

Daily changes of seismic velocities in shallow materials on Mars

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Key points:

- Reflection phases are seen at ~1.2 s, ~2.4 s, and ~3.9 s in autocorrelations of the InSight seismic data for all three components
- Daily velocity variations averaged in the top ~18-200 m of ~40-5% are resolved using reflection waves at ~4 Hz
- The changes are driven by surface temperature variations producing thermoelastic strain and material failure at shallow depth

22 **Abstract**

23 Temporal changes of *S*-wave velocities at shallow depth on Mars are derived using seismic
24 data from the InSight mission. Autocorrelation functions are computed for three-
25 component seismic recordings to retrieve zero-offset reflection seismograms. Observed *S*-
26 wave reflection phase with two-way travel time of ~ 1.2 s and its multiples indicate an
27 interface at ~ 200 m depth. Daily relative travel time changes (dt/t) with $\sim 5\%$ variations
28 are correlated well with the surface temperature. A top ~ 1 -m-thick regolith layer produces
29 a delay of about one Martian day between the dt/t and surface temperature. Assuming the
30 travel time changes are produced primarily in the top ~ 18 m sand layer, the daily velocity
31 variations in that layer are $\sim 40\%$. The dominant mechanisms driving the changes are
32 thermoelastic strain in the shallow structure generating the time delays and possible
33 material failures in the regolith layer.

34

35 **Plain Language Summary**

36 Seismic and environmental data provided by the InSight mission are used to study the
37 behavior of shallow materials on Mars in response to daily temperature variations.
38 Autocorrelations of moving time windows of the seismic data provide information on
39 waves that are excited and recorded at the sensor location. Signals reflected at an interface
40 ~ 200 m deep with $\sim 5\%$ daily travel time variations are seen in the autocorrelations. The
41 travel time variations correlate well with the surface temperature data. A delay of about
42 one Martian day may be generated by the ~ 1 -m-thick unconsolidated surface layer on Mars.
43 The analysis suggests that the changes of travel times are produced by thermal-induced
44 strain and related perturbations to elastic moduli and mass density in the shallow structure
45 on Mars. If the observed $\sim 5\%$ daily travel time variations are concentrated in the top ~ 18
46 m sand layer, there are $\sim 40\%$ corresponding daily velocity variations in the layer.

47

48 **1. Introduction**

49 Seismic interferometry has been widely used to image (Lin et al., 2013; Pham &
50 Tkalčić, 2017; Romero & Schimmel, 2018; Shapiro & Campillo, 2004) and monitor
51 buildings and seismic structures on Earth (e.g. Bonilla et al., 2019; Brenguier et al., 2008;
52 Mao et al., 2019; Prieto et al., 2010; Qin et al., 2020). Velocity variations associated with
53 earthquakes (e.g. Karabulut & Bouchon, 2007; Peng & Ben-Zion, 2006) and periodic (e.g.
54 daily, seasonal) loadings such as hydrological changes, thermoelastic strain and tides (Ben-
55 Zion & Allam, 2013; Johnson et al., 2017; Mao et al., 2019), shed light on in-situ structures
56 and susceptibility of subsurface materials to failure. These issues are of great importance
57 to interpreting observed seismic motion, reliability of underground facilities and other
58 applications.

59 Recent developments enabled geophysical studies on Mars and other objects in the
60 solar system. Martian interior structures can be divided (e.g. Fei, 2013; Khan et al., 2018;
61 Yoder et al., 2003) as on Earth into crust, mantle and core (Smrekar et al., 2019). The
62 NASA's Interior Exploration using Seismic Investigations, Geodesy and Heat Transport
63 (InSight) mission deployed a seismic station on Mars at the end of 2018 (Lognonné et al.,
64 2019; Panning et al., 2017). Seismic waveforms from a single three-component station,
65 augmented by environmental data (e.g. Temperature and Wind for InSight (TWINS)), were
66 used to search for marsquake (Banerdt et al., 2020; Giardini et al., 2020), constrain shallow
67 elastic and anelastic properties of Mars (Lognonné et al., 2020), and analyze source
68 properties of the ambient seismic noise on Mars (e.g. Suemoto et al., 2020).

69 Using seismic interferometry, Deng & Levander (2020) identified prominent body-
70 wave reflection phases in stacked vertical component autocorrelation data, and associated
71 them with reflections from deep interfaces (e.g. the Martian Moho and core-mantle
72 boundary). Analysis of data from the Apollo Lunar Seismic Profiling Experiment
73 (Nakamura et al., 1982) resolved the structures and thermal properties of the Moon
74 (Kovach & Watkins, 1973; Langseth et al., 1976; Larose et al., 2005; Tanimoto et al., 2008)
75 and discovered moonquakes triggered by diurnal temperature changes (Cooper & Kovach,
76 1975; Duennebier, 1976; Duennebier & Sutton, 1974).

