# Comparisons among the five ground-motion models developed using RESORCE for the prediction of response spectral accelerations due to earthquakes in Europe and the Middle East

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## 7 Abstract

8 This article presents comparisons among the five ground-motion models described in other articles 9 within this special issue, in terms of data selection criteria, characteristics of the models and predicted 10 peak ground and response spectral accelerations. Comparisons are also made with predictions from the 11 Next Generation Attenuation (NGA) models to which the models presented here have similarities (e.g. a common master database has been used) but also differences (e.g. some models in this issue are 12 nonparametric). As a result of the differing data selection criteria and derivation techniques the 13 predicted median ground motions show considerable differences (up to a factor of two for certain 14 scenarios), particularly for magnitudes and distances close to or beyond the range of the available 15 observations. The predicted influence of style-of-faulting shows much variation among models 16 whereas site amplification factors are more similar, with peak amplification at around 1s. These 17 differences are greater than those among predictions from the NGA models. The models for aleatory 18 19 variability (sigma), however, are similar and suggest that ground-motion variability from this region is 20 slightly higher than that predicted by the NGA models, based primarily on data from California and 21 Taiwan.

22 Keywords: strong-motion data; ground-motion models; ground-motion prediction equations; style of

23 faulting; site amplification; aleatory variability; epistemic uncertainty; Europe; Middle East.

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#### 24 1. Introduction

25 The collection of five ground-motion models presented in other articles in this special issue has 26 similarities to the five sets of ground-motion prediction equations (GMPEs) derived during the Next 27 Generation Attenuation (NGA) project (Power et al., 2008) and described in a special issue of 28 Earthquake Spectra in 2008. Firstly, both sets of models were derived for state-of-the-art seismic 29 hazard assessments for shallow active crustal seismicity in specific geographical regions: western 30 North America (specifically California) for NGA, and Europe and the Middle East here. In passing it 31 may be noted, however, that the NGA models have been shown to be applicable to Europe and the 32 Middle East (Stafford et al., 2008). Secondly, all five GMPEs presented here were derived based on 33 records chosen from a common strong-motion database (RESORCE, see Akkar et al., 2013c), whose 34 compilation has similarities to the procedure followed when developing the NGA database (Chiou et 35 al., 2008). Thirdly, careful data selections were made by each of the GMPE developers and state-of-36 the-art derivation techniques were followed. Lastly, the collection of GMPEs produced seeks to 37 acknowledge the still considerable epistemic uncertainty present in the assessment of earthquake shaking (e.g. Douglas, 2010). For the application of the NGA models within the USGS national hazard 38 39 calculations additional branches were added to the logic-tree in certain magnitude-distance bins to 40 capture epistemic uncertainty beyond that represented by these models (Petersen et al., 2008).

41 On the other hand, the collection presents significant differences with respect to the NGA models. 42 Firstly, unlike the NGA models, which were all derived using regression analysis, generally the 43 random-effects approach (e.g. Abrahamson and Youngs, 1992), (although with some coefficients fixed 44 a priori based on physical arguments), here only two models were derived in this way (Akkar et al., 2013a, b; Bindi et al., 2013). Two of the others are non-parametric models derived using data-driven 45 46 approaches (Derras et al., 2013; Hermkes et al., 2013) and the other model (Bora et al., 2013) makes 47 predictions of response spectral accelerations using random-vibration theory based on empirical models for Fourier amplitude spectra and durations. Secondly, unlike the multi-year NGA project, 48 49 which involved extensive interactions among developers and other project participants (leading to 50 multiple iterations of the models), the models presented here were derived in a much shorter period 51 and following limited communication among groups. Although the development of RESORCE was 52 funded by SHARE and SIGMA, which led to some interactions among the model developers, this 53 special issue is principally the fruit of parallel and independent efforts (by authors in five countries) 54 rather than a coordinated national project. This means that the differences in the approaches used are larger than for NGA. It is possible that the use of multiple approaches for the models presented in this 55 56 volume more effectively captures epistemic uncertainty in terms of the centre, the body and the range 57 of technically-defensible interpretations of the available data (USNRC, 2012). Thirdly, the 58 independent parameters used by the models presented here are: common among groups (all use only:

moment magnitude, M<sub>w</sub>; distance to the surface projection of the fault, R<sub>JB</sub><sup>10</sup>; the same style-of-59 faulting classifications; and the average shear-wave velocity to 30m,  $V_{s30}$ ) and fewer (e.g. data were 60 61 insufficient to include terms involving sediment depth,  $Z_{1,0}$  or  $Z_{2,5}$ , or depth to the top of rupture,  $Z_{TOR}$ ) 62 than in the NGA models. This makes comparisons among the models and their use in future seismic 63 hazard assessments easier since no adjustments for differences in independent parameters (e.g. Bommer et al., 2005) are required. Lastly, no strict model requirements were agreed at the beginning 64 65 of the derivation procedure, unlike those imposed on the NGA model developers, which means that 66 the models presented here have varying ranges of applicability in terms of, for example, magnitude 67 and distance.

