# Investigating global correlations between tsunami, earthquake, and subduction zone characteristics

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#### Abstract

Tsunamigenic earthquakes pose a large hazard in subduction zones, but it is currently unclear in which - if any - tectonic setting they preferentially occur. We compile the Subduction Nature & Interconnected Tsunamigenic earthquake Characteristics (SNITCH) database with parameters on the geodynamics, megathrust seismicity, and tsunami characteristics for tsunamis caused by earthquakes in all subduction zones. We use a bivariate regression analysis to detect possible relationships between the tsunamigenic earthquake characteristics of a subduction zone and its interplate seismicity, as well as its geometric, structural, and kinematic parameters. We focus our analysis on the normalised number of tsunamigenic earthquakes  $N_t$ . The bivariate analysis does not reveal any significant correlations between  $N_t$  and the seis-

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mogenic zone geometry of the megathrust. However, we do find correlations between  $N_t$  and the megathrust seismicity and tectonic parameters characterising a subduction zone. We employ a multivariate Fisher analysis on the tectonic parameters to see which combinations best distinguish the subduction zone segments in which relatively many and few tsunamis occurred. We find that the type of margin (i.e., erosional or accretionary), the trenchnormal component of the subduction and convergence velocity, the amount of sediments at the trench and the roughness of the incoming plate are the most important parameters to achieve this. Therefore, tsunamigenic earthquakes may be more prone to occur in tectonic settings where plates subduct relatively fast beneath a sediment-starved, erosional margin. A complex, shallow subduction interface, characterised by multiple faults and fractures that arise at a margin with little trench sediments to smooth subducting plate topography, could account for the larger number of tsunamigenic earthquakes. These results could have implications for hazard assessment.

*Keywords:* tsunamis, earthquakes, tsunamigenic earthquakes, subduction zones, multivariate statistics, tectonics

#### 1 1. Introduction

Tsunamigenic earthquakes are defined as earthquakes that cause tsunamis and usually occur on thrust faults in subduction zones. In the past decades, tsunamigenic earthquakes have greatly impacted society, with the most notable events being the 2004  $M_w$  9.1–9.3 Sumatra-Andaman earthquake and resulting Indian Ocean tsunami, and the 2011  $M_w$  9.0 Tōhoku-Oki earthquake and tsunami (e.g., Lay et al., 2005; Titov et al., 2005; Fujii et al.,

2011; Ozawa et al., 2011). During these large events, the megathrust typi-8 cally plays the most important role, as it provides the largest potential slip 9 area, and is therefore capable of producing the largest earthquake with an 10 accompanying tsunami. However, other faults than the megathrust, such as 11 outer rise or splay faults, likely play an important role in tsunamigenesis as 12 well (Fukao, 1979; Sibuet et al., 2007; Waldhauser et al., 2012; von Huene 13 et al., 2016; Fan et al., 2017; Sladen and Trevisan, 2018). Since these faults 14 have steeper dips than the megathrust, they can accommodate more vertical 15 displacements for similar amounts of slip (Wendt et al., 2009). However, it is 16 difficult to determine whether an earthquake ruptured along the megathrust 17 or a splay fault, due to the uncertainty in earthquake and tsunami source 18 localisation (Sibuet et al., 2007; Waldhauser et al., 2012). 19

Tsunami earthquakes are a subset of tsunamigenic earthquakes (Satake 20 and Tanioka, 1999; Satake, 2015). They are defined by their disproportion-21 ally large tsunami waves compared to their seismic waves (Kanamori, 1972). 22 Other characteristics of tsunami earthquakes include their slow rupture ve-23 locity and long rupture duration (Kanamori, 1972). It is typically thought 24 that they rupture the shallowest part of the subduction interface (Lay et al., 25 2012), where the rocks contain many fluids and are velocity-strengthening 26 and compliant (Bilek and Lay, 1999; Faulkner et al., 2011; Sahakian et al., 27 2019). Since tsunami earthquakes could pose an even larger, unexpected haz-28 ard than regular tsunamigenic earthquakes, studies have typically focused on 29 the possible mechanisms behind tsunami earthquakes and which type of sub-30 duction setting might be more prone to produce them (Polet and Kanamori, 31 2000; Bilek and Lay, 2002; Geersen, 2019). Based on these studies, two 32

<sup>33</sup> subduction zone parameters in particular are associated with tsunami earth<sup>34</sup> quakes: the amount of sediments at the trench and the roughness of the
<sup>35</sup> subducting plate.

Tsunami earthquakes are typically associated with sediment-starved, ero-36 sional margins, because these settings can sustain very shallow slip due 37 to their shallow frictional regime (Polet and Kanamori, 2000; Bilek, 2010; 38 Geersen, 2019). However, it has also been suggested that sediment-rich mar-39 gins could promote several aspects typical for tsunami earthquakes. The 40 lower rigidity and strength of sediments could for example facilitate the slow 41 tsunami earthquake rupture (Polet and Kanamori, 2000). Similarly, the sud-42 den uplift of sediments in the unconsolidated accretionary wedge, which is 43 typically larger in accretionary margins with large amounts of trench sedi-44 ments, during an earthquake could account for large vertical displacements 45 of the water column (Seno, 2002; Tanioka and Seno, 2001). 46

The degree of roughness of an incoming plate is defined by the size and dis-47 tribution of topographic features, such as seamounts, horst and graben struc-48 tures, and ridges. Generally, tsunami earthquakes are associated with rough 40 incoming plates (Tanioka et al., 1997; Polet and Kanamori, 2000; Geersen, 50 2019). For example, observations of past tsunami earthquakes, such as the 51 1947 Offshore Poverty Bay and Tolaga Bay earthquakes, have shown that 52 ruptures could be affected by seamounts (Bell et al., 2014). Most notably, it 53 has been speculated that the low rupture velocities typically associated with 54 tsunami earthquakes stem from rupture on a seamount (Bell et al., 2014). 55 Other structural features on the incoming plate, such as subducting fracture 56 zones (Robinson et al., 2006) or ridges (Gahalaut et al., 2010), have also been 57

<sup>58</sup> proposed to influence the rupture and its velocity.

The observed relationship between tsunami earthquakes, the amount of 59 trench sediments in a subduction zone, and incoming plate roughness appears 60 to be contrary to the relationship observed for large  $(M_w > 8.5)$  megath-61 rust earthquakes. Large megathrust earthquakes are typically associated 62 with a smooth incoming plate and a large trench sediment thickness (Ruff, 63 1989; Heuret et al., 2012; Wang and Bilek, 2014; Scholl et al., 2015; Brizzi 64 et al., 2018; Van Rijsingen et al., 2018). However, it is unclear how tsunami-65 genic earthquakes, which include both tsunami earthquakes and some large 66 megathrust earthquakes, are affected by trench sediments and incoming plate 67 roughness. A global assessment, including statistics on the relationship be-68 tween tsunamigenic earthquakes and general subduction zone characteristics, 69 is still missing. 70

Here, we combine a subduction zone characteristics and megathrust seis-71 micity database with a tsunami database. For the first time, we provide a 72 global overview of parameters playing a role in the tsunamigenic earthquake 73 process. We investigate the relationships between tsunamigenic earthquakes, 74 megathrust seismicity, and the tectonic setting of subduction zones. Us-75 ing bi- and multivariate statistical analyses, we identify subduction zone 76 characteristics associated with the occurrence of tsunamigenic earthquakes. 77 We find that fast-converging systems where an oceanic plate subducts at a 78 sediment-starved, erosional margin are more prone to produce tsunamigenic 79 earthquakes. 80

