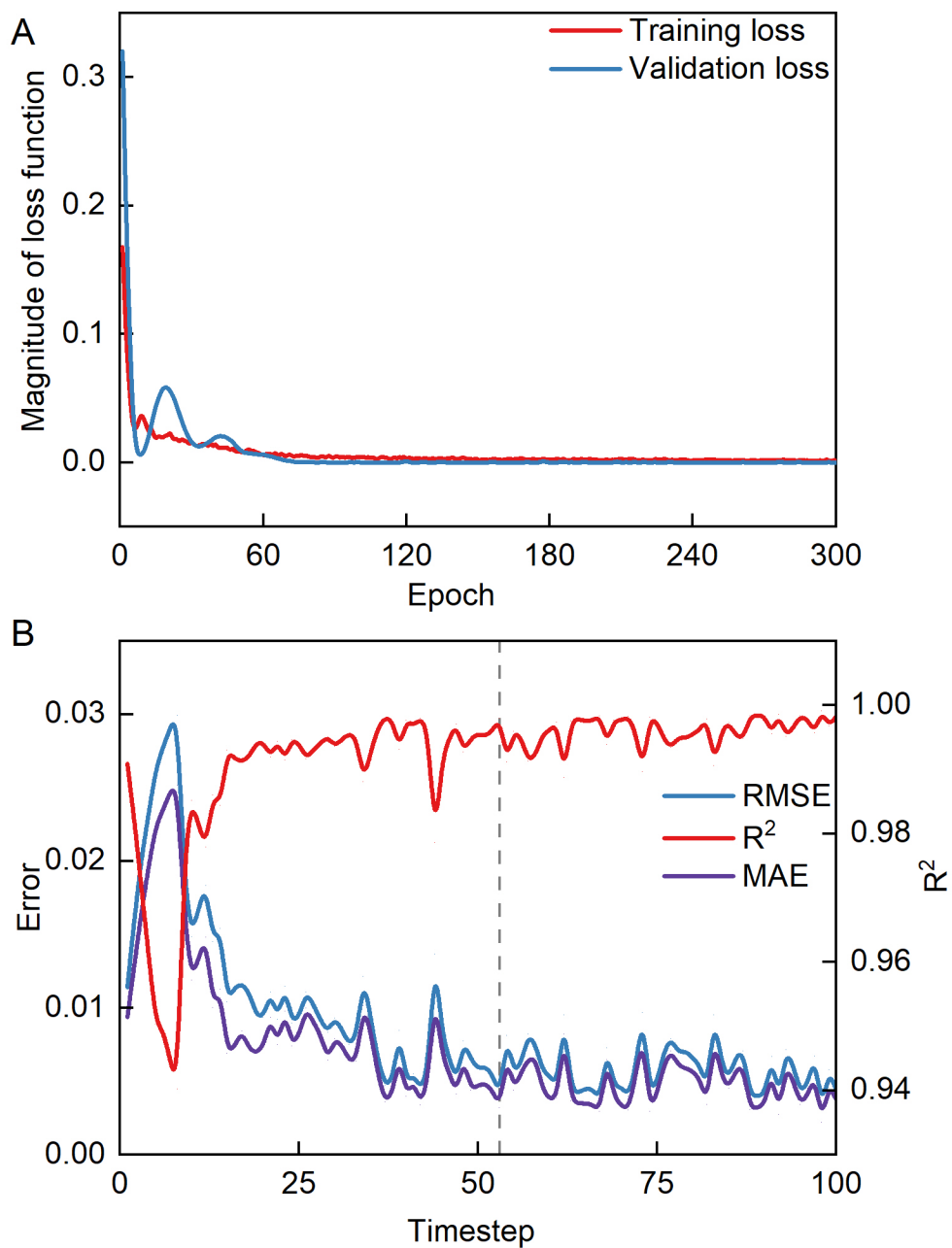


Fig. S10.

(A) The value of the loss function varies with the number of epochs in the LSTM for P prediction.
 (B) The relationship between the accuracy and the timestep of the LSTM.

Table S1.

The periods of the power spectrum of the Earth's temperature from 1836 to 2020 based on the FFT arithmetic corresponding to variation cycles of the Earth's rotation rate and astronomical periods.

Temperature periods (yr)	Earth rotation periods (yr)	Astronomical periods (yr)
3.5	4	Quasi-four yrs tidal cycle
9.1	9.2	The sunspot cycle (8.9-9.4 yrs); long-term lunar cycle (~9.1 yrs); the opposition-synodic cycle of Jupiter and Saturn (~10 yrs)
11.33-12.19	12.15	The sunspot cycle (9.9-13.035 yrs); the alignment cycle of Venus, Earth and Jupiter (~11 yrs); the period of Jupiter (11.86 yrs); the synodic period of Jupiter and Neptune (12.78 yrs)
18.28-20.14	18.6 19.855	The luni-solar node cycle (18.61 yrs); the synodic period of Jupiter and Saturn (19.858 yrs); the similar synodic period of Mercury (19.99 yrs)
29.92	29.783	The period of Saturn (29.42 yrs); the similar synodic period of Saturn (30.02 yrs); the period of polar shift (29.8 yrs)
~61	59.555	The sunspot cycle (~57.1 yrs); the repetition of the combined orbits of Jupiter and Saturn (~ 60 yrs)

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