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69 Despite the differences between the NGA project and this special issue, the NGA comparison article by Abrahamson et al. (2008) is used as a template for this article comparing the five models presented 70 in this issue, namely those by: Akkar et al. (2013a, b) (their model using R<sub>JB</sub>), Bindi et al. (2013) (their 71 model using  $V_{s30}$  directly<sup>11</sup>), Bora *et al.* (2013), Derras *et al.* (2013) and Hermkes *et al.* (2013). This 72 73 decision means that comparisons between the figures presented here can be readily made to those shown in Abrahamson et al. (2008) because the same choices of independent parameters and the same 74 75 axes and scales are used (also to help in making these comparisons the same figure numbering has 76 been retained). Note that some of the graphs show predictions up to M<sub>w</sub> 8, for consistency with 77 Abrahamson et al. (2008), even though some developers do not recommend their models are applied 78 for such large earthquakes (Table 1). To further facilitate comparisons with the NGA models, 79 predictions from the GMPEs of Boore and Atkinson (2008) are included on the figures. This NGA model was chosen from among the five because it is the most similar to those presented in this special 80 81 issue through its use of R<sub>JB</sub> and fewer independent variables, e.g. no terms using Z<sub>TOR</sub> or Z<sub>1.0</sub> (or Z<sub>2.5</sub>) 82 are included. Because the models presented here have fewer independent parameters and the aleatory 83 variabilities (standard deviations) of the models are all homoscedastic (uniform for all independent and dependent variables) some figures drawn by Abrahamson et al. (2008) are not relevant and are not 84 drawn. They are replaced with figures showing other features of the models that are not covered by the 85 86 other graphs, for example the influence of style of faulting on ground-motion predictions (e.g. 87 Bommer et al., 2003).

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The next section presents the data selection criteria used by the different groups. The followingsections compare different aspects of the models in terms of: attenuation with distance, scaling with

 $<sup>^{10}</sup>$  Akkar et al. (2013a, b) also derived GMPEs using epicentral ( $R_{epi}$ ) and hypocentral ( $R_{hyp}$ ) distances. These are not considered in this article.

 $<sup>^{11}</sup>$  Bindi et al. (2013) also derived GMPEs using hypocentral ( $R_{hyp}$ ) distance and EC8 site classes rather than  $V_{S30}$  directly. These models are not considered in this article.

91 magnitude, style-of-faulting factors, site amplification, predicted response spectra and aleatory
92 variability. The article ends with some brief conclusions.

# 93 2. Data selection criteria

94 All GMPE developers started with the same RESORCE archive, which is presented by Akkar et al. 95 (2013a) in this special issue. At the time of model derivation this databank contained 5,882 mainly-96 triaxial accelerograms (from  $0 \le R \le 587$ km) from 1,814 earthquakes (with  $2.8 \le M_w \le 7.8$ ) and 1,540 97 different strong-motion stations. The five groups of developers applied different selection and 98 exclusion criteria, which led to them using between only 14% and 38% of the available accelerograms 99 (see Table 1). The same magnitude ranges were used by all groups, except by Derras et al. (2013) who 100 used a slightly lower minimum magnitude (3.6 rather than 4.0), to select their data and only Bindi et 101 al. (2013) and Derras et al. (2013) varied from the distance cut-off of 200km (using 300km and 102 547km, respectively, instead). None of the RESORCE developers used selection criteria based on 103 earthquake type (e.g. mainshock, aftershock or swarm) or considered its influence on ground motions. 104 Consequently all types of earthquakes (including aftershocks) were selected, unlike Boore and 105 Atkinson (2008) who exclude this type of event when deriving their NGA model and other NGA 106 models that included terms in their models to distinguish between mainshocks and aftershocks. As 107 discussed by Douglas and Halldorsson (2010) there is considerable doubt over the classification of 108 European earthquakes into mainshock, aftershock and swarm and their analysis using the data and 109 model of Ambraseys et al. (2005) suggested that the influence of earthquake type on ground motions 110 is limited. A similar conclusion is reached by Bindi et al. (2013) after examining the residuals for their 111 model separated into mainshock and aftershock classes. The five model databases principally 112 comprise records from normal and strike-slip earthquakes, with a smaller number of accelerograms 113 from reverse-faulting events. The distribution of records by style-of-faulting is reasonably uniform 114 with respect to magnitude but the largest ( $M_w > 7$ ) earthquakes are mainly from strike-slip earthquakes 115 in Turkey (Kocaeli and Düzce) and Iran (Manjil). The variation in the final databases principally 116 results from the exclusion of data based on the filters used to process the accelerograms. The result of 117 these various selection criteria are different sizes of databases used for the derivations of the five 118 models (Table 1). All of the models were derived using roughly 1 000 strong-motion records.

