



地震災害鏈風險評估及管理研究中心 E-DREM研討會

地震誘發山崩之早期預估

Early Estimates of Landslides After a Major Earthquake

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INTRODUCTION

This presentation will include two major parts:

- Development of an earthquake-induced **Landslide Prediction Model** for predicting shallow landslides at a general region where the model was trained by using previous EQ-induced landslides, landslide causative factors, and EQ intensity data.
- Application of the model to **Early Estimate of triggered Landslides** after a major earthquake by inputting EQ intensity data, which are estimated from a GMPE for Aerial intensity. Suppose earthquake location and magnitude are already known. It will be better if fault rupture information is also known.

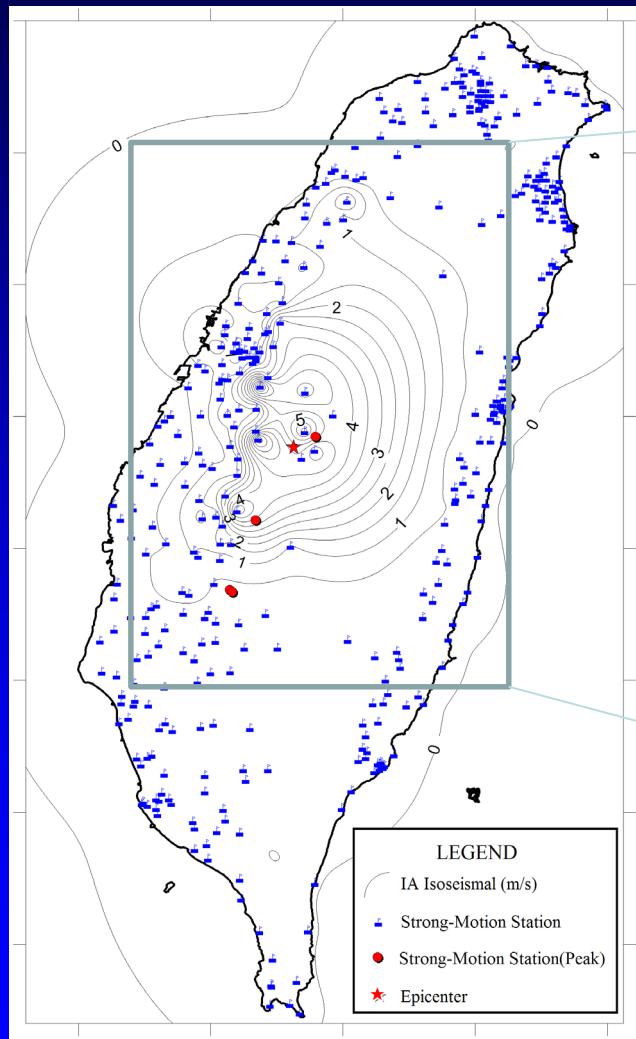


Development of a Landslide Prediction Model

- First, a landslide susceptibility analysis is performed to built a landslide susceptibility model which represents relative grades of slope instability at the region.
- Then, using landslide data, Arias intensity data, and susceptibility values at each study grid, an empirical relationship taking Arias intensity and susceptibility value as two independent variables and the **probability of landslide failure** as a dependent variable can be developed.
- The empirical formula then can be used as a landslide prediction model, providing the distribution of Arial intensity and susceptibility values at a region are known.



Arias Intensity Map of the Chi-Chi Earthquake



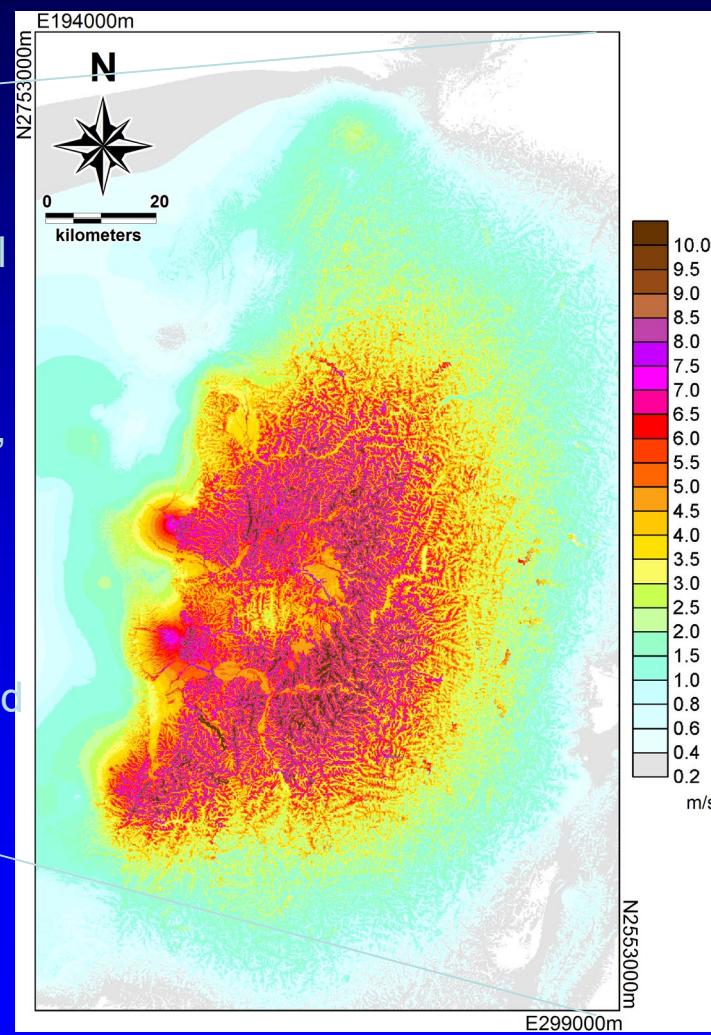
Arias Intensity

The following the empirical formula proposed by Lin and Lee (2003) is used in the topographic correction,

$$I_a' = f I_a ,$$

$$f = \sqrt{h / 93.8 + 0.287} + 0.464$$

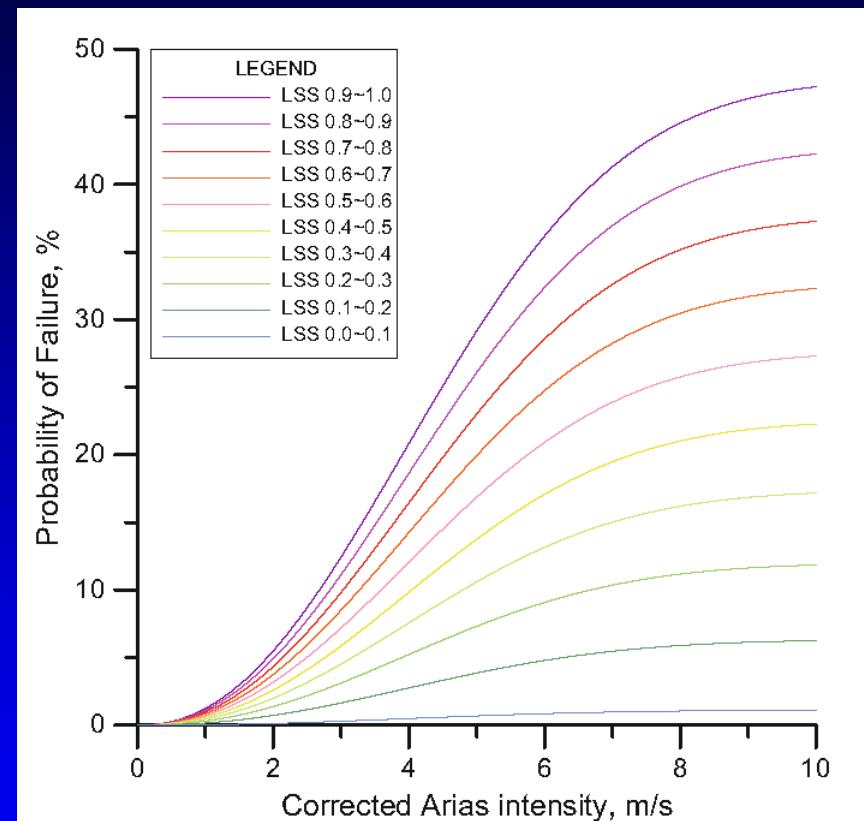
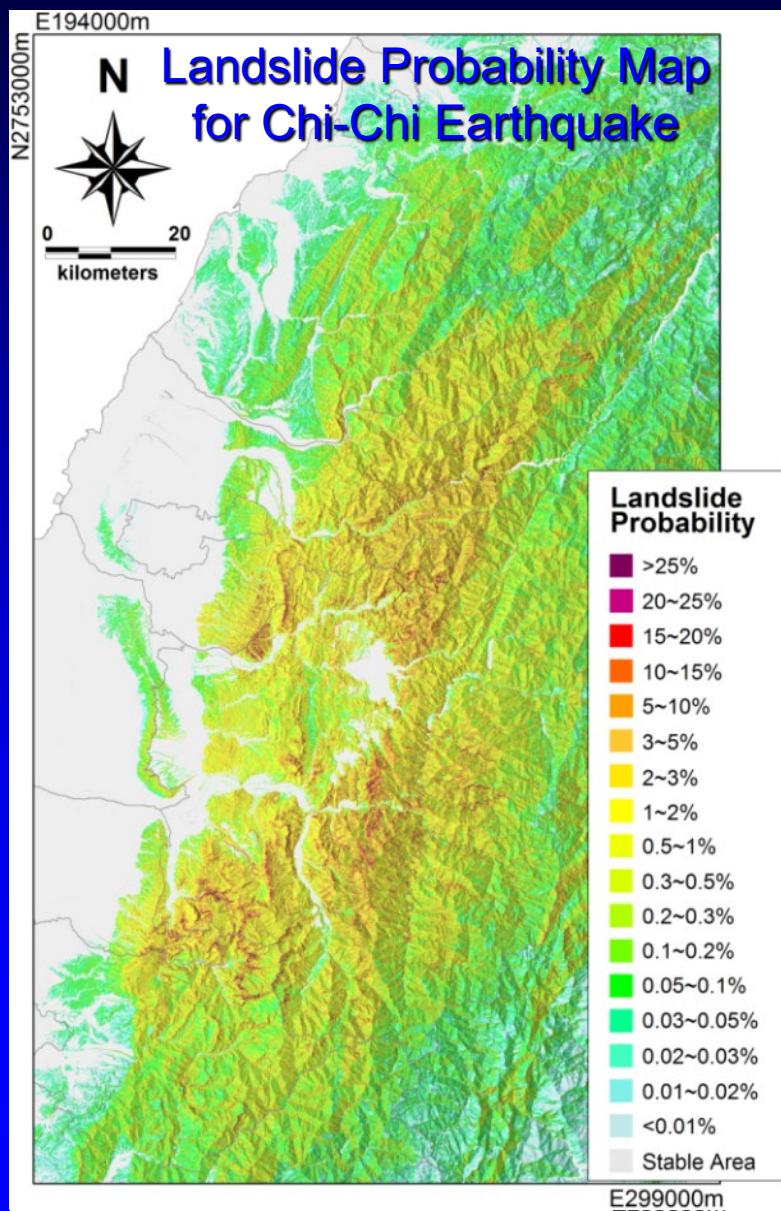
where I_a is the Arias intensity; I_a' is the corrected one; f is the amplification factor; and h is the height relative to riverbed in meters.



