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The research program titled "Earthquake and 1 2 Volcano Hazards Observation and Research 3 Program" was started in fiscal year (FY) 2014 as a 4 new five-year project authorized and funded by the 5 **Council for Science and Technology of the Ministry** 6 of Education, Culture, Sports, Science and 7 Technology. It included a new format of 8 "Core-to-Core collaborative research called, 9 Collaborative Research between Earthquake 10 Research Institute, University of Tokyo and Disaster Prevention Research Institute, Kyoto 11 12 University". In this format, two types of research, "Participation Type Research" and "Subject 13 Proposal Type Research" were conducted from 14 15 FY2015. A preliminary study was performed in 16 **FY2015** for "Integrated Research" of "Participation Type Research," which developed a 17 18 framework for seismic risk evaluation at 19 prefectural offices of Osaka and Kochi for an 20 earthquake occurring along the Nankai Trough, 21 considering the epistemic uncertainty. The 22 secondary study was performed from FY2016 23 through to FY2018, wherein the methodology for 24 the seismic risk evaluation was improved on three aspects: i.e., revision in ground motion prediction 25 26 models considering the saturation effect, revision in 27 loss models in terms of the fatalities as well as the 28 direct losses of buildings, and extension of target 29 sites to the whole of Osaka and Kochi prefectures. 30 The results suggest that the epistemic uncertainty 31 in the ground motion prediction models is most 32 sensitive to the overall uncertainty of seismic risk. Along with "Integrated Research", a total of 14 33 34 "Research on Specific Topics" related to time-35 dependent risk analysis, economical risk evaluation, 36 source characterization, structural damage 37 estimation models, ground motion estimation 38 models, soil amplification models and disaster 39 prevention planning considering the uncertainty of 40 risk assessment, were studied during this period in

41 order to improve the risk assessment studies for
42 "Integrated Research". With respect to "Subject
43 Proposal Type Research," a total of 27 individual
44 research themes focused on research to understand
45 hazards/risks by earthquakes and volcanic
46 eruptions and to mitigate disasters by them.

47 Keywords: core-to-core collaborative research,
48 disaster mitigation, earthquakes, volcanoes, hazard
49 estimation, risk evaluation, Nankai Trough earthquake

50 1. Introduction

51 The research program "Observation and Research 52 Program for Prediction of Earthquakes and Volcanic Eruptions", authorized and funded by the Council for 53 54 Science and Technology of the Ministry of Education, 55 Culture, Sports, Science and Technology (MEXT), was planned for FY2009 through to FY2013. It faced 56 57 criticism after the 2011 off the Pacific coast of Tohoku Earthquake, as the outputs from the program were not 58 59 effective in mitigating the disaster caused by the earthquake. At the end of this five-year program in 60 FY2013, a new five-year research program was 61 proposed that placed emphasis on the mitigation of 62 63 disasters by earthquakes and volcanic eruptions in 64 addition to conducting observation and research for 65 understanding earthquakes and volcanic eruptions. In FY2014, a new five-year research program called 66 67 "Earthquake and Volcano Hazards Observation and Research Program" was initiated, which included a 68 69 new format of collaborative research called, "Core-to-70 Core Collaborative Research between Earthquake Research Institute, University of Tokyo (ERI) and 71 72 Disaster Prevention Research Institute, Kyoto 73 University (DPRI)" (Core-to-Core Research). It was 74 clarified that the aim of the research program is not 75 only for observation and research for earthquake and 76 volcanic eruption prediction, but for conducting 77 researches that are aimed at contributing to estimating

and mitigating disasters caused by earthquakes and 1 volcanic eruptions. ERI is the "Joint Usage/Research 2 3 Center for Earthquake and Volcano Sciences" and 4 DPRI is the "Joint Usage/Collaborative Research Center for Multi-disciplinary Disaster Prevention 5 Study." The collaborative research between these two 6 institutes (research centers) is expected to accelerate 7 8 researches mitigating disaster caused by earthquakes and volcanic eruptions. 9

10 In this new format of collaborative research, two types of researches were conducted, namely 11 12 "Participation Type Research" and "Subject Proposal 13 Type Research". Groups of or individual researchers 14 proposed ideas related to understanding the occurrence of disaster by earthquakes or volcanic eruptions and 15 their consequence, as well as how to mitigate the 16 17 damage for both research types. For "Participation Type Research", groups consisting of researchers from 18 many institutions in Japan including ERI and DPRI, 19 proposed research related to probabilistic seismic risk 20 assessment associated with the occurrence of an 21 earthquake along the Nankai Trough. "Subject 22 23 Proposal Type Research" aimed to promote disaster 24 mitigation research in a wider range of research areas. 25 The proposals for both research types were evaluated 26 by the "Coordinating Committee for Core-to-Core 27 Research".

