

THE OFFICIAL MAGAZINE OF THE OCEANOGRAPHY SOCIETY

Oceanography

CITATION

Hori, T., M. Hyodo, R. Nakata, S. Miyazaki, and Y. Kaneda. 2014. A forecasting procedure for plate boundary earthquakes based on sequential data assimilation. *Oceanography* 27(2):94–102, <http://dx.doi.org/10.5670/oceanog.2014.44>.

DOI

<http://dx.doi.org/10.5670/oceanog.2014.44>

COPYRIGHT

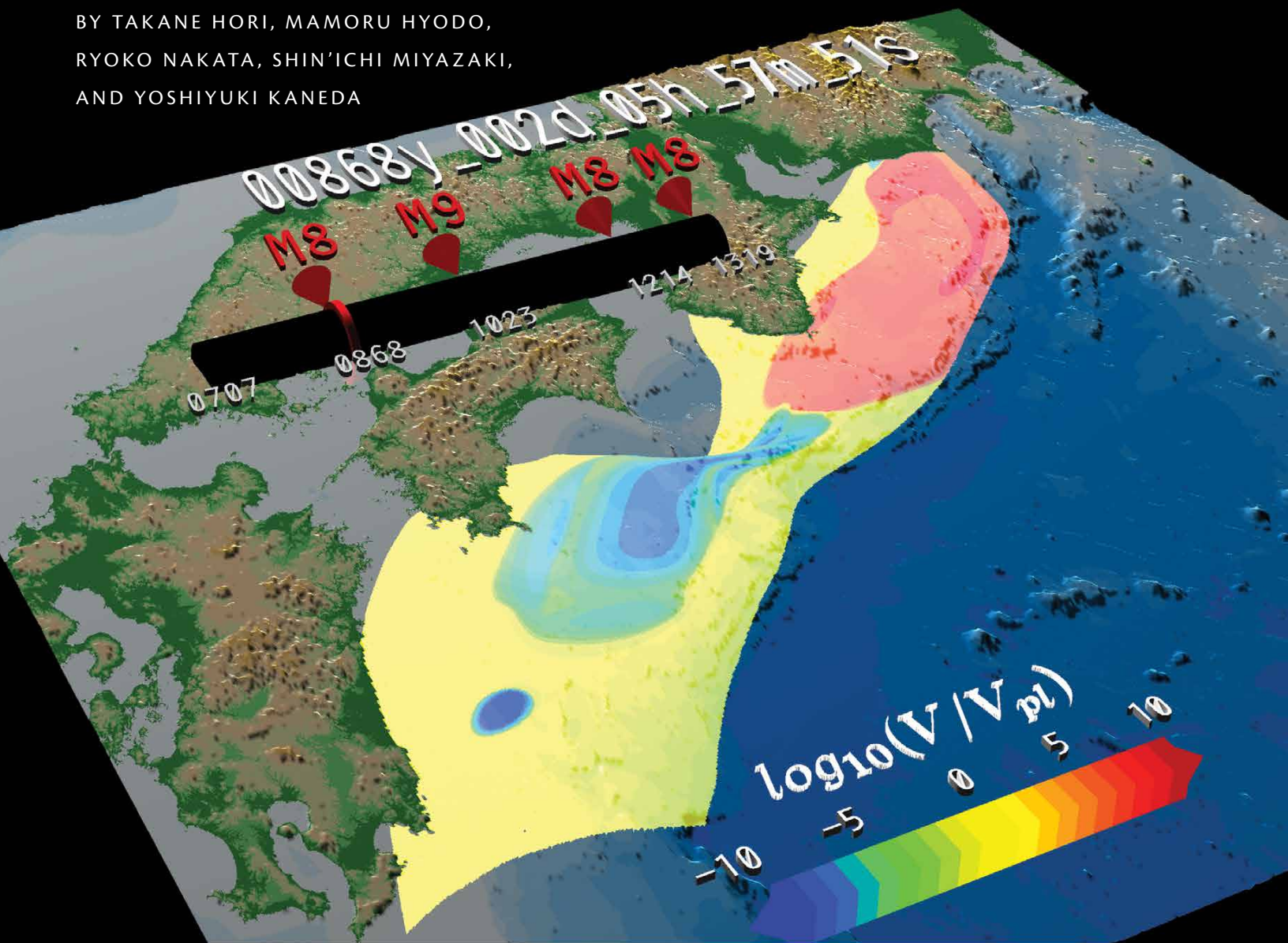
This article has been published in *Oceanography*, Volume 27, Number 2, a quarterly journal of The Oceanography Society. Copyright 2014 by The Oceanography Society. All rights reserved.

USAGE

Permission is granted to copy this article for use in teaching and research. Republication, systematic reproduction, or collective redistribution of any portion of this article by photocopy machine, reposting, or other means is permitted only with the approval of The Oceanography Society. Send all correspondence to: info@tos.org or The Oceanography Society, PO Box 1931, Rockville, MD 20849-1931, USA.

A Forecasting Procedure for Plate Boundary Earthquakes Based on Sequential Data Assimilation

BY TAKANE HORI, MAMORU HYODO,
RYOKO NAKATA, SHIN'ICHI MIYAZAKI,
AND YOSHIYUKI KANEDA



A snapshot of slip velocity (V) distribution for M8 earthquake occurrence in an earthquake generation cycle simulation along the Nankai Trough, off Southwest Japan. Red, yellow, and blue colors indicate high-speed slip (seismic), moderate-speed slip (comparable to the plate motion = V_{pl}), and slow speed slip (much slower than the plate motion), respectively.

ABSTRACT. A forecasting procedure is proposed for plate boundary earthquakes in subduction zones. It is based on spatio-temporal variation in slip velocity on the plate interface, which causes interplate earthquakes. Model outputs are not only information about the occurrence of great earthquakes (time, place, and magnitude) but also information about the physical state evolution that causes earthquakes. To overcome the difficulty in forecasting earthquake generation resulting from uncertainty both in the physical model and in the observation data, we introduce a type of sequential data assimilation. In this method, we compare observed crustal deformation data to simulations of several great interplate earthquake generation cycles. We are currently constructing a prototype, applying this forecasting procedure to the Nankai Trough, Southwest Japan, where great interplate earthquakes have occurred and are anticipated.

