



National Applied Research Laboratories

National Center for Research
on Earthquake Engineering

臺灣地區隨機式地動模擬技術之工 程應用開發

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Chun-Hsiang Kuo

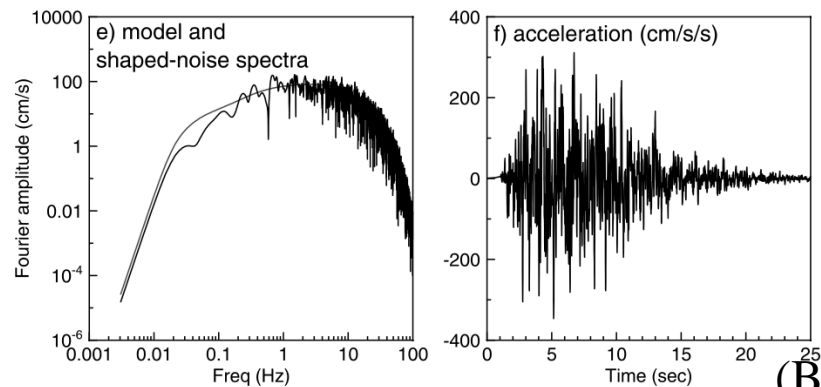
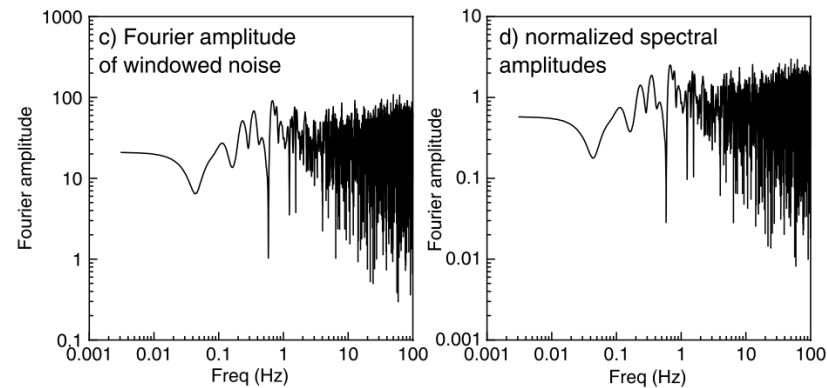
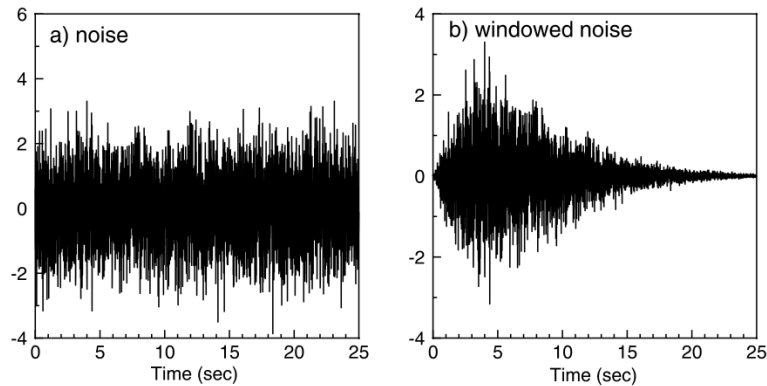
Che-Min Lin

2018.08.28

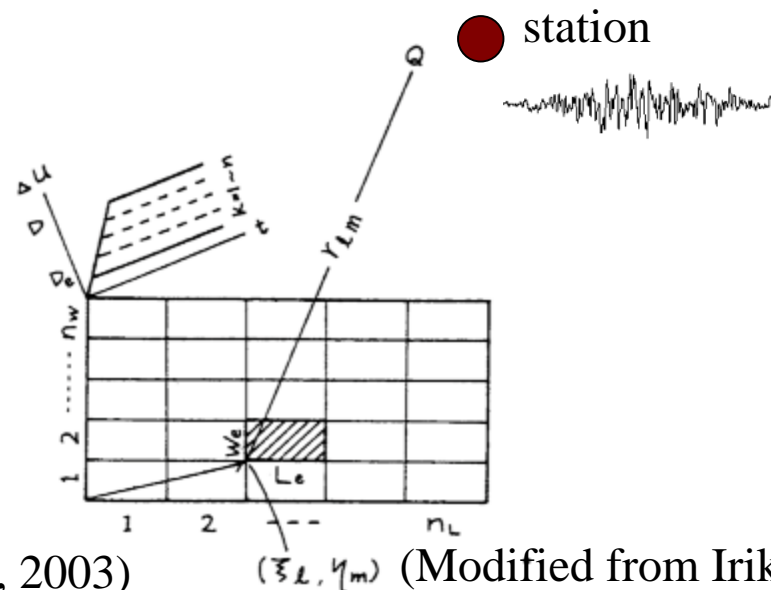
Outlines

- Introductions.
- Site Correction from ETF.
- Applications.