One major difference between the data used by the models compared here and that used for the NGA models is the large number of poorly-recorded earthquakes. This is indicated by the mean number of records per earthquake for the five RESORCE models being between 3.0 and 5.8 (Table 1) whereas the mean number of records per earthquake for the NGA models varies between 13.1 and 27.1. This difference implies that the terms of the models related to the earthquake source (e.g. style-of-faulting terms and between-event standard deviations) are more poorly constrained than they are in the NGA models, which, as shown below, leads to significant differences in these aspects of the models. The 126 complexity of the source modelling in some of the NGA models, however, means that these models 127 may suffer from trade-offs, for example between the effect of  $Z_{\text{TOR}}$  and style-of-faulting.

# 128 *3. Attenuation with distance*

129 The decay with distance from the source for peak ground acceleration (PGA) and spectral acceleration 130 for a structural period of 1s and 5% critical damping [SA(1s)] can be seen in Figure 1, for 131 V<sub>\$30</sub>=760m/s, i.e. NEHRP B/C boundary (Building Seismic Safety Council, 2009) (soft rock, Eurocode 8 class B), and in Figure 2, for V<sub>S30</sub>=270m/s, i.e. NEHRP D (soft soil, Eurocode 8 class C). 132 133 Generally the decay rates are similar as are the predicted ground motions, particularly for small and moderate events and PGA. Predictions from the models derived by standard regression techniques 134 (Akkar et al., 2013a, b; Bindi et al., 2013) are comparable except at the limits of their applicability 135 (M<sub>w</sub> 8 and close to the source of large earthquakes, R<sub>JB</sub><10km). Bindi et al. (2013) include an anelastic 136 attenuation<sup>12</sup> term for short periods whereas Akkar et al. (2013a, b) tried including such a term but 137 138 found that it converged to a non-physical value and hence they removed it from their functional form. 139 Predictions from the nonparametric models show considerable variations and the model of Hermkes et al. (2013) shows a complex decay rate, with a change of slope (often flattening) starting around 50km. 140 141 Despite all models having being derived from a common original archive (even if the final databases 142 used differed), a factor of two difference in predicted median ground motions from the models is not 143 uncommon, except for magnitudes and distance near the centre of the available data (e.g.  $M_w 6$ ).

144 As is becoming commonly recognised and modelled, the decay of earthquake ground motions is magnitude dependent. This effect can be seen by comparing the decay rates for  $M_w$  5 (roughly  $1/R^{1.5}$ 145 for PGA) to those for M<sub>w</sub> 8 (slower than 1/R). The predicted ground motions from the RESORCE 146 147 models all decay more rapidly than those from the GMPEs of Boore and Atkinson (2008), particularly 148 for PGA, which leads to much lower predicted ground motions at moderate distances (roughly 20-149 100km) from these models compared to Boore and Atkinson (2008). Boore and Atkinson (2008) note 150 that their distance dependence for small earthquakes and long periods may be biased towards a decay that is less rapid than the true decay. The faster decay of ground motions in Italy (from where a 151 considerable portion of the data used to develop the RESORCE models comes) than in California was 152 153 previously noted by Scasserra et al. (2009).

154 *4. Magnitude scaling* 

155 The magnitude scaling of the five models show the expected behaviour of higher scaling at long 156 structural periods (Figure 3). All models show nonlinear magnitude scaling with, generally, lower

<sup>&</sup>lt;sup>12</sup> The expression 'anelastic attenuation' is only strictly valid for GMPEs for Fourier amplitudes and not response spectral ordinates.

dependence of ground motions on magnitude for large events. This nonlinear behaviour is expected 157 from physical models (e.g. Douglas and Jousset, 2011). Some studies (e.g. Schmedes and Archuleta, 158 159 2008) provide physical arguments for oversaturation of short-period ground motions for large 160 earthquakes (i.e. ground motions that decrease as magnitude increases). This effect is not seen for any of the final RESORCE models for magnitudes within their range of applicability. However, when 161 Akkar et al. (2013a, b) included a cubic magnitude term they found that the obtained model predicted 162 163 oversaturation for M<sub>w</sub>>7.25, which they considered physically unrealistic and hence they finally 164 adopted a functional form that did not allow such oversaturation. They note, however, that due to a 165 lack of data from large earthquakes in Europe and the Middle East there is considerable epistemic 166 uncertainty in magnitude scaling for  $M_w > 7.5$  and hence they suggest including additional branches in a 167 logic tree to account for this uncertainty. As for the distance decay, within the magnitude range that is well covered by data ( $M_w$  5 to 7) the models predict similar spectral accelerations whereas for larger 168 earthquakes the models differ greatly, depending on whether they are solely driven by the data or the 169 170 functional form assumed. The magnitude scaling of the RESORCE models is broadly in line with that 171 predicted by the Boore and Atkinson (2008) GMPEs, although because of the lower attenuation 172 predicted by this model there is a considerable offset in the predictions at the considered distance of 173 30km.