77 In this study, we retrieve high-frequency (~ 4 Hz) body waves reflected from a shallow
78 (~ 200 m deep) interface using moving short-time (20 s) window autocorrelations of

79 seismic recordings, and analyze daily variations in arrival times of the reflections to
80 monitor possible material changes in near-surface structures. Considering the large daily
81 temperature variations ($\sim 76^{\circ}\text{C}$) and low barometric pressure ($\sim 700\text{ Pa}$) on Mars, the in-situ
82 monitoring of velocity variations aims to provide high-resolution information on the
83 properties and dynamics of the shallow materials at the study area on Mars.

84

85 **2. Data & Instrumentation**

86 NASA's InSight spacecraft deployed a six-axis seismometer on Mars providing
87 seismic data sampled at 10 Hz, 20 Hz and 100 Hz, augmented by the TWINS
88 environmental sensors. Except for the detected marsquakes (Giardini et al., 2020), seismic
89 data on Mars are dominated by noise from atmospheric events and wind-generated lander
90 noise (Lognonné et al., 2020; Suemoto et al., 2020). Surficial geology studies (Golombek
91 et al., 2020) and investigation of seismic data (Lognonné et al., 2020) at the landing site
92 suggest a relatively smooth terrain with a $\sim 3\text{-}18\text{m}$ -thick layer of sand with few rocks
93 overlying coarse breccia. Analyses of seismic and environmental recordings on Mars
94 (Lognonné et al., 2020) provided near-surface Young's modulus ($\sim 47\text{ MPa}$), P-wave
95 velocity ($118\pm 34\text{ m/s}$) and thermal inertia ($160\text{-}230\text{ Jm}^{-2}\text{K}^{-1}\text{s}^{-1/2}$) of the regolith layer in the
96 top 1-2 m.

97 We analyze the seismic and environmental data (Fig. 1) for temporal variations in the
98 properties of near-surface structures on Mars. The 100 Hz seismic data are continuously
99 recorded during Julian days 66-67 (UTC on Earth; Fig. S1); therefore, we present the
100 analysis primarily based on the two-day 100 Hz data. Close to this time interval, the 20 Hz
101 (days 63-65) data are also analyzed (supporting information) to show similar patterns with
102 those derived from the 100 Hz data but with larger uncertainties. Temperature and wind
103 recordings are plotted in Figs 1&S2. The three-component recordings are detrended and
104 rotated to the geographical east-west (EW), north-south (NS), and vertical (UD)
105 components (e.g. Fig. 1a). The rotated data are then segmented into 20s-long time windows
106 with 50% overlap, resulting in analysis time steps of 10 s. The daily amplitude variations
107 of seismic data are significant (~ 3 orders of magnitude) at frequencies above $\sim 5\text{ Hz}$, as is
108 shown in Figs 1b&S3. Thus, for each time window, we bandpass filter the data at 1-5 Hz,

109 where the amplitude variation is less dramatic, and calculate autocorrelation functions
110 (ACFs) to retrieve the zero-offset reflection seismograms. Resulting ACFs are presented
111 in Figs 2&S4-S5. By tracking travel time variations of body waves in ACFs reflected from
112 interfaces beneath the station, we can infer the temporal evolution of subsurface materials
113 at the InSight landing site.

114 For each ACF, the delay of travel time (dt) with respect to a reference trace associated
115 with the stack of all ACFs is obtained through cross-correlation in a time window where
116 clear reflected phases are observed. Fig. 2c shows the reference ACFs (black dashed
117 curves) and example traces (black solid curves) at 1 pm of Julian day 66. The cross-
118 correlation time window is determined as follows: (i) We first stack the envelopes of all
119 ACFs (Figs 2&S4-S5), and center the cross-correlation time window at the second peak
120 (i.e. the highest peak excluding the zero-lag) of the stacked envelope function (Figs
121 2d&S6). (ii) Then we calculate the dominant frequency for each trace and remove ACFs
122 with peak frequencies that are larger than 5 Hz or lie outside three times the standard
123 deviation in the distribution of ACF dominant frequencies (Fig. S7). The obtained median
124 dominant frequency f_0 is ~ 4 Hz, close to the Nyquist frequency of the 10 Hz data, therefore
125 the analyses based on 10 Hz data are less reliable and not presented in this paper. (iii) The
126 cross-correlation time window is defined as ± 3 times the median dominant period $T_0 =$
127 $1/f_0$ from the center determined in step (i), resulting in ~ 1.5 s-long cross-correlation time
128 windows (blue vertical lines in Fig. 2c)

129 We show the stacked envelope functions and cross-correlation time windows in Fig.
130 2d for the three components at 100 Hz and in Fig. S6 for data at 20 Hz. To suppress
131 potential effects of wavefield changes on the inferred delay times, we discard the ACF if
132 any of the following holds: (i) The peak value of envelope function in the cross-correlation
133 time window is smaller than 20% quantile of the peak envelope values from all ACFs. (ii)
134 The cross-correlation coefficient with the reference ACF trace is less than 0.5. (iii) The
135 retrieved dt deviates more than three times the median absolute deviation from the median.
136

137 **3. Analysis**

138 The travel time variations are clearly seen in the two-day EW-component ACFs filtered
139 at 1-5 Hz from the 100 Hz data (Fig. 2a). Results for the other two components (Fig. S4)
140 and data at 20 Hz (Fig. S5) show consistent patterns. Reflected signals at ~ 1.2 s, ~ 2.4 s,
141 and 3.9 s (i.e. two-way travel time) are observed in the stacked envelope functions (e.g.
142 Fig. 2d). The cross-correlation time windows used to calculate delay time are centered on
143 the first labeled peak, $T_l = 1.17$ s, 1.29 s, 1.19 s for EW, NS and UD components,
144 respectively. The relative travel time change averaged over the entire propagation path is
145 calculated as dt/t , where t is the lapse time for the center of the cross-correlation time
146 window. Positive dt/t values indicate increasing travel time and thus slower seismic
147 velocities.