INTRODUCTION

Earthquake forecasting or prediction attempts to estimate when, where, and how large earthquakes will occur. Long-term earthquake forecasts provide probabilities of earthquake occurrence within a few decades. This information is used, for example, in seismic hazard assessment for building codes, insurance rate calculations, and policymaking. However, short-term forecasts—whether an earthquake will occur within several years or less—are still at the trial stage (e.g., Jordan, 2006). Short-term deterministic predictions have been tried, but they have not been successful (e.g., Geller, 1997; Geller et al., 1997; Kagan 1997). Note that the outputs of most earthquake predictions and forecasts, whether based on statistics or physics, are information on earthquake occurrence, such as occurrence time, magnitude (M), hypocenter location, frequency magnitude distribution, and recurrence time probability density functions (e.g., Tullis et al., 2012).

In contrast, weather forecasts provide not only the probability of rainfall but also the state of the atmosphere that causes rainfall. The state of the

atmosphere is monitored continuously so that its evolution can be forecast. Both the atmosphere's monitored (current) and forecast states are important outputs in weather forecasting. Our ultimate goal in earthquake forecasting is to provide outputs similar to those in weather forecasting—monitored and forecast physical states that cause great interplate earthquakes. In this paper, we describe a procedure for forecasting earthquake generation based on incorporation of real-time observations into a physical model.

Mathematical models for earthquake generation that correspond to atmospheric models exist only for interplate earthquakes (e.g., Rice, 1993; Lapusta et al., 2000; Hashimoto et al., 2013). These simple models can, at least qualitatively, reproduce a range of slip behaviors on the plate interface, including those that generate great interplate earthquakes (e.g., Kodaira et al., 2006; Kato, 2008; Nakata et al., 2012; Noda et al., 2013). In these models, earthquakes are represented as unstable frictional slip on a plate interface. Strain energy that will be released during an earthquake is stored around the coupled

area of the interface, where the slip velocity of the interface is much slower than the velocity of plate motion. In the model, we use a simple law of friction derived from rock experiments because we cannot measure the friction at the plate interface. Because of such limitations in the model and also limitations in observed data, we cannot forecast the slip behavior in a deterministic way. We can, however, use physical models and run as many different scenarios as possible to avoid overlooking any risks. Despite these limitations, our model is worth pursuing because improvements can be introduced easily, and soon we will be able to include more real-time observations, especially offshore, where great interplate earthquakes nucleate.

In this article, we show that physical state evolution that causes earthquakes on a plate interface can be modeled as spatio-temporal variation in slip velocity along the interface. We then introduce a simple mathematical model for plate-interface earthquakes and explain our forecasting procedure. Finally, we introduce a model prototype and discuss remaining issues.

EARTHQUAKE GENERATION MODEL FOR PLATE BOUNDARIES

Earthquake generation can be represented in a model as a repetitive sequence of stick-slip events on a plate interface. The coupled zone is loaded by the velocity difference between the area that is stuck and surrounding areas where slow sliding occurs. “Slow” means that the sliding velocity is an order of magnitude smaller than that of seismic slip, which causes elastic wave radiation. Our model

can accommodate earthquakes whose magnitude and recurrence intervals have complex patterns caused by stress transfer from surrounding stick-slip fault movement as well as slow sliding.

Geodetic data can confirm that coupled areas on plate interfaces correspond to source areas where $M > 7$ earthquakes have generated tsunamis (Hashimoto et al., 2009, 2012). Slip causes deformation at Earth's surface that can be measured by global navigation satellite systems (GNSS) with great accuracy (less than 1 cm error in the horizontal components). From these data, it is possible to estimate interseismic slip rate distribution and from that to calculate slip deficit (slip that is insufficient to fully accommodate the plate movement). Peaks in slip deficit that coincide with the source regions of large, historical interplate earthquakes are observed

(Figure 1a; Hashimoto et al., 2012). More importantly, from these data it is possible to determine the extent of the coupled area that is consistent with the large slip area of the 2011 Tōhoku-Oki earthquake (Figure 1b; Hashimoto et al., 2012), suggesting that the source areas of future $M9$ great earthquakes could be estimated using observational data. For example, Figure 1a indicates that a wide coupled area exists along the Kuril Trench off northernmost Japan, which corresponds to a past tsunami source area as large as that of the 2011 Tōhoku-Oki earthquake, whose recurrence is anticipated based on geological data analyses (Nanayama et al., 2003; Sawai et al., 2009).

Uncertainties remain about the size of the coupled area, especially offshore near the trench if only on-land data are available (e.g., Nishimura et al., 2004). The relationship between the coupled

area and potential earthquakes is also uncertain because large amounts of slip can occur in slow sliding areas during interseismic periods (Noda and Lapusta, 2013). Note that the uncertain coupled area corresponds to the relatively large fault slip area during the 2011 Tōhoku-Oki earthquake (e.g., Fujiwara et al., 2011).

During interseismic periods, afterslip along faults triggered by the main earthquakes (Heki et al., 1997) and slow slip events (SSEs; Hirose et al., 1999) have been observed. An SSE denotes spontaneous slow sliding on the plate interface. A few years before the 2011 Tōhoku-Oki earthquake, SSEs were observed near the Tōhoku-Oki hypocenter (Ito et al., 2012), and $M7$ earthquakes with large afterslips were observed within the source area (Suito et al., 2011). SSEs and large afterslips may be preseismic signals

