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Complete electrification worsens the net energy prospects of a transition based on wind and solar energy.

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This article is a non-peer reviewed preprint submitted to EarthArXiv.

29 **Title:** Complete electrification worsens the net energy prospects of a transition based on wind and
30 solar energy.

31 **Keywords:** criticality, deep electrification, energy transition, net energy, energy constraint, physical
32 framework

33 **Abstract**

34 Mitigating climate change largely relies on substituting fossil fuels with low-carbon, electricity-
35 producing energy sources. This mass electrification deeply alters sectoral energy demand, as some
36 sectors can be more efficiently electrified than others. Building transition infrastructure – such as solar
37 and wind farms, grid extensions, and electric vehicles – at a sufficient pace to achieve ambitious
38 transition plans requires significant amounts of energy, potentially causing societal disruptions. We
39 develop a framework to assess how mass electrification will affect transition energy requirements by
40 disaggregating them into sectors and assigning them electrification efficiencies. We apply this model
41 to the European Union (EU-27) under a scenario phasing out fossil fuels by 2050. We find that sectors
42 employed to build transition infrastructure are more difficult to electrify than the economy-wide
43 average. Mass electrification therefore increases transition energy requirements relative to supply,
44 exacerbating net energy challenges. We also find that, depending on the order in which sectors are
45 electrified, transition-related demand for coal (linked to steel production for wind turbines) can be
46 significant compared to its supply, suggesting coal can be a critical material. Our results show that
47 improving the electrification efficiency of sectors used in the transition significantly improves net
48 energy prospects, hence we suggest prioritising battery electric trucks and industrial heat pumps over
49 their less efficient hydrogen-powered alternatives. By capturing sector- and vector-specific dynamics,
50 our analysis identifies previously undocumented net-energy challenges and actionable levers to mitigate
51 them. These results highlight the importance of physically consistent transition models to guide the
52 energy transition.

53 1. Introduction

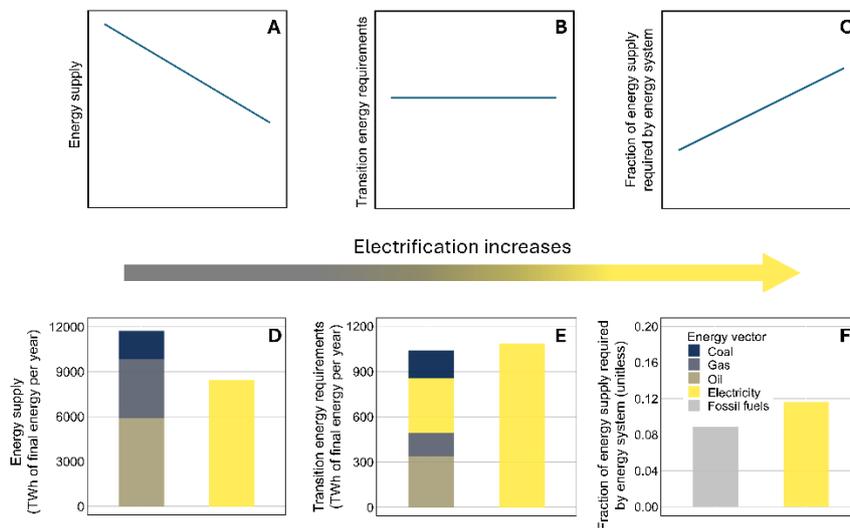
54 The energy transition from fossil fuels to low carbon energy sources must proceed swiftly to keep global
55 warming well below 2°C [1]. This endeavour requires coordinated global efforts and is constrained by
56 both physical and social factors. On the social side, countries differ widely in their dependence on fossil
57 fuels [2,3] and in their suitability for renewable energy sources [4–6], making international cooperation
58 and multilateral agreements difficult to establish. Physical challenges range from mitigating the
59 intermittency of solar and wind power plants [7], maintaining grid frequency as momentum-based
60 generation declines [8], and managing the increasing material and energy intensity of the energy sector
61 itself [9,10]. Here, we will focus on physical challenges, specifically the interaction between the
62 evolving final energy mix and the energy requirements of the transition.

63 As highlighted in literature [10,11], building the renewable power plants, electric grid
64 extensions, and end-use devices required to substitute fossil fuels currently entails using fossil fuels.
65 For example, primary steel used in wind turbines is obtained from iron ore reduced using coal-derived
66 coke in a blast furnace [12], transported using diesel and heavy fuel oil in heavy-duty trucks and cargo
67 ships, respectively [13,14], and assembled into a turbine using diesel-fuelled cranes and other
68 construction equipment. Substituting all these processes with their electrified versions is likely to
69 change the amount of energy required to build a wind turbine – or any other piece of transition
70 infrastructure. It remains uncertain, however, whether this change will increase or decrease transition
71 energy requirements, especially considering the wide range of sector factors quantified (Fig. 3).

72 This gap results from very few models studying transition energy requirements and changes in
73 energy efficiency caused by electrification simultaneously, except for Capellán-Pérez et al., 2019 [15]
74 and Legendre et al., 2026 [16]. However, this mechanism is not embedded in [16], whilst the
75 electrification efficiency of sectors is not sufficiently disaggregated in [15] to support this analysis. If
76 complete electrification increases the energy efficiency of the overall economy to a greater extent than
77 that of sectors used to build transition infrastructure, then the net energy challenges of the transition
78 will be greater than estimated in previous work [10,15–21] (see Fig. 1). In addition, as fossil fuel

79 supplies decrease and transition energy requirements persist, transition-related fossil fuel demand could
80 represent a significant share of fossil fuel supply, potentially making them critical materials.

81 Here, we propose a methodology to address this gap which builds on the model developed by
82 the authors [16]. By breaking down the energy requirements of materials and processes used in the
83 transition into sectors for which we have calculated sector factors, we can quantify how the
84 electrification of sectors affects transition energy requirements. Using a physically consistent model,
85 we investigate two research questions. First, we quantify how electrification can affect transition energy
86 requirements. Second, we explore how changing the order of sector electrification may affect the total
87 energy requirements of the transition, and the risk of fossil fuel criticality.