148 Fig. 3 shows the observed dt/t values colored by the cross-correlation coefficients,
149 estimated from the two-day 100 Hz data. Due to the large scattering of the observed dt/t
150 values, we smooth the measurements by taking the running median for every 65 points,
151 and calculate the corresponding standard deviation as the data uncertainty (gray area in
152 Fig. S8). The smoothed dt/t curve has a maximum time resolution of ~ 10 min. We choose
153 a window size of 65 points due to the trade-off between time resolution and smoothness of
154 the resulting dt/t curve. Spikes still present in the smoothed dt/t data (e.g. red curves in
155 Fig. 3) and are likely associated with data gaps and low-quality ACFs (e.g. Fig. 2a). Results
156 from the 20 Hz data are illustrated in Fig. S9 (results for the NS component are not shown
157 due to low data quality).

158 The smoothed dt/t curves (e.g. Fig. 3) have a similar shape to the temperature
159 recording (Fig. 1c), showing a relatively flat linear change during Martian night times (e.g.
160 8:00 pm to 8:00 am) and significant variations during the daytime (e.g. 8:00 am to 8:00
161 pm; between the purple dashed lines in Fig. 3). This is in contrast to the more complicated
162 pattern of wind recordings (Fig. 1c) and indicates that the dominant mechanism driving the
163 temporal change is associated with temperature. Since high frequency (>1 Hz) seismic
164 noise recorded at the site is dominated by wind-induced lander noise (e.g. Suemoto et al.,
165 2020), the contribution from wavefield changes to the resolved dt/t curves is negligible.
166 We compare the smoothed dt/t curve with a linear transformation of the temperature
167 recording $T(t)$ given by $g_0(T; a, b) = a \cdot T(t) + b$. The coefficients $a > 0$ and b are
168 determined so that the maximum and minimum values of the $g_0(T; a, b)$ match,

169 respectively, the median values of the upper 95 and lower 5 percentiles of the smoothed
 170 dt/t curve. The obtained a and b parameters are presented in Table S1 and show
 171 consistent values from different data sets.

172 The difference between the linearly-scaled temperature (black curve) and smoothed
 173 dt/t values (red curve) in Fig. 3, $\delta_0(t) = g_0(T; a, b) - dt/t$, is much smaller than the
 174 data uncertainties (shaded area in Fig. S8) during Martian night times (e.g. 8:00 pm to 8:00
 175 am). This indicates a robust linear relation between the smoothed dt/t and surface
 176 temperature (hereinafter, dt/t -temperature relation). We also find a good agreement in the
 177 timing between the two curves of the turning point around 6 am in the Martian time, after
 178 which the temperature and dt/t values increase dramatically. This suggests the time delay
 179 between the smoothed dt/t curve and surface temperature is comparable to the time
 180 resolution of the data (~ 10 min) at Martian night plus possible multiples of Martian day.
 181 The difference $\delta_0(t)$ during the Martian daytime (e.g. between the purple dashed lines in
 182 Fig. 3) is much larger than that at night, indicating either a nonlinear relation or a different
 183 time shift between these two curves during the daytime. The same dt/t -temperature
 184 relations are also consistently observed in data at 20 Hz (Fig. S9).

185 We further verify the robustness of the observed dt/t -temperature relation through
 186 curve fitting the smoothed dt/t using $g_0(T; a, b)$, i.e. inferring the coefficients a and b by
 187 minimizing $\delta_0(t)^2$ for all available data. The best fitting result (black curve in the upper
 188 panel of Fig. S10) shows that we cannot fit the measurements equally well during the
 189 Martian night and day times. We also conduct the curve fitting using $g_1(T; a, b, t_0) = a \cdot$
 190 $T(t - t_0) + b$, considering possible time shift t_0 between the two curves. The best fitting
 191 result is obtained by minimizing $\delta_1(t; t_0)^2$ for each possible t_0 from -2 h to 2 h, where
 192 $\delta_1(t; t_0) = g_1(T; a, b, t_0) - dt/t$. We note that the estimated time shift t_0 is
 193 representative of the wrapped phase delay and may be cycle skipped, i.e. the actual delay
 194 is $t_d = t_0 + T_M \cdot N$, where N is an integer and T_M is a Martian day. The result indicates the
 195 best fitting t_0 is -45 mins (bottom panel of Fig. S10), when all available dt/t data are used,
 196 implying that the smoothed dt/t curve likely either precedes the temperature record by
 197 ~ 45 min or is delayed by ~ 23 hours. Considering the best fitting $\delta_1(t; t_0)$ is smaller than
 198 the data uncertainties (shaded area in Fig. S8), we rule out the possibility of a non-linear
 199 dt/t -temperature relation during Martian day times. The best fitting time shift t_0 remains