Corrected Arias Intensity



The Landslide Prediction Model



$$y = 43.928\lambda(1 - e^{-11.956\lambda^{0.994}})(1 - e^{-0.020x^{2.669}})$$

x : corrected Arias intensity,

y : probability of failure,

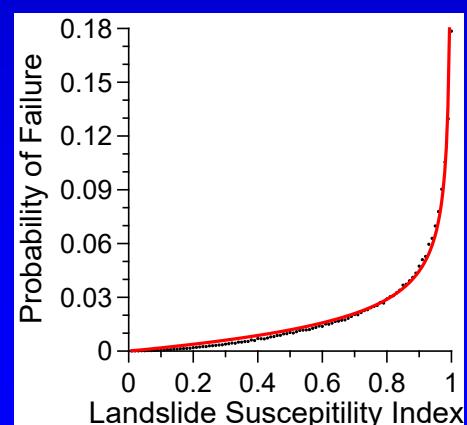
λ : event-independent susceptibility.



Early Estimate of triggered Landslides

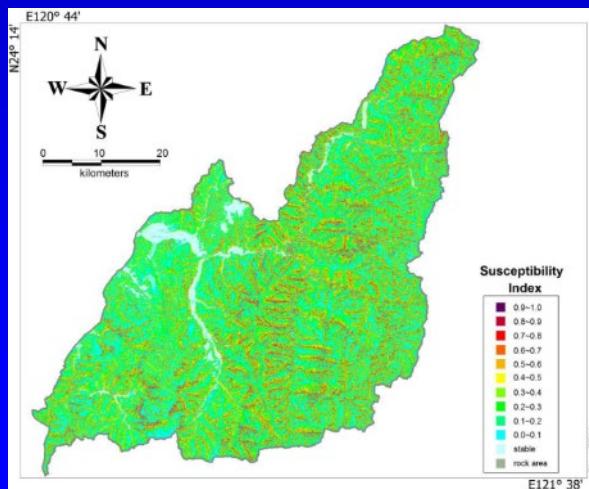
- The application requires a scenario earthquake or a return period earthquake, an **Arias intensity map**, and a **landslide susceptibility map** of the region. The output is a **probability of landslide failure map**.
- The probability of landslide failure at a study grid is a spatial probability of landslide occurring at the grid.

The probability of landslide failure is calculated at each susceptibility bin and each Arias intensity bin, and is the ratio of failure grids divided by total grid.

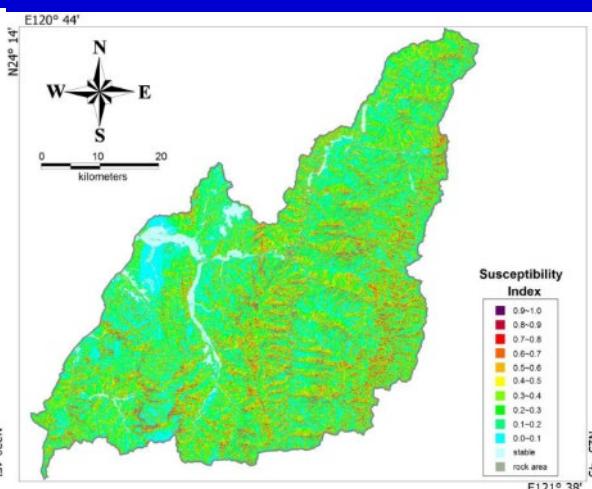


Early Estimate of triggered Landslides

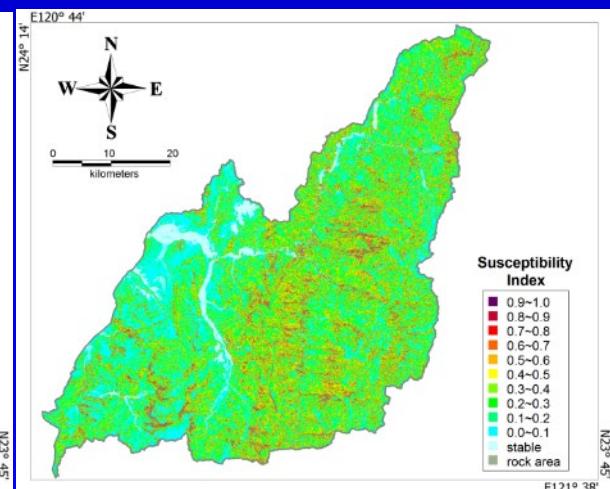
- The landslide susceptibility map could be built from a **multi-temporal landslide inventory** of the region with no restriction of earthquake triggered ones, or it is trained from an **event-based landslide inventory** of earthquake-induced or rain-induced (Lee, et al., 2008a,b).



2004 Typhoon Mindulle



Multi-temporal inventory



1999 Chi-Chi EQ



Early Estimate of triggered Landslides

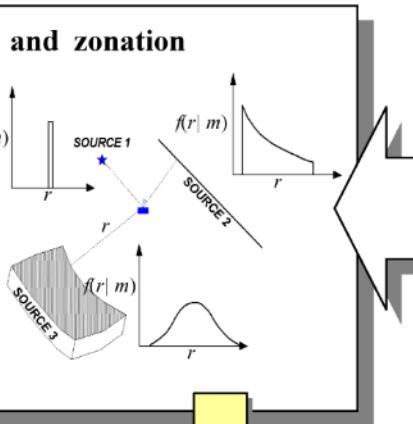
- The **Arias intensity map** could be estimated from a scenario earthquake or from a probabilistic seismic hazard analysis (**PSHA**).

The following slides introduce how to develop a return-period Arias intensity map from PSHA and then used in developing a return-period landslide probability map.

Seismic Hazard Analysis Procedure

Source model and zonation

- Active fault
- Area sources
- Subduction zone

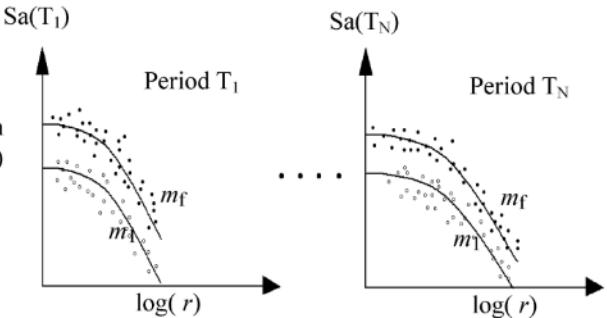


GIS Data base

- Strong motion data
- Bouguer anomaly
- Structure
- Active fault
- DEM
- Earthquake Catalog

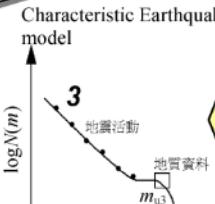
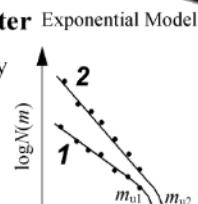
Strong ground motion attenuation

- Site classes
 - Crustal earthquakes & Subductionzone earthquakes
 - Response spectrum attenuation relationship for period ($T_1 \sim T_N$)
- Note : $Sa(T_i)$ is the acceleration response spectrum of period T_i . $m_1 \sim m_f$ is earthquake magnitude.



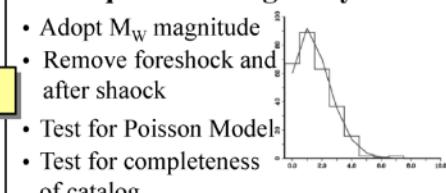
Source parameter

- Source geometry
- Fault slip-rate
- Earthquake Occurrence rate
- Max. Earthquake



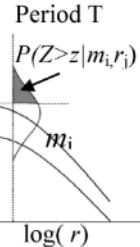
Earthquake catalog analysis

- Adopt M_W magnitude
- Remove foreshock and after shock
- Test for Poisson Model
- Test for completeness of catalog



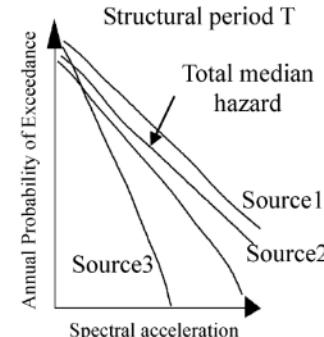
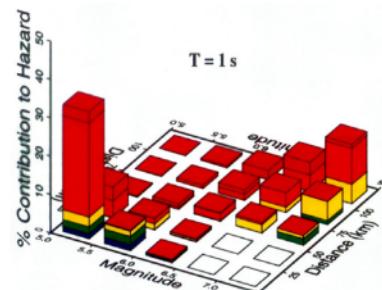
Ground motion exceed probability

Calculate the probability of ground motion $Sa(T)$ exceed z , using reponse spectrum attenuation relationship at period T , magnitude m_i and distance r_j



Deaggregation

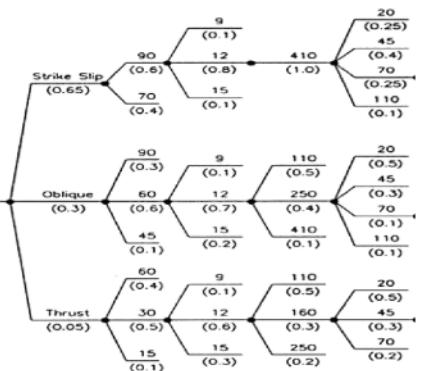
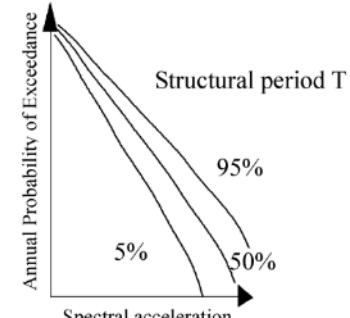
- Examine the contribution of every source to hazard