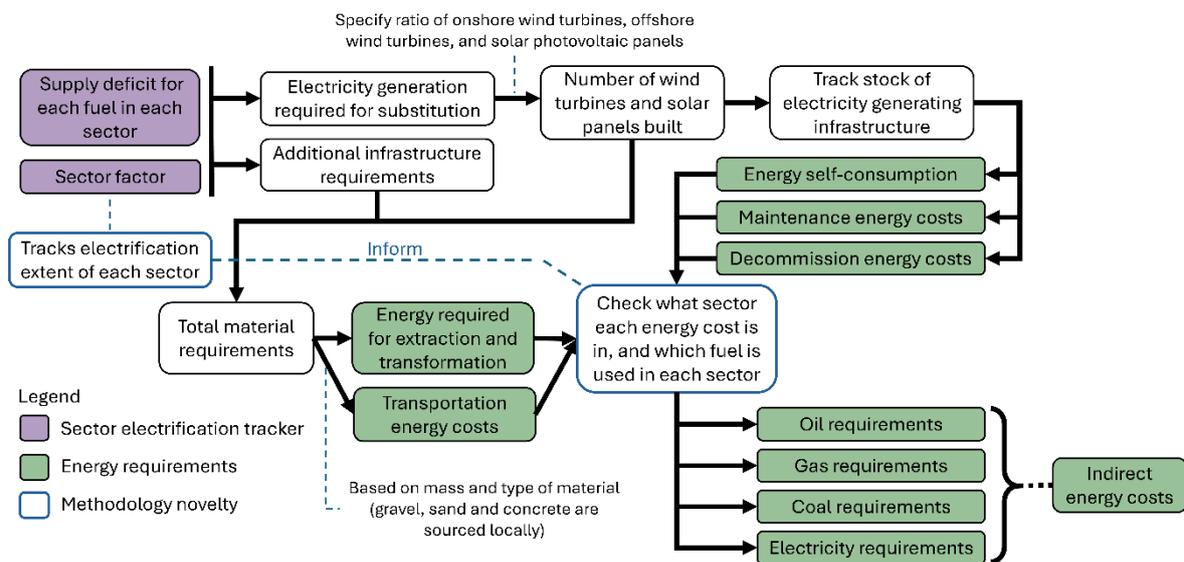


88
89 **Fig. 1 | Electrification may worsen net energy prospects of the energy transition.** Electrification of fossil fuel
90 uses decreases the energy supply required to meet current energy services (A). If the energy required to build
91 transition infrastructure is concentrated in sectors that do not become more efficient with electrification (B), then
92 it will lead to transition energy requirements occupying a greater share of energy supplies (C). Panels D, E and F
93 show corresponding stylised results from two scenarios where the energy supply remains fossil-based, with
94 transition energy requirements met with fossil fuels (left) and the energy supply is 100% electric, and transition
95 energy requirements are met with electrified processes (right).

96 2. Methodology

97 2.1 Methodology summary

98 The methodology proposed is summarised in Fig. 2 and builds on that developed by the authors in [16]
 99 which aimed to quantify the energy required to produce the renewable energy power plants and
 100 associated infrastructure necessary to phase out fossil fuels while maintaining current services. In
 101 addition to this, the new methodology enables quantifying the changes in transition energy requirements
 102 caused by the inherent electrification of means of producing transition-related infrastructure during the
 103 transition. This methodology also enables disaggregating transition energy requirements into major
 104 energy vectors (oil,



105

106 **Fig. 2 | Methodology.** Summary of the method used to calculate yearly transition energy requirements. The energy
 107 supply deficit in each fuel-sector combination is multiplied by the associated sector factor to determine the
 108 electricity generation required to substitute these fuels. The capacity of wind turbines and solar panels required to
 109 generate this electricity is calculated based on their performance factors. By tracking the stock of electricity
 110 generating infrastructure, we estimate the operation-related energy requirements of the stock. For each sector, we
 111 quantify the infrastructure requirements for using the electricity generated. We estimate the material requirements
 112 of renewable power plants and additional transition infrastructure using life cycle inventory analyses. Each
 113 material requirement is multiplied by its corresponding energy intensity broken down into sectors (e.g., iron
 114 reduction, industry thermal energy use, etc.) based on a tailor-made dataset to obtain transition energy
 115 requirements disaggregated into sectors. Finally, we disaggregate these energy requirements into energy vectors
 116 by tracking the extent of electrification of each sector the energy is used in and estimate indirect energy
 117 requirements.

118 gas, coal, and electricity) to identify potential fuel-specific supply and demand challenges. To avoid
 119 unnecessary repetition, details of the previously developed methodology are found in [16], and this

120 section focuses on the differences and improvements made over the previous version. We focus on a
121 scenario phasing out fossil fuels by 2050 to represent current net-zero plans, and because it most clearly
122 exhibits the differences in results stemming from the novel methodology developed.

123 2.2 Estimating sector factors

124 Substituting fossil fuels in different sectors requires a different amount of electricity per unit of fossil
125 fuel. To accurately account for this discrepancy, we calculate this ratio, called a “sector factor” for each
126 major energy consuming sector of the economy using equation 1,

$$127 \quad SF_{f,s} = \frac{\text{final electrical energy required to provide service (MJ of electricity)}}{\text{final thermal energy required to provide service (MJ of thermal energy)}}, \quad (\text{Eq. 1})$$

128 in which $SF_{f,s}$ is the sector factor for fuel f used in sector s . Fig. 3.3 summarises the sector factors
129 calculated, and detailed information on how each factor is calculated is provided in supplementary note
130 1. We provide an example calculation below for the light road transport sector below:

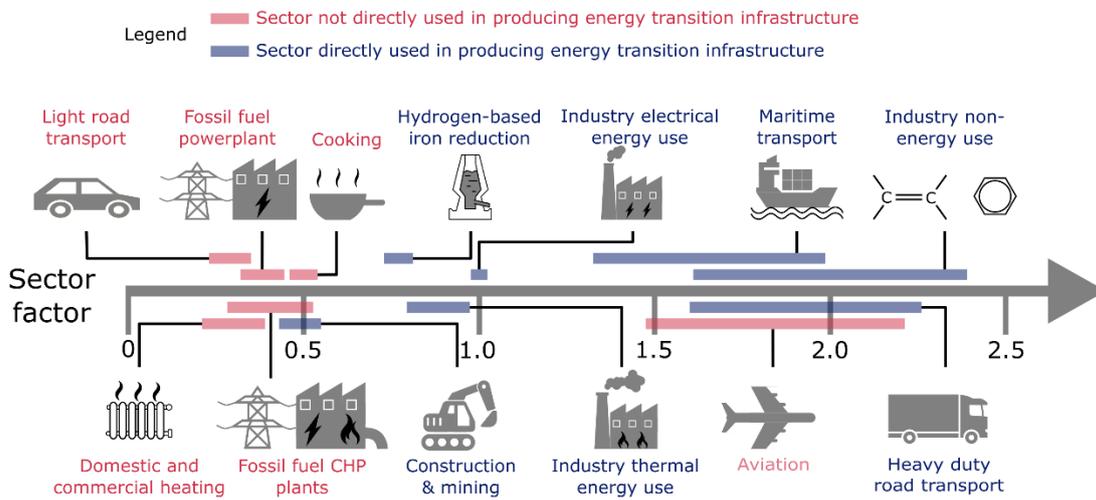
$$131 \quad SF_{LRT} = \frac{\text{final electricity to drive BEV 100km} * \frac{1}{\text{EV charger efficiency}}}{\text{final thermal energy to drive ICEV 100km}}, \quad (\text{Eq. 2})$$

132 where SF_{LRT} is the sector factor of the light road transport sector, and “EV charger efficiency” represents
133 the amount of electricity reaching the EV batter divided by the electricity taken from the grid. The final
134 electricity required to drive a battery electric vehicle for 100 km is based on an efficient commercially
135 available vehicle (13.7 kWh, or 49.3 MJ of electricity [22]), the corresponding value for internal
136 combustion engine vehicles is taken as the average value for the EU fleet (6 L of gasoline or 192 MJ
137 [23]), and the efficiency of electric vehicle chargers is taken as 88%, the higher end of values found by
138 [24]. This results in a sector factor of 0.29.