#### <sup>81</sup> 2. The SNITCH database

We compile a database containing information on megathrust seismicity, 82 seismogenic zone geometry, subduction zone tectonics, and tsunami events. 83 We call this database the Subduction Nature & Interconnected Tsunamigenic 84 earthquake Characteristics (SNITCH) database. The SNITCH database con-85 sists of two parts: SNITCH-SN is a subduction zone database containing data 86 on subduction zones characteristics and megathrust seismicity presented in 87 Heuret et al. (2011, 2012); Brizzi et al. (2018); Lallemand et al. (2018). 88 SNITCH-T consists of characteristics of tsunamis caused by earthquakes 80 compiled from NOAA NGDC/WDS Global Historical Tsunami data (Global 90 Historical Tsunami Database, Retrieved: February 1, 2019). In the following, 91 we describe how we assembled the SNITCH database in detail. 92

#### 93 2.1. SNITCH-SN: Subduction nature

We use the subduction zone characteristics database of Brizzi et al. (2018), which is based on the database of Heuret et al. (2011, 2012). This database consists of 62 subduction zone segments (Fig. 1) derived from merging 505 subduction zone transects based on homogeneous megathrust seismicity, homogeneous seismogenic zone geometry, or rupture areas for  $M_w \ge 8.0$  earthquakes confined in a single segment.

We do not consider the trench-parallel extent of the subduction zone and upper plate nature parameters from the database presented in Brizzi et al. (2018), as they only provide limited physical meaning. We also do not consider the relative upper plate, trench, and subducting plate velocities in this database. Instead, we focus on the subduction and convergence velocities independent of any reference frame to describe the kinematics of the system
(DeMets et al., 1990).

We add the parameters  $L^*$  and  $W_{\text{interplate}}$  from Heuret et al. (2011) as 107 measures for the along-strike length of the subduction segment and the seis-108 mogenic zone width, respectively. We also include two new parameters that 109 quantify the roughness of the seafloor of the incoming plate prior to subduc-110 tion according to Lallemand et al. (2018): long (i.e., 80–100 km) and short 111 (i.e., 12–20 km) wavelength roughness. These parameters serve as a proxy 112 for the roughness on the subduction interface. The different wavelengths 113 are sensitive to different styles of topographic features on the subducting 114 plate. Short wavelength roughness is typically associated with small- and 115 intermediate-sized seamounts. Long wavelength roughness typically relates 116 to large seamounts, seamount chains, and oceanic ridges. To translate the 117 data provided by Lallemand et al. (2018) to the format of the 62 subduction 118 zone segments used here, we average the roughness values for all transects 119 comprising one subduction segment. Our final SNITCH-SN database has 25 120 different parameters (Table 1). 121

The AvsE parameter denotes the type of margin in a subduction segment 122 and can be either accretionary or erosional. Accretionary wedges are defined 123 as margins where mass is being accreted over long periods of geological time 124 (> 10 Myr). In contrast, mass is eroded at erosional margins. Material accre-125 tion can be facilitated through material transfer from the subducting plate 126 to the overriding plate, by scraping off material at the trench or underplat-127 ing (Clift and Vannucchi, 2004). Accretionary margins can also experience 128 short-lived periods of erosion. Similarly, erosional margins can experience 129

periods of accretion. For example, the Nankai subduction segment is an 130 accretionary margin which experienced short periods of erosion (Clift and 131 Vannucchi, 2004). These erosional periods could be induced by the subduc-132 tion of, for instance, a seamount. According to Clift and Vannucchi (2004), 133 accretionary margins are typically associated with slow convergence rates 134  $v_{\rm cn}$  and larger trench sediment thickness  $T_{\rm sed}.$  In contrast, erosional margins 135 favour rapidly converging systems with less sediment cover (< 1 km) (Clift 136 and Vannucchi, 2004). 137

We sort the SNITCH-SN parameters in three different categories to sim-138 plify the analysis: megathrust seismicity, geometric, and tectonic parameters. 139 The megathrust seismicity parameters result from earthquake observations 140 from the ISC-GEM Global Instrumental Earthquake (Storchak et al., 2013) 141 and Centennial-Harvard CMT catalogues spanning from 1900 up to 2007 142 (see Heuret et al., 2011; Brizzi et al., 2018, for more details). The geometric 143 parameters of the seismogenic zone are derived from megathrust seismicity 144 from 1900 to 2007 according to Heuret et al. (2011) (Fig. 3). Therefore, the 145 geometric parameters only shed light on the geometry of the seismogenic zone 146 along the megathrust and do not include information on the geometry of the 147 downgoing slab, overriding plate, splay or outer rise faults.  $W_{\rm intraslab}$  consid-148 ers the entire downdip length of the slab and is derived from all intraslab 149 earthquakes recorded in the area. The tectonic parameters are independent 150 of any earthquake catalogue, and give insight into the nature of the sub-151 ducting and overriding plate, the large scale geometry of the system, such 152 as the distance between the volcanic arc and the trench  $D_{\rm arc-trench}$ , and the 153 kinematics of the subduction zone. 154

Table 1: Parameters in the SNITCH-SN database: sub-duction nature

Symbol	Parameter	Unit		
	Megathrust seismicity parameters			
$N_{eq}$	Number of earthquakes	-		
τ	Seismicity rate: number of events per century and	-		
	per $10^3$ km trench			
CSM	Cumulative seismic moment	N m		
$M_{ m mrr}$	Equivalent representative magnitude in the sense	-		
	of Ruff and Kanamori (1980)			
$M_{\rm max,GEM1900}$	Maximum $M_w$ from 1900–2007 according to the	-		
	ISC-GEM catalogue			
$M_{\rm max,Cent\&CMT}$	Maximum $M_w$ from 1900–2007 according to the	-		
	Centennial & CMT catalogues			
$M_{\rm max,GEM1960}$	Maximum $M_w$ from 1960–2007 according to the	-		
	ISC-GEM catalogue			
Geometric parameters (based on seismicity)				
$z_{\min}$	Depth of the updip limit of the seismogenic zone	km		
$z_{ m max}$	Depth of the downdip limit of the seismogenic zone	km		
$x_{\min}$	Distance from the trench of the updip limit of the	km		
	seismogenic zone			
$x_{\max}$	Distance from the trench of the downdip limit of	km		
	the seismogenic zone			
$W_{\rm interplate}$	Downdip width of the seismogenic zone	km		

$\theta$	Dip of the megathrust	0
R	Curvature radius of the slab at the trench	km
$W_{\rm intraslab}$	Downdip length of the slab	km
	Tectonic parameters	
$L^*$	Trench-parallel extent of the subduction zone seg-	km
	ment	
A	Age	Myr
$D_{\rm arc-trench}$	Mean distance between the volcanic arc and the	km
	trench	
UPS	Upper plate strain	-
	1 = extension (E); 2 = neutral (N); 3 = compres-	
	sion $(C)$	
$T_{\rm sed}$	Sediment thickness at the trench	km
AvsE	Type of margin	-
	0 = accretionary (A); 1 = erosional (E)	
$R_{\rm sw}$	Short wavelength roughness (12-20 km) $$	m
$R_{\rm lw}$	Long wavelength roughness (80-100 km) $$	m
$v_{ m sn}$	Trench-normal component of the subduction ve-	mm year $^{-1}$
	locity from DeMets et al. (1990)	
$v_{ m cn}$	Trench-normal component of the convergence ve-	mm year <sup><math>-1</math></sup>
	locity from DeMets et al. (1990)	