Use logic tree method to handle the uncertainty of parameters and models

Uncertainty range of hazard for 5%~95%

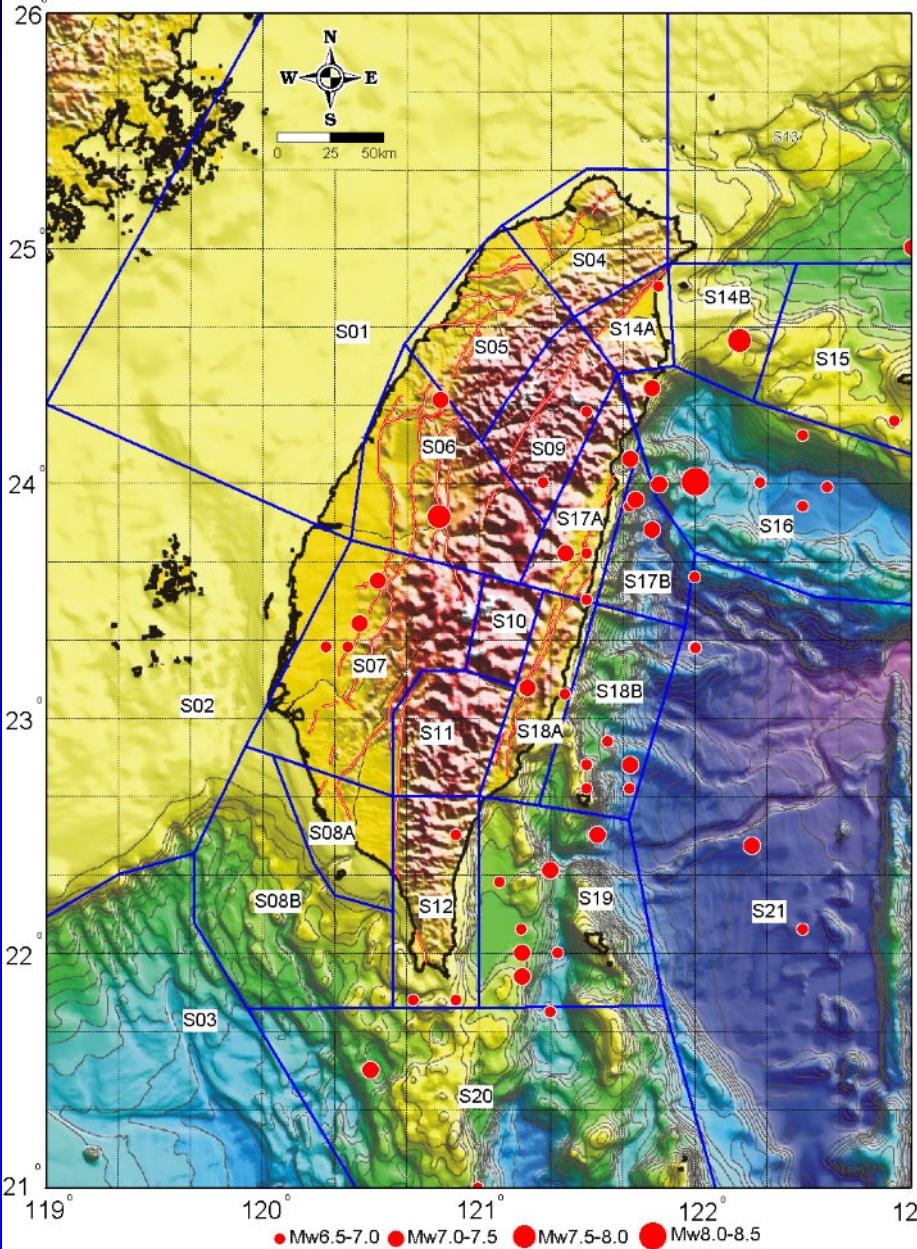
Structure of logic tree



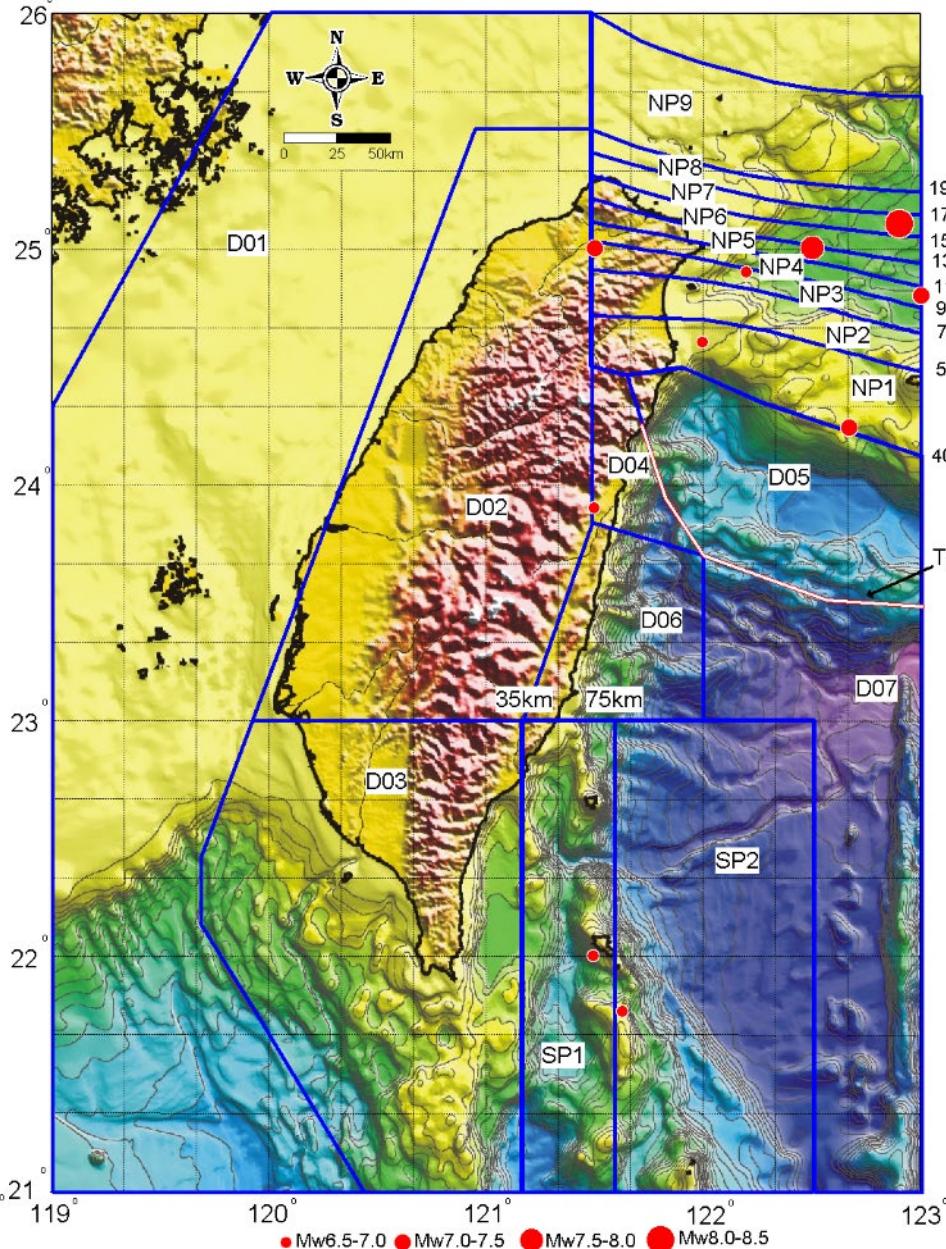


Source Model

Regional Source (Depth \leq 35km)



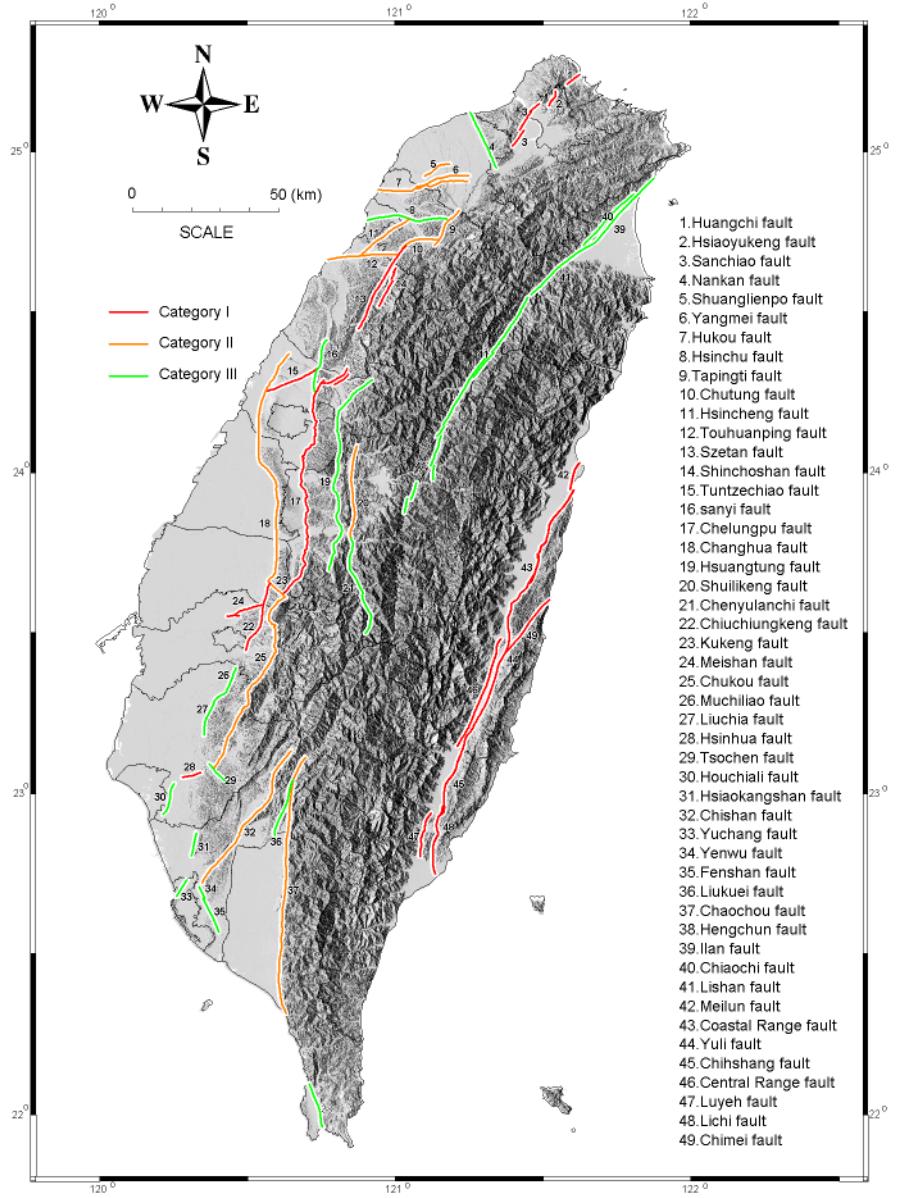
Regional Source (Depth>35km)