This article will outline the Core-to-Core Researchfrom FY2014 and FY2018.

30 2. Structure of the Research Types

31 2.1. Participation Type Research

In "Participation Type Research", research related
to probabilistic seismic risk assessment at Osaka and
Kochi prefectures associated with the occurrence of an
earthquake along the Nankai Trough was conducted.

36 This research had two objectives: conduct integrated research aimed at "Construction of a New 37 38 Paradigm for Improving Uncertainty of Risk Evaluation for Large Magnitude Earthquakes" that 39 combines research areas from source process to 40 41 stakeholder involvement; and study specific research topics that were considered necessary to improve and 42 43 update "Integrated Research."

44 2.1.1. Integrated Research

45 "Integrated Research" was formulated with 7 research subgroups related to seismic risk evaluation, 46 47 i.e. source process, wave propagation and deep subsurface structure, strong motion estimation, 48 49 shallow subsurface structure, structural damage 50 risk estimation, evaluation, and stakeholder involvement. Another subgroup was formed to 51 develop the platform for seismic risk evaluation and 52 53 integrate the inputs from the aforementioned 54 subgroups.

55 The collaborative research was initiated and 56 required researches were appointed in the first year of

57 the research project. As a preliminary study, the 58 methodology of the entire research was constructed by 59 the platform development group and models in related 60 research fields were selected by corresponding research subgroups. Then, the process of seismic risk 61 62 evaluation was revised and extended on the basis of a methodology determined in the preliminary study. The 63 64 ground motion prediction equations (GMPEs) and risk models were revised and target sites were expanded to 65 the whole prefecture. 66

- ob the whole prefecture.
- 67 2.1.2. Specific Research
- 68 Specific research topics were selected on the basis
- 69 of discussions carried out in "Integrated Research."

70 Table 1 shows the specific research conducted from

71 FY2015 to FY2018.

Fiscal	scal Research topics					
year	Title	PI ^a				
2015	Study on disaster risk assessment considering the time line	Shinichi Matsushima (DPRI, KU)				
	Integrated simulation for economical assessment of seismic damage	Muneo Hori (ERI, UT)				
	Study on disaster risk assessment considering the time line	Shinichi Matsushima (DPRI, KU)				
2016	Integrated simulation for economical assessment of seismic damage	Muneo Hori (ERI, UT)				
	Construction of source models for evaluation of disaster risk for large earthquakes	Takashi Furumura (ERI, UT)				
	Improvement of structural damage estimation methods	Hiroshi Kawase (DPRI, KU)				
2017	Construction of source models for evaluation of disaster risk for large earthquakes	Takashi Furumura (ERI, UT)				
	Improvement of structural damage estimation methods	Hiroshi Kawase (DPRI, KU)				
	Increasing precision of estimation methods of soil amplification during large earthquakes	Kyohei Ueda (DPRI, KU)				
	Improvement of strong motion estimation following large earthquakes focused on the source model	Masatoshi Miyazawa (DPRI, KU)				
2018	Increasing precision of estimation methods of soil amplification during large earthquakes	Kyohei Ueda (DPRI, KU)				
	Improvement of strong motion estimation following large earthquakes focused on the source model	Masatoshi Miyazawa (DPRI, KU)				
	Study on disaster prevention planning based on damage risk assessment with uncertainty	Norio Maki (DPRI, KU)				
	Data analysis and construction of modelling method for estimating exposure in the future	Kazuyoshi Nishijima (DPRI, KU)				

Table. 1 Topics of the specific research for each fiscal year.

a. Principal investigator

1 2.2. Subject Proposal Type Research

2 Earthquake and/or volcanic disasters are caused by 3 the vulnerability of the human and social environment 4 when hazards such as strong motions, tsunamis, 5 volcanic ashes and/or lava flow from earthquakes and volcanic eruptions act on them. Disaster science 6 7 concerning earthquakes and volcanic eruptions is geared toward to understanding the occurrence of 8 9 events and the occurrence and transition of disasters 10 caused by those events and in utilizing such 11 knowledge to prevent/mitigate disaster. For this 12 purpose, researchers in areas of physics, engineering, 13 and cultural and social science are required to 14 cooperate and conduct interdisciplinary and comprehensive research and pursue them to 15 understand the cause of disasters. 16

17 "Subject Proposal Type Research" involved the following five categories: 1. study of cases of 18 earthquake/volcanic disaster, 2. improvement of prior 19 20 evaluation methods for earthquake/volcanic hazards, 3. 21 improvement of real-time estimation methods for 22 earthquake/volcanic hazards, 4. investigation of the 23 mechanism of earthquake/volcanic disaster occurrence, and 5. improvement of information 24 25 mitigate dissemination to earthquake/volcanic 26 disasters.