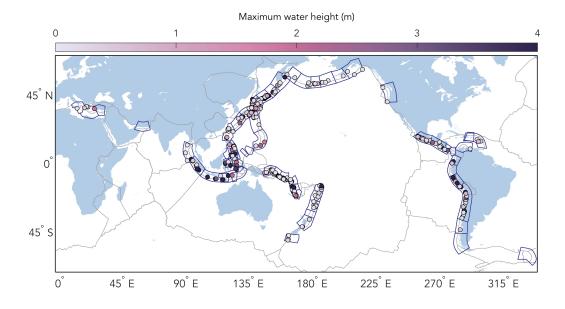


Figure 1: All 329 definite tsunami events caused by an earthquake in the NOAA NGDC/WDS Global Historical Tsunami Database that occurred from 1962 to 2018, organised into the subduction zone segments (dark blue) defined by Heuret et al. (2011). Events are coloured by maximum observed water height.

#### 155 2.2. SNITCH-T: Tsunamigenic earthquakes

We download data from the NOAA NGDC/WDS Global Historical Tsunami 156 Database (Global Historical Tsunami Database, Retrieved: February 1, 2019). 157 We choose this database over the Global Tsunami Database of the Novosi-158 birsk Tsunami Laboratory of the Institute of Computational Mathematics 159 and Mathematical Geophysics of Siberian Division of Russian Academy of 160 Sciences (NTL/ICMMG SD RAS; Global Tsunami Database, 2100 BC to 161 Present, 2019), because the NOAA database is better suited for studying the 162 statistics on the occurrence of tsunamis (Gusiakov et al., 2019). We select 163 definite tsunami events that were caused by an earthquake from 1962–2018. 164 We choose 1962 to start our data retrieval, because of the instalment of the 165

World-Wide Standardised Seismograph Network that year, which ensured 166 global monitoring of earthquakes. Prior to 1962, the NOAA NGDC/WDS 167 Global Historical Tsunami Database is potentially incomplete. Using this 168 time window, we extract 395 tsunamis. Because some of the parameters in 169 the SNITCH-SN database are based on megathrust seismicity data up to 170 2007 (Sec. 2.1), we make a second version of the SNITCH-T database that 171 is limited to 2007, which consists of 284 tsunamis. Hence, there are two 172 versions of the SNITCH-T database: SNITCH-T-2007 and SNITCH-T-2018. 173 For each tsunami in the NOAA NGDC/WDS Global Historical Tsunami 174 Database, we extract the tsunami source location (i.e., earthquake epicen-175 ter), maximum water height measured  $h_w$ , tsunami magnitude  $M_t$ , tsunami 176 intensity  $I_t$ , earthquake magnitude  $M_w$ , and earthquake hypocenter depth  $z_f$ 177 (i.e., the focal depth). 178

The tsunami magnitude  $M_t$  is defined as (Iida et al., 1967)

$$M_t = \log_2 h,\tag{1}$$

where h is the maximum runup height of the tsunami wave.

The tsunami intensity  $I_t$  is defined as (Soloviev and Go, 1974)

$$I_t = \log_2\left(\sqrt{2} \cdot h\right). \tag{2}$$

We sort all tsunamis into the subduction zone segments defined by Heuret et al. (2011) based on their tsunami source location. For the SNITCH-T-2018 database, 66 events are situated outside the subduction zone segments. We remove these events from our analysis, as they are not associated with tsunamigenic earthquakes in subduction zones. This results in a total of 329 tsunamis in the SNITCH-T-2018 database (Fig. 1). In the SNITCH-T-2007 database, 47 tsunamis are situated outside the subduction zone segments, so
the final SNITCH-T-2007 database consists of 237 tsunamis.

As the subduction zone segments consist of rectangular transects, they 190 can overlap in some places. If a tsunami is placed in an area where two or 191 more subduction zone segments overlap, we manually place it in a segment. 192 For this purpose, we consider the depth of the earthquake, which better 193 suggests with which subducting plate, and hence which subduction zone seg-194 ment, a tsunami should be associated. In total, there are 46 tsunamis (14%)195 of all tsunamis in SNITCH-T-2018) that are manually sorted into subduction 196 zone segments following this procedure. 197

When all tsunami events are sorted in a subduction zone segment, we count the amount of tsunamis in each subduction zone  $(N_{t,tot})$  and calculate the normalised number of tsunamis per km trench  $N_t$ 

$$N_t = \frac{N_{t,\text{tot}}/L^*}{\max(N_{t,\text{tot}}/L^*)},\tag{3}$$

where  $L^*$  is the along-strike length of a subduction segment. For each seg-201 ment, we also calculate the maximum water height among all events that 202 occurred in that segment, the average maximum water height observed for 203 the events, the maximum and average tsunami magnitude and intensity, the 204 average and minimum focal depth, and the minimum, average, and maximum 205 earthquake magnitude that caused a tsunami in that segment. We then have 206 13 parameters in the SNITCH-T database (Table 2). As the data in the 207 NOAA NGDC/WDS Global Historical Tsunami Database is scarce for each 208 tsunami, some subduction segments do not have values for all parameters. 209 The only parameters for which we have a complete record for all subduction 210 zone segments are  $N_t$  and  $N_{t,tot}$ . We deem  $N_t$  the most reliable quantity for 211

Tabl	Table 2: Parameters in the SNITCH-T database: tsunamigenic earthquakes				
Symbol	Parameter	Unit			
$N_t$	Normalised number of tsunamis per km trench	-			
$N_{t,\mathrm{tot}}$	Total number of tsunamis in a subduction zone segment	-			
$h_{w,\max}$	Maximum water height observed for an event in a segment	m			
$\overline{h_w}$	Average maximum water height of all events in a segment	m			
$M_{t,\max}$	Maximum tsunami magnitude observed for an event in a segment	-			
$\overline{M_t}$	Average tsunami magnitude of all events in a segment	-			
$I_{t,\max}$	Maximum tsunami intensity observed for an event in a segment	-			
$\overline{I_t}$	Average tsunami intensity of all events in a segment	-			
$\overline{z_f}$	Average earthquake focal depth of all events in a segment	$\mathrm{km}$			
$z_{f,\min}$	Minimum earthquake focal depth in a segment	km			
$M_{w,\max}$	Maximum earthquake magnitude in a segment	-			
$\overline{M_w}$	Average earthquake magnitude of all events in a segment	-			
$M_{w,\min}$	Minimum earthquake magnitude in a segment	-			

robust insights on the relationship between tectonics and tsunamigenesis as 212

it is normalised and not dependent on the size of the subduction segments. 213

Therefore, we focus our analysis on  $N_t$ . 214

#### 3. Bivariate statistical analysis 215

#### 3.1. Methods 216

We calculate the Pearson's product-moment correlation coefficient  ${\cal R}_p$  for 217 SNITCH-T with itself and SNITCH-SN. The Pearson's product-moment cor-218 relation coefficient gives insight into the linear correlation between two vari-219

ables. To reduce the effect of outliers on linear correlations, we also calculate the Spearman rank correlation coefficient  $\rho$ , in which the similarity or monotonicity between two variables is assessed, regardless of any linear relationship that might exist between them.