Source Model

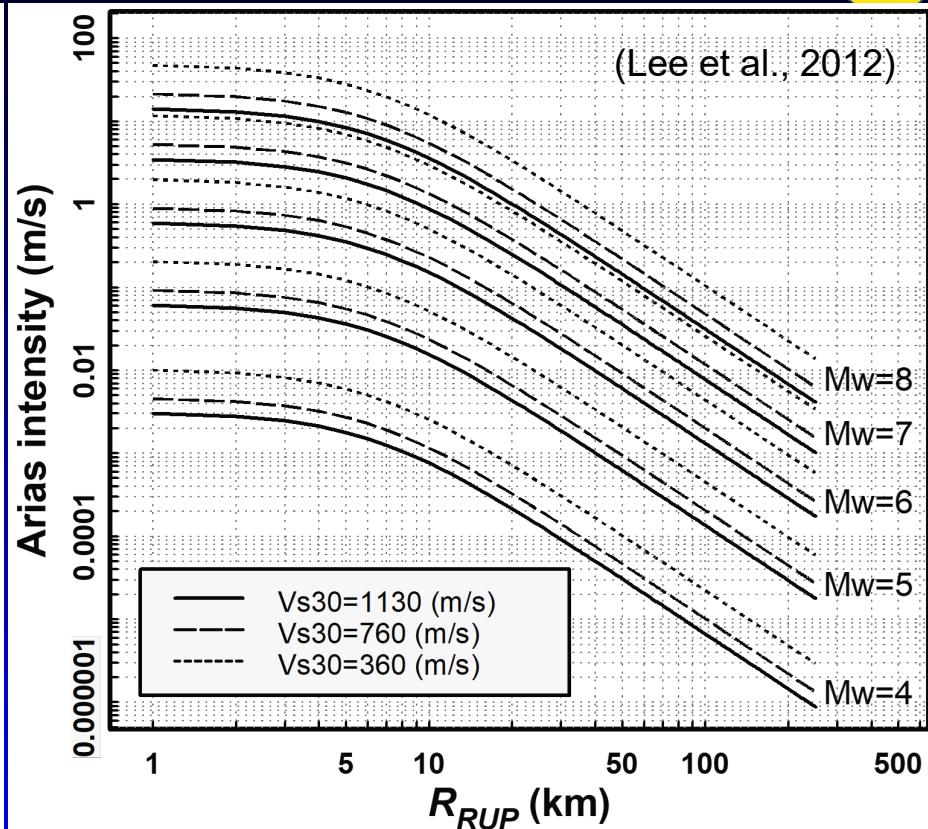
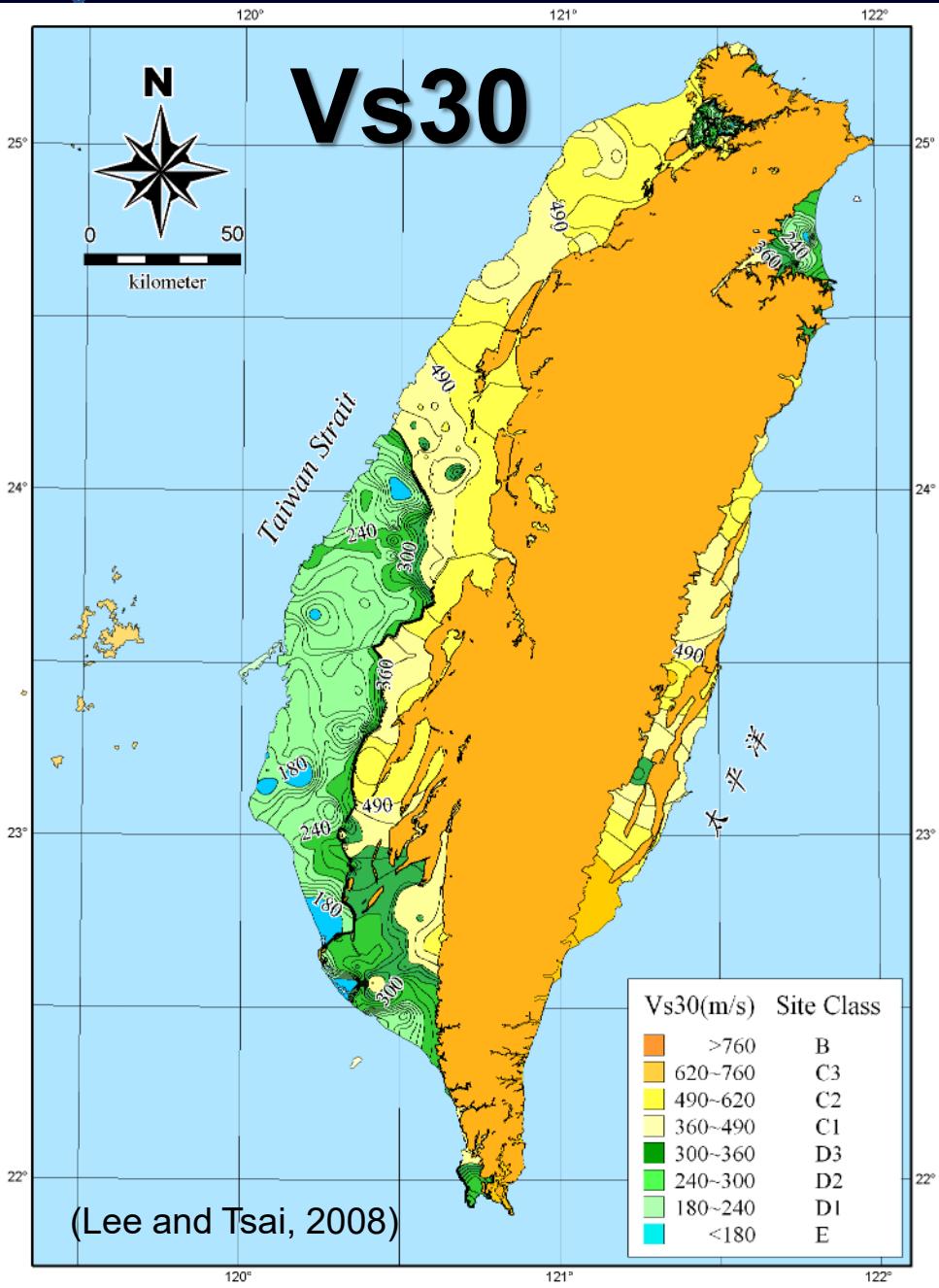
Active faults in Taiwan



