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# Extreme curvature of shallow magma pathways controlled by competing stresses 

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## Summary paragraph

To feed off-summit eruptions at volcanoes, magma moves by creating and passing through cracks that can propagate many kilometres downslope. Typically, these cracks are vertical (dykes). Here we analyse the propagation of a flat-lying magma-filled crack (sill) at Sierra Negra volcano, Galápagos Islands, using space-borne radar interferometric data spanning the 2018 eruption. This sill propagated along a $15-\mathrm{km}$-long curved trajectory, which is hard to explain with current understanding and models. We perform both a simple analytical analysis and three dimensional (3D) numerical crack propagation simulations, which incorporate the effects of magma buoyancy, realistic topography and tectonic stresses that may control the sill's propagation. We show that sill trajectories can only be understood and predicted if accounting for the interaction of all these factors, and explain the observed trajectory at Sierra Negra as the result of competing stresses being close to one another through-

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# out the propagation of the sill. Under certain conditions, these events may be inherently unstable but remain predictable by combining high resolution observations with sophisticated theoretical understanding. 

## 1 Introduction

Sierra Negra is an intra-plate basaltic shield volcano with a maximum elevation of 1140 m above sea level (a.s.l.), a shallow ( 110 m ) and structurally complex $7 \times 10 \mathrm{~km}$ elliptical caldera, and is the most voluminous of the five coalescing volcanoes that form Isabela Island in the western Galápagos Archipelago, Ecuador ${ }^{1}$. Thirteen effusive eruptions have occurred at Sierra Negra since 1813. The three most recent eruptions ${ }^{2}$ all occurred in the northern flank of the volcano and produced $0.90 \mathrm{~km}^{3}$ in $1979,0.15 \mathrm{~km}^{3}$ in 2005 , and $0.19 \mathrm{~km}^{3}$ in 2018 . While the 1979 and 2005 eruptions were fed by vents high on the northern flank and with eruptive fissures aligned parallel to the caldera rim, the vents of the 2018 eruption were scattered with no preferred orientation up to 9.5 km from the caldera rim, at a minimum elevation of 90 m a.s.l. Vents at such low elevation do not seem to be common in the recent history of the volcano. On the other hand, some of the higher-elevation eruptive vents of the 2018 eruption reactivated existing fissures. The 2018 eruption interrupted a thirteen-year semi-continuous period of uplift that raised the floor of the summit caldera by up to 5.2 m since the 2005 eruption as measured by GPS (Extended Data Fig. 1), presumed to be re-pressurization of a $\sim 2 \mathrm{~km}$ deep magma reservoir. On the 26 June 2018 at 19.40 the appearance of volcanic tremor marked the beginning of the eruption. Throughout the eruption, seismicity was mainly located along the caldera fault system with fewer events in the northwestern upper flank. Caldera deflation rapidly started with the onset of eruptive activity and by the time the eruption ended on August 25th 2018, GPS stations measured a cumulative intra-caldera subsidence of up to $\sim 8.5 \mathrm{~m}$ (Extended Data Fig. 1).

Short-lived ( $<24 \mathrm{hrs}$ ) effusive eruptions from multiple fissures (Fissure 1-5, Fig. 1) on 26-27 June were followed by a long-lasting effusive eruption from the most distal fissure (Fissure 6) between July 1st and August 25th. Geodetic monitoring by continuous GPS at Sierra Ne-
gra is limited to the summit caldera, such that the feeder-induced surface displacements were only measured by interferometric synthetic aperture radar (InSAR). The first co-eruptive synthetic aperture radar (SAR) image was acquired on 29 June at 17:50 UTC by the Japan Aerospace Exploration Agency's ALOS-2 satellite, approximately 70 hours after the onset of the seismic swarm (Fig. 1). Further SAR images were acquired on 30 June and 1 July by the European Space Agency's Sentinel-1 satellite constellation, right before the opening of Fissure 6 (Extended Data Fig. 2a and b). Additional SAR images were captured during the eruption of Fissure 6 (Extended Data Fig. 3a and b).

Surface deformation patterns before and after Fissure 6 erupted show a surprising trajectory for the propagating feeder. The deformation patterns point at a flat-lying magma body (sill, see Methods) with a propagation direction that turned by over 90 degrees, whilst the sill remained flat-lying. Even though turning and twisting of dykes has been observed frequently ${ }^{3-5}$, such a 90 degree turn has never been observed before.