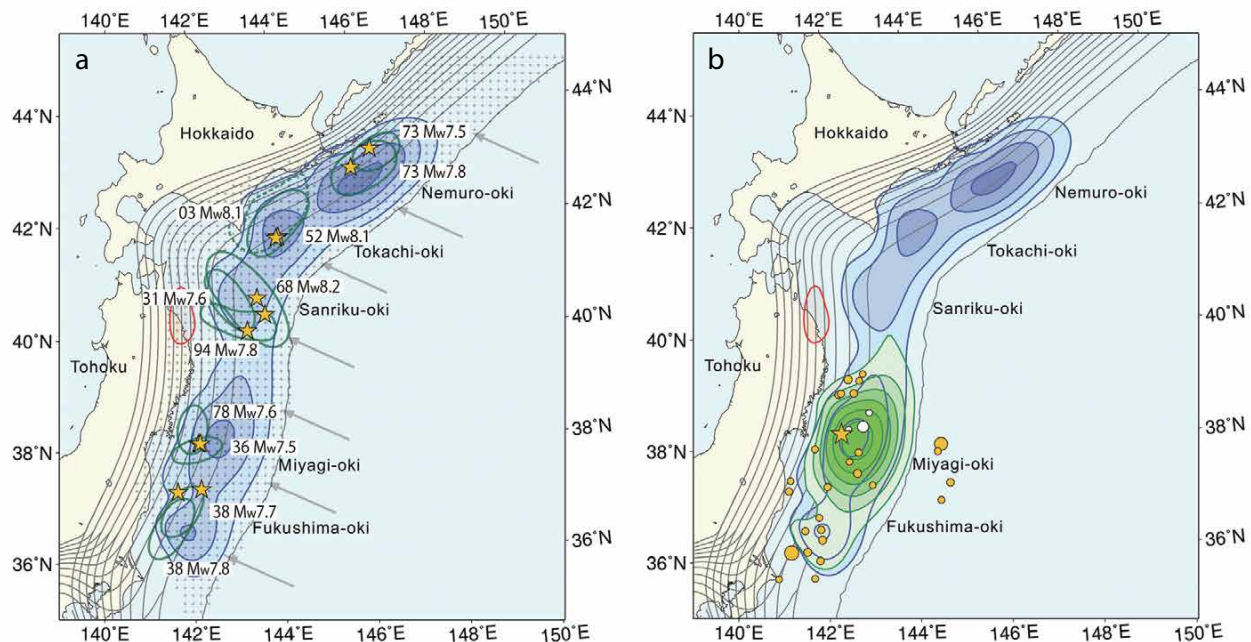


Figure 1. (a) Slip-deficit zones estimated from interseismic global navigation satellite systems (GNSS) data (from Hashimoto et al., 2012). The blue and red contours represent, respectively, interseismic slip-deficit and slip-excess rates at intervals of 3 cm yr^{-1} . The green circles and yellow stars indicate tsunami source regions and epicenters, respectively, of large interplate earthquakes that occurred in the last century. (b) Coseismic slip distribution estimated from inversion of GEONET (GNSS Earth Observation Network System) data (from Hashimoto et al., 2012). The green contours represent the inverted coseismic slip distribution on the plate interface at intervals of 4 m. For comparison, the blue contours show the interseismic slip-deficit rate distribution at intervals of 3 cm yr^{-1} .

that could have indicated that the 2011 Tōhoku-Oki earthquake was about to occur, although it is also possible that such phenomena occur without being followed by a larger earthquake (Ohtani et al., 2014). The SSEs occurred within the subseafloor source area of the 2011 Tōhoku-Oki earthquake so that GNSS observations couldn't detect them. They were revealed during processing of ocean bottom pressure gauge data recovered after the earthquake. Ocean bottom cabled observatories that are now operating off Kumano in the eastern part of the Nankai Trough (Kaneda, 2010) and being constructed in the western part of the Nankai Trough and in the Japan Trench (Kaneda, 2014, in this issue) will enable detection of such slow sliding signals in real time.

MATHEMATICAL MODEL OF SLIP VARIATION AT THE PLATE INTERFACE

We need to model the geometry of the plate interface in order to model stick-slip behavior there. The interface is divided into small subfaults. The stress transferred to each small subfault from slip on other subfaults is calculated using a Green's function for an elastic half-space medium (Okada, 1992). The interface is assumed to obey a simple law of friction derived from rock experiments. This law of friction describes the relationships between slip velocity, shear stress in the slip direction, and fault strength (Nakatani, 2001). If the shear stress is less than the fault strength, the slip velocity is much smaller than the relative plate motion. However, if the stress is higher than the fault strength, the velocity can reach seismic slip rates as high as 1 m s^{-1} . Fault strength is not constant but rather evolves, depending on slip history. Fault

strength declines when slip occurs (slip weakening) and recovers when the slip rate is low (logarithmic healing). Laws for fault strength evolution have been proposed (e.g., Dieterich, 1979; Ruina, 1983; Kato and Tullis, 2001). Stick-slip and slow sliding areas can be identified from the heterogeneous distribution of friction law parameters. For the stick-slip area, the rate of fault weakening is high and fault strength recovery time is short. Slow sliding areas have the reverse properties. Recent experiments indicate that fault strength becomes very low when the sliding velocity reaches the order of 1 m s^{-1} (e.g., Wibberley et al., 2008).

When the mathematical model described above is applied to slip behavior at subduction zone plate interfaces, it successfully reproduces various earthquake occurrence patterns and slow sliding behaviors. For example, variations in the size of and the time intervals between significant earthquakes along the Nankai Trough, offshore Southwest Japan, and along the northern part of the Japan Trench have been reproduced qualitatively (Kodaira et al., 2006; Kato, 2008). The model of an earthquake generation cycle for an M9 earthquake, with preceding earthquakes of M7~M8 within the source area, is qualitatively consistent with the characteristics of the 2011 Tōhoku-Oki earthquake (Hori and Miyazaki, 2011; Ohtani et al., 2014). In addition to earthquake generation, slow sliding behavior on the plate interface has also been reproduced qualitatively

using this mathematical model. For example, the coexistence of afterslip and slow slip events for an M7 earthquake was reproduced for the Hyuga-nada region in Southwest Japan (Nakata et al., 2012). The above simulations are based on quasi-dynamic models in which elastic wave propagation is not included. Although fully dynamic models are more realistic (e.g., Lapusta et al., 2000; Noda and Lapusta, 2013; Noda et al., 2013), especially for rupture propagation, fully dynamic simulations with realistic plate geometry require very large computational resources, so their introduction remains to be tackled in the future.

A NEW EARTHQUAKE GENERATION FORECASTING SYSTEM CONCEPT

As described above, we can quantitatively estimate spatio-temporal variations in slip (slip rate) on a plate boundary from observational data, and we can reproduce such spatio-temporal variations (at least qualitatively) using numerical simulations based on a mathematical model of slip on a plate interface. However, it is impossible to predict future slip behavior in a deterministic way using a simulation that completely reproduces slip history. This is partly because slip variation is a highly nonlinear process. This is also because our mathematical model, especially with the simple law of friction we use, is incomplete, and observational data for slip history is also incomplete,

Takane Hori (horit@jamstec.go.jp) is Senior Research Scientist, **Mamoru Hyodo** is Research Scientist, and **Ryoko Nakata** is Research Scientist, all at the R&D Center for Earthquake and Tsunami, Japan Agency for Marine-Earth Science and Technology (JAMSTEC), Yokohama, Japan. **Shin'ichi Miyazaki** is Associate Professor, Division of Earth and Planetary Sciences, Graduate School of Science, Kyoto University, Kyoto, Japan. **Yoshiyuki Kaneda** is Designated Professor, Disaster Mitigation Research Center, Nagoya University, Nagoya, Japan.

especially for M9 earthquakes whose recurrence time is every several hundred years. However, we now expect to be able to detect phenomena that may occur prior to great earthquakes because of the availability of real-time continuous data from ocean bottom cabled networks. Thus, we need to consider how such slow sliding phenomena evolve and whether large earthquakes will nucleate sooner or later based on observations. How can we effectively use our knowledge of slip variation on the plate boundary?