200 negative for all data sets, and the absolute value becomes smaller when $\delta_1(t; t_0)^2$ is
 201 minimized during Martian night times (e.g. 8:00 pm to 8:00 am) and larger when $\delta_1(t; t_0)^2$
 202 is minimized during Martian day times (e.g. 8:00 am to 8:00 pm). The time delay from the
 203 curve fitting suggests the actual delay t_d between the dt/t curve and the temperature record
 204 is smaller during the day times.

205 In general, the curve fitting results are less reliable because of possible trade-offs
 206 between parameters. Therefore, we only focus below on the comparison between the
 207 smoothed dt/t data and $g_0(T; a, b)$ shown as black curve in Fig. 3. Since $g_0(T; a, b)$
 208 represents dt/t if it is linearly related to the surface temperature with a negligible wrapped
 209 phase delay, the absolute difference, $|\delta_0(t)|$, is large when a different wrapped phase delay
 210 exists. The relatively large absolute values of $\delta_0(t)$ during the daytime (between the purple
 211 dashed lines in Fig. 3) imply variations of phase delay between dt/t and surface
 212 temperature. Results from 20 Hz data show similar trends (Fig. S9). We also investigate
 213 the temporal pattern of dt/t for potential long-term variations using the 20 Hz data
 214 between Julian days 153-365 in 2019. However, except for the observed daily changes, we
 215 do not find any linear or periodic long-term patterns that stand out from the background
 216 fluctuations.

217

218 4. Discussion

219 We monitor temporal changes of seismic velocities in subsurface materials beneath the
 220 InSight lander on Mars using reflected body waves resolved from autocorrelation functions
 221 (ACFs) of ambient seismic noise recordings. The stacked envelope function (e.g. Fig. 2d)
 222 shows peaks at ~ 1.2 s, ~ 2.4 s and ~ 3.9 s for all three components. It is important to note
 223 that there are no clear signals at ~ 0.6 s, ~ 1.8 s or ~ 3.0 s in the stacked envelope function,
 224 suggesting the first arriving phase has a two-way travel time of ~ 1.2 s with the later phases
 225 being its multiples. Based on the polarization analysis of Suemoto et al. (2020), P and S
 226 reflected waves at the InSight landing site are identified in ACFs with two-way travel times
 227 of ~ 0.6 s and ~ 1.2 s, respectively. This suggests the observed phase at ~ 1.2 s and its
 228 multiples in the horizontal component ACFs are S -wave reflections.

229 The first arriving reflected phase resolved in ACFs of the vertical component also
230 yields a two-way travel time of ~ 1.2 s (blue curve in Fig. 2d). This is likely due to the
231 leakage of S wave energy onto the vertical component (e.g. Deng & Levander, 2020;
232 Gorbatov et al., 2013; Oren & Nowack, 2017; Phạm & Tkalčić, 2017). Another possibility
233 is that the first arriving phase in the vertical component travels as P waves in the regolith
234 layer (~ 1 -2 m thick; Lognonné et al., 2020), and converts to S waves at depth. We therefore
235 attribute the dt/t values measured from all three components to temporal changes in S -
236 wave travel times.

237 We use the S -wave velocity model A1 from Lognonné et al. (2020), where the S -wave
238 velocity increases from 59.85 m/s to 95.82 m/s in the top 1 m, and remains 316.23 m/s
239 between 1-10 m, to estimate the depth of the reflection interface. Assuming the same S -
240 wave velocity of 316.23 m/s for structures below 10 m, the two-way travel time of ~ 1.2 s
241 corresponds to a reflector at a depth of ~ 200 m. To infer the structural perturbations
242 responsible for the observed travel time variations, the relative velocity change dv/v can
243 be estimated via $dv/v = -dt/t$ (e.g. Ratdomopurbo & Poupinet, 1995; Snieder et al.,
244 2002) by assuming a homogeneous medium change. This results in a $\sim 5\%$ daily maximum
245 variations in S -wave velocity averaged over the top ~ 200 m.

246 However, the assumption of a homogenous dv/v in subsurface structures is unrealistic
247 and the changes are likely to concentrate in the very shallow damaged materials. The
248 material strength increases with confining pressure so shallow materials are more
249 susceptible to failure (Nur & Simmons, 1969; Yang et al., 2019). In addition, laboratory
250 experiments (e.g. Pasqualini et al., 2007; TenCate et al., 2004) show that shallow soft
251 materials (e.g. soil) exhibit high susceptibility to loading and behave nonlinearly for
252 dynamic strains as low as 10^{-8} , while the strain level needed to generate velocity variations
253 for hard bedrock is considerably larger, on the order of 10^{-3} . Indeed, analysis of borehole
254 data on Earth show that temporal changes tend to concentrate in the top few tens of meters
255 (e.g. Bonilla et al., 2019; Qin et al., 2020; Rubinstein, 2011). Therefore, the dv/v is likely
256 much larger than 5% in the shallow soft materials.