Assessment of Fault Parameters

Fault No.	Fault Name	Strike	Dip (degree)	Depth (km)	Button	Top	Length (km)	Friction coefficient	Displacement (m)	Maximum dip angle (rad)	Slip rate (mm/yr) (weighting)	Maximum earthquake magnitude Mu (weighting)	Recurrence interval (year)
01+02+03	Huangchi+Hsiaoyukeng+Sanchiao	NNW	60SE	Normal & Sinistral	36	0	15	17	1.8	624	1.0(0.2) 2.0(0.6) 3.0(0.2)	6.8(0.2) 7.0(0.6) 7.2(0.2)	543 746 568
04	Nankan	NNW	Normal& Dextral	22	0	10	10	0.7	223	0.2(0.2) 0.4(0.6) 0.6(0.2)	6.3(0.2) 6.5(0.6) 6.7(0.2)	1352 1896 1492	
05	Shuanglienco	ENE	50SE	Reverse	12	2	10	10	0.4	125	0.2(0.2) 0.5(0.6) 0.8(0.2)	6.0(0.2) 6.2(0.6) 6.4(0.2)	567 1036 831
06	Yangmei	ENE	50NW	Reverse	20	2	10	10	0.8	261	0.2(0.2) 0.5(0.6) 0.8(0.2)	6.4(0.2) 6.6(0.6) 6.8(0.2)	1082 1704 1334
07	Hukou	ENE	45SE	Thrust	32	0	12	17	1.5	543	0.5(0.2) 1.0(0.6) 1.5(0.2)	6.7(0.2) 6.9(0.6) 7.1(0.2)	733 1362 1041
08	Hsinchu	E-W	45S	Thrust	28	0	12	17	1.4	475	0.8(0.2) 1.5(0.6) 2.3(0.2)	6.6(0.2) 6.8(0.6) 7.1(0.2)	395 832 639
09	Tapingti	NNE	45SE	Thrust	15	0	12	17	0.8	255	0.3(0.2) 0.6(0.6) 0.9(0.2)	6.3(0.2) 6.5(0.6) 6.8(0.2)	653 1378 1090
10	Chutung	NE	50SE	Reverse	14	0	12	16	0.7	219	0.3(0.2) 0.6(0.6) 0.9(0.2)	6.3(0.2) 6.5(0.6) 6.7(0.2)	760 1249 983
11	Hsincheng	N40E	45SE	Thrust	22	0	12	17	1.1	373	1.0(0.2) 2.0(0.6) 3.0(0.2)	6.5(0.2) 6.7(0.6) 7.0(0.2)	267 532 412
12	Touhuaping	E-W	80S	Dextral	27	0	12	12	1.0	329	1.3(0.2) 2.5(0.6) 3.8(0.2)	6.5(0.2) 6.7(0.6) 8.0(0.2)	242 392 304
13	Szeten	N10E	75W	Reverse	35	0	12	12	1.3	435	1.3(0.2) 2.5(0.6) 3.8(0.2)	6.6(0.2) 6.8(0.6) 7.0(0.2)	259 471 362
14	Shinchoshan	N10E	60E	Reverse	16	0	12	14	0.7	222	1.3(0.2) 2.5(0.6) 3.8(0.2)	6.3(0.2) 6.5(0.6) 6.7(0.2)	180 302 238
14BT	Miaoli blind thrust	N10E	30E	Reverse & Dextral	37	2	15	26	2.6	962	2.5(0.2) 5.0(0.6) 7.5(0.2)	7.0(0.2) 7.2(0.6) 7.4(0.2)	223 397 298
15	Tuntzechiao	N60E	90	Dextral	20	0	15	15	0.9	301	1.3(0.2) 2.5(0.6) 3.8(0.2)	6.4(0.2) 6.8(0.6) 8.0(0.2)	226 368 287
16	Sanyi	NNE	40E	Thrust	22	0	15	23	1.5	513	0.5(0.2) 1.0(0.6) 1.5(0.2)	6.7(0.2) 6.9(0.6) 7.1(0.2)	940 1313 1005
17	Chelungpu	N-S	40E	Thrust	90	0	20	31	6.8	2800	0.0(0.2) 15(0.6) 23(0.2)	7.5(0.2) 7.7(0.6) 7.9(0.2)	182 268 194
18	Changhua	NNN	30E	Thrust	85	2	15	28	5.4	2354	0.8(0.2) 2.0(0.6) 23(0.2)	7.4(0.2) 7.6(0.6) 7.8(0.2)	153 226 165
19	Tamoupu-Hsuanlung	N-S	45E	Thrust	70	0	15	21	3.8	1485	0.4(0.2) 0.8(0.6) 1.2(0.2)	7.2(0.2) 7.4(0.6) 7.6(0.2)	2282 3306 2444
20	Shuilkeng	N-S	50E	Thrust	32	0	15	20	1.8	627	0.3(0.2) 0.6(0.6) 0.9(0.2)	6.8(0.2) 7.0(0.6) 7.2(0.2)	1810 2495 1896
21	Chenylanchi	N-S	50E	Thrust	36	0	15	20	2.0	705	0.4(0.2) 0.8(0.6) 1.2(0.2)	6.8(0.2) 7.0(0.6) 7.3(0.2)	1207 2023 1533
22	Chiuchingkeng	NNE	35E	Thrust	24	0	15	26	1.8	628	0.4(0.2) 10(0.6) 15(0.2)	6.8(0.2) 7.0(0.6) 7.2(0.2)	109 150 114
23	Kukeng	NW	90	Sinistral	10	0	15	15	0.5	161	1.5(0.2) 23(0.6) 4.8(0.2)	6.1(0.2) 6.3(0.6) 6.8(0.2)	136 204 162
24	Meishan	N75E	90	Dextral	14	0	15	15	0.7	219	3.0(0.2) 6(0.6) 9(0.2)	6.3(0.2) 6.5(0.6) 6.7(0.2)	94 124 98
24BT	Chayi blind thrust	N10E	30E	Thrust	36	2	15	26	2.5	936	6.0(0.2) 12(0.6) 18(0.2)	7.0(0.2) 7.2(0.6) 7.4(0.2)	122 163 122
25	Chukou	NE	40E	Thrust	70	0	15	25	4.5	1745	5(0.2) 10(0.6) 15(0.2)	7.3(0.2) 7.5(0.6) 7.7(0.2)	221 298 219
26+27	Muchilliao+Liuchia	NNE	35SE	Thrust	30	0	15	26	2.2	795	4.0(0.2) 8(0.6) 12(0.2)	6.8(0.2) 7(0.6) 7(0.2)	155 217 164
28	Tsochen	NW	90	Sinistral	12	0	15	15	0.6	188	1.3(0.2) 2.5(0.6) 3.8(0.2)	6.2(0.2) 6(0.6) 6.6(0.2)	192 263 209
29	Hsinhua	N70E	90	Dextral	12	0	15	15	0.6	180	2.5(0.2) 5(0.6) 7.5(0.2)	6.2(0.2) 6(0.6) 6(0.2)	96 132 104
30	Houchiali	NNE	60W	Thrust	12	0	15	17	0.7	208	2.5(0.2) 5(0.6) 7.5(0.2)	6.2(0.2) 6(0.6) 6(0.2)	83 145 114
30BT	Tainan blind thrust	N10E	30E	Thrust	38	2	15	26	2.5	938	5(0.2) 10(0.6) 15(0.2)	7.0(0.2) 7.2(0.6) 7.4(0.2)	146 195 146
31	Hliaokangshan	NNE	50SE	Reverse	12	0	15	20	0.7	235	0.8(0.2) 21(0.6) 2.3(0.2)	6.3(0.2) 6(0.6) 6.7(0.2)	347 523 411
32	Chishan	NE	45E	Thrust	60	0	15	21	3.3	1273	1.5(0.2) 3(0.6) 4.5(0.2)	7.1(0.2) 7(0.6) 7(0.2)	507 796 592
33	Yuelikangshan	N70E	80S	Reverse & Sinistral	12	0	10	12	0.5	139	0.5(0.2) 1.0(0.6) 1.5(0.2)	6.0(0.2) 6(0.6) 6(0.2)	312 554 443
33+35	Yenwu+Fenshan	NW	50E	Reverse	21	0	12	16	0.6	195	0.5(0.2) 1.0(0.6) 1.5(0.2)	6.2(0.2) 6(0.6) 6.6(0.2)	437 694 548
36	Liukuei	NE	50E	Reverse	20	0	15	20	1.2	392	0.2(0.2) 0.5(0.6) 0.8(0.2)	6.5(0.2) 6(0.6) 7(0.2)	1229 2196 1697
37a	Chaochou(north)	N-S	50E	Reverse	55	0	20	26	3.7	1436	2.0(0.2) 4(0.6) 6(0.2)	7.2(0.2) 7(0.6) 7(0.2)	471 647 479
37b	Chaochou(south)	N-S	50E	Reverse	40	0	20	26	2.8	1044	1.5(0.2) 3(0.6) 4.5(0.2)	7.0(0.2) 7(0.6) 7(0.2)	433 669 523
38	Hengchun	NNW	50E	Reverse	40	0	20	26	2.8	1044	1.0(0.2) 2(0.6) 3(0.2)	7.0(0.2) 7(0.6) 7(0.2)	650 1048 784
39	Ilan	NE	60SE	Normal	30	0	15	17	1.5	524	0.8(0.2) 21(0.6) 2.3(0.2)	6.7(0.2) 6(0.6) 7(0.2)	623 882 675
40	Chiaochi	NE	60SE	Normal	25	0	15	17	1.3	433	1.0(0.2) 2(0.6) 3(0.2)	6.6(0.2) 6(0.6) 7(0.2)	397 597 452
41a	Lishan(a)	NNE	60E	Normal	30	0	15	17	1.5	520	0.8(0.2) 21(0.6) 2.3(0.2)	6.7(0.2) 6(0.6) 7(0.2)	623 882 675
41b	Lishan(b)	NNE	60E	Normal	25	0	15	17	1.3	433	0.6(0.2) 21(0.6) 1.8(0.2)	6.8(0.2) 6(0.6) 7(0.2)	666 978 753
41c	Lishan(c)	NNE	60E	Normal	30	0	15	17	1.5	520	0.5(0.2) 21(0.6) 1.5(0.2)	6.7(0.2) 6(0.6) 7(0.2)	940 1323 1013
41d	Lishan(d)	NNE	60E	Normal	30	0	15	17	1.5	520	0.5(0.2) 1.0(0.6) 1.5(0.2)	6.7(0.2) 6(0.6) 7(0.2)	940 1323 1013
42	Meilun	N30E	50E	Reverse & Sinistral	30	0	30	39	3.1	1175	10(0.2) 20(0.6) 30(0.2)	7.1(0.2) 7(0.6) 7.5(0.2)	83 113 84
43	Ueimei	N30E	50E	Reverse & Sinistral	45	0	30	39	4.5	1762	10(0.2) 20(0.6) 30(0.2)	7.3(0.2) 7(0.6) 7.7(0.2)	111 148 109
49	Chimei	N40E	50E	Reverse & Sinistral	25	0	30	39	2.6	979	2.0(0.2) 4(0.6) 6(0.2)	7.0(0.2) 7(0.6) 7(0.2)	354 502 377
44	Yuli	N30E	50E	Reverse & Sinistral	48	0	30	39	4.7	1880	8(0.2) 16(0.6) 24(0.2)	7.3(0.2) 7(0.6) 7.7(0.2)	130 193 142
45	Chihsiang	N25E	50E	Reverse & Sinistral	30	0	30	39	3.1	1175	10(0.2) 20(0.6) 30(0.2)	7.1(0.2) 7(0.6) 7.5(0.2)	83 113 84
46	Yuli west	NNE	50W	Reverse & Sinistral	40	0	25	33	3.4	1305	6(0.2) 10(0.6) 15(0.2)	7.1(0.2) 7(0.6) 7(0.2)	150 243 180
47	Luyeh	N-S	50E	Reverse	18	0	25	33	1.7	587	4(0.2) 8(0.6) 12(0.2)	6.7(0.2) 6(0.6) 7(0.2)	105 179 137
48	Lichi	N-S	50E	Reverse & Sinistral	24	0	25	33	2.2	783	8(0.2) 16(0.6) 24(0.2)	6.9(0.2) 7(0.6) 7.3(0.2)	78 108 82

Site and Attenuation Model



Crustal attenuation curves with different Vs30

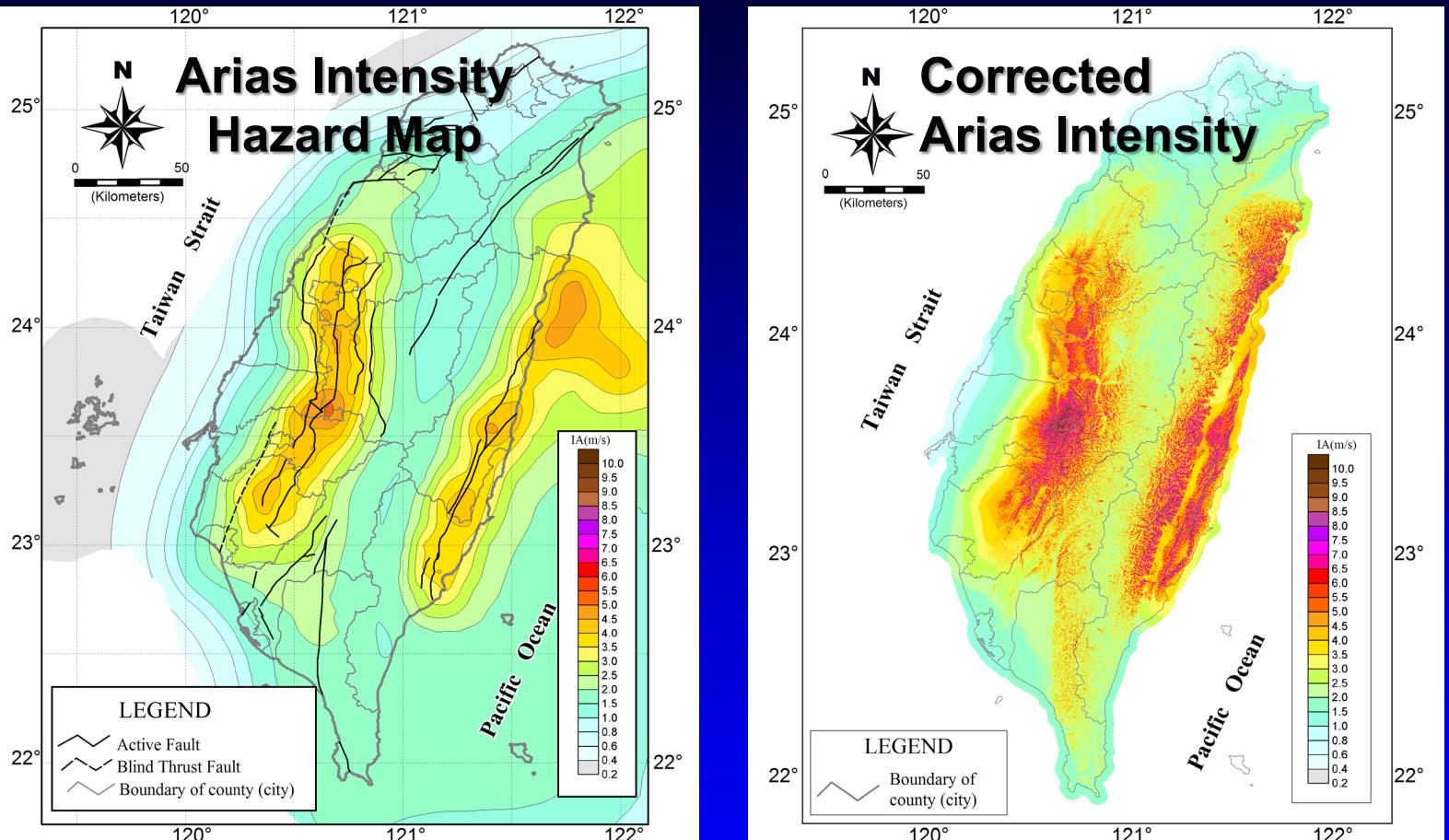
$$\ln I_a = 3.757 - 1.043(M - 6) + 18.077 \ln(M / 6) - 2.251 \ln(\sqrt{R^2 + 9.56^2}) \\ - 1.042 \ln(V_{s30}/1130) - 0.214 F_N + 0.22 F_R \quad \sigma = 0.994$$