## 2 Parameters and numerical result

In order to understand why the sill turned as observed, before proceeding with a 3D simulation, we reduce the physics of this problem to its component parts and evaluate how these affect the sill's direction of propagation. Previous studies have found that dyke trajectories are dependent on the ratio of tectonic to topographic loading stresses ${ }^{3,6,7}$. Here we propose that contrasting magma and rock weight gradients (buoyancy) must also be considered as one of the dominant forces.

Propagation directions of dykes have typically been predicted by maximizing the strain energy release rate ${ }^{3,8}$, on test elongations at the leading tip, thereby finding the path of least resistance. Such a method is unwieldy for true 3D propagation, as it would involve computing a large number of potential tip-line growth patterns. Here we use a theoretically equivalent, but more flexible, approach based on the maximum stress intensity, $K$ (see Methods). In our analytical approach, we reduce the sill geometry to that of a penny-shaped crack subject to stress gradients
(Supplementary Information), with an opening that is compatible with the surface displacements observed along the short-axis of the sill (see Methods). At selected points along the sill's path, we calculate $K$ around the tip-line ${ }^{9}$, and assume the greatest tip-line advance occurs in the direction where $K$ is largest (Paris fatigue law ${ }^{10}$ ). In our numerical simulations, we discretise the sill into triangular elements ${ }^{10,11}$ and update the tip-line at each step using the local value of $K$ as compared to the critical rock strength, $K_{c}$.

In our analytical approach, we employ stress intensity equations in a full-space. We then go on to numerically test how the free surface and the real topography would affect these results. In the numerical simulations, we compute stresses under an arbitrary topography in 3D with an external elastic stress field. As in previous 3D studies we neglect viscous effects of the contained fluid and chamber pressure.

We constrain the parameters in both models using inversions of co-eruptive InSAR data along the propagation path (Fig. 1, see Methods): depth $d=950 \mathrm{~m}$, radius $c=1900 \mathrm{~m}$ and volume $V=1.6 \pi c^{2} \mathrm{~m}^{3}$. $V$ represents the volume of the inflated nose of the propagating fracture, which is around a 10th of the estimated erupted volume ${ }^{2}\left(0.018 \mathrm{~km}^{3}\right)$. We set the rock properties to: $\rho_{r}=2900 \mathrm{~kg} \cdot \mathrm{~m}^{-3}, \mu=2 \cdot 10^{9} \mathrm{~Pa}$ and $\nu=0.35$ corresponding to the rock density, shear modulus and Poisson's ratio, respectively.

## 3 Effects defining the sill's path

Opening stress intensity $K_{I}$ around the edge of a penny-shaped crack of volume $V$ in a fullspace, subject to a constant pressure ${ }^{12}$ is:

$$
\begin{equation*}
K_{I}=\frac{3 \mu V}{4(1-\nu) c^{2} \sqrt{\pi c}} \tag{1}
\end{equation*}
$$

$K_{I}$ around a crack under a pressure gradient ${ }^{12}$ is:

$$
\begin{equation*}
K_{I \alpha}=\frac{4}{3 \pi} \Delta \gamma c \sqrt{\pi c} \cos (\alpha) \tag{2}
\end{equation*}
$$

where $\alpha$ is the angle away from the direction of the linear stress gradient $(\Delta \gamma)$ on the crack's walls. The pressure gradient in equation (2) defines the direction of $K_{\max }$ (blue lines in Fig. 2a). As such, ignoring other effects, the direction and magnitudes of competing pressure gradients acting on the crack define its propagation direction.

We now estimate stress gradients at Sierra Negra. First, we use an analytical solution describing stresses beneath a ridge-like topography ${ }^{13} . h$ and $v$ are the horizontal and vertical axis, respectively. We compute the horizontal gradient of vertical stress: $\delta \sigma_{v} / \delta h$, i.e., the normal stress gradient driving a flat-lying crack away from the caldera rim, at the inferred sill depth along its track. Linear stress gradients due to the difference between rock and fluid density (buoyancy) ${ }^{14}$ are $\left(\rho_{r}-\rho_{f}\right) g \sin (\beta)$, where $\rho_{f}$ is the magma density. The factor $\sin (\beta)$ means that if the crack is flat this gradient is zero. We set ${ }^{15} \rho_{f}=\rho_{r}-300 \mathrm{~kg} \cdot \mathrm{~m}^{-3}$. For the parameters above, 15 km from the caldera center (around where the sill began to turn) the dip needs to be around $10^{\circ}$ for the buoyancy gradient to exceed the stress gradient due to the overlying slope (Extended Data Fig. 4) and drive the sill to turn away from the downslope direction (Fig. 2a).