257 The observed travel time variations dt/t match well with the linearly scaled surface
258 temperature (Fig. 3) with different wrapped phase delays during Martian day (8:00 am to
259 8:00 pm) and night (8:00 pm to 8:00 am) times, implying the dominant mechanism

260 generating the travel time variations are temperature changes. Thermoelastic strain in an
 261 elastic half space covered by an unconsolidated layer is expected to have a phase delay of
 262 $\Delta t = \frac{y_b}{2} \sqrt{\frac{\tau}{\pi \cdot \kappa}} + \frac{\tau}{8}$ with respect to the daily variation of surface temperature (Ben-Zion &
 263 Leary, 1986; Berger, 1975; Tsai, 2011), where y_b and κ are the thickness and thermal
 264 diffusivity of the top incompetent layer and $\tau = 24$ hour. Using for example $y_b = 1$ m
 265 (thickness of the regolith layer; Lognonné et al., 2020) and $\kappa = 10^{-6}$ m²/s (Berger, 1975),
 266 Δt is ~26 hours. This delay would be somewhat different if the layer thickness or thermal
 267 diffusivity have different values. Using Δt of ~26 hours as the reference, we can unwrap
 268 the time delay t_0 resolved between the temperature and smoothed dt/t data in section 3
 269 giving a time delay t_d of ~23 hours during Martian day times and ~24 hours during Martian
 270 night times. This is based on the assumption that the clocks of the seismic and thermal
 271 sensors are synchronized and thermoelastic strain is the dominating mechanism. Keeping
 272 the thermal diffusivity as 10^{-6} m²/s, the thickness of unconsolidated layer is ~0.9 m to
 273 account for the 24-hour delay. This is similar to values of unconsolidated layer thickness
 274 inferred from analyses of thermoelastic strain on earth (Ben-Zion & Allam, 2013; Ben-
 275 Zion & Leary, 1986; Prawirodirdjo et al., 2006; Wang et al., 2020).

276 In addition to increasing the delay time for thermoelastic strain, a regolith layer with a
 277 thickness in the range of 0.5-1 m (Lognonné et al., 2020) contributes to the observed dt/t
 278 through additional thermal related responses, such as changes in mass density and elastic
 279 moduli due to crack opening-closing. It is important to note that the time delay t_d is ~1 hour
 280 smaller during the Martian day times. Since the delay is smaller for shallower materials
 281 within the top layer, the smaller t_d during the day times is likely related to a higher fraction
 282 of contribution from the regolith layer to the observed dt/t . This may include material
 283 failure due to thermal cracking generated by the significant temperature gradient during
 284 the Martian day times. We note that earthquake-like pulses can be generated from thermal
 285 cracking in shallow materials, as observed in seismic recordings on the Moon (Tanimoto
 286 et al., 2008). In general, thermal-related moonquakes have magnitudes less than -2.0
 287 (Cooper & Kovach, 1975). Since the temperature variations on Mars are smaller than on
 288 the Moon, the thermal-related quake-like pulses are expected to be smaller than those on
 289 the Moon. Wind shaking obstacles above the ground (e.g. rocks) can also produce quake-

290 like signals (Johnson et al., 2019). These and other possible environmental sources should
291 be considered when looking for marsquakes.

292 The sand layer beneath the InSight lander is ~ 3 -18 m thick (Golombek et al., 2020).
293 Based on the velocity model of Lognonné et al. (2020), the S -wave travel time in the top
294 18 m is ~ 0.07 s. For simplicity, we use a sand layer thickness of 18 m and neglect the
295 structural perturbations in bedrocks below 18 m. The daily peak to peak fluctuation in S -
296 wave dv/v averaged over the top 18 m sand layer is up to $\sim 40\%$ to account for the 5%
297 daily variaion in the observed dt/t (i.e. ~ 0.03 s in time delay). This velocity perturbation
298 in response to surface temperature variations on Mars is significantly larger than those
299 resolved on Earth, and may result from the combined effects of extreme environmental
300 conditions (low barometric pressure of ~ 700 Pa and large temperature variation of $\sim 76^\circ\text{C}$)
301 and in-situ structures with extremely low S -wave velocities of < 100 m/s in the top 1 m
302 (Lognonné et al., 2020).