To focus our analysis, we consider a relationship between two variables 224 worthy of further investigation if both the Pearson and Spearman correlations 225 are higher than or equal to 0.3 (Heuret et al., 2011) with *p*-values smaller than 226 0.05 (i.e., there is less than a 5% chance that the null hypothesis of there being 227 no correlation is true). p-values for the Spearman correlations are indicated 228 by p and p-values for Pearson correlations are indicated by  $p_p$ . For visualising 229 our results, we show the Spearman's rank correlation coefficient (Sec. 3.2), 230 because it typically shows the highest correlations. This is due to the fact 231 that the data is not linear, and can more easily be described by a monotonic 232 relationship. However, the differences in correlation coefficients between the 233 two methods is on average only a few percent. The results for Pearson's 234 product-moment correlation coefficient can be found in the Supplementary 235 Material. 236

#### 237 3.2. Results

### 238 3.2.1. Tsunamigenic earthquakes

Fig. 2 shows the correlation matrix for the Spearman's rank correlation coefficients of SNITCH-T-2018 with itself. In this and the following figures, correlations that are significant under our definition in Sec. 3.1 are indicated by a red plus or minus sign depending on a positive or negative correlation, respectively. Additional scatter plots and numbers for the correlations and corresponding *p*-values can be found in the Supplementary Material.

The normalised number of tsunamis per km trench  $N_t$  and total number 245 of tsunamis in a subduction zone segment  $N_{t,tot}$  correlate positively with the 246 maximum water height  $h_{w,\text{max}}$  ( $\rho = 0.44$  and  $\rho = 0.56$ , respectively), which 247 relates to the fact that the likelihood of a tsunami with high maximum water 248 height is larger when sufficient tsunami events occur in a given subduction 249 zone. A similar reasoning can be applied to the correlations between  $N_t$  and 250  $N_{t,\text{tot}}$  and  $M_{w,\text{max}}$  ( $\rho = 0.44$  and  $\rho = 0.49$ , respectively), as a large number 251 of tsunamigenic earthquakes in a subduction zone increases the likelihood of 252 a big earthquake being the cause of such an event. 253

The maximum water height parameters and  $M_{t,\text{max}}$  also correlate positively with the maximum and average earthquake magnitude, which indicates that larger earthquakes produce larger wave heights and hence tsunami magnitudes and intensities.

The average focal depth of the tsunamigenic earthquakes correlates positively with the magnitude of the earthquake ( $\rho = 0.35$ ), indicating that a larger earthquake magnitude corresponds to a deeper focal depth. This is reinforced by the correlation between the shallowest focal depth and the minimum earthquake magnitude ( $\rho = 0.43$ ). Hence, large tsunamigenic earthquakes likely nucleate at larger focal depths.

#### 264 3.2.2. Megathrust seismicity

The Spearman's rank correlation coefficient matrix of the tsunamigenic earthquake parameters of SNITCH-T-2007 and the megathrust seismicity parameters of SNITCH-SN is shown in Fig. 3.  $N_t$  correlates well with the number of earthquakes  $N_{eq}$  ( $\rho = 0.57$ ), the seismicity rate  $\tau$  ( $\rho = 0.63$ ), and the various measures of the maximum earthquake magnitude (0.34 <  $\rho$  < 0.46).

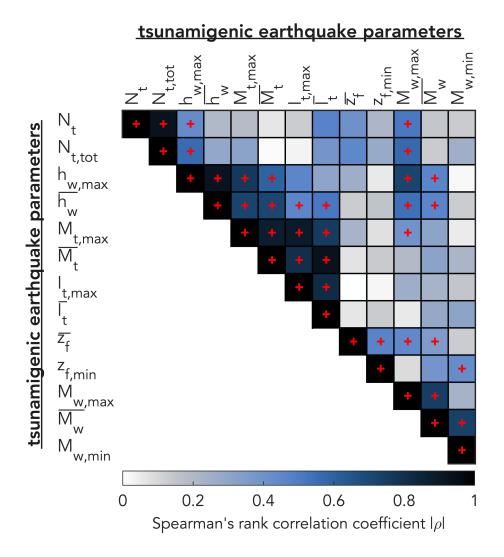


Figure 2: Spearman's rank correlation coefficients for SNITCH-T-2018: tsunami and tsunamigenic earthquake characteristics correlated with itself. Significant positive and negative correlations worthy of further investigation as defined in Sec. 3.1 are indicated by a red plus and minus sign, respectively. Abbreviations for parameters are explained in Table 2.

The maximum water height  $h_{w,\text{max}}$  correlates with some megathrust seismicity parameters, such as the cumulative seismic moment CSM ( $\rho = 0.45$ ), and the equivalent representative magnitude  $M_{\text{mrr}}$  ( $\rho = 0.43$ ). This indicates that larger wave heights can be associated with larger earthquakes. The maximum and average maximum magnitude of tsunamigenic earthquakes in a subduction zone correlate well with all the megathrust seismicity measures ( $0.3 < \rho < 0.76$ ), with the exception of  $M_{\text{max,Cent&CMT}}$  for  $\overline{M_w}$ .

#### 277 3.2.3. Geometry of the seismogenic zone and slab

There are few correlations between the geometric parameters describing 278 the seismogenic zone and subducting slab in SNITCH-SN and the tsunami-279 genic earthquake parameters of SNITCH-T-2007 (Fig. 3). The only signifi-280 cant correlations are found between the dip of the subduction zone  $\theta$  and the 281 average earthquake focal depth  $\overline{z_f}$  ( $\rho = 0.46$ ). This indicates that a larger 282 dip results in a larger focal depth, which is to be expected as a larger dip of a 283 subducting plate (i.e., a steeper slab) is often associated with a deeper seis-284 mogenic zone limit. The negative relationship between  $\overline{z_f}$  and the radius of 285 curvature  $R \ (\rho = -0.40)$  reflects the same physical explanation. The average 286 and minimum tsunamigenic earthquake magnitude also correlate positively 287 with the dip of the subduction zone. 288

#### 289 3.2.4. Tectonics of the subduction system

The tectonic parameters describe the large scale structure, geometry, kinematics, and nature of the subduction zone. Since the tectonic parameters are not influenced by a limited observational time span, we correlate them with the SNITCH-T-2018 database (Fig. 4).

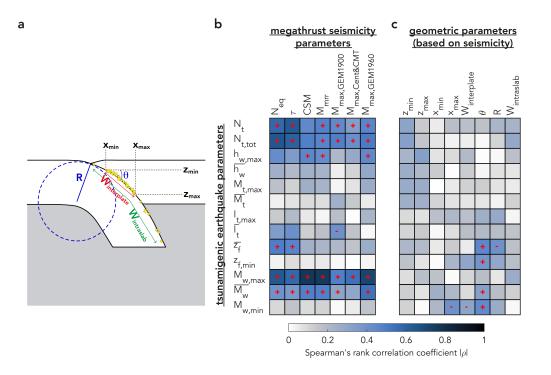


Figure 3: (a) Diagram showing how the geometric parameters in the SNITCH-SN database are estimated based on the extent of megathrust seismicity (yellow stars). (b,c) Spearman's rank correlation coefficients for SNITCH-T-2007 correlated with (b) the megathrust seismicity and (c) the geometric parameters (based on seismicity) of SNITCH-SN. Significant positive and negative correlations worthy of further investigation as defined in Sec. 3.1 are indicated by a red plus and minus sign, respectively. Abbreviations for parameters are explained in Table 2.