## 174 5. Style-of-faulting factors

175 The effect of style of faulting (faulting mechanism) on strong ground motion was highlighted by the 176 review of Bommer et al. (2003), who compared predictions of the reverse-to-strike-slip spectral ratios 177 (F<sub>R:SS</sub>) for various GMPEs (their Figure 3) and who also discussed the limited number of estimates of 178 the ratio of normal-to-strike-slip motions (F<sub>N:SS</sub>) then available. In the decade since then many more 179 estimates of these factors have been published as part of GMPEs, including in the NGA models, but 180 they still show considerable dispersion. Nevertheless, as shown by the example of the Boore and 181 Atkinson (2008) ratios plotted on Figure 4, reverse-faulting events are often thought to generate slightly higher amplitude motions that strike-slip earthquakes that in turn are slightly higher than 182 183 motions from normal-faulting earthquakes.

184 Figure 4 compares  $F_{R:SS}$  and  $F_{N:SS}$  for the five RESORCE models [and those of Boore and Atkinson 185 (2008)]. All developers, except Hermkes et al. (2013), assumed ratios that are independent of magnitude and distance. Using a nonparametric approach Hermkes et al. (2013) find ratios that depend 186 187 weakly on these variables. These ratios are generally quite close to unity (i.e. rupture mechanism has 188 no effect on spectral accelerations) but two models (Bindi et al., 2013; Hermkes et al., 2013) show 189 large values for F<sub>R:SS</sub> (>1.25), particularly those of Hermkes et al. (2013), whose ratios reach over two. F<sub>N:SS</sub> are generally within 0.1 of unity except, again, for Hermkes et al. (2013) at moderate and long 190 191 periods where the ratios reach 1.5. The overall observation that the style of faulting has a limited 192 impact on spectral accelerations is in line with the findings from previous studies, including those associated with the NGA models. The usual order of which style of faulting leads to the highest and 193 194 lowest motions is reversed in the model of Derras et al. (2013), which predicts that normal-faulting 195 events cause higher SAs than reverse-faulting earthquakes. One possible reason for this is that only 93 196 of the 1,088 records used to derive this model are from reverse-faulting events (compared to 540 from normal and 455 from strike-slip earthquakes) and, in addition, each earthquake is only associated with 197 198 on average 3.4 records (Table 1) and hence the style-of-faulting factors are poorly constrained. In view 199 of this, the style-of-faulting factors implied by the model of Derras et al. (2013) are not recommended 200 for application. Compared with the NGA database, RESORCE is much richer in data from normal-201 faulting earthquakes, e.g. less than 3% of the records used by Boore and Atkinson (2008) come from 202 normal events, and consequently the estimates of F<sub>N:SS</sub> from the RESORCE models are much better 203 constrained.

# 204 6. Scaling with $V_{S30}$

All models (Figure 5) predict an overall inverse dependence on  $V_{S30}$ , i.e. as  $V_{S30}$  increases ground motions decrease, even if no functional form was imposed. In addition, the models predict a stronger dependence on  $V_{S30}$  for longer structural periods (Figure 5, Figure 6). All of the models except those of Bindi *et al.* (2013) and Bora *et al.* (2013) include nonlinear site behaviour, i.e. lower amplifications on soft soils (low  $V_{S30}$ ) for stronger shaking (Figure 5, Figure 6). However, once again the dispersion in the predictions is quite large, particularly at longer periods.

211 The ratios of spectral accelerations on soft soil to rock reach their peak for a structural period of 212 around 1s with ratios of three or even higher (up to about 5.5 for Hermkes et al., 2013) (Figure 6), 213 although they show considerable variation among models. Similarly the peak in the stiff-soil-to-rock 214 ratios is at about 1s but the peak ratios are lower (around 1.5) and show smaller dispersion. These ratios are similar to those represented in a similar plot (their Figure 10) by Ambraseys et al. (2005). 215 216 One difference with the NGA models, however, is that the peak amplification occurs in the NGA 217 models at a longer period (>3s) [see, e.g., the curves for Boore and Atkinson (2008) in Figure 6], 218 which could be related to soil profiles that are deeper on average in California than in Europe and the 219 Middle East (Stewart et al., 2012) or to smaller sedimentary basins in Europe compared to California 220 that give rise to 2D-3D basin effects at shorter periods. Also the long-period site amplifications 221 predicted by the Boore and Atkinson (2008) model are generally lower than those predicted by the 222 **RESORCE** models.

## 223 7. Predicted response spectra

The models all predict similar response spectra on NEHRP B/C boundary sites for  $M_w$  5 to 7 at R<sub>JB</sub>=10km (Figure 7); any differences in the models become apparent at large magnitudes, longer

226 distances and for softer sites (see, e.g., Figures 1 and 2). For the largest events, the functional forms used to develop the models of Akkar et al. (2013a, b), Bindi et al. (2013), Bora et al. (2013) and 227 Hermkes et al. (2013) allow evaluation up to M<sub>w</sub> 8 whereas the model of (Derras et al. (2013) should 228 not be used for such magnitudes. The periods of the plateaus in the spectra do not show strong 229 230 magnitude dependency. Predictions from the GMPEs of Boore and Atkinson (2008) at this distance for all magnitudes fall roughly in the middle of the predictions from the RESORCE models but 231 232 because of the lower attenuation predicted by this model the predicted spectra for longer distances are 233 higher than those predicted by the RESORCE models (not shown here).