As shown in Extended Data Fig. 5, a dipping sill is attracted towards the free surface. For $c / d=2$, as observed, a dip of $15^{\circ}$ results in the same $K_{I}$ increase for both buoyancy and free surface, doubling dip's effects.

Lastly, we test if the other intrusions to the east that fed fissures 2, 3 and 4 (Fig. 1) may have attracted the sill. Two penny-shaped cracks subject to equal internal pressure ${ }^{12,16}$ separated 5 km from each other, as observed (tip separation of 1.2 km ) experience a maximal $K_{I}$ increase of $\sim$ $3 \%$. Such an increase is minor compared to the processes described earlier.

To summarise the analytical analysis, the stress gradient due to topography drives the sill away from the caldera rim. As the slope shallows, the buoyancy gradient begins to dominate even for shallowly dipping cracks, causing the sill to turn. The free surface amplifies this effect (Extended Data Fig. 7). This analytical method of assessing the sill path is flexible and fast. In spite of its simplicity it can explain the trajectory of previous intrusions, including curved dyke trajectories such as the 2014 Bárðarbunga dyke path (Supplementary Information).

In order to allow interaction between all factors discussed above, we develop a 3D Boundary Element Model ${ }^{9,10}$ to simulate a penny-shaped crack beneath the real edifice's topography. We include stresses due to gravitational loading and traction-free boundary conditions on the surface ${ }^{9,17}$. Using orientations of the crack in the 3D space obtained by inverting surface deformation (see Methods), our model explains the turning of the sill for snapshots along its path (Fig. 2), showing that it is the interaction between sill dip, slope gradients and the free surface that causes the observed turning. Note that increasing the ratio of the horizontal to vertical stress ( $\sigma_{h} / \sigma_{v}$ ) in the topographic loading model results in better fits.

## 4 Full 3D propagation model

Lastly, we run full 3D fracture propagation simulations ${ }^{10}$. Here the crack is neither constrained to be planar nor circular in shape, only such that it maintains a constant $V$. The tip-line shape is recalculated at every iteration moving it forward in proportion to $K / K_{c}$, if $K / K_{c}>$ 1 , at each triangle. We remove triangular elements that shut closed. Bending or twisting of the fracture's tip-line out of its plane is calculated using the maximum circumferential stress criterion ${ }^{18}$.

In this last approach, we use a planar free surface with a start height at $y=0$ of 990 m with a slope of $3^{\circ}$ facing to the north. The lithostatically stressed body $\left(\sigma_{h}=\sigma_{v}\right)$ is loaded due to topography ${ }^{13}$ (Extended Data Fig. 4). We also apply throughout the body a compressive tectonic stress of 4.5 MPa directed along $\sigma_{y y}$, with $\sigma_{x x}$ the mean between $\sigma_{y y}$ and $\sigma_{z z}$, as suggested by stress indicators ${ }^{19}$. Shear stresses from the topographic loading solution ${ }^{13}$ are set to zero, on the assumption that these stresses are diminished over time by faulting, diking and longer term rock deformation processes in the edifice's flanks.

The initial crack is an ellipse 1000 m wide and 5000 m long at a depth of 1000 m below sea level, dipping to the west by $\beta=1^{\circ} . K_{c}$ is set to $70 \mathrm{MPa} \cdot \mathrm{m}^{0.5}$. We find when the fracture gets a certain distance away from the caldera centre, it begins to turn and propagates east (Fig. 3). By changing the values of the parameters one at a time, we investigate the sensitivity of the path to
the input parameters and initial geometry (Fig. 4). Reducing the initial start $\operatorname{dip} \beta$ or the buoyancy reduces the force driving the sill eastwards, causing the sill to stall as the topography shallows (Fig. 4, curves B to E). The start depth defines when the free surface attraction takes effect (Extended Data Fig. 7F), such that only shallower sills can propagate eastwards (Fig. 4, curves F,G). The fracture toughness and volume define how far the sill can travel downslope as the topography shallows. These also control the sill width, reducing the buoyancy force when this is smaller, again trapping the sill (Fig. 4, curves H to K ). When the tectonic compressive stress is reduced, in places $\sigma_{v}$ becomes the most compressive stress, causing the sills track to become very unstable with the sill quickly rising to the surface (Fig. 4L).