139 Compared to our previous work [16], we further disaggregate the road transport sector into light
140 and heavy road transport to better capture the effect of electrifying road transport on the transport-
141 related energy requirements of the transition. We also disaggregate the industry energy use sector into
142 “industry thermal energy use” and “construction and mining” sectors because these have markedly

143 different sector factors, and the transition includes a significant amount of energy use relating to soil
 144 preparation and mining (as shown in Fig. 4) which is well-represented by this additional sector.

145



146

147 **Fig. 3 | Sector factors of the major energy consuming sectors of the economy.** The shaded bars represent the
 148 likely range (3 standard deviations) of the values given current estimates and the maturity of the technology used.
 149 Sectors labelled in blue are directly used in producing and deploying energy transition infrastructure while sectors
 150 labelled in red are not. Sectors farther to the right have higher sector factors, meaning they require more electricity
 151 to replace one unit of fossil fuel. As many of the blue sectors are on the right, this suggests deep electrification
 152 will increase transition energy requirements. All values and sources used are available in supplementary note 1 of
 153 this paper and supplementary note 2 of [24].

154

155 2.3 Disaggregating the energy required to extract, transform, and transport materials

156 The material-related energy requirements make up 84% (see supplementary Fig. 2) of the total transition
 157 energy requirements and are disaggregated into sectors based on detailed process data. As it would be
 158 difficult to find reliable, detailed and representative information for every material used in the energy
 159 transition, we obtained this data for the 11 materials and processes representing 90% of the material-
 160 related energy requirements. The energy intensities of the remaining materials were taken from [25]
 161 and [26] (adjusted to final energy) and were disaggregated into sectors according to the weighed
 162 distribution of the other materials. All sources, resulting disaggregation, and explanations can be found

163 in the excel supplementary information. The yearly energy requirements related to the material
164 requirements of the transition are calculated using equation 2,

$$165 \quad E_{mat, s, y} = \sum_{m=1}^{m_{max}} M_{m, y} EI_{m, s}, \quad (\text{Eq. 2})$$

166 where $E_{mat, s, y}$ represents the energy requirements linked to material extraction and transformation
167 in sector s for year y , $M_{m, y}$ represents the mass of material m required for year y , and $EI_{m, s}$ represents
168 the energy intensity of material m in sector s .

169 The energy required to transport materials has been updated compared to [24]. We still assign
170 500 km of heavy-duty road transport and 10,000 km of maritime transport to materials except for gravel,
171 sand and concrete which are sourced locally and hence only require 250 km of heavy-duty road transport
172 as suggested by [27]. However, the energy required per ton-km of heavy-duty road transport has been
173 revised from $3.5 \text{ MJ t}^{-1} \text{ km}^{-1}$ to $1.2 \text{ MJ t}^{-1} \text{ km}^{-1}$ based on industry data (see supplementary note 2). The
174 specific energy requirements of maritime transport are kept at $0.2 \text{ MJ t}^{-1} \text{ km}^{-1}$.

175 **2.4 Disaggregating other energy requirements into sectors**

176 Self-consumption, decommission, and maintenance energy requirements are calculated in the same way
177 as described in [16]. Self-consumption is allocated to the industry electricity use sector as it is
178 exclusively in the form of electricity. Maintenance energy requirements are distributed amongst sectors
179 in the same way as that year's material-related energy requirements. This is a simplification as the
180 materials required to maintain renewable energy power plants will not perfectly match those needed to
181 build them. However, since maintenance energy requirements only represent 1% of total transition
182 energy requirements (see supplementary Fig. 2), this does not significantly affect the results.
183 Decommission energy requirements – which represent <0.1% of total energy requirements (see
184 supplementary Fig. 2) – are entirely allocated to the construction and mining sector as the construction
185 vehicles (bulldozers and diggers) used in decommissioning are well-represented by those considered to
186 calculate the sector factor of the construction and mining sector.

187 2.5 Tracking the extent of electrification of each sector

188 The methodology presented calculates the amount of electricity generation required to substitute fossil
189 fuels based on which sector these fossil fuels are used in. In doing so, it inherently tracks the amount of
190 fossil fuel removed from each sector. To track the extent of electrification of each sector, we simply
191 subtract the cumulative amount of fossil fuel removed from a sector divided by the total amount of
192 fossil fuel initially used in the sector from unity, as shown in equation 3,

$$193 \quad EE_{f, s, y} = 1 - \left(\frac{\sum_{y=1}^y \sum_{f=1}^3 FFR_{f,s,y}}{\sum_{f=1}^3 FFI_{f,s}} \right), \quad (\text{Eq. 3})$$

194 where $EE_{f, s, y}$ is the extent of electrification of fossil fuel f 's use in sector s in year y (a fraction
195 between 0 and 1), $FFR_{f,s,y}$ is the amount (in Joules) of fossil fuel f removed from sector s in year y , and
196 $FFI_{f,s}$ is the amount of fossil fuel f initially used in sector s .