We can study slip evolution and attempt to forecast earthquakes by modeling many scenarios of slip behavior on a plate interface using different initial conditions and frictional parameters (Figure 2). Rundle et al. (2005) used a similar concept, in which many scenarios are numerically simulated. We store many scenarios in a “simulation database” while real-time observational data are stored in an “observation database.” From the simulation database, we calculate expected surface deformation, and

then compute the differences between simulated and real-time observed deformation. If we assume an error distribution between the model and observations, we can evaluate how well each simulation fits observations. We can then forecast slip evolution using scenarios whose likelihood is relatively high, exploiting our knowledge of slip behavior in the area of interest. Such a procedure has recently become available using massively parallel high performance supercomputers such as the K computer.

Our forecast procedure is a type of data assimilation method called Sequential Importance Sampling (SIS) that can be applied to nonlinear systems with observation errors. It is one of the most flexible data assimilation methods because nonlinear mathematical models can be used directly in SIS without modification or approximation (e.g., Kitagawa, 1996; Murakami et al., 2012). Werner et al. (2011) fully describe the mathematical background of this method, which applies similar

assimilation methods to statistical earthquake forecasting.

In sequential data assimilation, the likelihood of each scenario varies due to input of real-time data. As mentioned earlier, our model is too simple and data are too limited to reproduce slip history and predict slip evolution by one optimum scenario in which model parameters are constant. Hence, during the prospective forecast, model parameters that have higher likelihood can be changed depending on the observational data. This allows effective use of limited knowledge in forecasting slip evolution on a plate boundary.

PROTOTYPE FORECAST PROCEDURE FOR NANKAI TROUGH EARTHQUAKES

We are now constructing observation and simulation databases for the Nankai Trough, where a great earthquake is anticipated (Hori et al., 2013). For the observation database, we obtain GEONET (GNSS Earth Observation Network System) on-land data, and residuals are automatically calculated with simulated data every week. To calculate ocean bottom deformation, we use pressure gauge data collected automatically on a daily basis from the ocean bottom cable network (DONET: the Dense Ocean Floor Network for Earthquakes and Tsunamis) installed just above the source area of the 1944 Tonankai earthquake (Kaneda, 2010, and 2014, in this issue). However, residuals are not calculated for DONET data. Instead, the data are compared graphically with simulated data because the pressure gauge data include variations caused by processes other than crustal deformation. Removing such “noise” in the future will enable us to use this type of DONET data for

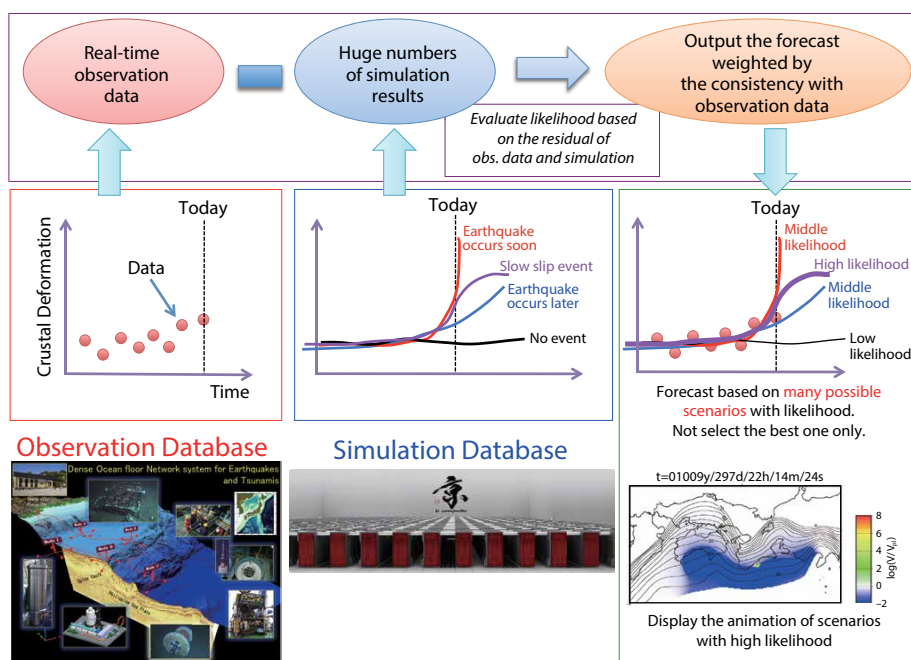


Figure 2. Schematic diagram of the earthquake forecasting procedure proposed in this study.

likelihood estimation.

For the simulation database, we show the preliminary results of 118 scenarios whose parameter variations do not yet cover an appropriate range of uncertainty. Each scenario corresponds to one set of model parameters. To calculate one scenario, it takes about 12 hours using 128 nodes of the K computer. Figure 3a shows the standard case: V_{pl} is the plate motion rate, and L , A and B are frictional parameters. L determines the slip amount necessary for fault weakening. A – B control the stability of steady sliding. Figure 3b shows some examples of earthquake slip distribution. Note that the moment magnitude can reach 9.0 in the simulated scenarios, although interpretations of historical data indicate only M8 earthquakes occurred (Ishibashi, 2004). See Hyodo and Hori (2013) for a more detailed description of model parameter distribution and simulated results of earthquakes along the Nankai Trough.