Table 2 shows the number of research projects thatwere conducted for "Subject Proposal Type Research"

29 from FY2014 to FY2018.

 Table. 2 Number research projects of the Subject Proposal Type

 Research for each fiscal year.

Fiscal	Research categories					
year	1	2	3	4	5	Total
2014	3	3	3	1	2	12
2015	2	4	4	1	1	12
2016	2	1	3	1	5	12
2017	2	1	3	2	3	11
2018	2	2	1	1	1	7
Total	11	11	14	6	12	54

30 2.3. Reports of Research

A brief report of each research project conducted during the five years can be found at the web site maintained by the Coordinating Committee of Earthquake and Volcanic Eruption Prediction Researches [1].

36 **3. Understanding Uncertainty of Seismic**

37 Risk Evaluation for Earthquakes along38 the Nankai Trough

In "Integrated Research" of "Participation TypeResearch," research by the eight subgroups mentionedin Section 2.1 was conducted to understand the

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42 uncertainty of seismic risk evaluation for earthquakes43 occurring along the Nankai Trough.

In this chapter, the output of "Integrated Research"
of "Participation Type Research" is explained in detail,
since this is the main feature of the Core-to-Core
Research.

In the first year of the 5-year research project, a 48 49 working group was formed to discuss the research 50 objective, which was determined to be mitigation of disasters caused by large magnitude earthquakes along 51 the Nankai Trough. A symposium was held at ERI, 52 53 wherein researchers from related research areas 54 gathered to discuss about the specific research plan for 55 the Core-to-Core Research. In the symposium, it was agreed that seismic risk and its uncertainty would be 56 57 evaluated using state-of-the-art methods.

58 In the initial phase of the research, a preliminary 59 study for developing a methodology for evaluating 60 seismic risk was conducted by the platform development subgroup. Models to be used for the 61 62 related research fields were then selected by the corresponding subgroups. The target location was the 63 prefectural offices of Kochi and Osaka prefectures. 64 65 For the secondary study beginning in FY2016, the 66 procedure of seismic risk evaluation was revised and 67 extended on basis of the methodology developed in the 68 preliminary study. The target location was expanded to the whole of Kochi and Osaka prefectures. 69

70 3.1. Preliminary Study

71 3.1.1. Scope of the study

The scope of the preliminary study was limited to 72 73 evaluating the expected loss due to the damage of an 74 arbitrary structure for the next Nankai Trough 75 earthquake at arbitrary locations. The location of the assumed source region of an earthquake occurring 76 along the Nankai Trough and the two target sites are 77 78 shown in Fig. 1. The conditions of the research were 79 set to evaluate seismic risk for direct economic loss 80 due to damage of 2-storey wooden houses located at 81 the prefectural offices of Osaka and Kochi prefectures.



Fig. 1. Locations of the source area of the Nankai Trough earthquake and target sites.

1 3.1.2. Procedure of the study

2 In this study, probabilistic seismic risk evaluation is 3 composed of five modules, i.e. source process modelling, strong motion estimation, 4 shallow 5 subsurface structure amplification, structural damage 6 estimation and risk evaluation, which are sequentially 7 connected as illustrated in Fig. 2. The output from the 8 upstream module is used as the input for the following 9 module. The magnitude and location of several earthquake source areas are defined and combined to 10 construct source models. The source area is decided 11 12 according to the magnitude. In order to consider the 13 possibility of occurrence of the next event, the source models are weighted according to the judgement of the 14 15 source model subgroup. Peak ground velocity (PGV) 16 of ground motions at the target sites was predicted in 17 the strong motion estimation module. Effects of site 18 amplifications were estimated in the shallow 19 subsurface structure module, while the vulnerability of 20 the target structure was estimated using fragility 21 curves in the structural damage estimation module. In 22 the risk evaluation module, seismic risk was evaluated 23 in terms of the expected value of loss.



Source: 5th IASPEI / IAEE international Symposium: Effects of Surface Geology on Seismic Motion [2] Fig. 2. Sequential process of modules for the evaluation of seismic

risk and its uncertainty.