303

304 **5. Conclusions**

305 We monitor temporal variations of seismic velocities on Mars using zero-offset
306 reflection seismograms constructed via short time window autocorrelation of seismic data
307 from the InSight mission. The stacked envelopes of ACFs show clear reflected S waves in
308 three components at ~ 1.2 s, ~ 2.4 s, and ~ 3.9 s. The first arriving phase is reflected from an
309 interface at ~ 200 m depth based on the local S -wave velocity model (Lognonné et al.,
310 2020), and the later arrivals are its multiples. The maximum delay in the two-way travel
311 time of the first arriving phase is ~ 0.06 s, corresponding to a relative travel time variation
312 (dt/t) of $\sim 5\%$ averaged over the top ~ 200 m. The dt/t pattern correlates well with the
313 local surface temperature recording with a phase delay of about one day, suggesting the
314 major mechanisms for the observed temporal variations are thermoelastic strain in the ~ 18
315 m sand layer above the bedrock and additional thermal effects such as changes in mass
316 density and elastic moduli in the top 0.5-1 m regolith layer. Sharp temperature increases
317 can introduce thermal cracking near the surface, which contributes to the ~ 1 hour decrease
318 in time delay between the observed dt/t and linearly scaled temperature data during the
319 Martian day times. The high susceptibility of the damaged materials in the top ~ 18 m and

320 shallow concentration of the driving mechanisms suggest up to ~40% *S*-wave velocity
321 perturbation in the top ~18 m at the time of the highest temperature on Mars.

322

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325 Seismology (IRIS) data center (InSight Mars SEIS Data Service, 2019;
326 www.iris.edu/hq/sis/insight). The wind and temperature data are downloaded from
327 [https://atmos.nmsu.edu/data_and_services/atmospheres_data/INSIGHT/insight.html#Sele](https://atmos.nmsu.edu/data_and_services/atmospheres_data/INSIGHT/insight.html#Selecting_Data)
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485

486 **Figure captions**

487 **Figure 1.** (a). Waveforms with 100 Hz sampling rate after removing the linear trend.
488 Relative amplitudes of the three component seismic data are preserved. (b).
489 Spectrogram of the waveform at EW component. (c). Wind (colored dots) and
490 temperature (black dashed curve) recordings during Julian days 66–67 (UTC on Earth).
491 Black ticks on x-axis correspond to UTC on Earth, while the local mean solar time on
492 Mars is shown in red with a format of “dddThh”. The first three digits (“ddd”) represent
493 the Julian day and the last two digits (hh) indicate the local time in hours on Mars.

494 **Figure 2.** Results from the two-day 100 Hz data: (a). ACFs of EW component waveforms.
495 (b). Envelope functions of EW-component ACFs. (c). The reference (dashed curve)
496 and example (solid curve) ACFs from EW (top), NS (center) and UD (bottom)
497 components. The reference ACF denotes the stack of all ACFs, and the example ACF
498 is calculated at 1 pm of Julian day 66 (UTC on Earth). Vertical blue lines indicate the
499 cross-correlation time windows. (d). Stacked envelope functions at EW (black), NS
500 (red) and vertical (blue) components. T_1 , T_2 and T_3 denote the time of the second, third
501 and fourth peaks in the stacked envelope functions, respectively. Horizontal bars
502 indicate the cross-correlation time windows, same as the vertical blue lines in (c).

503 **Figure 3.** dt/t measurements (colored dots) for 100 Hz data at EW (top), NS (center) and
504 vertical (bottom) components, colored by the cross-correlation coefficients. The red
505 curve illustrates the smoothed dt/t data using a running window of 65 points. The

506 linearly scaled temperature curve (black), $g_0(T; a, b)$, has maximum and minimum
507 values that match the median of the upper 95 and lower 5 percentiles of the red curve.
508 The vertical purple dashed lines indicate the Martian day time (8:00 am to 8:00 pm)
509 when the difference between the two curves is large. Ticks on x-axis are formatted
510 similarly as in Fig. 1.