We find a positive correlation between the type of margin AvsE and  $N_t$ ( $\rho = 0.35$ ), which translates to erosional margins being associated more with tsunamigenic earthquakes. This is corroborated by the negative correlation between  $N_t$  and  $T_{sed}$  ( $\rho = -0.40$ ).

N<sub>t</sub> correlates positively with the trench-normal component of the subduction and convergence velocity ( $v_{\rm sn}$  and  $v_{\rm cn}$ ;  $\rho = 0.66$  and  $\rho = 0.47$ , re-

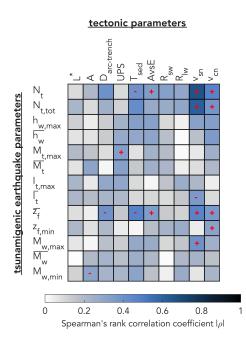


Figure 4: Spearman's rank correlation coefficients for SNITCH-T-2018 correlated with tectonic parameters of SNITCH-SN. Significant positive and negative correlations worthy of further investigation as defined in Sec. 3.1 are indicated by a red plus and minus sign, respectively. Abbreviations for parameters are explained in Table 2.

spectively), which complies with the assumption that more tsunamigenic earthquakes would be recorded during the same time span in settings where the stress build-up is more rapid. This also holds for non-tsunamigenic earthquakes (McCaffrey, 2008; Corbi et al., 2017b).

The maximum tsunami magnitude correlates positively ( $\rho = 0.33$ ) with the upper plate strain, meaning that compressional upper plates are more often associated with larger tsunami magnitudes. The average focal depth of tsunamigenic earthquakes  $\overline{z_f}$  shows a negative relationship with  $T_{\text{sed}}$  ( $\rho = -$ 0.47), and a positive correlation with AvsE ( $\rho = 0.35$ ), indicating erosional <sup>309</sup> margins are more associated with a larger average focal depth.

The average focal depth also correlates with both velocity measures. In line with  $N_t$ , the maximum tsunamigenic earthquake magnitude  $M_{t,\text{max}}$  correlates with the trench-normal component of the subduction velocity  $v_{\text{sn}}$  $(\rho = 0.40)$ .

Fig. 5 shows scatter plots of  $N_t$  versus the tectonic parameters (Table 2). 314 There are trends visible between AvsE,  $v_{sn}$ , and  $v_{cn}$  versus  $N_t$  as expected 315 from the high correlations found by the Spearman and Pearson methods. 316 Large  $N_t$  only occurs for low sediment thickness  $T_{\text{sed}}$ . There also seems to 317 be a trend for both seafloor roughness parameters, indicating that a rougher 318 seafloor is associated with more transmis. This is confirmed by the signif-319 icant (p < 0.05), relatively high ( $\rho = 0.32$  for  $R_{\rm sw}$  and  $\rho = 0.30$  for  $R_{\rm lw}$ ) 320 Spearman rank correlations for both  $R_{sw}$  and  $R_{lw}$ , although no significant, 321 high correlations are found for the Pearson's coefficient. The two subduction 322 zone segments with the highest normalised number of tsunamis  $N_t$  are Japan 323 and South-Kuril. Because of their high  $N_t$ , they are often outliers. 324

#### 325 4. Multivariate statistical analysis

#### 326 4.1. Methods

Following Sandri et al. (2004); Brizzi et al. (2018), we use the Fisher discriminant method (e.g., Duda et al., 1973) to perform a pattern recognition analysis focused at discovering combinations of parameters that could promote the occurrence of tsunamigenic earthquakes. We only consider the tectonic parameters of the SNITCH-SN database to take advantage of the larger amount of data in the corresponding SNITCH-T-2018 database. We exclude

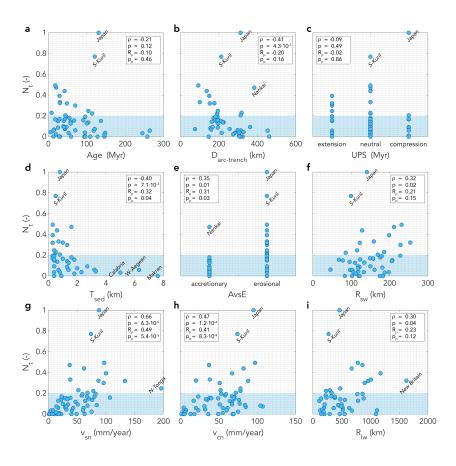


Figure 5: Scatter plots showing the relation between the normalised number of tsunamigenic earthquakes per km trench  $N_t$  and (a) the age of the subducting plate A; (b) the distance between the volcanic arc and the trench  $D_{\rm arc-trench}$ ; (c) the upper plate strain UPS; (d) the sediment thickness at the trench  $T_{\rm sed}$ ; (e) the type of margin AvsE; (f) the short wavelength (i.e., 12–20 km) roughness  $R_{\rm sw}$ ; (g) the trench-normal component of the subduction velocity  $v_{\rm sn}$ ; (h) the trench-normal component of the convergence velocity  $v_{\rm cn}$ ; and (i) the long wavelength (i.e., 80–100 km) roughness  $R_{\rm lw}$ . Each dot represents one of the 62 subduction zone segment. Correlation coefficients and p-values are indicated for both the Spearman and Pearson methods. The names of the subduction zone segments are indicated for isolated points in the scatter plots. The threshold of 0.2 for the multivariate analysis is indicated by the blue rectangle.

 $L^*$ , because this parameter solely depends on the choice of the subduction zone segments and does not represent a physical feature of the subduction system.

We first identify linear combinations that can divide the subduction zone segments in two classes based on  $N_t$ , with class 1 containing subduction zone segments with few tsunamigenic earthquakes (i.e.,  $N_t < 0.2$ ), and class 2 containing subduction zone segments with a large number of tsunamigenic earthquakes (i.e.,  $N_t \ge 0.2$ ). The threshold of 0.2 is chosen because it seems to naturally divide the data in the case of the bivariate analysis, as shown in the scatter plots of the age, sediment thickness, and type of margin in Fig. 5.