24 In this study, the misfits of the models to the data 25 and/or the presence of competing models are 26 considered as epistemic uncertainty; the overall 27 uncertainty of the calculated seismic risk is influenced by each epistemic uncertainty. Each epistemic 28 29 uncertainty is estimated by each research subgroup 30 and the overall uncertainty is evaluated considering 31 those epistemic uncertainties. A great number of 32 combinations of models and modelling uncertainties 33 are assumed to calculate risk on the basis of Monte-34 Carlo Simulation (MCS); the probabilistic distribution of risk is obtained from the results of the MCS. The 35 36 overall uncertainty in the calculated risk is defined on 37 the basis of the probabilistic distribution. The degree



Source: 5th IASPEI / IAEE international Symposium: Effects of Surface Geology on Seismic Motion [2]

Fig. 3. The definition of the degree of uncertainty.

of uncertainty is defined as the length of the interval
between the 5% quantile value and the 95% quantile
value of the expected losses obtained from the MCS
results, as shown as a schematic figure in Fig. 3.

42 The ultimate goal of this research is to investigate 43 possibilities to reduce the overall uncertainty of seismic 44 risk. A sensitivity analysis with quantified values of risks 45 and their uncertainties was performed to investigate 46 which part's uncertainty has the largest effect on the 47 overall uncertainty. First, the reference value of overall 48 uncertainty is evaluated in case uncertainties of all parts 49 exist. This uncertainty is called "original uncertainty" in 50 this paper. Second, overall uncertainty is calculated when 51 we do not consider uncertainty of the source model and 52 uncertainties of all the other parts exist. The same process 53 is performed with respect to GMPEs, site amplification, 54 fragility curve and loss model parts. Third, the most 55 important part is defined by comparing the variation in 56 the overall uncertainty for each case. If the overall 57 uncertainty is significantly affected by the uncertainty of 58 a certain part, the uncertainty of that part should be 59 considered as an important factor to reduce the overall 60 uncertainty. An image of sensitivity analysis is illustrated in Fig. 4. In Fig. 4, the uncertainty of GMPE is most 61 62 sensitive to the overall uncertainty.



Fig. 4. Image of sensitivity analysis.

63 3.1.3. Models applied in the source process study

64 Source process

65 Six source areas were selected for the Nankai 66 Trough earthquake based on the Japan Seismic Hazard 67 Information System (J-SHIS) [3]. The moment 68 magnitude (M_w) values of six source areas are 69 assumed as 9.1, 8.7, 8.3, 8.5, 8.2, and 8.4. The shortest 70 distance from six sources to the Kochi prefectural 71 office site are 25.7, 25.6, 227, 25.6, 227, and 25.6 km, 72 respectively. Those to the Osaka prefectural office site are 70.9, 107, 107, 114, 107, and 114 km, respectively. 73 74 Six source models were proposed by combining six 75 source areas as shown in Fig. 5. While the former two 76 source models consist of a single source area, the other 77 four source models consist of two source areas. When 78 there are two source areas in a source model, it is 79 considered that the two source areas will rupture at a 80 certain time interval, but not concurrently. Weights of 81 source models were assumed as 10, 30, 15, 15, 15, and 82 15%, for source models (SM) 1 to 6, respectively. The probability of occurrence of the earthquake is not 83 84 considered, so the conditional risk is considered under 85 the conditions of the occurrence of an earthquake.



Fig. 5. Six source models for the Nankai Trough earthquake proposed in this study.

1 Strong motion estimation

2 GMPEs are empirical attenuation relation derived 3 from regression analysis. In this study, GMPEs that 4 have been developed based on Japanese data and are 5 capable of estimating PGVs are used for the seismic 6 risk evaluation. They are defined as follows;

7
$$\log PGV_{\text{EB}} = f(M_{\text{w}}, X, \Lambda) + \varepsilon_{\text{GMPE}}$$
.....(1)

8 where, PGV_{EB} is PGV at the engineering bedrock of the target site. M_w is the moment magnitude of the 9 source area, and X is the shortest distance to the 10 source from the site. Each GMPE model has an error 11 12 term considering modelling uncertainty, ε_{GMPE} . The 13 value of ε_{GMPE} is randomly selected using normal distribution with standard deviation (σ) values of 14 15 corresponding GMPEs. Since ε_{GMPE} is assumed as being normally distributed, the predicted PGVs will be 16 17 lognormally distributed.