The predicted spectra for soft soil sites show a much broader plateau and greater dispersion than in the predicted spectra on rock (Figure 8), which is due to the strong long-period site amplifications predicted by some models (Figure 6). Again a factor of two in the predicted spectral accelerations can be seen between the highest and lowest predictions.

#### 238 8. Aleatory varability

239 As noted above, all models predict homoscedastic aleatory variability (standard deviation, sigma) and consequently only a single figure is required to summarise this aspect of the models (Figure 9). As 240 241 Akkar et al. (2013a, b) note there is limited data from larger earthquakes and consequently the 242 apparent magnitude dependency seen within their between-event residuals may not represent the true 243 aleatory variability at large magnitudes. Consequently they assumed magnitude-independent sigmas. Similar arguments hold for the other models. The sigmas fall into two groups: Bora et al. (2013), 244 245 which has slightly higher values, and the other four models. This difference is related to higher values 246 of the between-event (tau) standard deviations whilst the within-event (phi) standard deviations are 247 similar. The sigmas show similar dependence on period with a first peak between 0.1 and 0.2s (near 248 the plateau of predicted response spectra) and then a further increase in sigma as period increases. 249 However, the period dependency is quite limited with less than a 20% difference between the lowest 250 and the highest sigma.

251 The values of tau for the models of Akkar et al. (2013a, b), Derras et al. (2013) and Hermkes et al. 252 (2013) are similar to those of the NGA models although slightly higher [see, e.g., the curve for Boore and Atkinson (2008) shown on Figure 9], whereas the taus of Bindi et al. (2013) and Bora et al. (2013) 253 254 are larger. The values of phi of the different models are slightly (by about 0.1 ln units for moderate 255 magnitudes) higher than those of the NGA models [again, see the curve for Boore and Atkinson 256 (2008) on Figure 9], which leads to overall sigmas that are also about 0.1 ln units higher. The NGA 257 models of aleatory variability also do not show a strong period dependence. The higher estimates of 258 aleatory variability for the RESORCE models compared with the sigmas of the NGA models could be 259 related to: a) truly higher variability in ground-motion databases in Europe and the Middle East 260 (caused by, e.g., mixing together of data from a wide geographical region with different tectonics and

geology); b) the use of more data from small earthquakes whose motions are possibly intrinsically 261 more variable than those from large events because of, e.g., higher variability in stress drops; or c) 262 problems with the metadata in RESORCE, particularly for small events (or more likely a mixture of 263 264 these reasons). (Insufficiently complex functional forms for the RESORCE models cannot explain this 265 difference because it is apparent even for the non-parametric models). One aspect of the metadata that 266 could be revisited in future models for Europe and the Middle East, particularly for applications below 267 M<sub>w</sub> 5.5, is the use of moment magnitude (sometimes obtained by conversions from other magnitude 268 scales) rather than local magnitude  $(M_L)$  for the smaller earthquakes. It was shown by Bindi *et al.* 269 (2007), for north-western Turkey, that the use of  $M_{\rm L}$  for small earthquakes leads to lower estimates of 270 between-event variability (tau) compared to using  $M_w$ . This is because corner frequencies for such 271 earthquakes are generally higher than 1Hz, which is the frequency range at which M<sub>L</sub> is measured 272 whereas M<sub>w</sub> is measuring energy at frequencies below the corner and hence it is a poorer measure of 273 the size of such events. Therefore, it could be envisaged that M<sub>L</sub> is used below, say, M<sub>w</sub> 5.5 for the 274 derivation of GMPEs and then in applications the local magnitude scale for that region is used to 275 evaluate the model. Sabetta and Pugliese (1987) adopted a similar composite magnitude scale ( $M_L$ ) below M 5.5 and surface-wave magnitude, M<sub>s</sub>, above this limit) when deriving their GMPEs for Italy. 276

# 277 9. Conclusions

278 In this article, various aspects of the five ground-motion models that are described in other articles in 279 this special issue have been compared. Despite all the developers having started with the same 280 common strong-motion archive and having used the same independent parameters, the predicted 281 spectral accelerations from the models show significant differences, which can be related to varying 282 data selection criteria and derivation techniques. All aspects of the models for the median ground 283 motions (magnitude scaling, style-of-faulting factors, distance decay and site amplification) show 284 variation from one model to the next. These differences when combined lead to variations in the predicted response spectral accelerations for scenarios of interest of more than a factor of two. These 285 differences demonstrate that epistemic uncertainty in ground-motion prediction in Europe and the 286 287 Middle East remains large and it cannot be explained by differences in the metadata of the strongmotion records used or different sets of independent parameters (e.g. hypocentral distance rather than 288 289 Joyner-Boore distance or surface-wave magnitude rather than moment magnitude). One of the reasons 290 for this large epistemic uncertainty is that a given earthquake in Europe and the Middle East is, on 291 average, recorded by fewer strong-motion instruments than in California, Taiwan and Japan and hence 292 the aspects of the models related to source effects are less well constrained.