Figure 4 shows how we changed the model parameter distributions for the various scenarios. We changed (1) the deeper limit of the seismogenic slip area (seismogenic zone) and its strength for 56 scenarios (Figure 4a), (2) the upper limit of the seismogenic zone for 30 scenarios (Figure 4b), and (3) the strength of the barrier for slip propagation between eastern and western areas of the Kii Peninsula for 30 scenarios (Figure 4c). An SSE patch is included for two scenarios (Figure 4d). The resultant recurrence time intervals of great earthquakes for the different scenarios were from 50 to 210 years, with an average of 115 years, which is comparable to historical data on recurrence of M8 class earthquakes along the Nankai Trough (Ishibashi, 2004).

From the scenarios of spatio-temporal

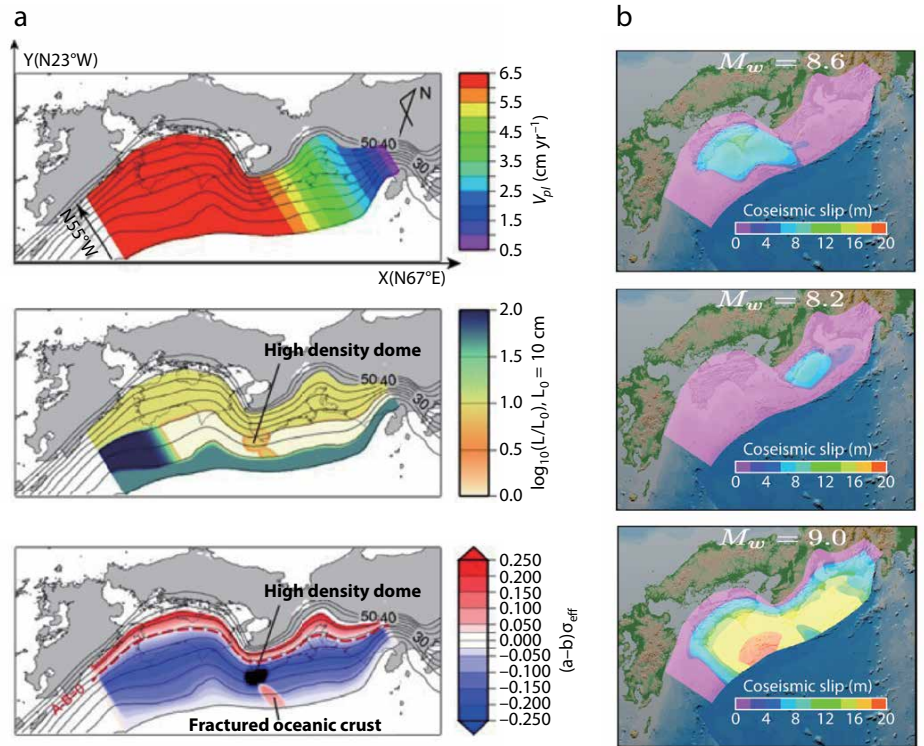


Figure 3. (a) Distribution of relative plate motion and frictional parameters in the Nankai Trough. (b) Resultant slip distributions from earthquake generation cycle simulation.

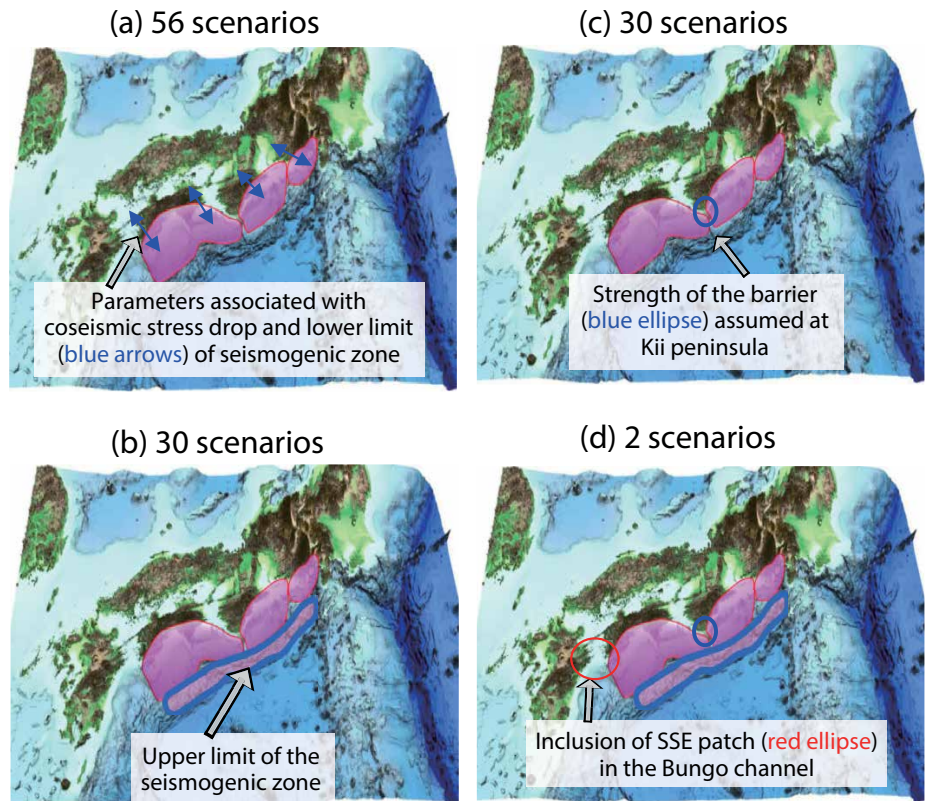


Figure 4. Classification of scenarios based on the heterogeneity of frictional properties.

variations in slip on the plate interface, we estimated the surface deformation at 22 GEONET stations located along the Pacific coast from Kyushu to the Kii Peninsula in Southwest Japan using vertical deformation data from those stations (Figure 5a). We then calculated the differences between the deformations estimated from our simulations and those observed at the stations. The period of simulation was more than 1,000 years and included several earthquake cycles. Because GEONET data are available for only 17 years, we searched for the 17-year period that gave the minimum residual between observed and simulated deformation in the earthquake generation cycle simulation for each scenario. This means that we estimated the time when each large earthquake would occur in each scenario.

Vertical and horizontal velocity vectors at GEONET sites for the highest/lowest likelihood are plotted together with observations in Figure 5a.

At Kushimoto, large differences in subsidence velocity are shown among the different scenarios, but other sites (e.g., Muroto) have considerably smaller variations. Accordingly, likelihoods largely depend on the consistency of the vertical deformation data around the Kushimoto station on the Kii Peninsula. Vertical deformation around Kushimoto depends on how strongly the plate boundary is coupled below the Kii Peninsula. Weak (strong) coupling causes lower (higher) subsidence rates at Kushimoto. As Figure 5b shows, coupling is weak (slip velocity is around the plate rate) and strong (slip velocity is much lower than the plate rate) below the Kii Peninsula for the best and worst scenarios, respectively.