197 2.6 Calculating dynamic energy requirements of the transition

198 We define the transition energy requirements calculated using our novel methodology as “dynamic
199 energy requirements” while those calculated assuming the transition energy requirements electrify with
200 identical efficiency to the overall economy as “static energy requirements”. To calculate the dynamic
201 energy requirements of the transition, we use a three-step process. First, we track the yearly energy
202 requirements of the transition in each sector using equation 4,

$$203 \quad TER_{s, y} = E_{mat, s, y} + E_{trans, s, y} + SC_{s, y} + E_{maint, s, y} + E_{decom, s, y}, \quad (\text{Eq. 4})$$

204 where $TER_{s, y}$ is the total energy requirements in sector s for year y , $E_{trans, s, y}$ represents the energy
205 requirements linked to transporting materials, $SC_{s, y}$ represents the energy self-consumption of
206 renewable power plants in sector s for year y , $E_{maint, s, y}$ represents the maintenance-related energy
207 requirements in sector s for year y , and $E_{decom, s, y}$ represents the decommission-related energy
208 requirements in sector s for year y . The sources and explanations for the values of $E_{trans, s, y}$, $SC_{s, y}$,
209 $E_{maint, s, y}$, and $E_{decom, s, y}$ are available in the excel supplementary information. Second, we track

210 how much of each energy vector is used to meet transition energy requirements each year using equation
 211 5 for fossil fuels and equation 6 for electricity,

$$212 \quad E_{total, f, y} = \sum_{s=1}^{smax} TER_{s, y} \left(\frac{IE_{f, s}}{IE_{total, s}} \right) (1 - EE_{f, s, y}), \quad (\text{Eq. 5})$$

$$213 \quad E_{total, e, y} = \sum_{f=1}^3 \sum_{s=1}^{smax} TER_{s, y} \left(\frac{IE_{f, s}}{IE_{total, s}} \right) (EE_{f, s, y}), \quad (\text{Eq. 6})$$

214 where $E_{total, f, y}$ is the total amount of fossil fuel f required by the transition in year y , $IE_{f, s, y}$ is the
 215 initial amount of energy provided by fossil fuel f in sector s , $IE_{total, s}$ is the total amount of energy
 216 initially used in sector s , and $E_{total, e, y}$ is the total amount of electricity used by the transition in year
 217 y . Third, we aggregate the energy requirements by vector into final energy using equation 7,

$$218 \quad E_{total\ final, y} = \sum_{f=1}^3 E_{total, f, y} + E_{total, e, y}, \quad (\text{Eq. 7})$$

219 where $E_{total\ final, y}$ is the total energy required by the transition in year y .

220 **2.7 Indirect energy requirements**

221 The direct energy requirements calculated using equation 7 are obtained using a bottom-up assessment
 222 and hence are likely underestimated due to truncation errors caused by narrow system boundaries [28–
 223 34]. To estimate the truncation error, referred to here as indirect energy requirements, we consulted
 224 literature which aims to quantify this error in the context of process-based life cycle assessments
 225 [28,34]. As in [16], we use a ratio of “true” energy requirements to estimated energy requirements of
 226 1.3, which means the true energy requirements are 30% larger than the direct energy requirements. The
 227 indirect energy requirements are assumed to be spread across sectors and energy vectors with the same
 228 distribution as direct energy requirements.

229 **2.8 Uncertainties and sensitivity analysis case studies**

230 The parameters used in this model are all derived from peer-reviewed sources, with most parameters
231 being based on multiple sources. However, there is still uncertainty associated with each parameter. To
232 test the robustness of the model results, we assign an uncertainty in the form of a standard deviation to
233 each parameter based on the certainty of the source(s) used to obtain it (see supplementary Table 3 for
234 mean and standard deviation values used). The model is then run 1,000 times for each case studied,
235 sampling parameter values from a Gaussian distribution, and a 90% confidence interval is shown on
236 every result obtained.

237 In addition to this, we conduct three sensitivity analysis case studies on parameters that are
238 highly uncertain and parameters of which the value results from engineering or policy decisions that
239 have not yet been taken. (1) Industry thermal energy use can be electrified by using electricity directly,
240 by using green hydrogen, or by using high-temperature heat pumps where applicable. We use three
241 different values for the industry energy use sector factor to represent (i) a neutral mix of technologies
242 as used in the default model, (ii) a mix of technologies with a high penetration of hydrogen use, and
243 (iii) a mix leaning towards a high uptake of heat pumps. (2) The electrification of heavy-duty road
244 transport can be achieved by using either hydrogen fuel cells or batteries to replace diesel tanks. We use
245 two different values for heavy-duty road transport sector factors to represent (i) using fuel cells as in
246 the default model and (ii) using batteries. Note that choosing batteries over fuel cells would result in a
247 significantly lower range, which could exacerbate logistical challenges, and that although batteries
248 represent significant energy requirements in light vehicles, we assume these energy requirements are
249 negligible for trucks due to their high use factor (as a device is used more intensively during its lifetime,
250 its embodied energy diminishes compared to the energy it uses). (3) The length of grid extensions
251 needed to transport the additional electricity generated and deal with the spatial heterogeneity of wind
252 and solar-based generation is subject to significant uncertainty [9,35–37] (see supplementary note 5 of
253 [16]). We assess the impact of the modelling methodology used by producing three scenarios where (i)
254 the grid requirements scale with the gross electricity production as in the default model, (ii) the grid
255 requirements scale with the installed capacity of power plants (as done by [9]), and (iii) the distribution
256 grid scales with installed capacity, and the transmission grid scales with four times the electricity
257 generation (as observed in literature summarised in supplementary note 5 of [16]).

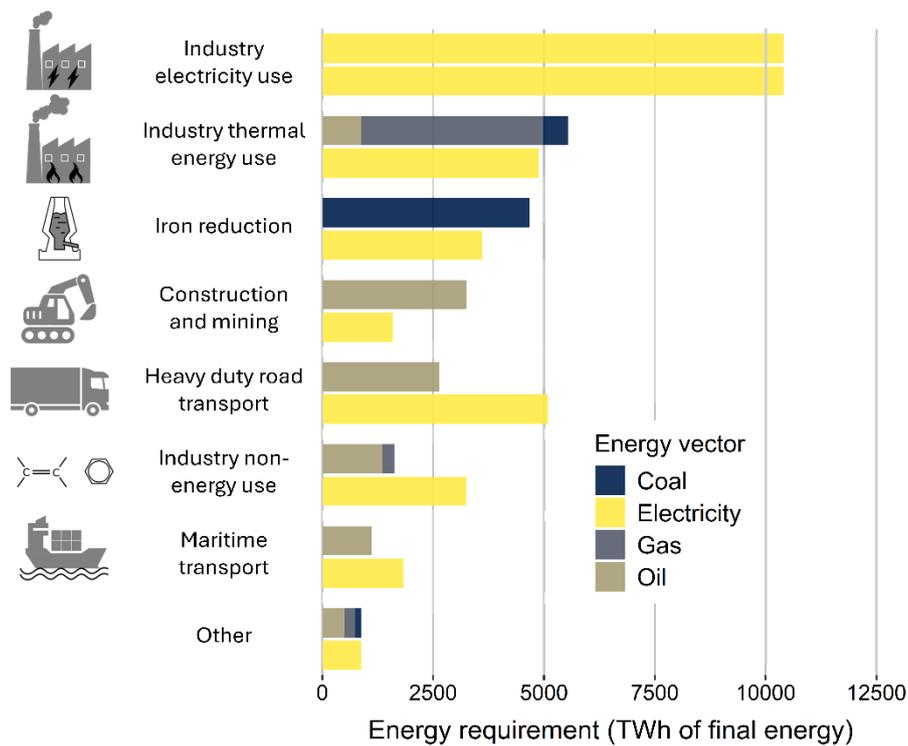
258 **3. Results**

259 **3.1 Industrial sectors used to produce transition infrastructure are more difficult to**
260 **electrify than average.**

261 We summarise the distribution of transition energy requirements among different sectors and energy
262 vectors in Fig. 4 for two illustrative scenarios: one where all infrastructure is built with the current
263 energy mix, and another where all infrastructure is built using electrified processes only.