The aleatory variabilities are slightly higher than those associated with the NGA models, again (e.g.
Strasser et al., 2009) showing that this aspect of ground-motion modelling is stable within a narrow
band (±0.2 ln units) around 0.7 (for PGA). In particular, estimates of the within-event variability (phi)

show little variation from one study to the next. The between-event variability (tau), however, can be significantly affected by the inclusion of data from smaller (less well-studied) earthquakes. Further studies to constrain the value of tau for European events are, therefore, recommended.

The five models presented in this volume should be of considerable value for seismic hazard assessments in Europe and the Middle East, providing both state-of-the-art predictions of spectral accelerations and a basis for quantifying epistemic uncertainty in those predictions.

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392 Figures

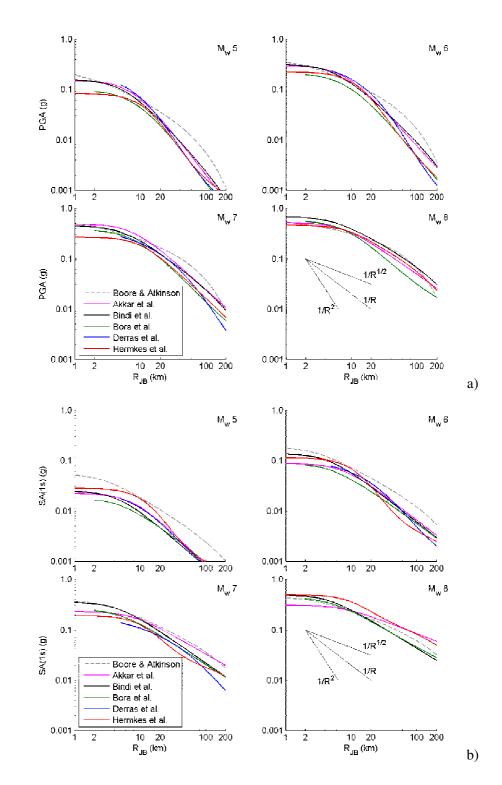
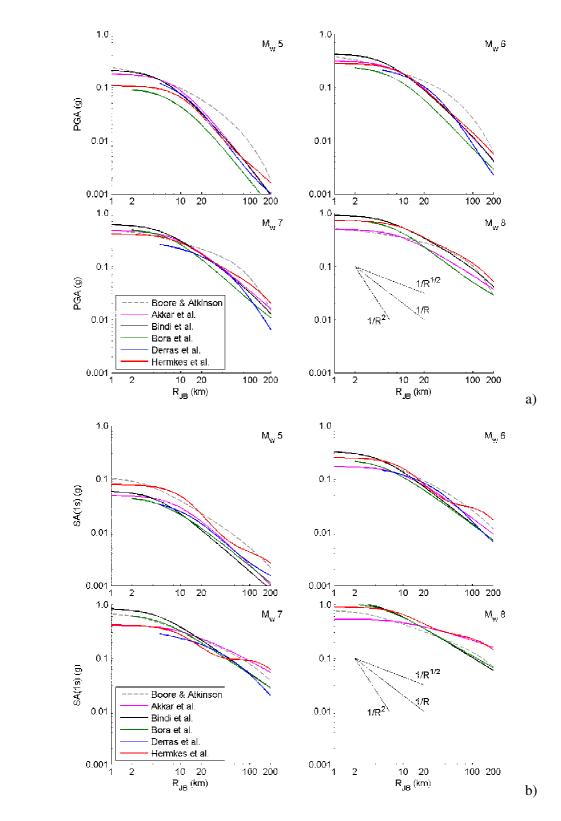
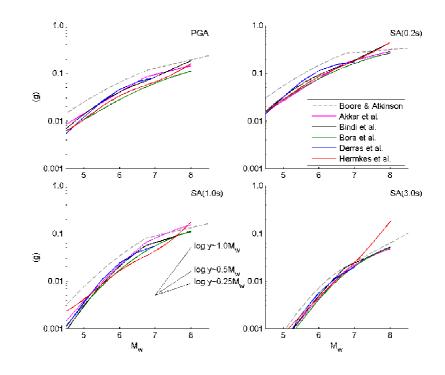




Figure 1: Comparison of distance scaling for strike-slip earthquakes for  $V_{S30}=760$  m/s (NEHRP B/C boundary) for  $M_w$  5 (top left), 6 (top right), 7 (bottom left) and 8 (bottom right) for a) PGA and b) SA(1s). The predictions from the model of Derras et al. (2013) are not shown for  $M_w$ 8 since this is outside its range of applicability. The other models are shown for this magnitude even though some developers do not recommend their application for such large events.