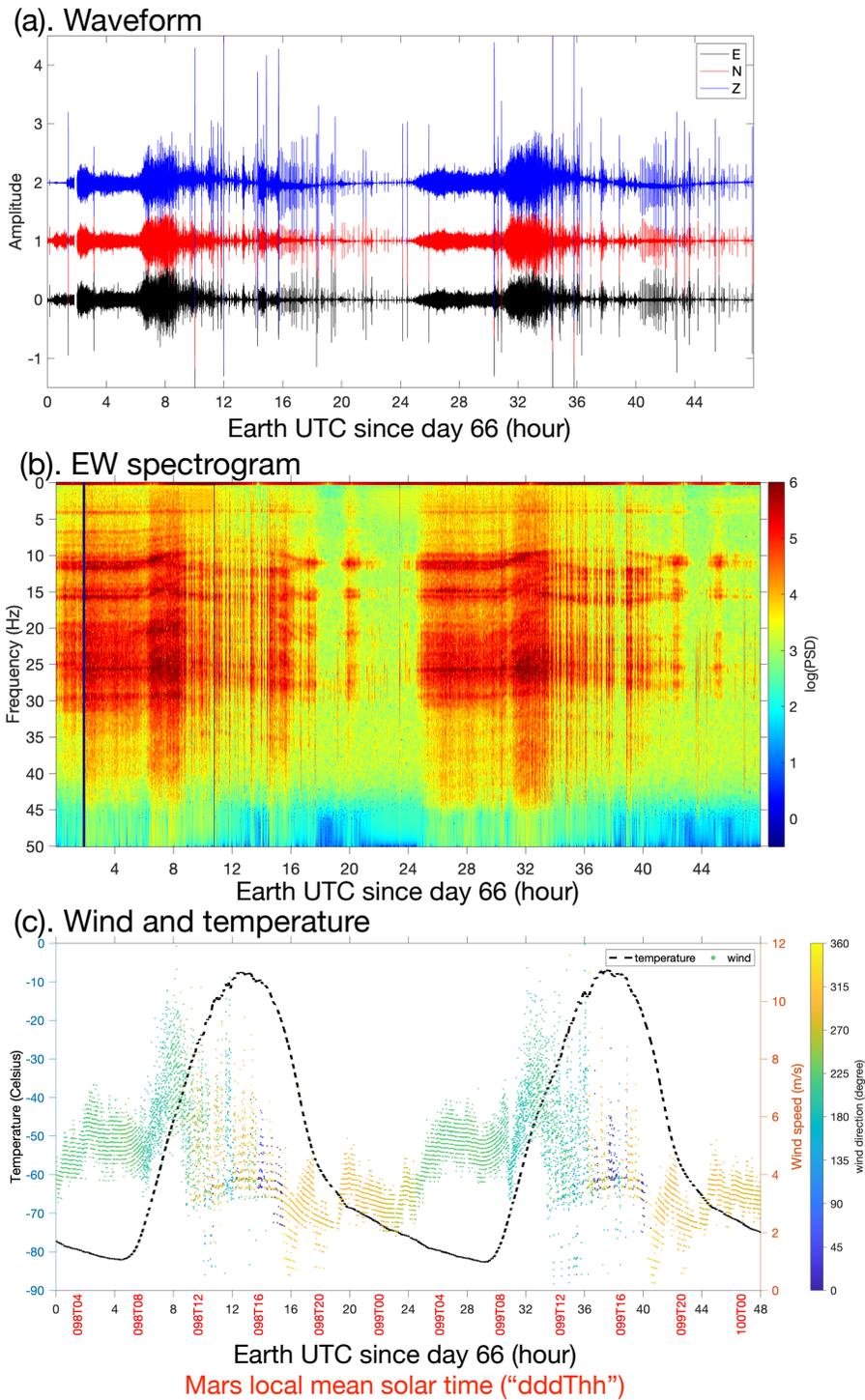


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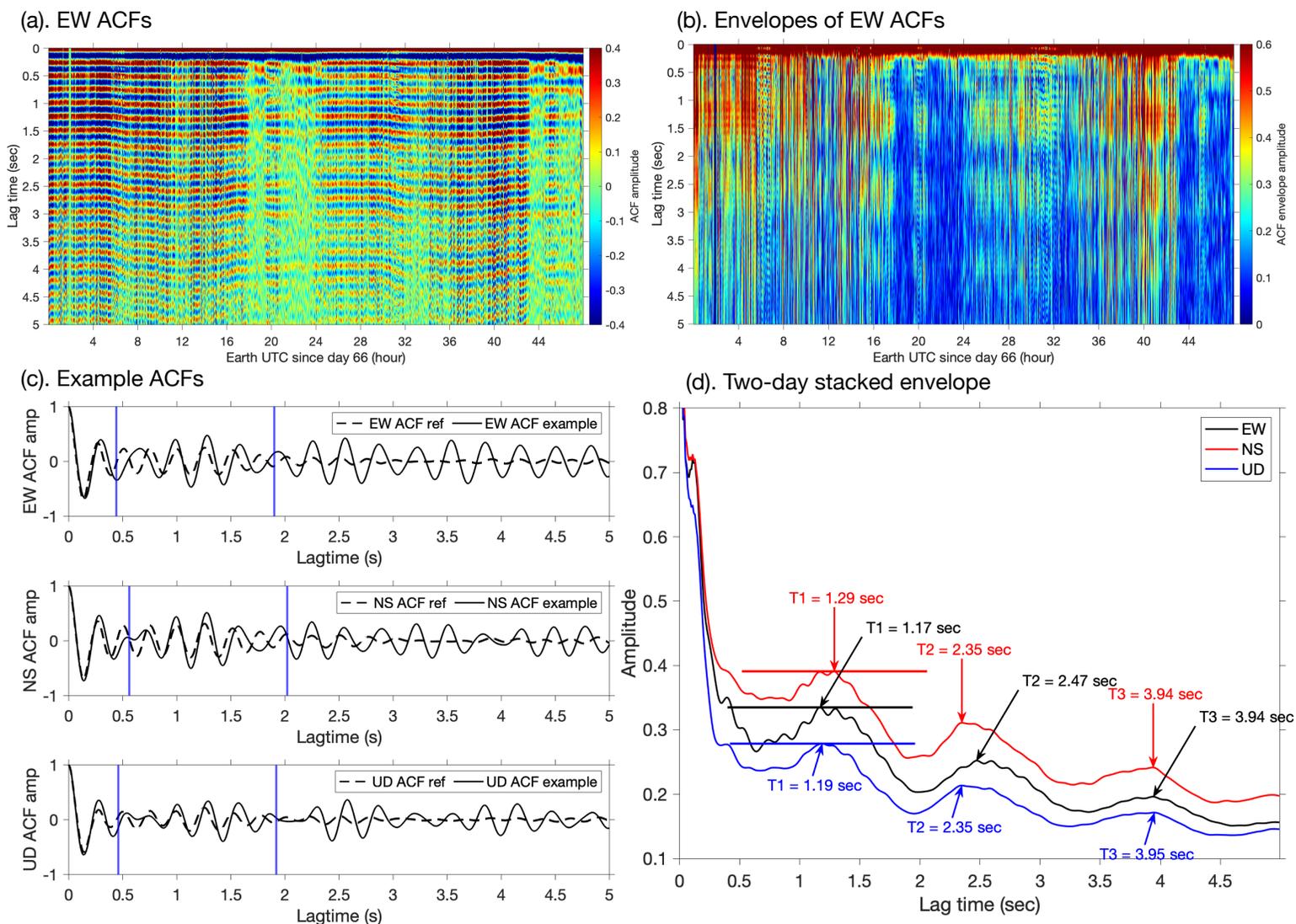