Figure 6 shows temporal variations in vertical displacement at Kushimoto and Muroto for GEONET data and simulated scenarios in which the initial values are optimally fit to the data. Each of 10 scenarios with similar likelihood

is plotted. Each scenario shows abrupt uplift or subsidence, which indicates the occurrence of a great interplate earthquake along the Nankai Trough. The occurrence times are widely distributed even for higher likelihood scenarios. To further constrain the occurrence time, some preseismic phenomena should occur and be detected by observation.

CONCLUSIONS

The forecasting procedure presented here is a prototype, but we consider it important to demonstrate a test forecast using it. Although earthquake predictability is low, monitoring and continuous communication with the public about slip variations on plate interfaces and their possible results may improve public scientific literacy with regard to earthquake generation. Further, testing our procedure will identify issues that need to be solved for forecasting and public communication of earthquake information. We need to improve our

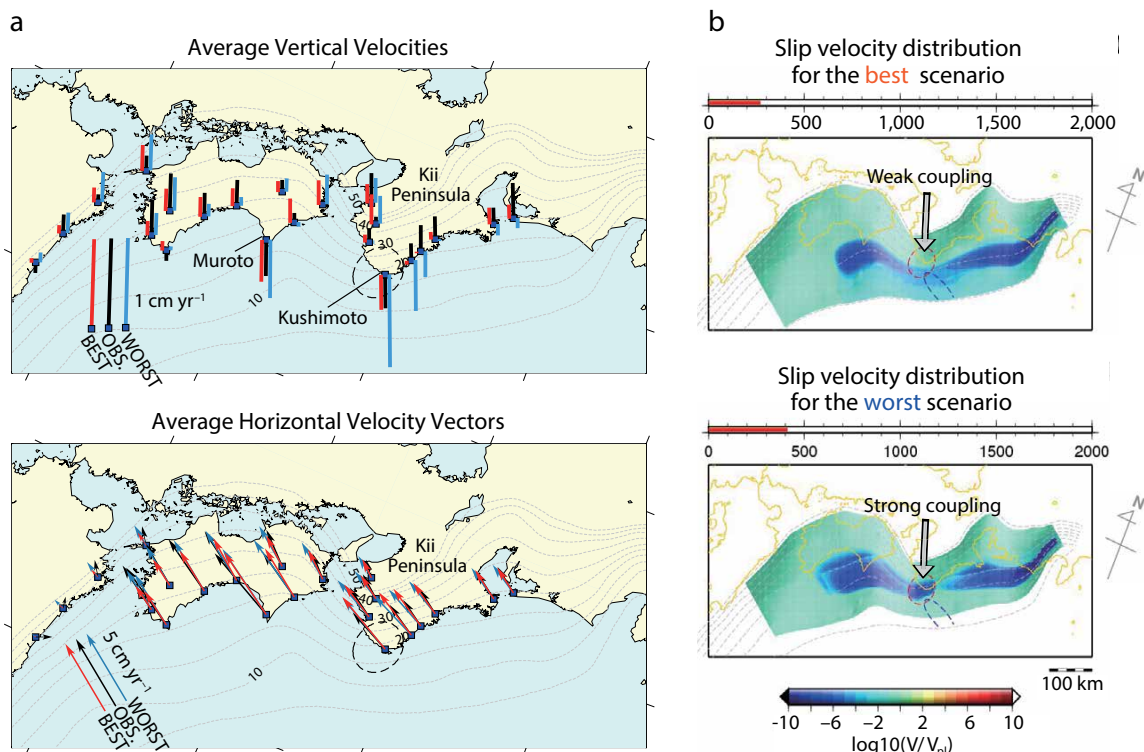


Figure 5. (a) Vertical (above) and horizontal (below) velocity distribution of observation data (black), the best scenario (red), and the worst scenario (blue). (b) Slip velocity distribution on the plate interface for the best case scenario (above) and the worst case scenario (below). Blue indicates a coupled area. A large difference can be seen beneath the Kii Peninsula, indicated by a red ellipse.

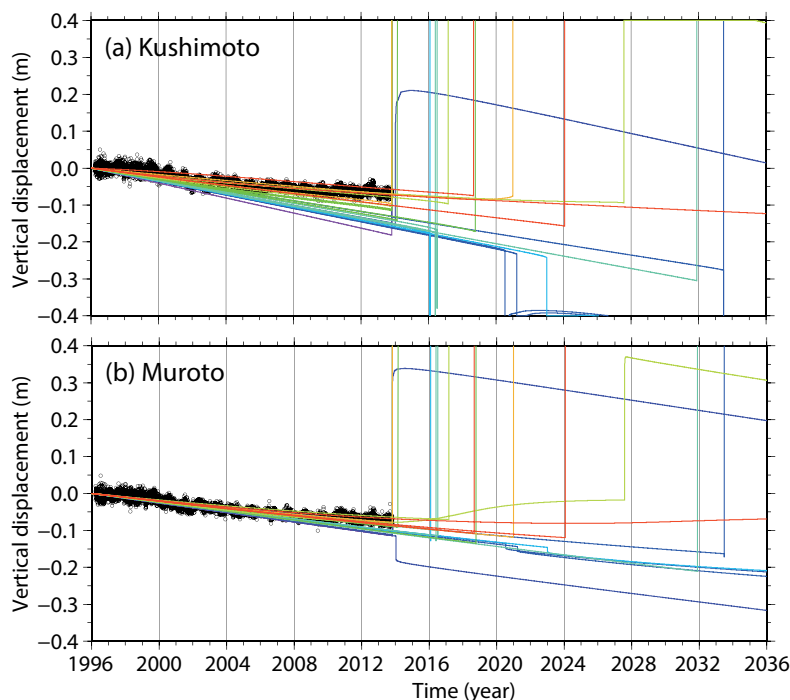



Figure 6. Time variation of observation data (dots) and simulated scenarios with their likelihoods indicated by color at the Kushimoto and Muroto stations (located in Figure 5). One of ten scenarios was picked from among those with similar likelihoods. Abrupt deformation indicates the timing of a great earthquake in each scenario.