The simulations compare well with the observed trajectory; the sill was destined to turn, although it could have stalled or erupted earlier on its path.

## 5 Conclusions

Previous flank volcanism at Galápagos volcanoes has been fed by radial and circumferential dykes ${ }^{4,20}$. Here we have shown evidence of flank volcanism fed by a long curving sill. We find that trajectories of shallow sills underneath topography will be unstable and defined by a delicate balance between buoyancy forces, topographic load, external stresses and the free surface. Still, trajectories may be anticipated, provided all those factors are well-constrained and their interaction is accounted for. By combining such models with careful analysis of high-resolution crustal deformation data, we showed that such parameters as well as the state of stress of the volcano can be well constrained, reducing the uncertainties in the hazard.

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Fig. 1. Interferogram spanning the sill propagation phase of the $\mathbf{2 0 1 8}$ eruption. SAR data from the ALOS-2 satellite. Each colour cycle represents 11.45 cm of line-of-sight (LOS) surface displacement. Gray polygons show the extent of the lava flows emplaced during the time period spanned by the interferogram.

Yellow lines mark the location and extent of all eruptive fissures. Black triangles mark the location of GPS
stations. Black arrows show the satellite orbit direction ( $\sim \mathrm{N}-\mathrm{S}$ ), look direction ( $\sim \mathrm{E}-\mathrm{W}$ ), and the incidence
angle in degrees. Descending pass, Track 147, ScanSAR mode.


Fig. 2. Simulating the propagation direction of fracture at selected locations a) Analytical $K_{I}$ diagram. Black circles represent the fracture, distance of the dashed gray line to the fracture edge represents $K_{I}$ magnitude, blue segment represents $K_{\max }$ direction. Topographic contours in orange. b) Numerical simulation of the propagation direction at Sierra Negra. Fractures are scaled down to a 1 km radius, white dashed-line represents $K_{I}$ magnitude as in a). Dip and strike directions shown, defined by inversions (see Methods). For P7 a dip of $15^{\circ}$ is used. Dashed grey outline is a contour of sill-induced deformation from Extended Data

Fig. 3. Background $\sigma_{h} / \sigma_{v}=0.5$ in topographic loading model.


Fig. 3. Numerical simulation of the sill propagation. a) Map view, b) cross-section looking along the downslope direction and c ) cross-section looking along the $x$-axis c ). The fracture is shown at chosen locations along its computed path. Grey points are edges that closed in the previous iteration. The shaded patch in a) is the sill track and the dotted line is the caldera rim. In c) the solid line is the topographic slope used to load the body and the dashed line is the simulations free surface. Parameters used: $\beta=1^{\circ}, \rho_{f}=\rho_{r}-300$ $\mathrm{kg} / \mathrm{m}^{3}$, start depth of $1000 \mathrm{~m}, K_{c}=70 \mathrm{MPa} \cdot \mathrm{m}^{0.5}, V=1.6 \pi c^{2} \mathrm{~m}^{3}$ and $\sigma_{y y}=-4.5 \mathrm{MPa}$.


Fig. 4. Effects of parameters on the simulated sill path. Fracture paths from simulations as in Fig. 3,
defined by the triangle with the maximum $K$ value at each iteration. Dashed lines with blue dots are fractures that stalled, solid lines with red dots reached the free surface (erupted). In each simulation we changed one parameter with respect to Fig. 3, as follows: A is reference simulation from Fig. 3, B: $\beta=1.5^{\circ}, \mathrm{C}: \beta=0.5^{\circ}, \mathrm{D}$ $\rho_{f}=\rho_{r}-450 \mathrm{~kg} / \mathrm{m}^{3}, \mathrm{E}: \rho_{f}=\rho_{r}-150 \mathrm{~kg} / \mathrm{m}^{3}$, F: Start depth$=800 \mathrm{~m}, \mathrm{G}:$ Start depth=1200 m, H: $K_{c}=55$ $\mathrm{MPa} \cdot \mathrm{m}^{0.5}, \mathrm{I}: K_{c}=85 \mathrm{MPa} \cdot \mathrm{m}^{0.5}, \mathrm{~J}: V=1.8 \pi c^{2} \mathrm{~m}^{3}, \mathrm{~K}: V=1.4 \pi c^{2} \mathrm{~m}^{3}$, L: $\sigma_{y y}=-3 \mathrm{MPa}, \mathrm{M}: \sigma_{y y}=-6$ MPa.