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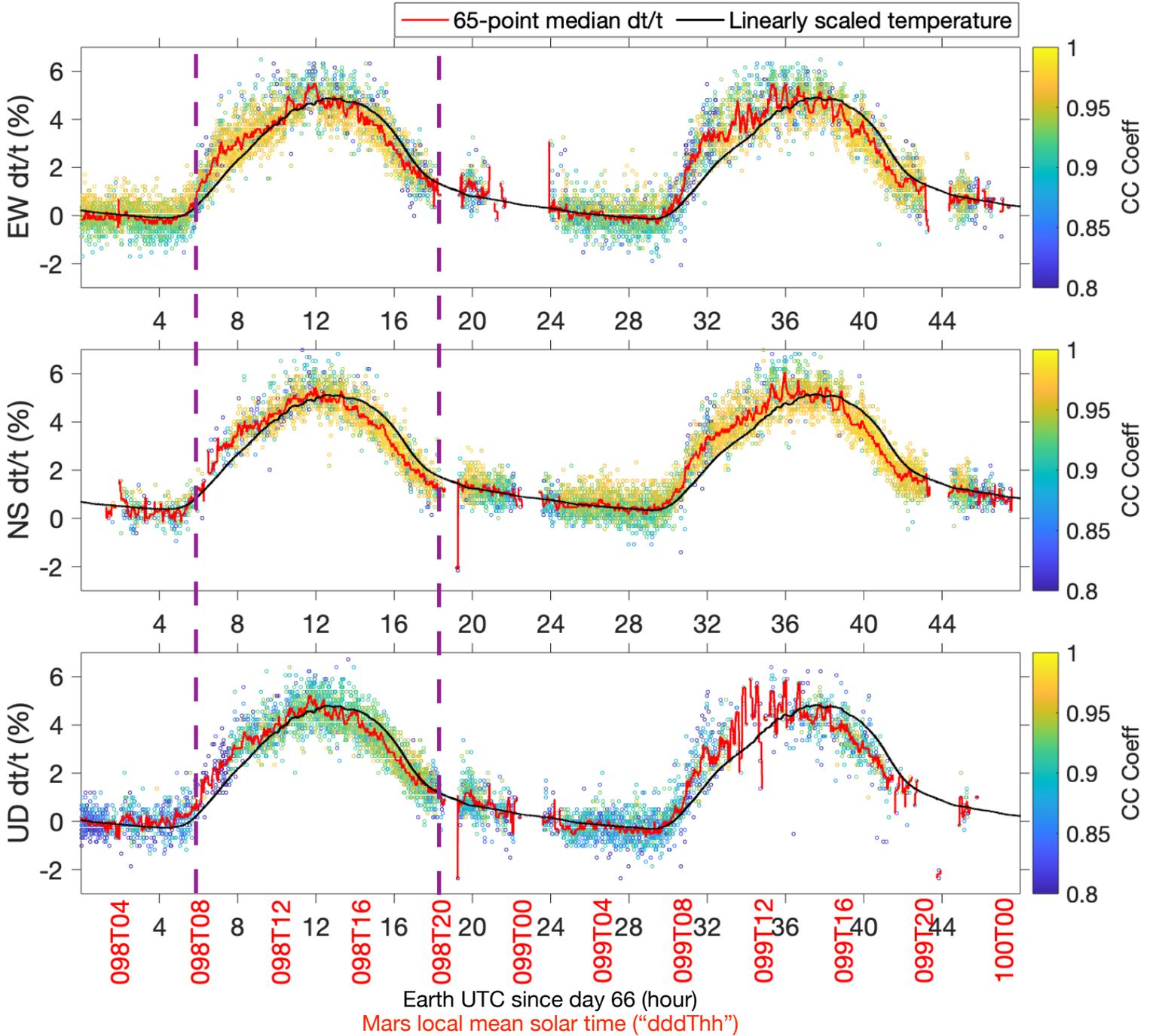


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