264 We observe that 33-35% of the transition energy requirements are in industry electricity use,
265 which does not become more efficient in final energy terms when switching from a fossil fuel to a solar
266 and wind-based energy system. This is mainly due to two materials required by the transition which
267 have electricity-intensive production processes: aluminium, used in solar panel frames and grid
268 transmission lines, and silicon wafers in photovoltaic panels. The sectors which experience efficiency
269 gains with electrification are industry thermal energy use (used widely in production processes), iron
270 reduction (for primary steel production used mainly in wind turbine towers), and construction and
271 mining (used in the mining phase of all minerals, and site preparation for solar plants and wind turbine
272 foundations). On the other hand, heavy duty road transport (used for all materials, but with the bulk of
273 energy demand associated with gravel, sand and concrete transport which make up 65-80% of mass
274 requirements of wind and solar farms), maritime transport (used for all materials), and industry non-
275 energy use (mainly producing plastics used as wire gauges, and other smaller parts) become less energy
276 efficient with electrification. Note that using battery electric trucks would reverse the trend for heavy
277 duty road transport, as seen in sector factor calculations in supplementary note 1 and supplementary
278 figure 3.

279



280

281 **Fig. 4 | Distribution of transition energy requirements amongst sectors.** Total energy required by the transition
 282 in each sector to phase out fossil fuels by 2050, whilst maintaining all services previously provided by fossil fuels.
 283 The top bar indicates the amount of energy required using the current energy mix disaggregated by energy vector,
 284 and the bottom bar indicates the amount of energy required if the energy mix is 100% electrical.

285

286 **3.2 Electrifying transition infrastructure production processes increases total transition**
 287 **energy requirements.**

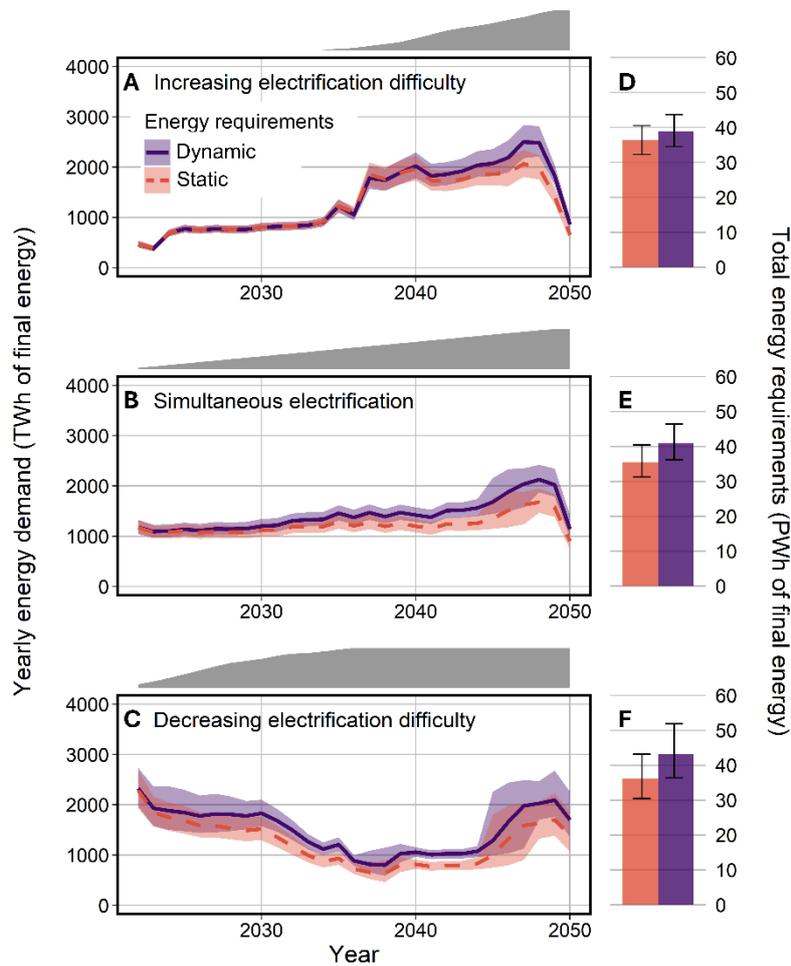
288 We compare transition energy requirements calculated using the static and the dynamic modelling
 289 methods under three scenarios with different sector electrification orders (Fig. 5). In the static
 290 methodology results, the three scenarios exhibit two similar trends: first, around 2047, 25 years after
 291 the start of the transition, there is an increase in transition energy requirements caused by the need to
 292 replace wind turbines built in 2022. Secondly, the transition energy requirements increase gradually as
 293 the stock of solar panels and wind turbines grows, leading to higher electricity self-consumption and
 294 maintenance requirements.

295 The different shapes of the three static methodology curves are caused by the order of sector
 296 electrification. The model assumes we substitute a fixed amount of fossil fuels each year, hence

297 electrifying a high-sector factor sector requires more wind turbines, solar panels and grid extensions to
298 be built in a year, leading to higher transition energy requirements. Electrifying sectors in order of
299 increasing or decreasing electrification difficulty effectively shifts energy transition requirements later
300 (Fig. 5A) or earlier (Fig. 5C) respectively, while simultaneous electrification spreads the transition
301 energy requirements as evenly as possible (Fig. 5B). Despite all three scenarios having the same stock
302 of solar panels and wind turbines at the end of the transition, building the stock later means it needs to
303 be maintained and operated for less time, and fewer wind turbines are built before 2025 and ultimately
304 need to be replaced within the transition period. As a result, electrifying sectors in order of increasing
305 difficulty leads to the lowest static transition energy requirements, followed by simultaneous
306 electrification and decreasing difficulty. This mechanism affects the dynamic methodology scenarios in
307 the same way as the static methodology.