Introductions



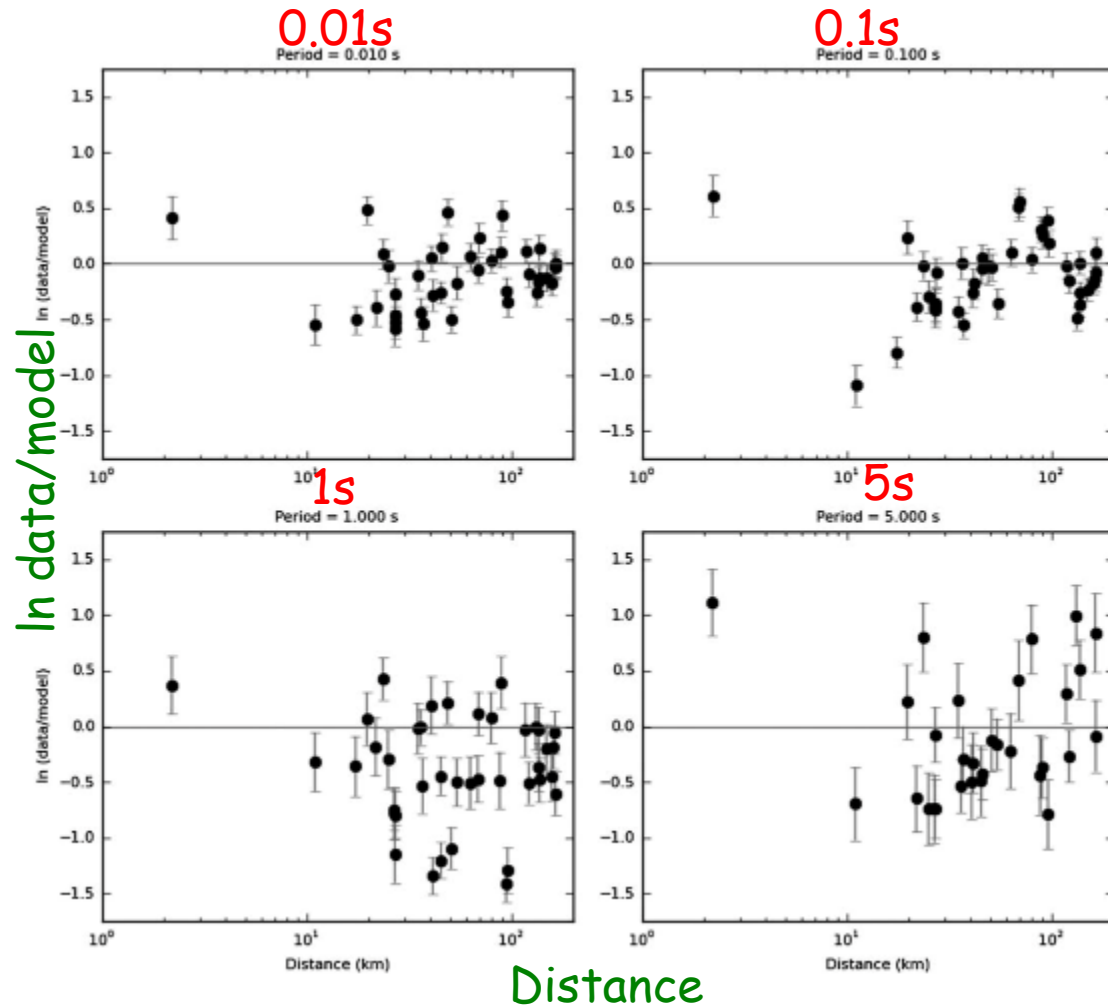
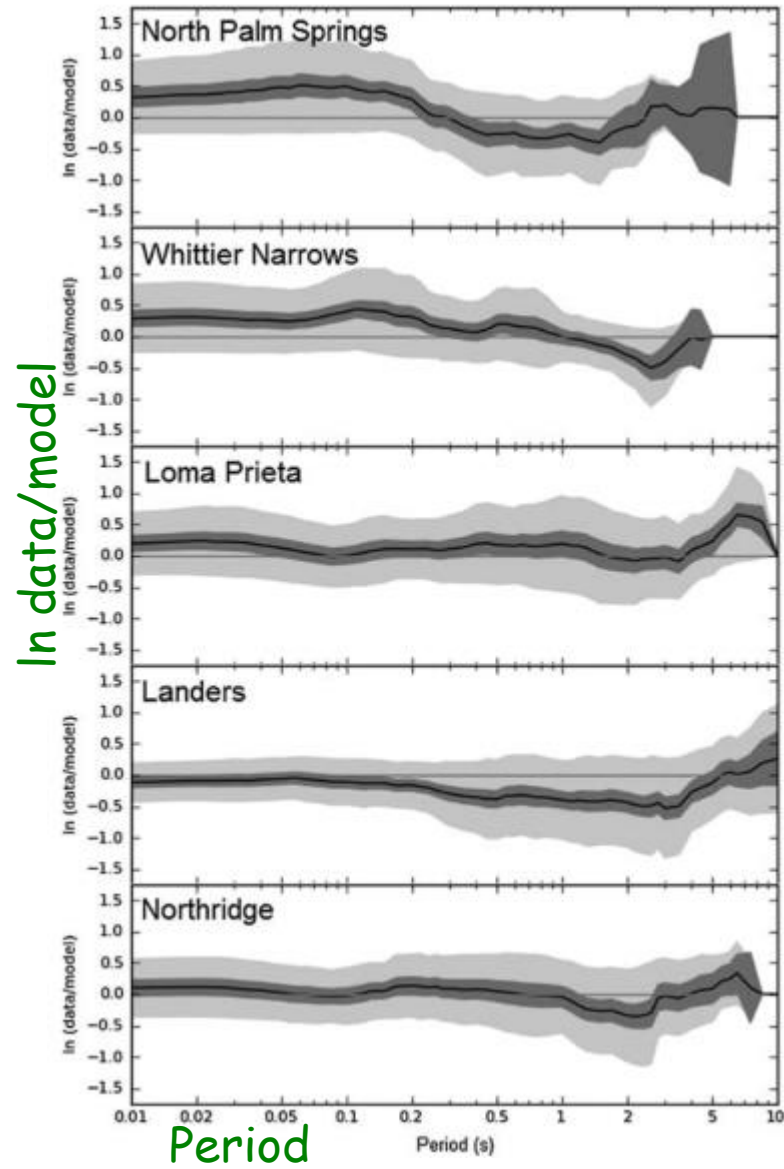
- **SMSIM** (Boore, 1983; Boore, 2003; Boore, 2009) : 點震源。
- **EXSIM** (Motazedian and Atkinson 2005; Assatourians and Atkinson 2007; Boore 2009): 有限斷層。