Likelihood
low high

simulation model for treating smaller earthquakes not only at plate boundaries but also off the boundaries. We also need to improve our physical model of earthquake generation, especially by incorporating a more complex and realistic law of friction for the plate interface. Because of the flexibility of the assimilation procedure, we can compare mathematical models for earthquake generation if they can estimate observed surface deformation.

ACKNOWLEDGEMENTS

We thank M.J. Werner and two anonymous reviewers for their comments, which improved the manuscript. We also thank E.S. Kappel, editor of *Oceanography*, for English editing. We appreciate the assistance of Editage in the preparation of our draft manuscript. We thank K. Ando for preparing the image in the title page. This work has been partially supported by the “Research project for compound disaster mitigation on the great earthquakes and tsunamis

around the Nankai trough region” at the Ministry of Education, Culture, Sports, Science and Technology (MEXT) of Japan. Some of the results were obtained using the K computer at the RIKEN AICS (Proposal number hp120278). We used Generic Mapping Tools (Wessel and Smith, 1998) to draw the figures. 

REFERENCES

- Dieterich, J.H. 1979. Modeling of rock friction: Part 1. Experimental results and constitutive equations. *Journal of Geophysical Research* 84:2,161–2,168, <http://dx.doi.org/10.1029/JB084iB05p02161>.
- Fujiwara, T., S. Kodaira, T. No, Y. Kaiho, N. Takahashi, and Y. Kaneda. 2011. The 2011 Tohoku-Oki earthquake: Displacement reaching the trench axis. *Science* 334:1,240, <http://dx.doi.org/10.1126/science.12111554>.
- Geller, R.J. 1997. Earthquake prediction: A critical review. *Geophysical Journal International* 131:425–450, <http://dx.doi.org/10.1111/j.1365-246X.1997.tb06588.x>.
- Geller, R.J., D.D. Jackson, Y.Y. Kagan, and F. Mulargia. 1997. Earthquakes cannot be predicted. *Science* 275:1,616–1,617, <http://dx.doi.org/10.1126/science.275.5306.1616>.
- Hashimoto, C., E. Fukuyama, and M. Matsu'ura. 2013. Physics-based 3-D simulation for earthquake generation cycles at plate interfaces in subduction zones. *Pure and Applied Geophysics* <http://dx.doi.org/10.1007/s00024-013-0716-4>.
- Hashimoto, C., A. Noda, and M. Matsu'ura. 2012. The M_w 9.0 northeast Japan earthquake: Total rupture of a basement asperity. *Geophysical Journal International* 189:1–5, <http://dx.doi.org/10.1111/j.1365-246X.2011.05368.x>.
- Hashimoto, C., A. Noda, T. Sagiya, and M. Matsu'ura. 2009. Interplate seismogenic zones along the Kuril-Japan trench inferred from GPS data inversion. *Nature Geoscience* 2:141–144, <http://dx.doi.org/10.1038/ngeo421>.
- Heki, K., S. Miyazaki, and H. Tsuji. 1997. Silent fault slip following an interplate thrust earthquake at the Japan Trench. *Nature* 386:595–597, <http://dx.doi.org/10.1038/386595a0>.
- Hirose, H., K. Hirahara, F. Kimata, N. Fujii, and S. Miyazaki. 1999. A slow thrust slip event following the two 1996 Hyuganada earthquakes beneath the Bungo Channel, Southwest Japan. *Geophysical Research Letters* 26:3,237–3,240, <http://dx.doi.org/10.1029/1999GL010999>.
- Hori, T., and S. Miyazaki. 2011. A possible mechanism of M 9 earthquake generation cycles in the area of repeating M 7–8 earthquakes surrounded by aseismic sliding. *Earth, Planets, and Space* 63:773–777, <http://www.terrapub.co.jp/journals/EPS/pdf/2011/6307/63070773.pdf>.
- Hori, T., S. Miyazaki, M. Hyodo, R. Nakata, and Y. Kaneda. 2013. Earthquake forecasting system based on sequential data assimilation of slip on the plate boundary. *Theoretical*