402 Figure 2: Comparison of distance scaling for strike-slip earthquakes for  $V_{S30}=270$  m/s (NEHRP D) for 403  $M_w 5$  (top left), 6 (top right), 7 (bottom left) and 8 (bottom right) for a) PGA and b) SA(1s). The 404 predictions from the model of Derras et al. (2013) are not shown for  $M_w8$  since this is outside its 405 range of applicability. The other models are shown for this magnitude even though some developers 406 do not recommend their application for such large events.



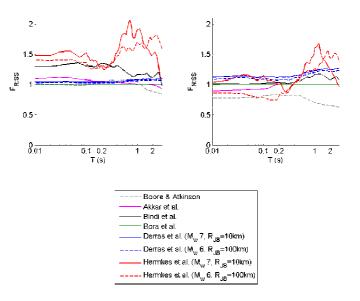


408 Figure 3: Comparison of magnitude scaling of the median ground motion for strike-slip earthquakes

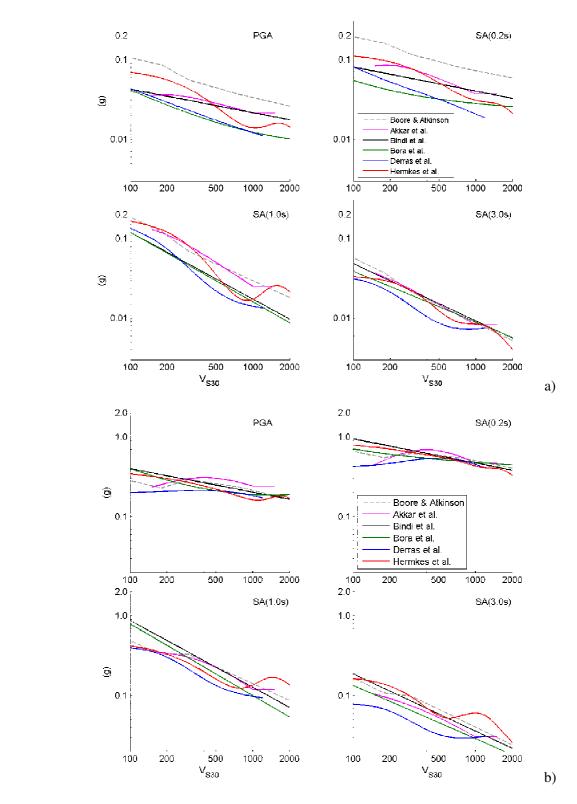
410 SA(1.0s) (bottom left) and SA(3.0s) (bottom right). Predictions are generally shown up to  $M_w$  8 even

and V<sub>S30</sub>=760 m/s (NEHRP B/C boundary) at R<sub>JB</sub>=30 km for PGA (top left), SA(0.2s) (top right),

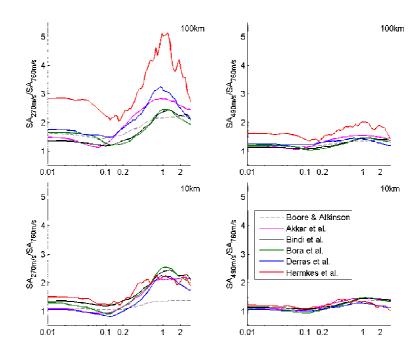
411 though some developers do not recommend their models for such large events.



- 413 Figure 4: Comparison of style-of-faulting factors for SA: a) ratio of reverse to strike-slip ( $F_{R:SS}$ ) and b)
- 414 ratio of normal to strike-slip ( $F_{N:SS}$ ). Ratios are scenario-independent except for those of Hermkes et
- 415 *al.* (2013). The predictions of Bora et al. (2013) are independent of the style of faulting.  $F_{N:SS}$  of Akkar
- 416 et al. equals unity for T>0.2s and therefore this curve is under that of Bora et al. (2013) for these
- 417 *periods*.



420 Figure 5 Comparison of  $V_{S30}$  scaling of the median ground motion for  $M_w$  7 strike-slip earthquakes for 421 PGA (top left), SA(0.2s) (top right), SA(1.0s) (bottom left) and SA(3.0s) (bottom right) at: 422 a)  $R_{JB} = 100$  km and b)  $R_{JB} = 10$  km.