(Boore, 2003)

(Modified from Irikura, 1983)

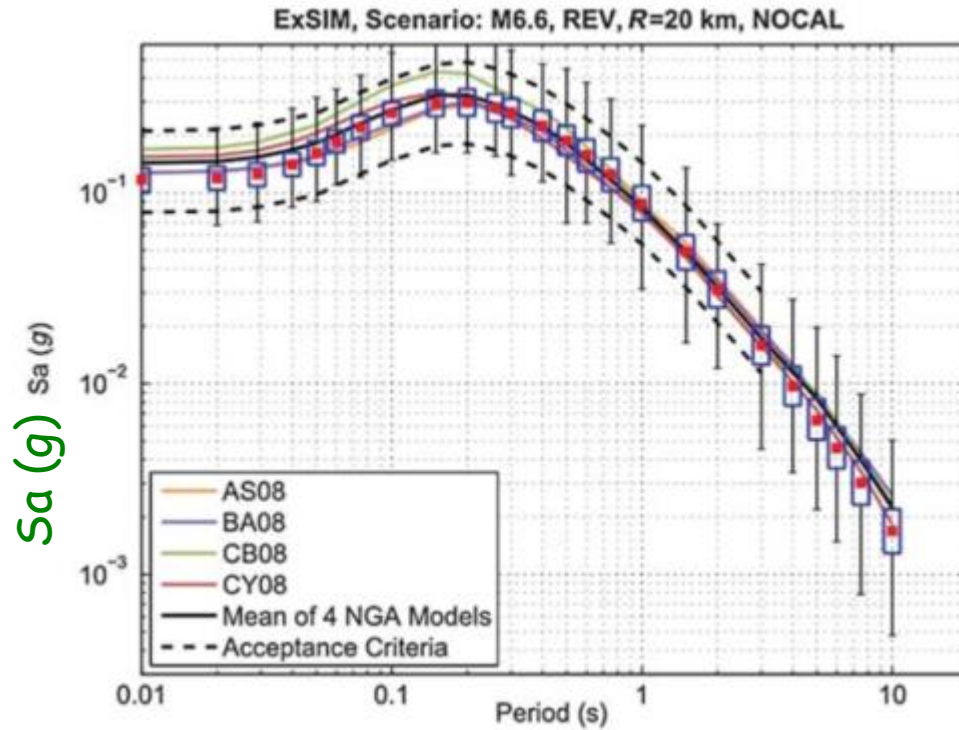
Introductions



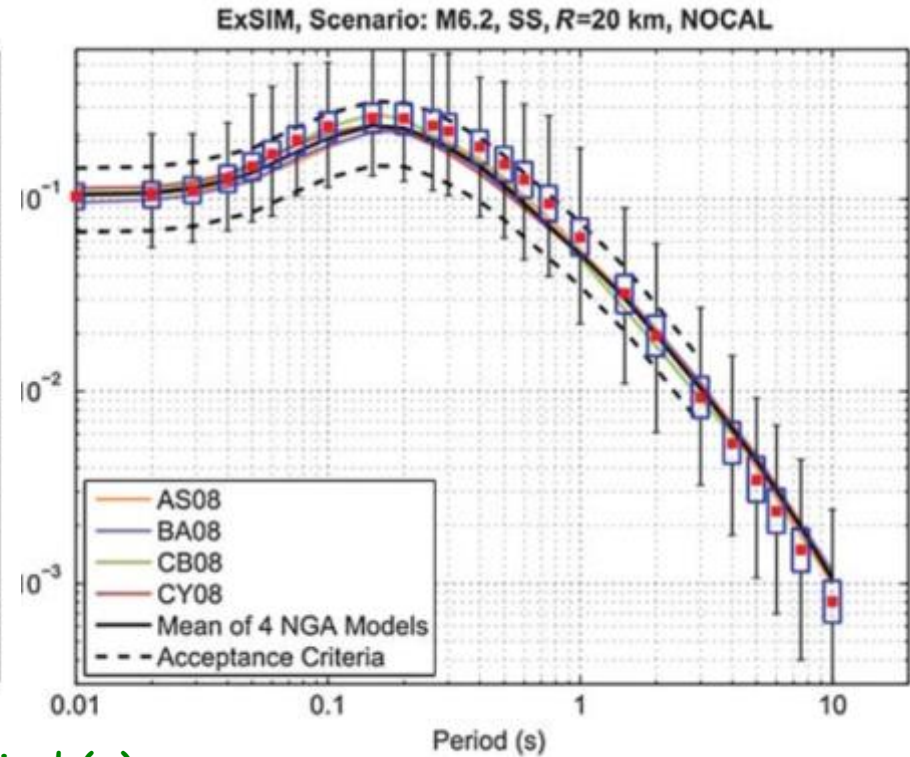
(Atkinson and Assatourians, 2015 for SCEC BBP)