## Methods

## GPS data

Extended Data Fig. 1 shows the continuous GPS time series for three stations located at the summit of Sierra Negra (see Fig. 1 for station locations). Data downloaded from http: / / geodesy.unr.edu.

## Definition of $\boldsymbol{K}$

The total stress intensity which is compared to the fracture toughness at a point of a cracks tip-line can be defined by a combination of the opening, sliding and tearing mode stress intensity factors ${ }^{18}\left(K_{I}, K_{I I}\right.$ and $\left.K_{I I I}\right)$.

$$
\begin{equation*}
K=\sqrt{K_{I}^{2}+K_{I I}^{2}+\left(\frac{1}{1-\nu}\right) K_{I I I}^{2}} \tag{3}
\end{equation*}
$$

which relates to strain energy release rate ${ }^{12}(\mathcal{G})$ through:

$$
\begin{equation*}
K=\sqrt{\frac{\mathcal{G} E}{1-\nu^{2}}} ; \tag{4}
\end{equation*}
$$

where $E$ is the Young's modulus.

## InSAR processing and additional observations

All interferograms were created using the InSAR Scientific Computing Environment (ISCE) software ${ }^{21}$ and by applying conventional differential InSAR processing techniques for stripmap, ScanSAR (ALOS-2), and Terrain Observation by Progressive Scans (TOPS) (Sentinel-1) data. Topographic contributions to the interferometric phase are removed using the Deutsches Zentrum für Luft und Raumfahrt (DLR) 12-m resolution digital elevation model based on TanDEM-X satellite measurements ${ }^{22}$, and interferograms are phase-unwrapped using the Statistical-cost, Networkflow Algorithm for Phase Unwrapping (SNAPHU) ${ }^{23}$ implemented in ISCE.

## InSAR inversions along track

Deformation source parameters and uncertainties are estimated using a Bayesian approach implemented in the Geodetic Bayesian Inversion Software ${ }^{24}$. The inversion algorithm samples posterior probability density functions (PDFs) of source parameters using a Markov chain Monte Carlo method, incorporating the Metropolis-Hastings algorithm, with automatic step size selection. Posterior PDFs are calculated considering errors in the InSAR data, which we directly quantify using experimental semivariograms to which we fit an unbounded exponential one-dimensional function with a nugget ${ }^{24}$. The exponential function is then used to populate the data variance-covariance matrix. Prior to inversions, all InSAR data sets are subsampled using an adaptive quadtree sampling ${ }^{25}$ to reduce the computational burden when calculating the inverse of the data variance-covariance matrix and in forward model calculations. For all models, we assume that the deformation sources are embedded in an isotropic elastic half-space with Poisson's ratio $\nu=0.25$. Since no detailed prior information on the deformation source parameters are available, prior probability distributions are assumed to be uniform between geologically realistic bounds. In each inversion, posterior PDFs are sampled through $10^{6}$ iterations. Depth estimates are referred to as distance from the surface.

At profile locations P1, P4 and P5 in Extended Data Fig. 6 we estimate source parameters of a rectangular dislocation with constant opening ${ }^{26}$ and retrieve openings of $0.74 \pm 0.03,1.73 \pm 0.03$ and $2.80 \pm 0.03 \mathrm{~m}$ respectively, where the value after $\pm$ brackets the 2.5 and 97.5 percentile of the results from our Bayesian inversion scheme ${ }^{24}$ (Extended Data Table. 1). Using such solutions the depth of this sill along its path is consistently $900-1000 \mathrm{~m}$ below the ground surface with a half-width of approximately 1.5 km .