18 Five GMPE models were selected for strong motion 19 estimation module; Si and Midorikawa [4] (GMPE1), 20 Kanno and others [5] (GMPE2), Satoh [6] (GMPE3), 21 and Morikawa and Fujiwara [7] (GMPE4 and 22 GMPE5). In this study, only GMPE4 and GMPE5 are 23 applicable for SM1 whose moment magnitude is over 24 9, while all five GMPEs can be applied in the other 25 five source models whose M_w is under 9. The reason is that the saturation effect for an earthquake with of a 26 27 large magnitude is considered only in GMPE4 and 28 GMPE5, but not in the other three GMPEs.

29 In this study, PGV at the engineering bedrock where 30 the average shear-wave velocity (V_s) for top 30 m 31 depth (AVS30) is 600 m/s, is first estimated. PGVs 32 predicted by GMPE2 to GMPE5 are targeted for 33 engineering bedrock with AVS30 of 311, 500, 350 and 350 m/s, respectively. The predicted PGVs for these 34 35 five GMPEs include the effect of site amplification: 36 thus the predicted PGVs needs to be adjusted to PGVs 37 at engineering bedrock with AVS30 of 600m/s. The 38 conversion procedure of PGVs predicted by five 39 GMPEs is illustrated in Fig. 6. In case of GMPE2, 40 PGV is converted by its own converting relation [5], 41 but the converting relation by Fujimoto and 42 Midorikawa [8], shown in Eq. (4), is applied for PGVs 43 by other GMPEs. The comparison of the predicted and

- 44 converted PGVs of five GMPEs are shown in Fig. 7,
- 45 in case of the source model 2 whose M_w is 8.7 and

46 focal depth is 19.2 km.





Fig. 7. Comparison of PGVs by five GMPEs.

47 Shallow subsurface structure

48 The site amplification from engineering bedrock 49 with AVS30 of 600m/s to the surface is defined by the 50 site amplification model. In this study, the site 51 amplification model was proposed for the shallow 52 subsurface structure module as a simplified format as 53 follows;

54
$$PGV_{GS} = AF \cdot PGV_{EB}$$
.....(2)

55 where, PGV_{GS} and AF are PGV at the ground 56 surface and the amplification factor of the site, 57 respectively.

58 In this study, the site amplification factor of PGV is 59 estimated through two steps. The first step is the 60 estimation of AVS30 from the soil profile based on the study by Matsuoka and others [9] as shown in Eq. (3). 61 AVS30 is defined as the function of conditions of the 62 63 site for each geomorphologic classification, such as 64 elevation (Ev), slope (Sp), and distance from mountain or hill (Dm). Information 65 of geomorphologic classification of J-SHIS [3] is applied. 66 67 ε_{SA1} is modelling uncertainty in the first step. The 68 second step is the estimation of amplification factor from estimated AVS30 as shown in Eq. (4) [8]. ε_{SA2} 69 70 is modelling uncertainty in the second step. The 71 methods of applying modelling uncertainties are the 72 same as those in GMPEs. The standard deviation of 73 previous studies [9, 8] is applied as ε_{SA1} and ε_{SA2} . 74 Epsilons are also assumed to be normally distributed;

therefore, the predicted PGV at the ground surface will
 likewise follow a log-normal distribution.

3
$$\log AVS30 = f(Ev, Sp, Dm) + \varepsilon_{SA1}....(3)$$

4
$$\log AF = 2.367 - 0.852 \log AVS30 + \varepsilon_{SA2} ...(4)$$

5 Structural damage estimation

6 The fragility curve model for 2-storey wooden 7 houses defined by Murao and Yamazaki [10] was 8 selected for the structure damage estimation module. 9 The exceedance probability P_R , which is the 10 probability that damage of rank R or worse will occur for a ground motion of PGV_{GS} , is defined using a 11 cumulative probability distribution function Φ . Φ is a 12 standard normal distribution and P_R is assumed to be 13 14 lognormally distributed as follows;

15
$$P_R(PGV_{\rm GS}) = \Phi\left(\frac{\ln PGV_{\rm GS} - \ln \mu_{\rm D}}{\zeta_{\rm D}}\right).....(5)$$

where, μ_D is the modelling uncertainty term assumed 16 in this study. $\ln \mu_D$ is assumed as lognormally 17 18 distributed with distribution parameters of λ and ζ_{λ} . 19 ζ_{λ} is the coefficient of variation (c.o.v.) of $\ln \mu_{\rm D}$, and is assumed as 20% in this study. λ and $\zeta_{\rm D}$ are 20 21 parameters of the fragility curve, corresponding to the 22 mean and standard deviation of $\ln PGV_{GS}$, 23 respectively.