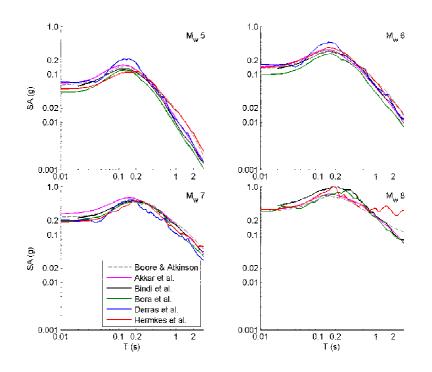


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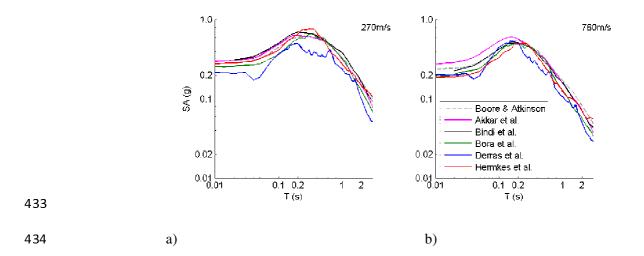
424 Figure 6: Comparison of ratios between SA for  $V_{S30}=270$ m/s (NEHRP D) (left) and SA for

 $V_{S30}$ =490m/s (NEHRP C) (right) to SA for  $V_{S30}$ =760m/s for  $M_w$  7 (strike-slip) at  $R_{JB}$ =100km (top) and

426  $M_w$  7 (strike-slip) at  $R_{JB}$ =10km (bottom).

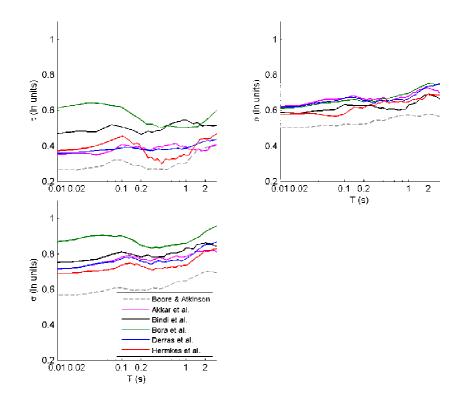


428 Figure 7: Comparison of median 5% damped spectra for strike-slip earthquakes and  $V_{S30}$ =760 m/s 429 (NEHRP B/C boundary) at  $R_{JB}$ =10 km for  $M_w$  5 (top left), 6 (top right), 7 (bottom left) and 8 (bottom 430 right). The predictions from the model of Derras et al. (2013) are not shown for  $M_w$  8 since this is 431 outside its range of applicability. The other models are shown for this magnitude even though some 432 developers do not recommend their application for such large events.



435 Figure 8: Comparison of median 5% damped spectra for strike-slip earthquakes at  $R_{JB}=10$  km for

 $M_w$  7 and a)  $V_{S30}=270$  m/s (NEHRP D) and b)  $V_{S30}=760$  m/s (NEHRP B/C boundary).



438 Figure 9: Comparison of the between-event (tau), within-event (phi) and total (sigma) standard
439 deviations. All models have homoscedastic standard deviations.

441 Table 1: Number of different earthquakes, stations and records used to derive the five models,

442 magnitude and distance ranges of the data used, the ranges of applicability recommended by the model

443 developers and the exclusion criteria used to select the records used to derive the model.

Model	Akkar et al.	Bindi et al.	Bora et al.	Derras et al.	Hermkes et al.
		(V <sub>S30</sub> model)			
Number of earthquakes (E)	221	225	369	320	279
Number of stations (S)	322	345	341	201	251
Number of records (R)	1041	1224	1232	1088	835
R/E	4.7	4.8	3.3	3.4	3.0
M <sub>min</sub> to M <sub>max</sub> (data used)	4.0 to 7.6	4.0 to 7.6	4.0 to 7.6	3.6 to 7.6	4.0 to 7.6
M <sub>min</sub> to M <sub>max</sub> (recommended)	4.0 to 8.0	4.0 to 7.6	4.0 to 7.6	4.0 to 7.0	4.0 to 7.6
$R_{min}$ to $R_{max}$ (km) (data used)	0 to 200	0 to 300	0 to 200	0 to 547km	0 to 200
R <sub>min</sub> to R <sub>max</sub> (km)	0 to 200	0 to 300	0 to 200	5 to 200km	0 to 200
(recommended)					
Record exclusion	Singly-recorded	Unknown style	Not	Focal depth more	Unknown style of
criteria (other than	earthquakes; all	of faulting; sites	representative of	than 25km; sites	faulting; sites
in terms of	three components	with no measured	shallow crustal	with no measured	with no measured
magnitude and	not available;	VS30; singly-	event; unknown	V <sub>S30</sub> ; unknown	V <sub>S30</sub> ; not free-
distance)	focal depth	recorded	style of faulting;	style of faulting	field conditions;
	greater than	earthquakes; only	only one		high-pass cut-off
	30km; sites with	records with low-	horizontal		frequency higher
	no measured	pass cut-off	component; sites		than 0.25Hz
	$V_{S30}$ ; structural	frequency lower	with no measured		
	period beyond	than 20Hz and	$V_{S30}$ ; poor quality		
	usable period	outside passband	record; high-pass		
	range defined by	of high-pass filter	cut-off frequency		
	Akkar and	all three	higher than		
	Bommer (2006);	components not	Brune-source		
	events with	available; focal	corner frequency		
	$M_w < 5$ with fewer	depth>35km.	for stress drop of		
	than 3 records;		100bars.		
	unknown or				
	oblique style of				
	faulting; not free-				
	field.				