308 The divergence between the results of the static and dynamic methodologies increases as sectors
309 directly used to produce energy transition infrastructure are electrified (Fig. 5A-C). This occurs because
310 these sectors have a high – and hence unfavourable - weighted average sector factor of 1.07, compared
311 to 0.80 for the overall economy. As a result, the dynamic methodology always reports higher transition
312 energy requirements than the static methodology, although the difference in cumulative energy
313 requirements of the between the two methodologies varies depending on the order of sector
314 electrification (Fig. 5D-F). When sectors are electrified in order of increasing difficulty (Fig. 5A, D),
315 the sectors used in producing transition infrastructure are electrified later, hence the energy requirement
316 burden is born for fewer years leading to lower overall transition energy requirements. In contrast,
317 electrifying sectors in order of decreasing difficulty causes these sectors to be electrified earlier on,
318 resulting in the energy burden being born for the longest time and requiring the highest transition energy
319 requirements of the scenarios shown (Fig. 3.4B, E). Electrifying all sectors simultaneously leads to the

320 transition energy requirements obtained from both methodologies diverging progressively, and to
 321 intermediate cumulative energy requirements relative to the other two scenarios (Fig. 5C, F).



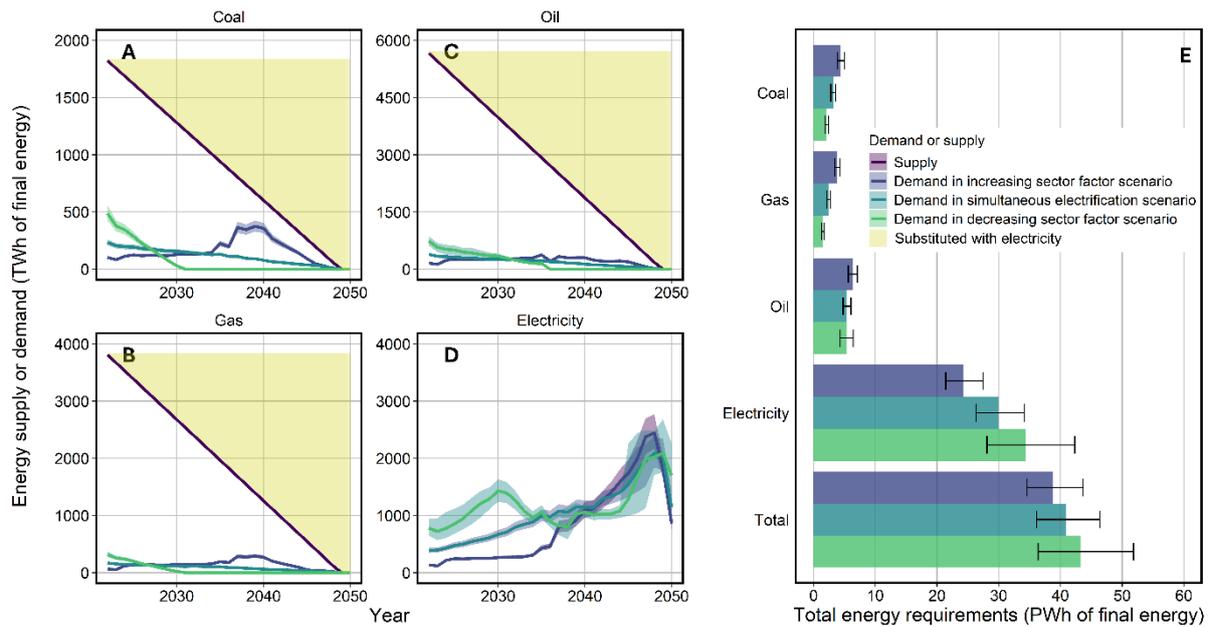
322

323 **Fig. 4 | Effect of sector electrification order on transition energy requirements.** Yearly (A-C) and cumulative
 324 (D-F) energy requirements of the transition using a static (red bars and lines) or dynamic (purple bars and lines)
 325 modelling methodology. The grey shaded area above each plot represents the overall progression of electrification
 326 in sectors directly used to produce transition infrastructure. The shaded regions surrounding the lines and the error
 327 bars on the bar charts represent 90% confidence intervals based on 1,000 simulations with parameter values
 328 sampled from normal distributions.

329 **3.3 Fossil fuel supply tensions can be mitigated through selecting the order of sector**
 330 **electrification.**

331 When sectors directly used in producing transition infrastructure are electrified, the energy
 332 requirements of the transition are shifted from fossil fuels to electricity (Fig. 4). We show this on a
 333 continuous timeline in Fig. 6A-D. In Fig 6A-C, we see that for the decreasing sector factor scenarios,

334 fossil fuels are phased out from transition energy requirements by mid-transition and hence show the
 335 lowest transition fossil fuel requirements (Fig 6E). In the other two scenarios, they are required all
 336 throughout the transition. As a result, electricity requirements are much higher for the decreasing sector
 337 factor scenario for the first half of the transition (Fig. 6D). Only the coal requirements in the increasing
 338 sector factor scenario come close to their respective supply, indicating criticality, while all other energy
 339 vectors and scenarios exhibit low criticality.



340
 341 **Fig. 6 | Effect of sector electrification order on fossil fuel demand and criticality.** Yearly transition-related
 342 demand of coal, oil, gas, and electricity (A-D) and cumulative transition-related energy requirements
 343 disaggregated by energy vector (E). The shaded regions surrounding the lines and the error bars on the bar charts
 344 represent 90% confidence intervals based on 1,000 simulations with parameter values sampled from normal
 345 distributions.

346
 347 **4. Discussion**

348 **4.1 Implications of increasing energy requirements for the energy transition**

349 We introduce a methodology that incorporates how the electrification of production processes affects
 350 the energy required to produce transition infrastructure. This is achieved by disaggregating the energy

351 requirements of materials and processes needed to build transition infrastructure into specific sectors
352 and estimating how their efficiencies change when electrified.

353 As the transition energy requirements are concentrated in hard-to-electrify sectors, these
354 requirements increase by 5% under a fully electrified energy mix compared to the current fossil-
355 dominated mix. At the same time, energy supply decreases by 20%, leading to a 31% relative increase
356 in the share of energy supply spent on the energy system during the transition. This divergence between
357 the dynamic and static methodology results is only fully realised once all the sectors that the transition
358 makes use of are electrified, and since these only represent 37% of total fossil fuel energy use, the order
359 in which sectors are electrified determines how much of this divergence is observed during the transition
360 period. Electrifying sectors from easiest to hardest minimises this gap, with the dynamic transition
361 energy requirements only being 7% greater than static ones, while in the simultaneous and hard-to-easy
362 electrification orders they are 15% and 20% greater, respectively (Fig. 5). This highlights that even
363 under favourable sector electrification order, net energy barriers to the transition are still greater than
364 suggested in previous work [10,15,17–21].