The Fisher discriminant analysis typically consists of a learning phase, a 343 voting phase, and control experiments (e.g., Sandri et al., 2004, and references 344 therein). However, following Brizzi et al. (2018), we confine our analysis to 345 the learning phase due to the limited amount of data. During the learning 346 phase, an input set of n parameters is used to identify all the possible linear 347 combinations consisting of k = 1, ..., n parameters. To distinguish the effect 348 of multiple parameters that could be interdependent, we run 36 Fisher anal-349 yses to systematically test the effect of the parameters. The parameters A, 350  $D_{\rm arc-trench},$  and UPS are independent parameters that are always included 351 in the analysis.  $T_{sed}$  and AvsE (i.e., the type of margin: accretionary or 352 erosional) are dependent on each other as larger sediment thickness is usu-353 ally associated with accretionary margins, whereas small sediment thickness 354 is typically associated with erosional margins. Hence, 3 different test cases 355 need to be run: one in which both parameters are included and two where 356 each parameter is included separately. The same reasoning holds for the two 357

measures of incoming plate roughness  $R_{sw}$  and  $R_{lw}$ . We adopt a simular 358 reasoning for the velocities  $v_{sn}$ ,  $v_{cn}$ , but we also include the option to exclude 359 both velocities from the linear combination, because they could potentially 360 relate to the limited time span of observations in addition to a physical mech-361 anism. This then results in a total of  $3 \cdot 3 \cdot 4 = 36$  different sets of input 362 parameters for the Fisher analysis. For a given set of input parameters, 363 there is one linear combination with a minimum number of parameters  $k_m$ 364 that minimises the error: the optimal linear combination (Fig. 6). For each 365 analysis, we automatically detect this optimal linear combination when the 366 error reduction by including more parameters into the analysis becomes less 367 than 5% with respect to the initial error in the case of including only one 368 parameter. Hence, we end up with an optimal linear combination for each of 369 the 36 Fisher analyses. The coefficients in the linear combinations indicate 370 the importance of a parameter in the combination. 371

To systematically determine which parameters are the most important 372 for generating tsunamigenic earthquakes, we look at three measures: (i) the 373 fraction that a parameter is picked in the best linear combination for a Fisher 374 analysis when it is part of the input; (ii) the normalised average coefficient of 375 a parameter based on all Fisher analyses for which it is included in best linear 376 combination; (*iii*) the maximum fraction of a consistent sign (i.e., positive 377 or negative) of the coefficient of a parameter to account for the robustness of 378 the effect of the parameter in the linear combination. We define the measure 379 of relative importance RI of a parameter as the multiplication of these three 380 measures. 381

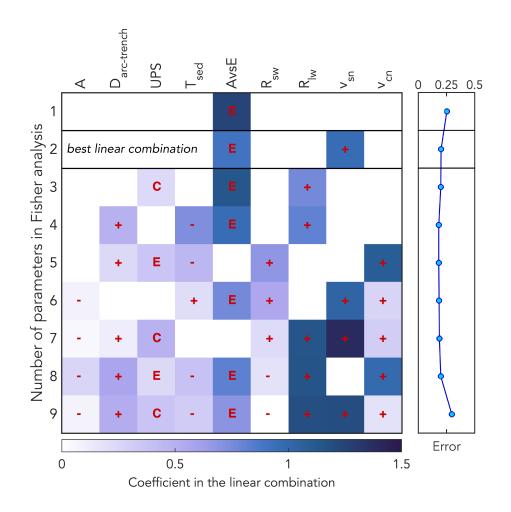


Figure 6: Representative Fisher analysis for one set of input parameters (listed at the top). When a parameter is included in the linear combination, a red symbol indicates how it promotes class 2 ( $N_t \ge 0.2$ ). Hence, a plus indicates that larger values of a parameter are associated with class 2. For discrete parameters, letters indicate the most favourable setting for class 2 (Table 1). The right panel shows the error reduction when more parameters are included in the linear combination. The optimal linear combination for which the error is maximally reduced for the least amount of features included in the linear combination is indicated by black lines.

## 382 4.2. Results

Fig. 6 shows the results for one representative Fisher analysis. The input parameters used in the test are indicated at the top, and the resulting coefficients of the linear combinations for different numbers of parameters allowed in the linear combination (on the *y*-axis) is indicated by the colours in each row. Parameters are part of the linear combination when a red symbol is present in the relevant square.

If only one parameter is used to distinguish the two classes of few (class 389 1;  $N_t < 0.2$ ) and many (class 2;  $N_t \ge 0.2$ ) tsunamigenic earthquakes, the 390 type of margin AvsE is the deciding factor. In this case, an erosional margin 391 is more favourable to produce many tsunamis. When a second parameter 392 is allowed to enter the linear combination that divides the two classes, the 393 trench-normal component of the subduction velocity is picked by the Fisher 394 algorithm. The positive coefficient indicates that a large subduction velocity 395 correlates to class 2, i.e., many tsunamigenic earthquakes. These two param-396 eters, AvsE and  $v_{sn}$ , also exhibited high correlations in the bivariate analysis 397 (Sec. 3.2.4). The combination of these two parameters is also the optimal 398 linear combination as defined in Sec. 4.1. The error is namely reduced the 399 most with respect to the least amount of features required to divide the two 400 classes. When a third parameter enters the linear combination, the upper 401 plate strain UPS is picked by the Fisher analysis. An overriding plate that 402 experienced compression is associated with many tsunamis. Simultaneously, 403 the long wavelength roughness  $R_{\rm lw}$  is picked instead of the subduction ve-404 locity, indicating that a rougher incoming plate is associated with the class 405 of many tsunamis. With four parameters, the upper plate strain is removed 406

from the linear combination, and instead the sediment thickness  $T_{\rm sed}$  and the 407 distance between the volcanic arc and the trench  $D_{\rm arc-trench}$  are picked. As 408  $D_{\rm arc-trench}$  can be related to the dip of a slab, with large  $D_{\rm arc-trench}$  being asso-409 ciated with a more shallowly dipping slab, a positive coefficient in the linear 410 combination could hint at a relationship between shallowly dipping slabs and 411 tsunamigenic earthquakes. The negative coefficient of the sediment thickness 412  $T_{\rm sed}$  associated here with many tsunamis is in line with the erosional mar-413 gin that is consistently present in almost all linear combinations. When all 414 9 parameters are included in the linear combination, which is theoretically 415 possible, the error is higher compared to the best linear combination. This 416 indicates that including more parameters into the linear combination does 417 not necessarily improve it. Also note that the parameters chosen for the 418 linear combinations can differ completely when a different number of param-419 eters is allowed for the linear combination. The sign of the parameter can 420 also change for different numbers of parameters. When the sign consistently 421 remains the same over all linear combinations and Fisher analyses, we deem 422 the effect of the parameter on dividing the two classes to be robust. In sum-423 mary, for the example Fisher analysis of Fig. 6, the linear combination that 424 best describes the difference between the two classes with these parameters 425 as input consists of the type of margin and the subduction velocity. 426

When we consider all 36 Fisher analyses, the amount of parameters included in the best linear combination is on average 2.9. The maximum amount of parameters included in the optimal linear combination is 6. The error associated with the best linear combination is on average 0.22. This corresponds to an average of 10.5 segments (25.6%) that are classified in the <sup>432</sup> wrong class according to the optimal linear combination. The best linear
<sup>433</sup> combinations for each of the 36 Fisher analyses that were run for different
<sup>434</sup> combinations of input parameters are shown in Fig. 7. Several variables ap<sup>435</sup> pear to stand out, such as the type of margin (consistently erosional) and the
<sup>436</sup> subduction velocity (consistently positive). We summarise the main findings
<sup>437</sup> of these 36 analyses in Fig. 8, by calculating the relative importance of each
<sup>438</sup> parameter as described in Sec. 4.1.