24 Damage degree for wooden houses is classified as 25 heavy, moderate, and partial damage. The same fragility curve model is applied to the different damage 26 27 degrees, but the parameters, λ and ζ_D , are applied 28 separately. The parameters of fragility curves for 3 29 damage degrees are presented in Table 3, and the 30 fragility curves corresponding to 3 damage degrees are 31 shown in Fig. 8.

Table. 3 Parameters of the fragility curve for wooden house [10].



Fig. 8. Fragility curves for wooden houses [10].

32 Risk evaluation

Risk is defined as the expected value of loss. A simplified loss model is proposed for the risk valuation module. Quantified values for direct (economic) losses [10] shown in Table 4, are applied as a loss model. The lower bound of values of loss for each damage degree are applied for loss model 1 (LM1) and the upper bound values are applied for loss

- 40 model 2 (LM2). In case of the partial damage in LM1,
- 41 5% loss is used for the lowest value.

Table. 4 Quantified values for direct (economic) loss [10].

Structure	Damage	Loss
	partial	$0\%\sim 20\%$ of loss
Wooden	moderate	$20\%\sim 50\%$ of loss
nouse	heavy	50% ~ 100% of loss

42 3.1.4. Result of the sensitivity analysis

43 Sensitivity analyses are performed for two target sites. The results are shown in Fig. 9. Quantile values 44 45 of 5, 50 and 95% are shown by the dot for loss estimate line for each case. Very large uncertainties in the 46 47 calculated risks are observed in all cases, especially in 48 case of Kochi prefectural office site. For the 49 comparison of uncertainty, the rate of reduction in 50 uncertainty with respect to original uncertainty is 51 defined as a criterion. The reduction rates are 52 presented in Table 5. Based on the reduction rate of 53 each case, uncertainty of GMPEs are most influential 54 to overall uncertainty. Those of site amplification and loss model were less sensitive, where those of source 55

56 process and fragility curve were relatively insensitive.



Module	Kochi pref. office	Osaka pref. office
Source process	0%	2%
GMPEs	19%	46%
Site amplification	2%	20%
Fragility curve	1%	5%
Loss	26%	-2%

Table. 5 Rate of reduction of uncertainty.

3.1.5. Issues of preliminary analysis and challenges
 for the next step

3 From the preliminary study, some research agendas 4 were found necessary to be investigated. First, the 5 validity of suggested GMPEs needed to be verified 6 because great differences were observed not only in the expected losses but also in the predicted PGVs as 7 8 shown in Fig. 7. Second, the loss model needs to be 9 defined more sophisticatedly since it was too simple and distinctive, and had more assumptions compared 10 with other models. 11

12 3.2. Seismic risk evaluation

The secondary study was performed to conduct
actual seismic risk evaluation for the whole area of the
Kochi and Osaka prefectures, along with research to
solve the aforementioned research agendas.

17 3.2.1. Revision of GMPEs

18 According to a recent paper [11], the effect of 19 saturation of ground motions needs to be considered 20 for megathrust earthquakes at the subduction zone. 21 Based on the study, in case the shortest distance from 22 source to site is applied for GMPEs, saturation of M_w needs to be considered for M_w over 8.3. This idea is 23 24 adapted for GMPE1 to GMPE3, since the saturation effect is considered in GMPE4 and GMPE5 [7]. 25 Except for two source areas whose M_w are 8.3 and 26 8.2. M_w is larger than 8.3, and therefore the saturation 27 effect is considered for every source model. The 28 29 comparison of the predicted PGVs of revised five 30 GMPEs is illustrated in Fig. 10.

Compared with Fig. 7, the variability in the
predicted PGVs decreased. The results of sensitivity
analyses including the effect of saturation of



Fig. 10. Comparison of PGVs by 5 GMPEs considering saturation.

magnitude for GMPEs are shown in Fig. 11. The
decrease in expected risk values lead to a decrease of
their uncertainties. Based on the reduction rate of each
case, the relative relation of influence to the results
does not change

As shown in Fig. 9(a), the expected loss at the Kochi prefectural office site by SM1 is smaller than others despite its M_w being much larger than the others. This was improved as shown in Fig. 11(a), mainly because not only GMPE4 and GMPE5 but also GMPE1 to GMPE3, which predicts larger PGVs, were applied to SM1.



Fig. 11. Sensitivity analysis results for direct loss of houses considering the revision in GMPEs.