$$\ln I_a = 4.358 + 3.056(M - 6) - 2.325 \ln(M / 6) - 2.38 \ln R \\ - 0.677 \ln(V_{s30}/1130) - 0.199 F_N + 0.24 F_R + 1.447 Z_t$$

F_N: normal faulting mechanism,
F_R: reverse faulting mechanism.



475-year Arias Intensity Map

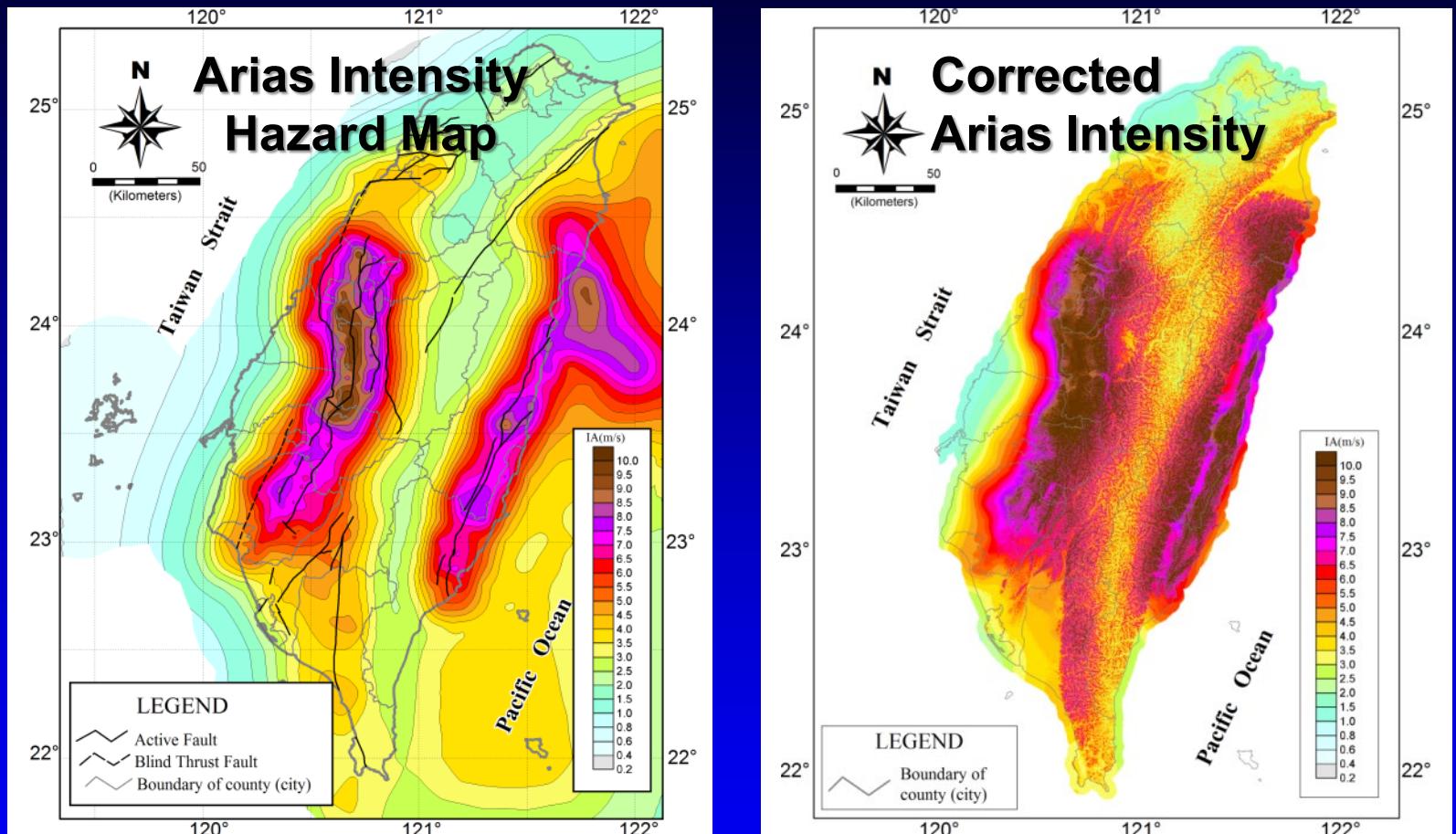


We used our seismic hazard model (Cheng et al., 2007) and a new Aerial intensity attenuation relationship (Lee et al., 2012) to perform a PSHA and got a 475-year Aerial intensity map for Taiwan (left). Then the Aerial intensity was topographically corrected by an empirical formula proposed by Lee et al. (2008). The corrected Aerial intensity (right) is then applied to the Chi-Chi seismic landslide hazard model, and then a 475-year seismic landslide hazard map for whole Taiwan is constructed .