The most important parameter, with a relative importance of 0.86, is the 439 type of margin, i.e., accretionary or erosional. When it is included in the 440 input parameters of the Fisher analysis, it is picked 95.8% of the time in 441 the best linear combination. After that, the second most important parame-442 ter is the trench-normal component of the subduction velocity with relative 443 importance 0.66, which is picked 66.7% of the time. The third most impor-444 tant parameter is the sediment thickness with RI = 0.46, which is picked 445 50% of the time. The long wavelength roughness has a relative importance 44F of 0.32 and the trench-normal component of the convergence velocity has 447 RI = 0.28. The other parameters show low measures of relative importance 448 with RI < 0.1. Hence, based on these results, subduction zones are more 449 prone to host tsunamigenic earthquakes at an erosional margin with few 450 sediments and a rough incoming seafloor in a rapidly converging system. 451

#### 452 5. Discussion

We compiled the SNITCH database consisting of tsunami characteristics, tsunamigenic earthquake parameters, megathrust seismicity, seismogenic zone geometry, and tectonic parameters of subduction zones across

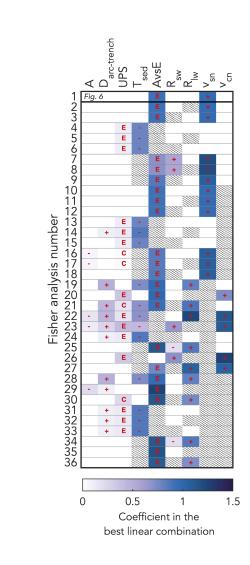


Figure 7: The best linear combination for each Fisher analysis. When a parameter is included in the linear combination, a red symbol indicates how it promotes class 2 ( $N_t \ge 0.2$ ). Hence, a plus indicates that larger values of a parameter are associated with class 2. For discrete parameters, letters indicate the most favourable setting for class 2 (Table 1). If parameters are not included in the input for a test, the area is dotted. Note that the best linear combination of Fig. 6 is included here as well and highlighted by horizontal black lines.

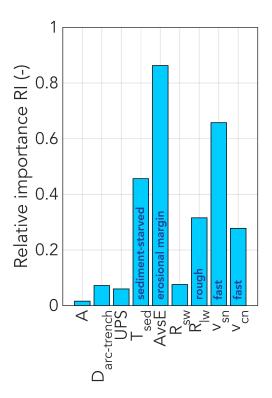


Figure 8: The relative importance of parameters (Sec. 4.1) as calculated from the Fisher analyses presented in Fig. 7. For parameters with a relative importance RI > 0.2, text in the bars indicates how the parameter promotes many tsunamigenic earthquakes (class 2).

the world. The bivariate analysis (Sec. 3) shows that the normalised number 456 of tsunamis per km trench  $N_t$  correlates with some of the interplate seismicity 457 and tectonic parameters in SNITCH-SN. However,  $N_t$  shows no correlation 458 with the geometric parameters describing the seismogenic zone. Specifically, 459 meaningful correlations are found with the type of margin (i.e., accretionary 460 or erosional), the trench-normal components of the subduction and conver-461 gence velocity of the subduction zone, the sediment thickness, seismicity 462 rate, and measures of maximum earthquake magnitude in a subduction zone 463

464 segment.

The multivariate analysis of the tectonic parameters points towards the same parameters identified in the bivariate analysis and to the incoming plate roughness, to distinguish subduction zones with a lower ( $N_t < 0.2$ ) and higher number of tsunamigenic earthquakes ( $N_t \ge 0.2$ ). Specifically, we find that rough incoming plates at erosional margins, in rapidly converging systems have produced more tsunamigenic earthquakes during the analysed time span.

In the following, we discuss which - if any - tectonic setting is more favourable for tsunamigenic earthquakes and how this could affect tsunamigenesis. We also speculate which kind of fault is likely to be the most important in producing tsunamigenic earthquakes, because we did not find a correlation with the seismogenic zone geometry parameters.

# 477 5.1. Are there specific tectonic settings where more tsunamigenic earthquakes 478 have been observed?

We find multiple significant correlations and patterns in both the bivari-479 ate and multivariate analyses, indicating that certain parameters are indeed 480 correlated with an increased amount of observed tsunamis. So, we show that 481 there are indeed specific tectonic settings where more tsunamigenic earth-482 quakes have been observed. Therefore, we speculate that there are specific 483 tectonic settings that could be more prone to host tsunamigenic earthquakes 484 (Sec. 5.2). However, most scatter plots still contain outliers (Fig. 5) and there 485 are always at least 8 segments incorrectly classified in the multivariate anal-486 ysis (Sec. 4.2). Besides that, for some parameters no clear correlation can be 487 discerned at all. This is partly due to the limited amount of data for the 62 488

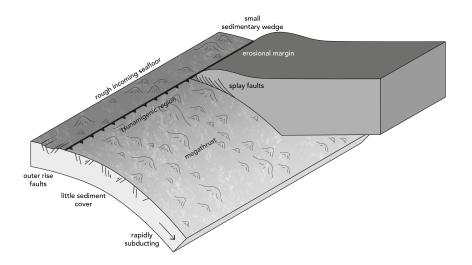


Figure 9: Cartoon of a tectonic setting more prone to host tsunamigenic earthquakes. A subducting slab with little sediments and a rough incoming seafloor subducts relatively rapidly beneath a continental plate at an erosional margin.

subduction zone segments. Most parameters in the SNITCH database do not
have values for each subduction zone segment due to a lack of observations.
In addition, we only consider a limited observational time span for the
data in this study, with the earthquake data limited to 1900–2007 and the
tsunami data limited to 1962–2018 (or, for comparison to the earthquake
parameters, 2007). This time span is constrained due to the availability of
global observations and could incur a bias in our results.

Interestingly, the seismogenic zone geometry parameters (Sec. 3.2.3) do not correlate with  $N_t$ , which can have different explanations. First, it might be that the amount of data present in our tsunami databases is too scarce to result in any significant correlation (Fig. 3). However, other parameters do show significant correlations, so this option is not necessarily true. An alternative explanation might be that the megathrust is not the most important fault in tsunamigenesis. Because of that, the seismogenic zone parameters that define the potential slip area on the megathrust do not correlate with  $N_t$ . We explore this option in more detail in Sec. 5.3.

#### 505 5.2. Which tectonic setting is more prone to host tsunamigenic earthquakes?

Our analysis shows that subduction zones where the incoming plate subducts 506 rapidly at an erosional margin are more prone to generate tsunamis through 507 earthquakes (Fig.9). Our analysis also highlights the importance of having 508 a thin sediment layer in the subduction segment in order to be associated 500 with more tsunamigenic earthquakes. The effect of a thin sediment layer on 510 tsunamigenic earthquake occurrence in subduction zones fits well with the 511 importance of erosional margins, because sediment-starved trenches are often 512 associated with erosional margins. However, this does not mean that ero-513 sional margins are completely devoid of sediment cover (Clift and Vannucchi, 514 2004). It has been suggested that the presence of sediments could enhance 515 tsunamigenesis, by promoting larger uplift (Ma and Nie, 2019). This could 516 explain the large range of  $N_t$  for subduction zone segments with moderate 517 sediment cover (i.e.,  $T_{\rm sed}$   $\leq$  2 km; Fig. 5d). Therefore, erosional margins 518 with a small sedimentary wedge may be more prone to host tsunamigenic 519 earthquakes. The negative correlation between sediment thickness and the 520 amount of normalised tsunamis in a subduction zone segment could also be 521 related to the effect of sediment thickness on the recurrence time of earth-522 quakes (Brizzi et al., 2017). Their numerical models show that less sediment 523 cover results in a smaller seismogenic zone with a shorter recurrence inter-524 val. Here, we find that subduction zone segments with a thick sedimentary 525

layer — and, presumably, a larger recurrence interval — have produced less 526 tsunamis, which could be a result of the limited observational time span of 527 the SNITCH database (Sec. 5.1). One outlier that is apparent in Fig. 5e is the 528 Nankai subduction segment, which has produced relatively many tsunamis 529 even though it is an accretionary margin rather than erosional. However, 530 the Nankai segment has experienced periods of erosion (Clift and Vannucchi, 531 2004), which might explain why it has experienced more transmis than the 532 other accretionary margins. The Nankai subduction segment is also charac-533 terised by a rough subducting plate with many topographical features such 534 as seamounts (Yokota et al., 2016). Since we find that rough subducting 535 plates are associated with more tsunamigenic earthquakes, this could also 536 contribute towards the reason as to why Nankai is an outlier. 537