## Choosing physical parameters

We approximate the sill in our analytical analysis as a penny shaped crack. To retrieve $c$ and $V$ for this geometry, we compare the ground deformation of a flat lying rectangular dislocation where the faces open 2 m with a depth $d$ of 950 m and its third axis extending far out of the
plane of observation, to the the analytical solution describing the uplift due to a pressurised pennyshaped crack under a half-space ${ }^{27}$ with the same $d$. The penny-shaped crack's ground deformation supplies a radial deformation pattern, therefore we only fit this to the ground deformation relative to the short-axis of the sill. Once fitted, we retrieve a radius $c=1900 \mathrm{~m}$ and volume $V=$ $1.6 \pi c^{2}$ (with the largest error $1.5 \%$ and $15 \%$ less than the maximum $u_{z}$ and $u_{x}$ value from the dislocation solution, respectively).

## Comparison of different effects on stress intensity factors

Extended Data Fig. 5 is computed using a numerical scheme to evaluate how $K_{I}$ in equation (1), decreases as the crack approaches the free surface ${ }^{9}$. For $c / d=2$ as observed, a dip of $15^{\circ}$ causes a relative increase and decrease of $K_{I}$ of $+30 \%$ and $-10 \%$ at its highest and lowest edge respectively. A $30 \%$ increase corresponds to the same $K_{I}$ increase as a sill dip of around $15^{\circ}$ due to $\left(\rho_{r}-\rho_{f}\right) g \sin (\beta)$. As with buoyancy, this effect increases with crack dip.

## End notes

## Data availability statement

Computed interferograms that support the findings of this study are achieved as geoTIFF files on Zenodo at http://... Sentinel-1 raw SAR data that support the findings of this study are publicly available at https://scihub.copernicus.eu. ALOS-2 raw SAR data availability is restricted to PI investigation at www.eorc.jaxa.jp/ALOS/en/.

## Code availability statement

The code used for boundary element numerical analysis in this study was the open source code https://doi.org/10.5281/zenodo. 3694163 with an interface with the Computational Geometry Algorithms Library software (C++) for meshing.

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## Author Contributions

T.D and M.B coordinated the work and wrote the initial manuscript. M.B and P.L acquired and analysed the InSAR and GPS data in this study. This analysis provided the evolution and geometry of the sill. T.D and E.R conceptualised the analytical and numerical fracture mechanics that form the interpretation in this work. T.D wrote the analytical and numerical fracture mechanics codes used in this study. All authors have read and revised the manuscript and contributed ideas to the research.

## Additional Information

Supplementary Information is available for this paper. Correspondence and requests for materials should be addressed to T.Davis.

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## Extended Data

Extended Data Table. 1. Bayesian inversion results for profiles shown in Extended Data Fig. 6, using rectangular dislocations ${ }^{26}$. The 2.5 percentile value, the maximum a posteriori probability solution, and the 97.5 percentile value are shown for each parameter. The results for P7 are not shown, due to unsatisfactory fits to the data.

| Profile | Opening $[\mathrm{m}]$ | Dip $^{\circ}$ | Dip Direction $^{\circ}$ | Depth $[\mathrm{m}]$ | Down-dip width $[\mathrm{m}]$ | Along-strike width $[\mathrm{m}]$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| P1 | $0.7 / 0.7 / 0.8$ | $0.6 / 1.6 / 2.7$ | $19 / 21 / 23$ | $861 / 899 / 958$ | $2907 / 2949 / 2986$ | $2554 / 3175 / 4503$ |
| P2 | $1.0 / 1.0 / 1.0$ | $11.0 / 12.8 / 15.4$ | $136 / 140 / 142$ | $998 / 1058 / 1335$ | $2527 / 2637 / 3787$ | $2356 / 2387 / 2421$ |
| P3 | $1.2 / 1.2 / 1.2$ | $3.0 / 5.5 / 7.5$ | $138 / 140 / 142$ | $939 / 992 / 1040$ | $3541 / 3891 / 13903$ | $2119 / 2140 / 2172$ |
| P4 | $1.7 / 1.8 / 1.8$ | $16.7 / 17.4 / 18.1$ | $199 / 199 / 200$ | $1053 / 1084 / 1115$ | $3296 / 3604 / 3653$ | $1754 / 1771 / 1789$ |
| P5 | $2.8 / 2.8 / 2.8$ | $14.0 / 14.5 / 15.0$ | $210 / 210 / 210$ | $994 / 1010 / 1026$ | $2196 / 2210 / 2224$ | $2838 / 2850 / 2859$ |
| P6 | $2.80 / 2.83 / 2.85$ | $14.1 / 14.6 / 14.9$ | $352 / 353 / 353$ | $976 / 993 / 1007$ | $2322 / 2340 / 2353$ | $2826 / 2840 / 2851$ |