- and *Applied Mechanics Japan* 62:179–189. https://www.jstage.jst.go.jp/article/nctam/62/0/62_179/_article.
- Hyodo, M., and T. Hori. 2013. Re-examination of possible great interplate earthquake scenarios in the Nankai Trough, southwest Japan, based on recent findings and numerical simulations. *Tectonophysics* 600:175–186, <http://dx.doi.org/10.1016/j.tecto.2013.02.038>.
- Ishibashi, K. 2004. Status of historical seismology in Japan. *Annals of Geophysics* 47:339–368, <http://dx.doi.org/10.4401/ag-3305>.
- Ito, Y., M. Hino, H. Kido, Y. Fujimoto, D. Osada, Y. Inazu, T. Ohta, M. Iinuma, S. Ohzono, M. Miura, and others. 2012. Episodic slow slip events in the Japan subduction zone before the 2011 Tohoku-Oki earthquake. *Tectonophysics*, <http://dx.doi.org/10.1016/j.tecto.2012.08.022>.
- Jordan, T.H. 2006. Earthquake predictability: Brick by brick. *Seismological Research Letters* 77:3–6, <http://dx.doi.org/10.1785/gssrl.77.1.3>.
- Kagan, Y.Y. 1997. Are earthquakes predictable? *Geophysical Journal International* 131:505–525, <http://dx.doi.org/10.1111/j.1365-246X.1997.tb06595.x>.
- Kaneda, Y. 2010. The advanced ocean floor real time monitoring system for mega thrust earthquakes and tsunamis: Application of DONET and DONET2 data to seismological research and disaster mitigation. *MTS/IEEE OCEANS 2010*, <http://dx.doi.org/10.1109/OCEANS.2010.5664309>.
- Kaneda, Y. 2014. DONET: A real-time monitoring system for megathrust earthquakes and tsunamis around southwestern Japan. *Oceanography* 27(2):103, <http://dx.doi.org/10.5670/oceanog.2014.45>.
- Kato, N. 2008. Numerical simulation of recurrence of asperity rupture in the Sanriku region, northeastern Japan. *Journal of Geophysical Research* 113, B06302, <http://dx.doi.org/10.1029/2007JB005515>.
- Kato, N., and T.E. Tullis. 2001. A composite rate- and state-dependent law for rock friction. *Geophysical Research Letters* 28:1,103–1,106, <http://dx.doi.org/10.1029/2000GL012060>.
- Kitagawa, G. 1996. Monte Carlo filter and smoother for non-Gaussian nonlinear state space model. *Journal of Computational Graphical Statistics* 5:1–25.
- Kodaira, S., T. Hori, A. Ito, S. Miura, G. Fujie, J.O. Park, T. Baba, H. Sakaguchi, and Y. Kaneda. 2006. A cause of rupture segmentation and synchronization in the Nankai trough revealed by seismic imaging and numerical simulation. *Journal of Geophysical Research* 111, B09301, <http://dx.doi.org/10.1029/2005JB004030>.
- Lapusta, N., J.R. Rice, Y. Ben-Zion, and G. Zheng. 2000. Elastodynamic analysis for slow tectonic loading with spontaneous rupture episodes on faults with rate- and state-dependent friction. *Journal of Geophysical Research* 105(B10):23,765–23,790, <http://dx.doi.org/10.1029/2000JB900250>.
- Murakami, A., T. Shuku, S. Nishimura, K. Fujisawa, and K. Nakamura. 2012. Data assimilation using the particle filter for identifying the elasto-plastic material properties of geomaterials. *International Journal for Numerical and Analytical Methods in Geomechanics* 37:1,642–1,669, <http://dx.doi.org/10.1002/nag.2125>.
- Nakata, R., M. Hyodo, and T. Hori. 2012. Numerical simulation of afterslips and slow slip events that occurred in the same area in Hyuganada of southwest Japan. *Geophysical Journal International* 190:1,213–1,220, <http://dx.doi.org/10.1111/j.1365-246X.2012.05552.x>.
- Nakatani, M. 2001. Conceptual and physical clarification of rate and state friction: Frictional sliding as a thermally activated rheology. *Journal of Geophysical Research* 106:13,347–13,380, <http://dx.doi.org/10.1029/2000JB900453>.
- Nanayama, F., K. Satake, R. Furukawa, K. Shimokawa, B.F. Atwater, K. Shigeno, and S. Yamaki. 2003. Unusually large earthquakes inferred from tsunami deposits along the Kuril trench. *Nature* 424:660–663, <http://dx.doi.org/10.1038/nature01864>.
- Nishimura, T., T. Hirasawa, S. Miyazaki, T. Sagiya, T. Tada, S. Miura, and K. Tanaka. 2004. Temporal change of interplate coupling in northeastern Japan during 1995–2002 estimated from continuous GPS observations. *Geophysical Journal International* 157:901–916.
- Noda, H., and N. Lapusta. 2013. Stable creeping fault segments can become destructive as a result of dynamic weakening. *Nature* 493:518–521, <http://dx.doi.org/10.1038/nature11703>.
- Noda, H., M. Nakatani, and T. Hori. 2013. Large nucleation before large earthquakes is sometimes skipped due to cascade-up: Implications from a rate and state simulation of faults with hierarchical asperities. *Journal of Geophysical Research* 118:2,924–2,952, <http://dx.doi.org/10.1002/jgrb.50211>.
- Ohtani, M., K. Hirahara, T. Hori, and M. Hyodo. 2014. Observed change in plate coupling close to the rupture initiation area before the occurrence of the 2011 Tohoku earthquake: Implications from an earthquake cycle model. *Geophysical Research Letters* 41:1,899–1,906, <http://dx.doi.org/10.1002/2013GL058751>.
- Okada, Y. 1992. Internal deformation due to shear and tensile faults in a half-space. *Bulletin of the Seismological Society of America* 82:1,018–1,040.
- Rice, J.R. 1993. Spatio-temporal complexity of slip on a fault. *Journal of Geophysical Research* 98:9885–9907, <http://dx.doi.org/10.1029/93JB00191>.
- Ruina, A. 1983. Slip instability and state variable friction laws. *Journal of Geophysical Research* 88:10,359–10,370, <http://dx.doi.org/10.1029/JB088iB12p10359>.
- Rundle, J.B., P.B. Rundle, A. Donnellan, D. Turcotte, R. Shcherbakov, P. Li, B.D. Malamud, L.B. Grant, G.C. Fox, D. McLeod, and others. 2005. A simulation-based approach to forecasting the next great San Francisco earthquake. *Proceedings of the National Academy of Sciences of the United States of America* 102:15,363–15,367, <http://dx.doi.org/10.1073/pnas.0507528102>.
- Sawai, Y., T. Kamataki, M. Shishikura, H. Nasu, Y. Okamura, K. Satake, K.H. Thomson, D. Masumoto, Y. Fujii, J. Komatsubara, and T.T. Aung. 2009. Aperiodic recurrence of geologically recorded tsunamis during the past 5500 years in eastern Hokkaido, Japan. *Journal of Geophysical Research* 114, B01319, <http://dx.doi.org/10.1029/2007JB005503>.
- Suito, H., T. Nishimura, M. Tobita, T. Imakiire, and S. Ozawa. 2011. Interplate fault slip along the Japan Trench before the occurrence of the 2011 off the Pacific coast of Tohoku Earthquake as inferred from GPS data. *Earth, Planets, and Space* 63:615–619, <http://dx.doi.org/10.5047/eps.2011.06.053>.
- Tullis, T.E., K. Richards-Dinger, M. Barall, J.H. Dieterich, E.H. Field, E.M. Heien, L.H. Kellogg, F.F. Pollitz, J.B. Rundle, M.K. Sachs, and others. 2012. Comparison among observations and earthquake simulator results for the allca2 California fault model. *Seismological Research Letters* 83:994–1,006, <http://dx.doi.org/10.1785/0220120094>.
- Werner, M.J., K. Ide, and D. Sornette. 2011. Earthquake forecasting based on data assimilation: Sequential Monte Carlo methods for renewal point processes. *Nonlinear Processes in Geophysics* 18:49–70, <http://dx.doi.org/10.5194/npg-18-49-2011>.
- Wessel, P., and W.H.F. Smith. 1998. New, improved version of Generic Mapping Tools released. *Eos Transactions, American Geophysical Union* 79:579, <http://dx.doi.org/10.1029/98EO00426>.
- Wibberley, C.A.J., G. Yielding, and G. Di Toro. 2008. Recent advances in the understanding of fault zone internal structure: A review. *Geological Society, London, Special Publications* 299:5–33, <http://dx.doi.org/10.1144/SP299.2>.