Introductions

M6.6 R20km



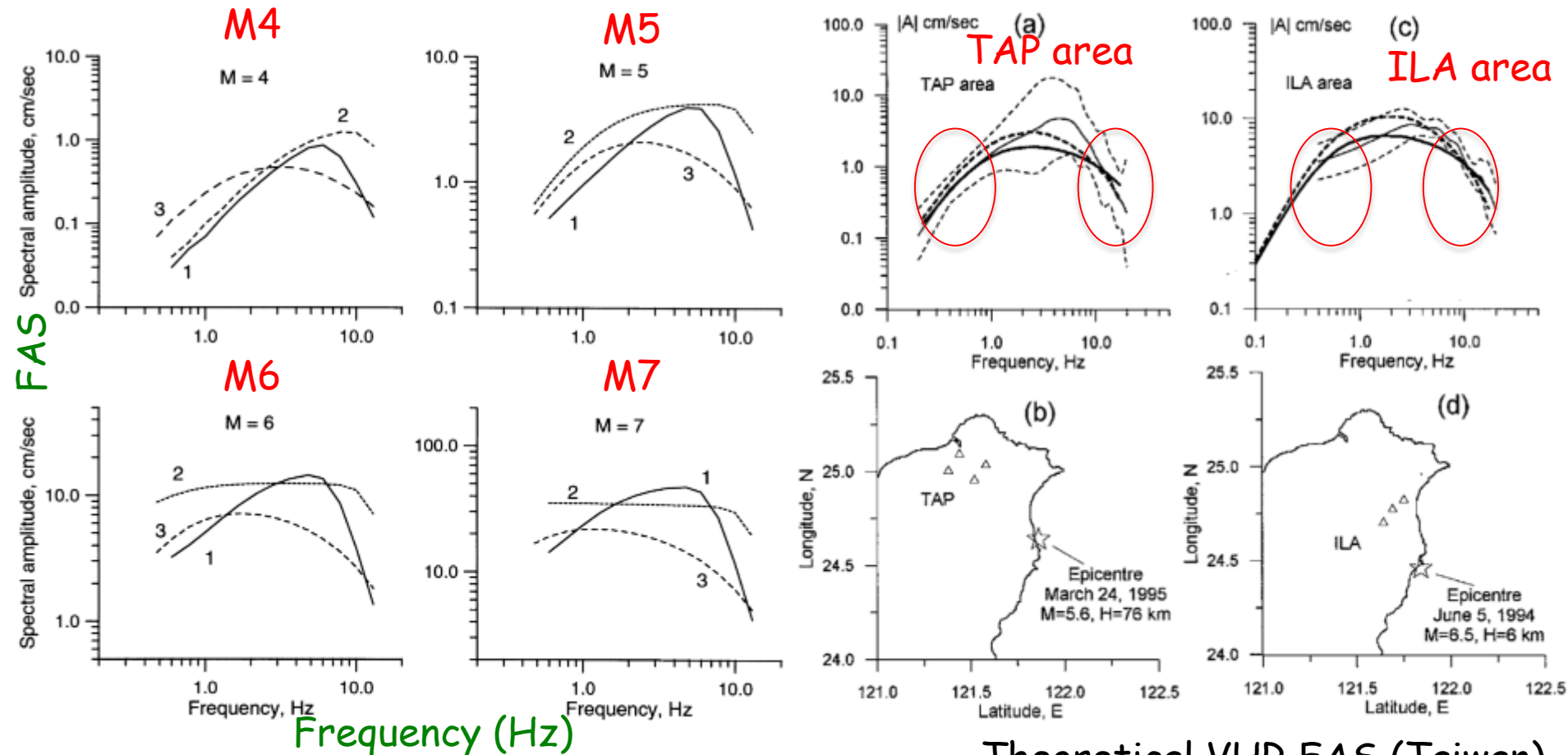
M6.2 R20km



Period (s)

(Atkinson and Assatourians, 2015 for SCAC BBP)

Introductions



Rock response of
1 Ratchi (高加索地區)
2 Spitak (亞美尼亞地區)
3 Taiwan

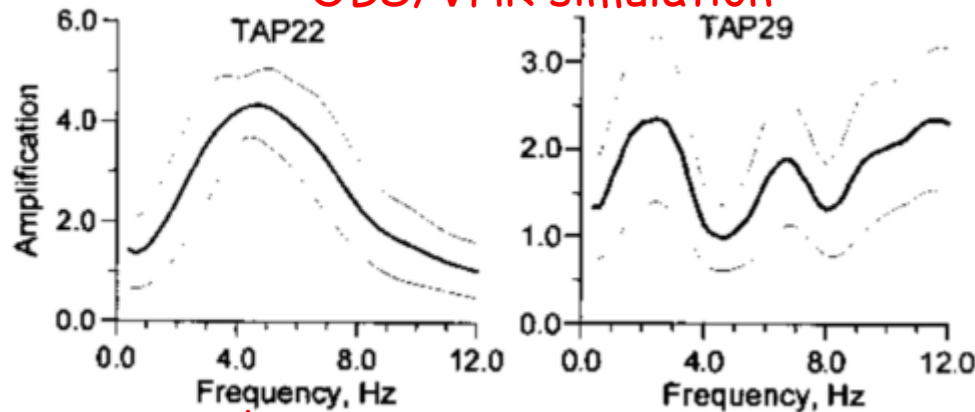
(Sokolov, 2000)