Extended Data Fig. 1. Vertical GPS movement's from continuous GPS stations GV01, 02 and 04
situated on Sierra Negra's summit. See Fig. 1 for station location


## Extended Data Fig. 2. Interferograms of Sierra Negra spanning the sill propagation phase of the

2018 eruption. SAR data are from the Sentinel-1 satellite. Same colourbar as Fig. 1, with each colour cycle as 2.8 cm of LOS ground displacement. Black arrows show the satellite orbit direction, a) $\sim \mathrm{S}-\mathrm{N} \mathrm{b}) \sim \mathrm{N}-\mathrm{S}$,
look direction a) $\sim$ W-E b) $\sim$ E-W, and the incidence angle in degrees. a) Ascending pass, Track 61 TOPS
mode. b) Descending pass, Track 106, TOPS mode. Symbols as in Fig. 1 in the main text.


Extended Data Fig. 3. Interferograms of Sierra Negra spanning the whole propagation and early eruption phase of the 2018 eruption. SAR data are from the ALOS-2 satellite. Colourbar as Fig. 1, with each colour cycle as 11.45 cm LOS ground displacement. Black arrows show the satellite orbit direction, a)

[^1]Track 41, Fine Stripmap mode (SM3; pixel resolution 9.1x5.3 m). b) Descending pass, Track 147, Ultra-fine

Stripmap mode (SM1; pixel resolution 3.0x3.0 m). Symbols as in Fig. 1 in the main text.


Extended Data Fig. 4. Magnitude of stress gradients, topographic vs buoyancy. Top panel shows in black the topographic profile of the volcano (profile A-A' in Fig. 2) and in blue an approximation of this profile used to calculate the analytical solution ${ }^{13}$. Bottom panel shows the required crack dip $\beta$ such that the two competing gradients match, according to $\left(\rho_{r}-\rho_{f}\right) g \sin (\beta)=\delta \sigma_{v} / \delta h$. Plane strain boundary element method result due to the topography is shown in black, the result of the analytical solution ${ }^{13}$ due to the approximate slope shown is shown in blue.


Extended Data Fig. 5. Half-space effects on $K_{I}$ at the upper and lower tips of a dipping pennyshaped crack. Maximum and minimum $K_{I}$ values (solid and dashed) for constant volume cracks, depth $d$ below a half-space, with radius $c$. Values relative to $K_{\infty}$, equation (1)). Note the offset from 1 when $c / d=0$, indicates the size of the numerical error.


Extended Data Fig. 6. Profiles used to estimate intrusion geometry. a) InSAR as in Extended Data

Fig. 3 with the location of the profiles (P1-P7) marked by blue shading. Gray polygons show the extent of the lava flows emplaced during the time period spanned by the interferogram. Yellow lines mark the location and extent of all eruptive fissures. b) Each plot shows the line-of-sight ground displacement for each data
point included in profiles 1-7. Vertical scale is not constant. c) All profiles shown on one plot, ( $\sim$ W-E).



Extended Data Fig. 7. Summary of changes in $K$ due to different effects on the sill at Sierra Negra.

Cross sections of cracks showing changes in stress intensity, $K_{I}$, at the crack tip due to different processes.

Crack opening exaggerated by 300 , red patches show the 2 nd invariant of stress computed from $K$ at the tip.
a) crack in a full space, b) crack under topographic stress gradient, topography exaggerated, c) crack with $15^{\circ}$
dip, buoyancy as defined in text, d) interacting cracks with separation defined in text, e) flat crack close to the
free surface, f) crack close to free surface with dip, only internal pressure.
a) Isolated crack full-space


## b) Topographic weight

d) Interaction

e) Half-space


Extended Data Fig. 8. Comparison of $K_{I}$ around a penny-shaped and elongated penny-shaped crack.
a) The mesh used for this analysis. $\theta$ is defined in degrees away from the tip $(y=1)$. Comparison of $K_{I}$
from equation (2) to that for an elongated penny-shaped crack as in a), assuming b) a stress gradient along the
$x$-axis; c) a stress gradient along the $y$-axis. d) Comparison of $K_{I}$ from equation (1) to that for an elongated
penny-shaped crack with uniform pressure. Note some slight numerical inaccuracies are present.