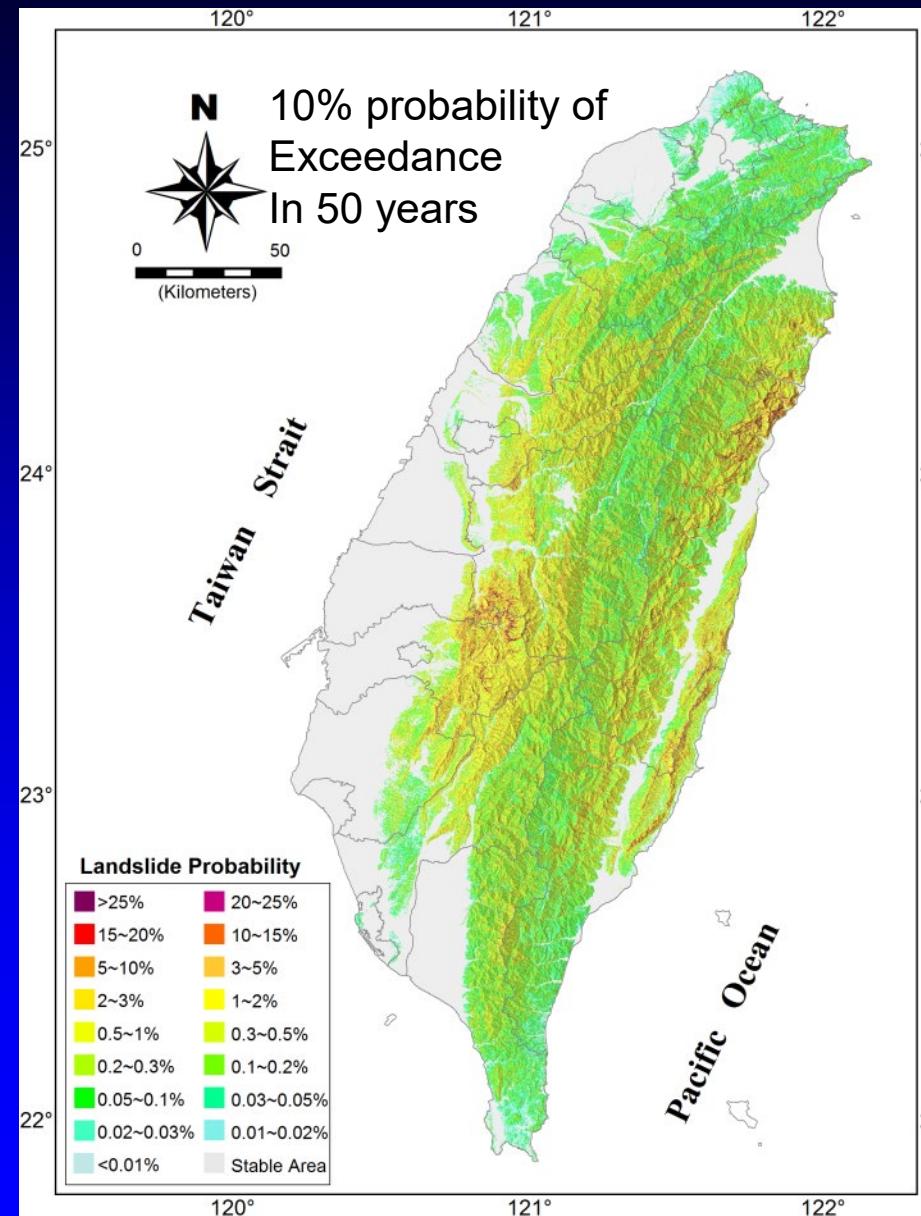
2475-year Arias Intensity Map



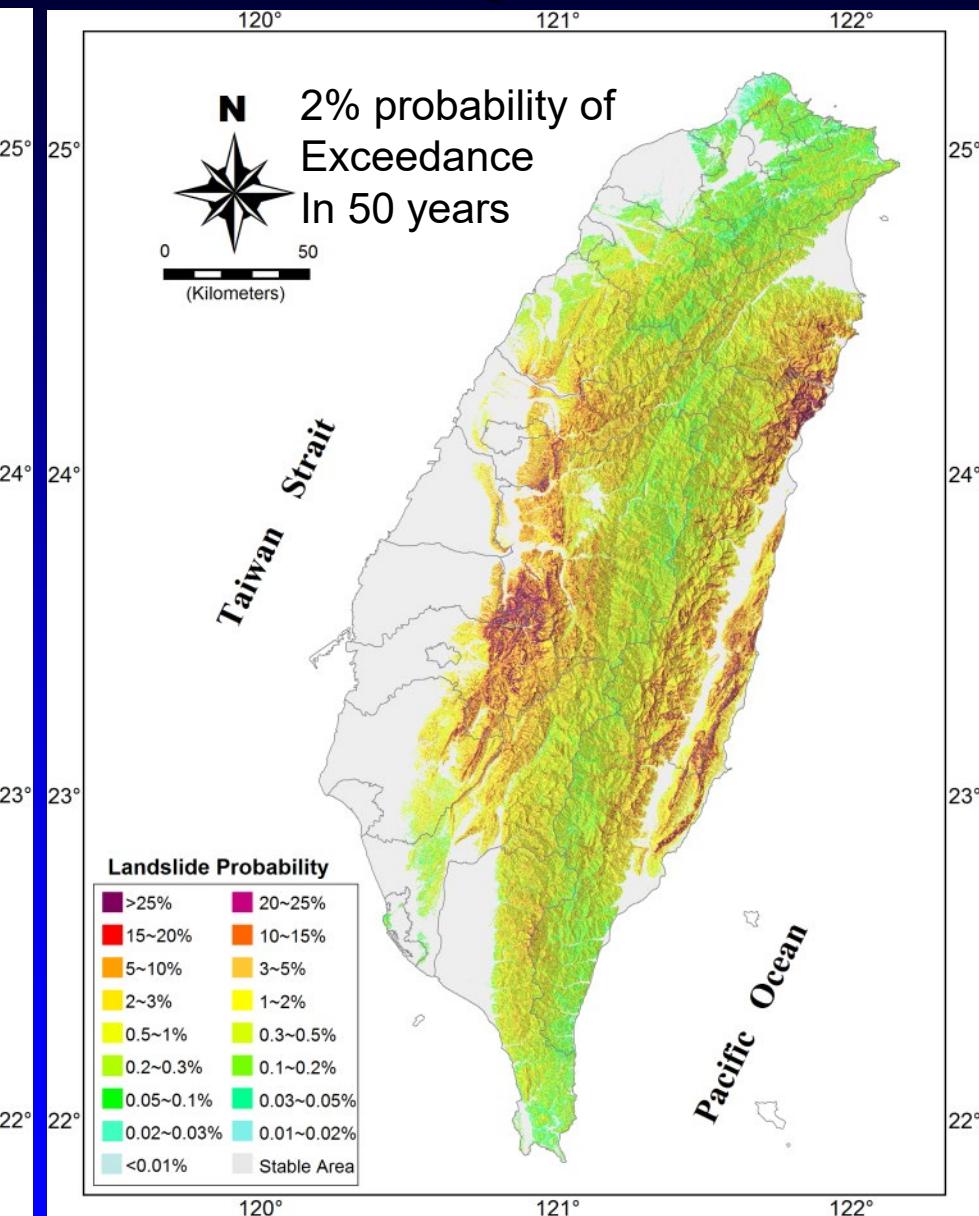
We used our seismic hazard model (Cheng et al., 2007) and a new Arial intensity attenuation relationship (Lee et al., 2012) to perform a PSHA and got a 2475-year Arial intensity map for Taiwan (left). Then the Arial intensity was topographically corrected by an empirical formula proposed by Lee et al. (2008). The corrected Arial intensity (right) is then applied to the Chi-Chi seismic landslide hazard model, and then a 2475-year seismic landslide hazard map for whole Taiwan is constructed .



Seismic Landslide Hazard Map of Taiwan



Landslide Probability Map for 475-year EQ



Landslide Probability Map for 2475-year EQ 15



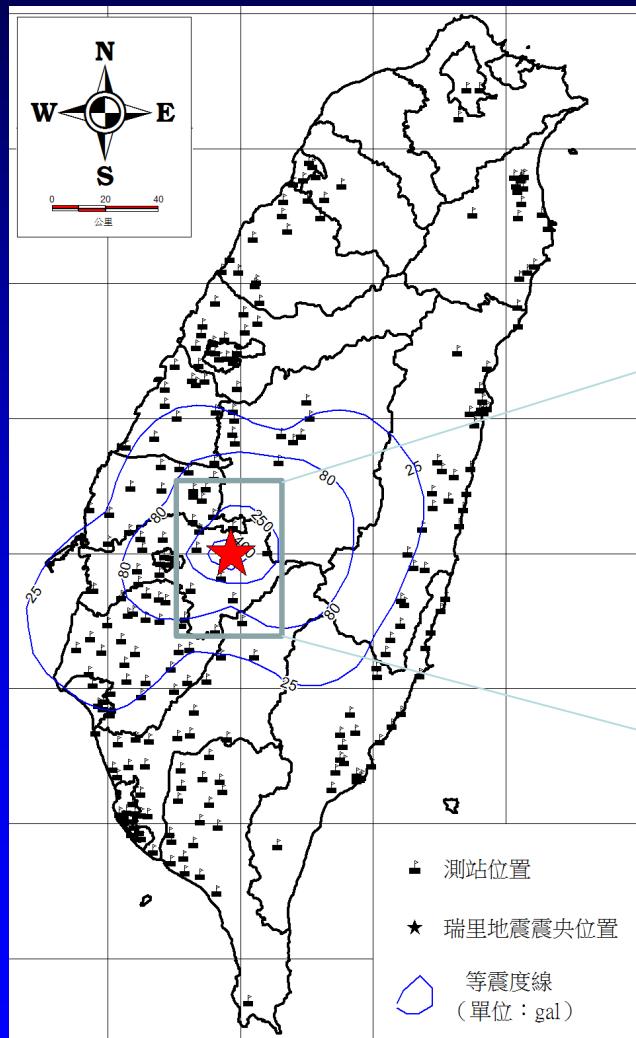
Early Estimate of triggered Landslides

- The **Arias intensity map** could be estimated from a **scenario earthquake** or from a probabilistic seismic hazard analysis (PSHA).

The following slides introduce how to develop an Arias intensity map for a **scenario earthquake** and then used in developing a return-period landslide probability map.



Arias Intensity Map of the 1998 M6.2 Jueli Earthquake



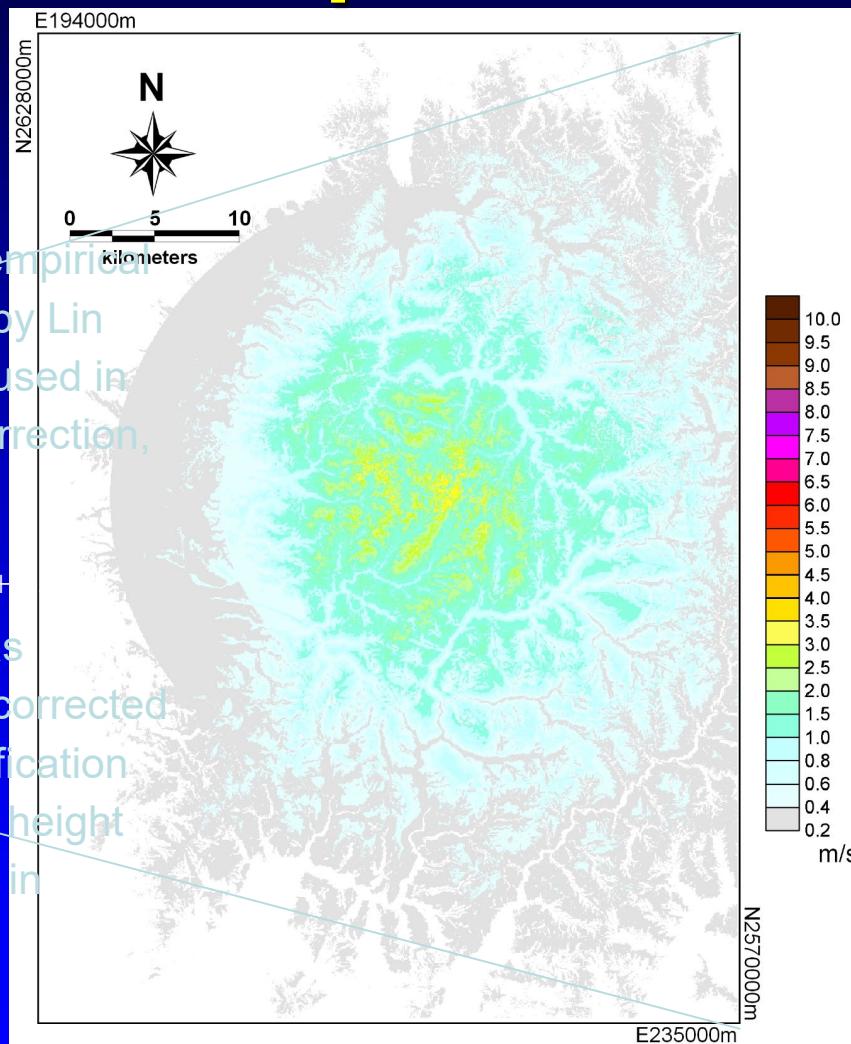
Location map

The following the empirical formula proposed by Lin and Lee (2003) is used in the topographic correction,