46 3.2.2. Revision of loss model

47 The risk is defined as the expected values of the 48 rates of losses in terms of the fatalities as well as the direct losses of wooden houses. The death rate 49 50 (casualties per house) defined by Tabata and Okada 51 [12] is applied to link the damage of wooden houses to 52 the fatalities, from the relation between the damage 53 index and the rate collapse of surrounding houses as 54 follows;

55
$$D_{\rm r}(x,y) = ae^{bx} + cxy^2$$
.....(6)

where, $D_r(x, y)$ is the rate of casualties per wooden 56 57 house. x is the damage index of the wooden house, and y is the surrounding collapse rate. Parameters of 58 59 a, b, and c are obtained by regression as 0.0104, 60 6.68, and 11.0, respectively, for a single wooden house. 61 Since data for the surrounding collapse rate is not always easily accessible, it is assumed as the function 62 63 of damage index, which is estimated from the data of

1 Kobe city [12], as shown in Fig. 12. The estimated 2 function is $y = x^2/2$, and the death rate per wooden 3 house is defined by the function of damage index as 4 Eq. (7) marked by red line in Fig. 12.

5
$$D_{\rm r}(x,y) = ae^{bx} + cx(x^2/2)^2$$
.....(7)



Fig. 12. Data of Kobe city and the approximated seismic death rate function for casualties per wooden house (after [12]).

6 Damage indices need to be quantified to be applied to the death rate function for casualties per wooden 7 house. Quantified damage indices applied in the study 8 9 [12] are marked by dotted lines in Fig. 13. These 10 values are based on the fragility curves defined in Okada and Takai [13] as marked by dotted and dashed 11 lines in Fig. 14. Since the fragility curves by Murao 12 13 and Yamazaki [10], marked by solid lines in Fig. 14, 14 are applied in this study instead of those by Okada and Takai [13], the damage indices for the death rate 15 function needs to be revised. From the comparison of 16 fragility curves of Murao and Yamazaki [10] and 17 Okada and Takai [13], the damage indices for death 18 19 rate function are revised to those marked by solid lines 20 in Fig. 13.

The quantified values for the rate of direct loss of houses are improved based on the strict meaning of the



Fig. 13. Data of Kobe city and the approximated seismic death rate function for casualties per wooden house (after [12]).



Fig. 14. Comparison of fragility curves [10, 13].

rate of loss [10]. As shown in Fig. 15, the degree of 23 24 loss rate depends on the judgement of investigator. In 25 the preliminary study, the values for the rate of direct loss based on the survey conducted by the local 26 27 government were directly applied in the loss model. 28 However, since the fragility curves applied in this 29 study are not based on the survey by the local 30 government, but rather on that by the "Special 31 Committee for Earthquake Disaster Recovery and 32 Urban Reconstruction," the quantified values need to 33 be changed. The quantified values are revised as 34 shown in Fig. 16 based on the comparisons of



Fig. 15. Differences in quantified values of rates of losses in building affected by the judgements of investigators [10].



Fig. 16. Comparison of fragility curves affected by the judgements of investigators [10].

1 proportions for damage degrees and fragility curves as

2 illustrated in Fig. 15 and Fig. 16, respectively.

3 One more improvement to the loss model is carried 4 out by adding a model with a median value and 5 considering uncertainty in the loss model by assuming 6 a uniform distribution instead of random selection of 7 values in each category.

8 The final loss model revised is briefly illustrated in 9 Fig. 17. First, the classification of damage is revised 10 from three classes to four classes. Second, the 11 quantified damage indexes are defined. Finally, the 12 loss model is defined in terms of rates of fatalities and 13 direct loss of houses with respect to damage indices.

The results of sensitivity analyses including the revision in the loss model are presented in Fig. 18. Expected values of risks are decreased because of the revisions in quantified values for the rate of loss of houses. Uncertainties are decreased at the Kochi prefectural office site but increased at the Osaka prefectural office site.







Fig. 18. Sensitivity analysis results of direct losses of houses considering the revision in loss model.

21 3.2.3. Expansion of target sites

The evaluation of seismic risk and its uncertainty has been extended to entire the Kochi and Osaka prefectures using revised methodology. The number of meshes of Kochi and Osaka prefectures are 103,465 and 27,640, and the size of a mesh is 100m×100m.

27 The expected rates of building losses for a wooden 28 house and those of the corresponding human losses are 29 illustrated in Fig. 19(a) and Fig. 19(b), respectively. 30 The expected values were very high, around 50% of 31 losses in buildings and around 3% of fatalities are 32 predicted, in certain places of Kochi prefecture, which 33 is around Kochi city. Compared with Kochi prefecture, 34 those of Osaka prefecture are relatively small.