Extended Data Fig. 9. Forecasting propagation directions along the Bárðarbunga dyke track. Numbered labels indicate the position of the penny at test locations ${ }^{3}$. Preferred directions of propagation, accord-
ing to equation (SI.2), where the maximum circumferential (hoop) stress is shown in blue.


## Supplementary Information

## Approximating the sill geometry as a penny

Here we estimate the error associated with approximating a 3D propagating crack as pennyshaped. We compare analytical formulas that describe $K$ around the tip-line of penny-shaped cracks under uniform pressure and linear stress gradients, equation $(1 \& 2)$ to those of a more realistic 3D shape (Extended Data Fig. 8a). We apply boundary conditions so that the opening of lengthenedtail crack matches that of the penny-shaped crack, at the location where the penny's opening is maximal. For penny-shaped cracks with constant internal pressure this is the crack centre. For a penny-shaped crack under a linear stress gradient the maximal opening is located along the direction of the stress gradient at $\sin (\pi / 4) c$. We find the analytical formulas capture the scale and shape of the problem with some deviations (Extended Data Fig. 8b, c and d). Note the accuracy of the numerical boundary element method to approximate $K$ can have errors of up to $10 \%$ and the mesh used in Extended Data Fig. 8 has $\sim 2000$ triangles $^{9,10}$.

## Reproducing Bárðarbunga's track

Here we test our analytical approach of approximating the crack as a series of isolated pennies on the case of the Bárðarbunga 2018 dyke track. The aim is to test how well the assumptions of our method perform in comparison to methods that take into account the entire dyke surface ${ }^{3}$.

We use a series of vertical pennies with $c=2000 \mathrm{~m}, d=4000 \mathrm{~m}, \mathrm{~V}=3 \pi c^{2} \mathrm{~m}^{3}$ (i.e. opening of 3 m if constant), $\nu=0.25, \mu=2 \cdot 10^{9} \mathrm{~Pa}$. All stresses are evaluated at the crack centre. We define the tectonic stress as that due to a vertical semi-infinite buried dislocation ${ }^{3}$ of 4 m opening with an upper tip depth of 10 km , centred at Askja volcano and striking at $12^{\circ}$. As before, we use an analytical solution describing stresses beneath topographic slopes using a state of perfect confinement ${ }^{13}$, applied along the straight dashed line shown in Extended Data Fig. 9. $K_{I}$ around the tip-line is defined by the internal volume through equation (1), and by the gradient in normal trac-
tion taken from the slope stress solution, equation (2). Shear stresses due to the tectonic and gravitational stresses are resolved as shear traction $\left(t_{s}\right)$ on the plane of the dyke at its centre and $K_{I I}$ is computed with:

$$
\begin{equation*}
K_{I I}=\frac{4 t_{s} \sqrt{c / \pi}}{2-\nu} \tag{SI.1}
\end{equation*}
$$

We compute $K$ at the leading tip of the penny (black dots in Extended Data Fig. 9). Free surface effects on values of $K_{I}$ and $K_{I I}$ are below $10 \%$, even with $c / d$ ratios of 0.99 . Turning of the leading tip is then computed using:

$$
\begin{equation*}
K_{I} \sin \theta+K_{I I}(3 \cos \theta-1) \tag{SI.2}
\end{equation*}
$$

where the minimum value corresponds to the direction of the greatest circumferential stress $\left(\theta_{0}=0\right)$ close to the tip, and as such the potential propagation direction ${ }^{18}$. We find our analytical approach predicts the dyke's pathway in a computationally efficient way (Extended Data Fig. 9).

## Supplementary material references

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[^1]:    $\sim \mathrm{S}-\mathrm{N}$ b) $\sim \mathrm{N}-\mathrm{S}$, look direction a) $\sim \mathrm{W}-\mathrm{E}$ b) $\sim \mathrm{E}-\mathrm{W}$, and the incidence angle in degrees. a) Ascending pass,