$$I_a' = f I_a ,$$

$$f = \sqrt{h / 93.8 + 0.287} +$$

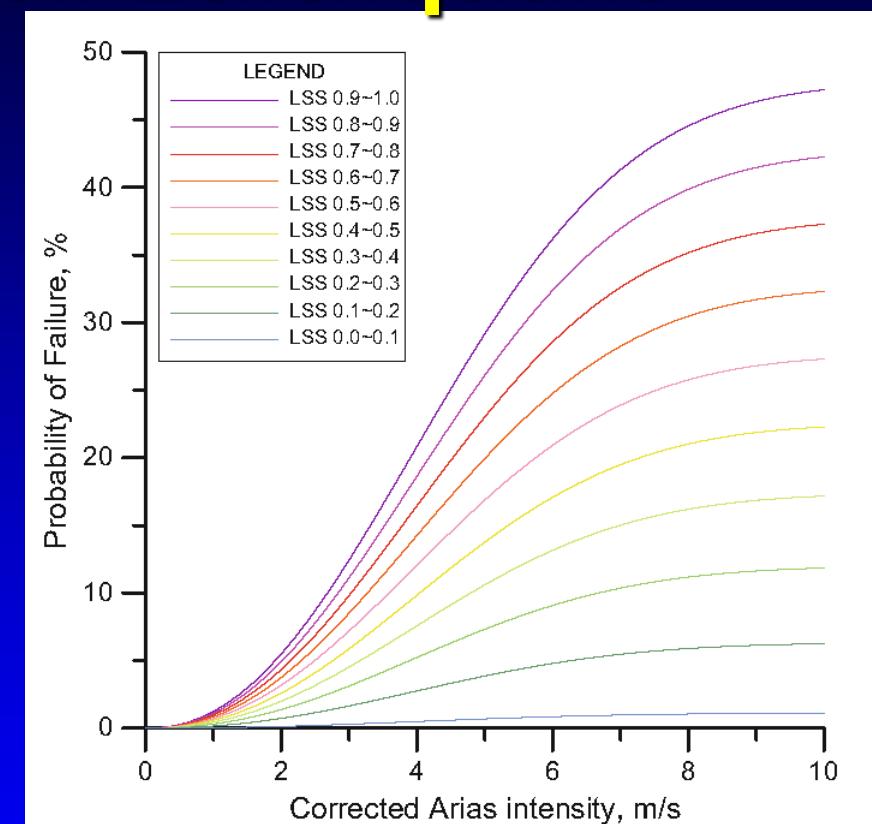
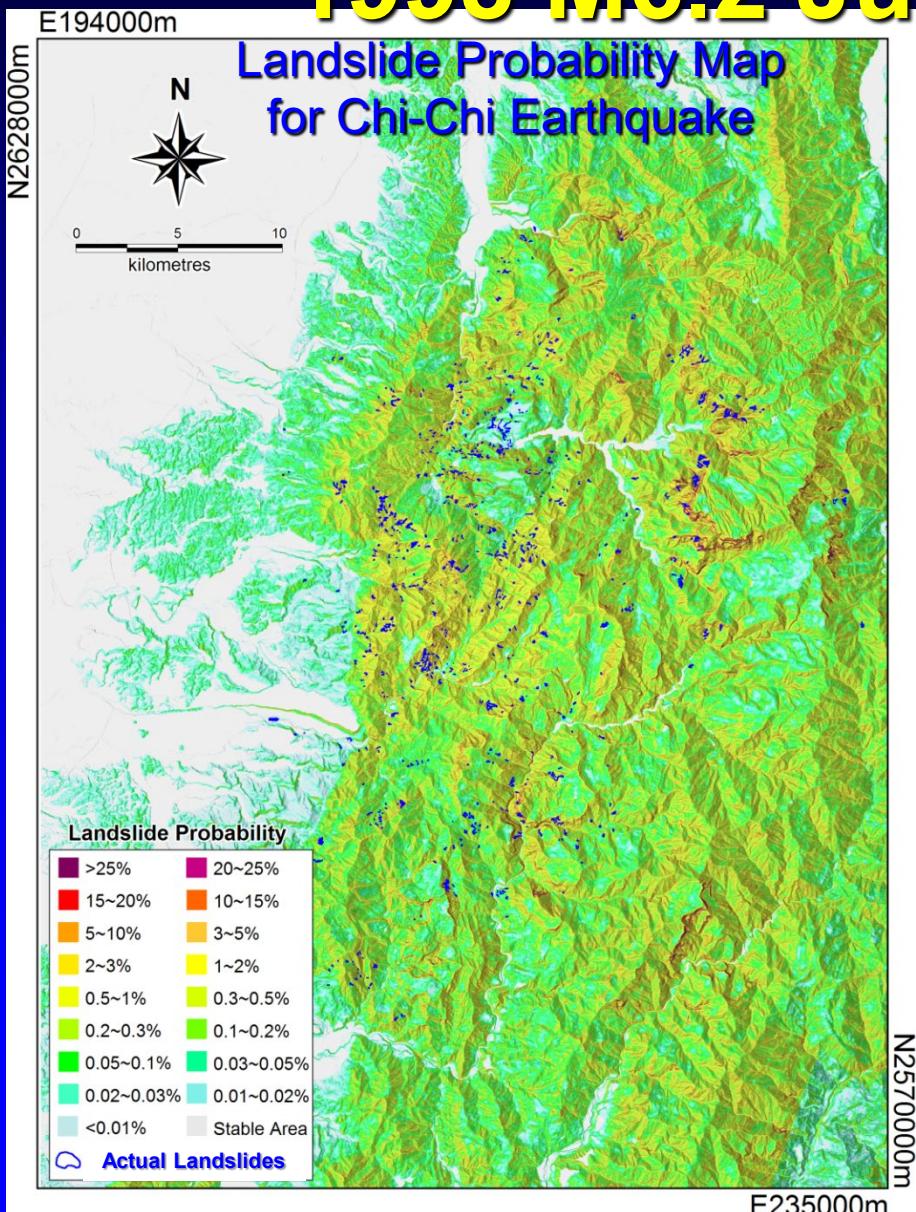
where I_a is the Arias intensity; I_a' is the corrected one; f is the amplification factor; and h is the height relative to riverbed in meters.



Corrected Arias Intensity



Landslide Prediction for the 1998 M6.2 Jueli Earthquake



$$y = 43.928\lambda(1 - e^{-11.956\lambda^{0.994}})(1 - e^{-0.020x^{2.669}})$$

x: corrected Arias intensity,

y: probability of failure,

λ : event-independent susceptibility.



SUMMARY and RECOMMENDATIONS

(1/4)

- An earthquake-induced **Landslide Prediction Model** for predicting shallow landslides has been developed. It has been trained by using EQ-induced landslide data, landslide susceptibility values, and topographically corrected Arias intensity of EQ.
- The model can directly applied to map probability of landslide failure of a region under certain return-period EQ-intensity.
- The model can directly applied to **Early Estimate of triggered Landslides** after a major earthquake by inputting EQ intensity data, which are estimated from a GMPE for Aerial intensity, providing earthquake location and magnitude are known. It would be better if fault rupture information is also known.



SUMMARY and RECOMMENDATIONS

(2/4)

- The present proposed hazard model is good for **prediction** of landslide spatial probability during an earthquake event,
mapping of the seismic landslide hazard probability for a certain return-period earthquake,
decision making for regional planning, site selection, hazard mitigation, and
estimation of sediment products for a drainage basin after an earthquake event.
- However, there is still lacking of output in regards to the **landslide magnitude** which is very important in risk assessment. This problem needs further study.

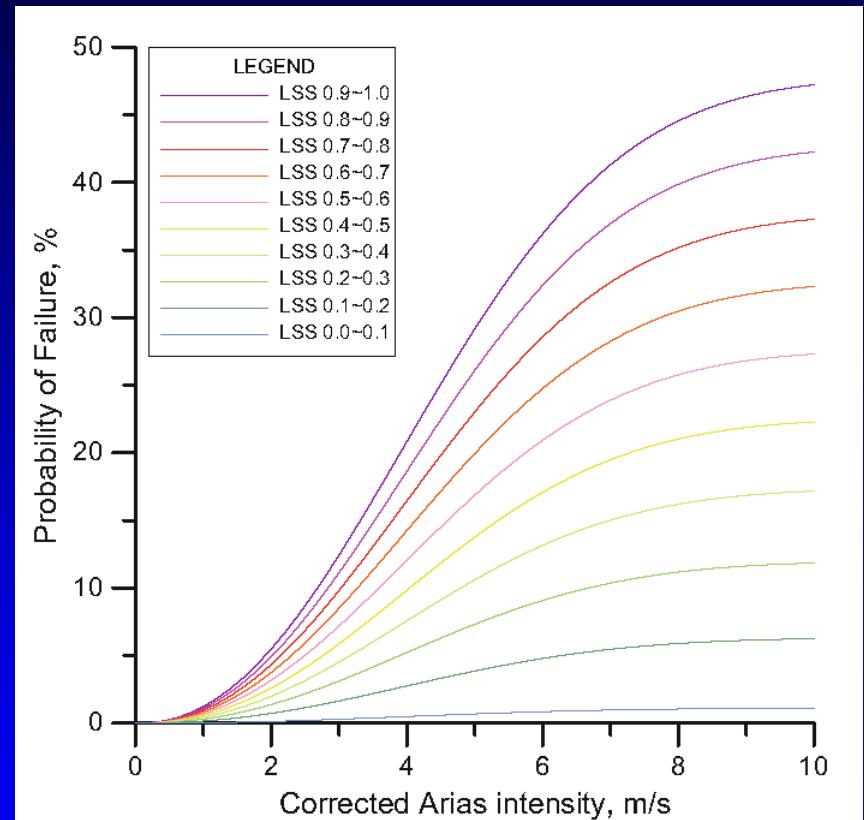
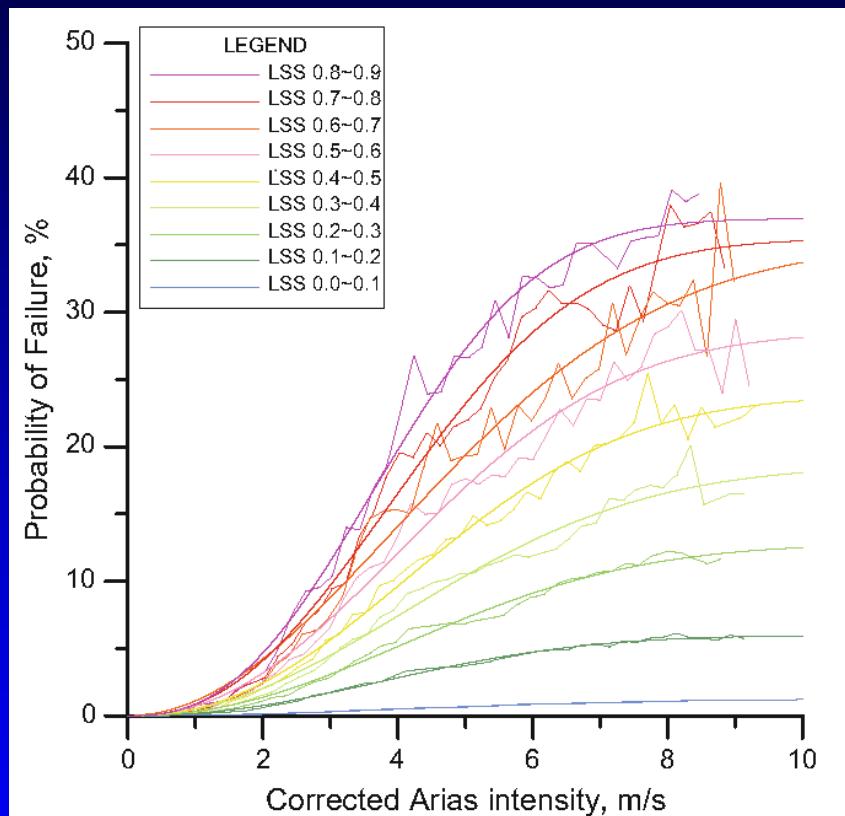


Thanks for your attention!

謝謝



Probability of Failure as a function of Corrected Arias Intensity and λ



A probability of failure curve is fitted with corrected Arias intensity at each susceptibility bin at the first step. Then, a probability of failure as a function of x and λ is developed.

$$y = 43.928\lambda(1 - e^{-11.956\lambda^{0.994}})(1 - e^{-0.020x^{2.669}})$$

x : corrected Arias intensity,

y : probability of failure,

λ : event-independent susceptibility.