35 The uncertainties of rates of building losses for a wooden house and those of human losses are 36 37 illustrated in Fig. 20(a) and Fig. 20(b), respectively. 38 Overall uncertainties are large in the Kochi prefecture 39 and those of the Osaka prefecture are relatively small. 40 The spatial distribution of the uncertainty reduction 41 rates in building losses in Kochi and Osaka prefectures 42 is illustrated in Fig. 21. Based on the results of a 43 sensitivity analysis, the conclusion is slightly different. 44 The effect of the loss model is less important than 45 previous results of sensitivity analysis. The spatial 46 distribution of the uncertainty reduction rates of the 47 human losses in Kochi and Osaka prefectures is 48 illustrated in Fig. 22. Based on the results of a 49 sensitivity analysis, the conclusion is the same as that 50 for the building losses. After the extension of sites, the 51 conclusion is almost similar but slightly changed. 52 Uncertainty in GMPEs is still most influential to 53 overall uncertainty, while that in site amplification is 54 less sensitive, and those of source process, fragility 55 curve and loss model are relatively insensitive.

56 3.3. Summary of risk evaluation for the Nankai57 Trough earthquake

58 "Integrated Research" was aimed at evaluating 59 seismic risk and its uncertainty for an earthquake 60 occurring along the Nankai Trough, by utilizing state-61 of-the-art methods. In the preliminary study, very 62 large uncertainties in the calculated risks were 63 observed, especially for the Kochi prefectural office 64 site. For comparison of uncertainty, the rate of 65 reduction in uncertainty with respect to the original 66 uncertainty is defined as a criterion. Based on the 67 reduction rate of each case, the uncertainty of strong motion simulation module is most influential to 68 69 overall uncertainty. Those of site amplification and 70 loss model modules were less sensitive, and those of 71 source process and structure damage estimation 72 modules were relatively insensitive.

After the preliminary study, the methodology for
seismic risk evaluation was improved in three parts.
First, the models for GMPEs were improved
considering the saturation effect. Second, the loss
model was improved by adding a human loss model
that is related to the direct loss of houses. The



classification of damage degree and the quantified
 value for the corresponding damage degree were
 revised, and the application method of the loss model
 was also revised. Third, target sites were extended to
 the whole of Kochi and Osaka prefectures. The
 conclusion did not change drastically after these three
 parts were improved.

8 The expected rates of direct loss for a wooden house 9 and the corresponding human loss were found to be very high, around 50% of losses in houses and around 10 3% of fatalities per house were predicted, in certain 11 12 places in the Kochi prefecture. Compared with the Kochi prefecture, those of the Osaka prefecture were 13 relatively small. The uncertainties of loss of wooden 14 houses and human loss were also found to be large in 15 the Kochi prefecture and those of the Osaka prefecture 16 17 were relatively small. Uncertainty in strong motion 18 estimation module is still most influential to the overall uncertainty, while that in site amplification 19 20 module is less sensitive, and those of source process, 21 fragility curve and loss model modules are relatively insensitive. 22



Fig. 21. Results of sensitivity analysis - Uncertainty reduction rate of loss of houses.



Fig. 22. Results of sensitivity analysis - Uncertainty reduction rate of human loss.

23 4. Summary of the Core-to-Core Research

The Core-to-Core Collaborative Research between 24 25 Earthquake Research Institute, University of Tokyo (ERI) and Disaster Prevention Research Institute, 26 27 Kyoto University (DPRI) started in FY2014 as a new 28 format of a collaborative research within the research 29 project Earthquake and Volcano Hazards Observation 30 and Research Program. During the period between FY2014 and FY2018, Participation Type Research 31 32 and Subject Proposal Type Research were conducted. 33 In "Subject Proposal Type Research", a total of 54 34 research proposals were accepted for researchers in 35 areas such as physics, engineering, and cultural and

science 1 social to cooperate and conduct 2 interdisciplinary and comprehensive research and 3 pursue research to understand the cause of disasters 4 and utilize the knowledge to prevent/mitigate disaster. 5 In "Participation Type Research", "Integrated

Research" and "Specific Research" was conducted for 6 7 "Construction of a New Paradigm for Improving 8 Uncertainty of Risk Evaluation for Large Magnitude 9 Earthquakes." In "Integrated Research", probabilistic seismic risk assessment at Osaka and Kochi 10 11 prefectures associated with the occurrence of an 12 earthquake along the Nankai Trough was conducted by combining research areas from source process to 13 14 stakeholder involvement. As a result, the uncertainty of probabilistic seismic risk was explicitly expressed 15 16 quantitatively.

17

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