— Theoretical VHR FAS (Taiwan)
(ENA BJ97)
- - - Average observation FAS

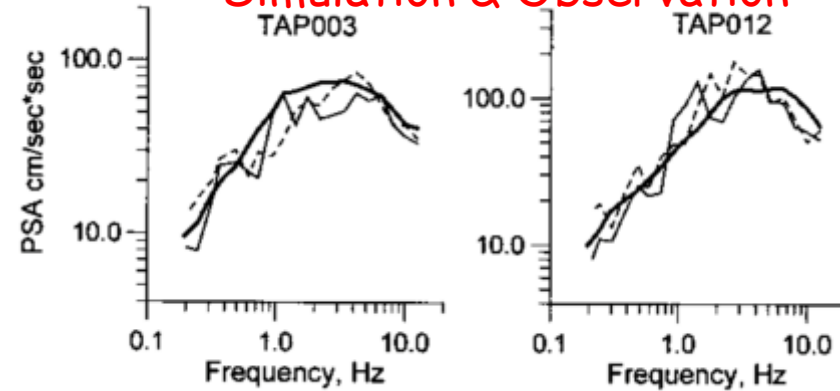
(Sokolov et al., 2000)

Introductions

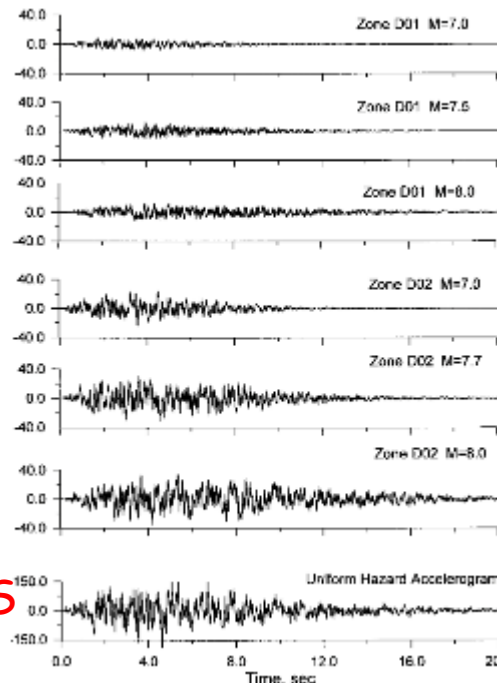
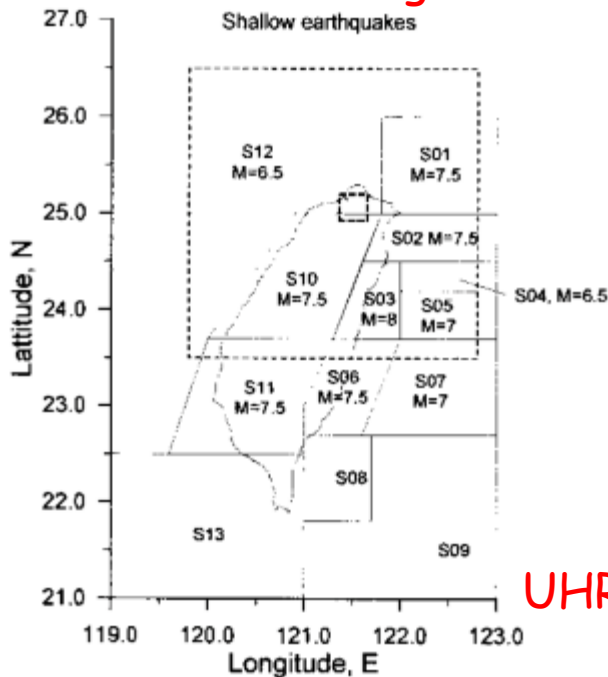
OBS/VHR simulation