365 Disaggregating transition energy requirements into energy vectors (Fig. 6) shows that the easy-
366 to-hard electrification order leads to the strongest fossil fuel criticality, although this remains weak
367 except for coal. In this electrification order, the largest fraction of coal, oil, gas, and electricity supply
368 required by the transition is 60%, 24%, 21%, and 27%, respectively, peaking between 2040 and 2047.
369 Because these fractions remain relatively low, the net energy advantages of electrifying sectors from
370 easiest to hardest outweigh the criticality risks incurred, with two exceptions. First, the iron reduction
371 sector, which represents only a quarter of total coal consumption in the EU but makes up a
372 disproportionate fraction of transition coal requirements (86% of transition coal requirements in 2040,
373 when peak criticality occurs), should be electrified in the first half of the transition. Second, while the
374 sector factor of fossil fuel-based electricity generation is generally low, replacing fossil power plants
375 with solar and wind energy significantly increases the fraction of electricity generation from intermittent
376 sources. As this may disproportionately increase storage losses, it could be advantageous to delay their
377 substitution.

378 Sensitivity analyses on key modelling assumptions highlight that opting for technological
379 choices with higher efficiency has strong net energy benefits, and that developing better electricity grid
380 models will improve transition energy requirement studies. Improving the efficiency of a technology
381 electrifying a sector used to build transition infrastructure has a triple effect on net energy. First, this
382 decreases the amount of electricity production needed to phase out fossil fuels, so less renewable power
383 plants and grid extensions need to be built, reducing transition energy and material requirements.
384 Second, a more efficient electrified sector reduces the energy requirement per unit of transition
385 infrastructure built. Third, as the fraction of electricity produced with intermittent sources and the total
386 electricity production fall, storage losses are also expected to fall.

387 Over the transition period, using more efficient battery electric trucks rather than hydrogen fuel
388 cell trucks reduces total transition energy requirements by 13% when electrifying all sectors
389 simultaneously (see supplementary Fig. 3F). Similarly, prioritising heat pumps for industrial thermal
390 energy use over electric boilers could decrease transition energy requirements by 6%, whereas using
391 hydrogen boilers increases them by 11% (see supplementary Fig. 3D). Finally, we find that if grid
392 requirements scale with installed capacity rather than electricity production (as in [9]), this increases
393 transition energy requirements by 13%; if further to this, transmission grid requirements are quadrupled
394 compared to the base case (as observed in [35–37]), this rises to 25% (supplementary Fig. 3E). Grid
395 requirement changes therefore introduce significant uncertainty in our results, suggesting that more
396 advanced grid models such as [35–38] could support a more robust assessment.

397 As the transition scenarios presented here involve a high penetration of intermittent renewable
398 energy sources into the electricity production mix (>80%), electricity will need to be stored to guarantee
399 reliable supply. This will lead to storage losses due to the round-trip efficiency of storage devices as
400 well as curtailment losses when electricity cannot be economically stored. Based on previous work,
401 these are likely of a similar magnitude to transition energy requirements and hence play a significant
402 role in the net energy challenges of the transition (see supplementary note 6 of [16] summarising
403 findings of [7,36,39–44]). This suggests integrating energy system models capable of quantifying these
404 losses and transmission grid expansion requirements into a physically consistent framework would
405 significantly improve the robustness of results obtained.

406 **4.2 Implications for net energy research**

407 A persistent methodological challenge in net-energy analysis arises from the need to compare energy
408 sources of different forms, such as electricity and heat, using a conversion factor [45]. This is
409 particularly relevant when estimating the energy return on investment (EROI) of energy technologies
410 that produce electricity – such as wind turbines, solar panels, nuclear power plants or hydroelectric
411 dams – but require both electrical and thermal energy to build. Previous studies assumed very different,
412 static conversion factors. Sahin et al. [21] assumed one unit of primary thermal energy converts to 0.4
413 units of electricity, while Capellán-Pérez et al. [15] and Slameršak et al. [10] assumed that final thermal
414 and final electrical energy are equivalent.

415 The framework we present addresses this discrepancy by deriving a physically grounded
416 conversion ratio. Once all sectors have been electrified, we find that, on average, 0.80 units of final
417 electrical energy are needed to substitute one unit of fossil fuel-based final thermal energy. This is
418 slightly higher than the value of 0.72 found in [16] because heavy road transport is considered separate
419 from light road transport in this paper and has a worse sector factor. However, if battery electric trucks
420 are considered instead of hydrogen fuel-cell trucks, this value decreases to 0.73. Presently, only easy-
421 to-electrify sectors (e.g., lighting, residential/commercial heating, light road transport, and rail
422 transport) have undergone substantial electrification, hence the appropriate ratio is closer to Sahin et al.
423 [21]’s suggestion. As the transition progresses, the relevant factor will change based on how much
424 energy is used in each sector, the technologies adopted for electrification, and their extent of
425 deployment.

426 As our results indicate that the electrification of sectors leads to changes in the amount of energy
427 needed to produce materials used in transition infrastructure, the denominator of an EROI calculation
428 (the amount of energy required to obtain a unit of energy) must be dynamic. To illustrate how this
429 impacts net energy analysis, we provide an example using wind turbines and solar panels. We find that
430 obtaining materials for onshore wind turbines or solar panels generating 1 TWh of electricity per year
431 with a fully electrified mix requires 8% less final energy than with the current mix. For offshore wind
432 turbines, the decrease is larger, at 11%. This reflects that offshore wind turbines rely most heavily on

433 steel, which is currently produced using coal in processes that become more efficient when electrified,
434 whereas the energy requirements of solar panels and onshore wind turbines are slightly skewed towards
435 harder-to-electrify sectors. These insights indicate the transition itself will change the energy
436 requirements of transition infrastructure, and therefore the static “cumulative energy demand” approach
437 used by previous studies [15,17–21,46] is not appropriate for scenarios with deep electrification. A
438 robust physical framework capable of reflecting this dynamic system is indispensable to net energy
439 analysis in a transition context.

440 **4.3 Implications of dynamic methodology findings for energy transition research**

441 Disaggregating transition energy requirements by sector and by energy vector reveals complexities that
442 aggregated net energy analyses cannot capture. Because this approach also shows that higher energy
443 requirements are likely, it is even more crucial to represent them in transition models. Our methodology
444 provides greater granularity than studies using “primary” and “final” energy stages as the results do not
445 need to be presented in an aggregated form using semi-arbitrary conversion factors to assess net energy.
446 This framework enables more detailed discussions on the net energy consequences of the transition,
447 such as the likelihood of energy supply stress in specific fuels (Fig. 6A-D) and the saturation of specific
448 sectors by transition needs (supplementary Fig. 2). As more specific insights are obtained, the energy-
449 related barriers to the transition can be described more precisely and support more targeted policy
450 recommendations, as in section 4.1. Therefore, we believe that future research on transition scenarios
451 should adopt similar physically grounded frameworks.