The importance of the trench-normal components of the subduction and 538 convergence velocity can be explained through the general relationship be-539 tween earthquakes and tsunamis also found in the bivariate analysis (Sec. 3.2; 540 Fig. 3). In a subduction zone with a high subduction or convergence velocity, 541 the stresses are built up faster and hence released more often in earthquakes, 542 resulting in a shorter recurrence interval. More earthquakes generally means 543 a larger likelihood of those earthquakes producing tsunamis. Since our study 544 is restricted to a specific time interval for tsunamigenic earthquake observa-545 tions, it is indeed likely that the subduction zones with a higher convergence 546 velocity have produced more tsunamigenic earthquakes in this time period 547 (McCaffrey, 2008; Corbi et al., 2017a). An alternative explanation for the 548 importance of the velocities could be that large convergence velocities are typ-549 ically associated with erosional margins (Clift and Vannucchi, 2004). Since 550

we find that erosional margins are the most important factor for increased tsunamigenesis, it follows that the two aspects associated most with erosional margins, i.e., fast convergence and a thin sediment cover, are also highlighted in our analysis as important factors for tsunamigenesis.

Other studies have already linked sediment thickness at the trench and 555 seafloor roughness to tsunami earthquakes (Tanioka et al., 1997; Polet and 556 Kanamori, 2000). The combination of a thin sediment layer at the trench and 557 a rough seafloor in particular has already been pointed out for 13 tsunami 558 earthquake regions at 7 different subduction zones (i.e., Sumatra, Java, 559 Hokkaido and the Kurils, Aleutians, Nicaragua, Peru, and New Zealand) by 560 Geersen (2019). They looked at structural similarities between marine acous-561 tic data. Our study strengthens this view by providing the first global, statis-562 tical analysis of the effect of these parameters on tsunamigenic earthquakes, 563 which include both tsunami earthquakes and large megathrust earthquakes 564 that caused tsunamis. The amount of trench sediments and the roughness 565 of the seafloor are often considered as related, because thick piles of sedi-566 ment entering the trench could potentially smooth out the topography on 567 the incoming plate (Ruff, 1989). It is generally thought that a rough in-568 coming seafloor and lack of sediments leads to a complex, heavily fractured 569 shallow subduction interface (Dominguez et al., 1998; Wang and Bilek, 2011, 570 2014; Ruh et al., 2016). Such a heavily fractured environment could promote 571 tsunamigenic earthquakes, because of the increased presence of splay faults 572 that can accommodate large vertical displacement. 573

#### 574 5.3. Which type of fault produces tsunamigenic earthquakes?

Large tsunamis have been caused by large earthquakes that ruptured 575 the megathrust, such as the 2004  $M_w$  9.1–9.3 Sumatra-Andaman (e.g., Lay 576 et al., 2005; Titov et al., 2005), 2010  $M_w$  8.8 Maule (e.g., Delouis et al., 577 2010), and 2011  $M_w$  9.0 Tōhoku-Oki earthquake (e.g., Fujii et al., 2011; 578 Ozawa et al., 2011). They have also been caused by smaller earthquakes 579 that potentially ruptured outer rise or splay faults, such as the 1933  $M_{\rm w}8.4$ 580 Sanriku (Kanamori, 1971), 1946 Unimak Alaska (von Huene et al., 2016), 581 and 2006 Java (Fan et al., 2017) tsunami earthquakes. Simultaneously, splay 582 faults could also play a role during large megathrust earthquakes, as sug-583 gested for the 2004  $M_w$  9.1–9.3 Sumatra-Andaman (DeDontney and Rice, 584 2012; Waldhauser et al., 2012) and the 2010  $M_w$  8.8 Maule (Melnick et al., 585 2012) earthquakes. 586

Our study shows a lack of correlations between  $N_t$  and the seismogenic 587 zone geometry parameters, as discussed in Sec. 5.1. This could result from 588 the fact that the megathrust is not the most important fault to produce 589 tsunamigenic earthquakes. Indeed, many studies have proposed that outer 590 rise or splay faults play an important role for tsunamigenesis (e.g., Fukao, 591 1979; Wendt et al., 2009; Sladen and Trevisan, 2018). Slip on these types of 592 faults, which are typically steeper than the megathrust, could result in larger 593 vertical displacement compared to megathrust events. This could explain the 594 discrepancy between earthquake moment magnitude and tsunami magnitude 595 observed during tsunami earthquakes (Kanamori, 1972). It could also explain 596 why we find that erosional margins have produced more tsunamigenic earth-597 quakes, since they are typically associated with a heavily fractured environ-598

<sup>599</sup> ment including splay faults. Hence, we speculate that faults other than the <sup>600</sup> megathrust might play an equally, or more, important role in tsunamigenesis.

#### 601 6. Conclusions

We compiled the SNITCH database, which contains global data on earth-602 quake and tectonic subduction zone features, tsunamis, and tsunamigenic 603 earthquakes for 62 subduction segments. In the performed bivariate anal-604 ysis, we find correlations between the normalised number of tsunamigenic 605 earthquakes per km trench  $N_t$  of the SNITCH-T database and some of the 606 tectonic parameters of the SNITCH-SN database (i.e., the type of margin: 607 accretionary or erosional, the trench-normal components of the subduction 608 and convergence velocity, and the sediment thickness at the trench). 609

The multivariate analysis explores the relationships between the tectonic 610 parameters and the tsunamigenic potential of a subduction zone further. The 611 type of margin (i.e., erosional or accretionary) and the subduction and con-612 vergence velocity normal to the trench are the most crucial parameters to 613 sort the subduction zones between a class with few tsunamigenic earthquakes 614  $(N_t < 0.2)$  and a class with many tsunamigenic earthquakes  $(N_t \ge 0.2)$ . 615 Other parameters of secondary importance for this division are the long wave-616 length roughness and the sediment thickness at the trench. Tsunamigenic 617 earthquakes therefore appear to be more common in rapidly converging, ero-618 sional subduction settings, with a rough incoming plate and low amounts of 619 sediments at the trench. These settings are characterised by heavily fractured 620 and complex, heterogeneous shallow subduction interfaces arising from the 621 rough seafloor and the lack of sediments smoothing the interface. Tsunami-622

genic earthquakes may be more common in such settings, because of the
presence of more splay faults, which could accommodate larger vertical displacements.

#### 626 7. Acknowledgements

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The SNITCH database is included in the Supplementary Material of thisarticle.

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