452 More broadly, the amounts of energy required to obtain different products crucial to the global
453 economy (e.g., steel, concrete, plastics, fertilisers, and goods transport [47], which make up >15% of
454 current energy expenditure [48]) will change in differing magnitudes and directions under a full energy
455 transition based on electrification. Hence, a transition model without a robust physical framework
456 describing these changes will be unable to accurately depict the future physical world. Such models risk
457 internal inconsistencies between the available energy supply, the energy invested in building the energy
458 system itself, and the residual energy available for other sectors [46]. Policies derived from such
459 analyses may thus be based on physically infeasible situations, undermining their effectiveness. On the

460 other hand, a model with a physical framework can highlight physical barriers to the transition and
461 inform policies to address them. Overall, we encourage the ongoing move away from non-physical
462 transition models towards physical models capable of describing the changes brought by mass
463 electrification, as the former's usefulness is undermined by the transition itself [46,49]. This will enable
464 better transition planning and minimise the risk of unforeseen bottlenecks.

465 **4.4 Limitations and future research opportunities**

466 Despite improving on previous approaches to estimate transition energy requirements, this study retains
467 several limitations, which we outline below alongside avenues for future research.

468 We use static values for several parameters that may be better described by dynamic values,
469 such as the energy efficiency of services, their demand levels, the performance factors of renewable
470 power plants, and their material requirements. The model also has a limited scope and hence cannot
471 consider how climate change will affect bioenergy and hydroelectricity supply, or how the recycled
472 content of materials will evolve. Finally, we do not use a full energy system optimisation model (ESOM)
473 to estimate the grid extension requirements or storage losses arising from the increasing electricity
474 production from intermittent sources (see section 2.5.3 for a detailed discussion of how these limitations
475 can affect the results).

476 Beyond these methodological and scope-related constraints, broader system-level dependencies
477 must also be considered. Although we estimate how much transition energy requirements increase once
478 fossil fuels are completely phased out, this does not mean that the supply chains of transition
479 infrastructure are made independent of fossil fuels. For example, helium, a by-product of natural gas
480 [50], is used in the manufacture of semi-conductors [51], which are essential for making the inverters
481 required by solar and wind farms [52]. As a result, if global natural gas production is stopped, essential
482 components of a solar- and wind-heavy grid risk becoming unavailable. Such supply chain dynamics
483 are beyond the scope of this work, but identifying them is essential to understanding and overcoming
484 obstacles to the transition

485 Finally, future work could go beyond estimating sector- and energy vector-level transition
486 energy requirements in two ways. First, as oil and coal are not homogenous vectors, and different

487 subcategories of these fossil fuels can only be used in specific sectors (e.g., gasoline and bitumen are
488 not interchangeable, and neither are bituminous and sub-bituminous coals) further disaggregating their
489 supply and transition-related demand could highlight other barriers. Second, because establishing
490 industrial capacity and training a specialised workforce can take decades, quantifying these needs would
491 clarify when such efforts must begin. This would enable plans for deploying infrastructure and
492 restructuring the workforce to be made ahead of time, helping to prevent these factors from becoming
493 bottlenecks for the transition.

494 **5. Conclusion**

495 This study introduces a framework that disaggregates the energy required to build transition
496 infrastructure by sector and energy vector, revealing how these requirements evolve as electrification
497 progresses. This captures more complex dynamics through which the transition will affect net energy
498 availability and the broader economy than aggregated net energy analysis [15,17–21]. Our results show
499 that these dynamics lead to stronger net energy constraints than previously documented. These
500 constraints are dependent on the order in which sectors are electrified. Starting from the easiest-to-
501 electrify and ending with the hardest-to-electrify results in the lowest energy requirements. However, it
502 leads to a high supply tension for coal, hence we suggest the prioritising electrifying the iron-reduction
503 process (whether via hydrogen direct reduction [53,54] as assumed here, or using different methods as
504 described in [55]) to mitigate this. Similarly, it may be sensible to substitute fossil fuel power plants
505 later than implied by the easy-to-hard electrification order, as this could prevent storage losses from
506 rising too rapidly. We identify three mechanisms through which improving the electrification efficiency
507 of a sector used to produce transition infrastructure improves net energy prospects and quantify two of
508 these impacts. As we find them to be significant, we support prioritising battery electric trucks and high-
509 temperature heat pumps over hydrogen fuel cell trucks and hydrogen boilers.

510 Beyond these sector- and vector-specific findings, the transition and the mass electrification
511 associated with it will significantly change how goods and services that are essential to the global
512 economy are produced (steel, plastics, fertilisers, concrete, and goods transport [47]). The amount of
513 energy needed to produce them will increase to different extents, likely affecting how they are used in

514 the global economy. Alongside the increasing amount of energy spent maintaining the energy system,
515 this is likely to deeply affect the energy system and the economy it underpins. This highlights the
516 importance of continuing the shift towards using physically consistent frameworks to support transition
517 planning. This is crucial given the increasing risk of fossil fuel depletion [56,57], and even more so in
518 regions highly dependent on imports such as the EU, which imports 90% of its oil [58] and gas [59]
519 consumption.
520

521 **Acknowledgements**

522 The authors are grateful to participants to the seminar “From Modelling to Strategic Decision-
523 Making Facing Planetary Boundaries: Issues and Challenges of a Multi-Disciplinary
524 Approach” (Les Houches, June 23-28, 2024) for fruitful comments on the work conducted. We
525 also sincerely thank the researchers who have made their data publicly available as online
526 supplementary information.

527 **Author Contributions**

528 UVL: Conceptualisation, Methodology, Formal Analysis, Writing - Original Draft,
529 Visualization; LD: Writing - Original Draft, Writing - Review & Editing, Supervision; PBP:
530 Conceptualization, Writing - Review & Editing, Supervision

531 **Financial support**

532 UVL thanks the EPSRC for funding their PhD studentship (grant number
533 EP/T51780X/1). LD thanks the Erling-Persson Family Foundation for funding the research.

534 **Conflicts of Interest declarations**

535 The authors declare that they have no known competing financial interests or personal
536 relationships that could have appeared to influence the work reported in this paper.

537 **Data availability**

538 All data and supplementary information will be made available upon request. The code used
539 for the model will be made available upon request.

540 **Declaration of AI use**

541 We have used AI-assisted technologies for spellchecking and as inspiration for rewording
542 individual sentences. After using these tools, the authors reviewed and edited the content as
543 needed and take full responsibility for the content of the publication

544

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