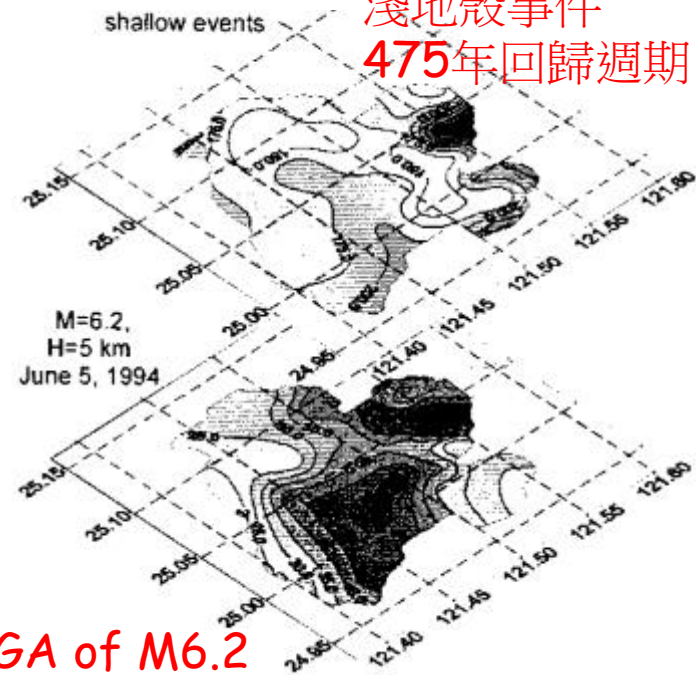
Simulation & Observation



Hazard Zoning



淺地殼事件
475年回歸週期



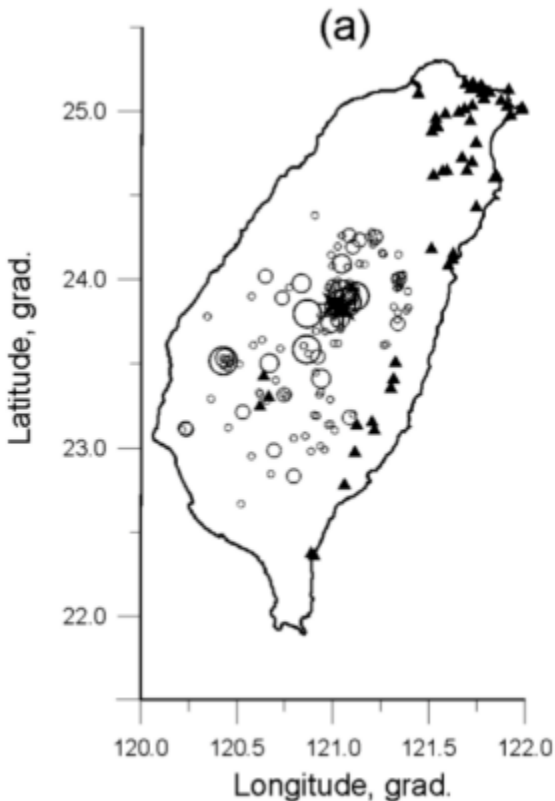
UHS

PGA of M6.2 earthquake

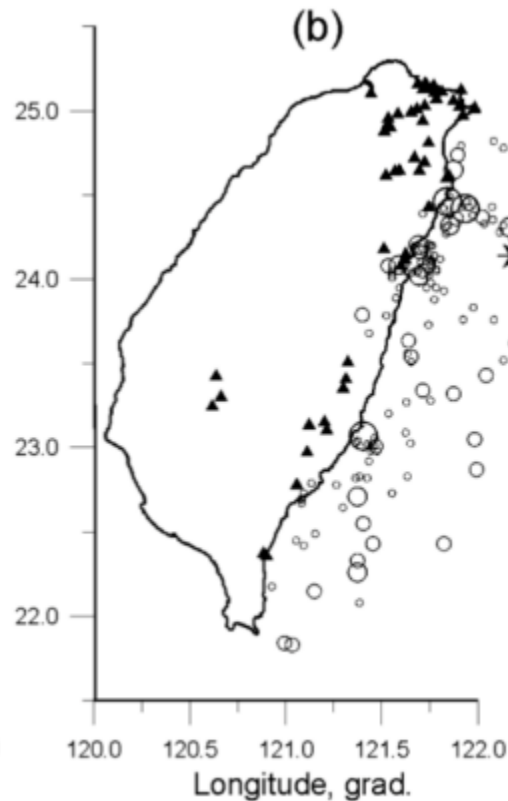
(Sokolov et al., 2001)

Introductions

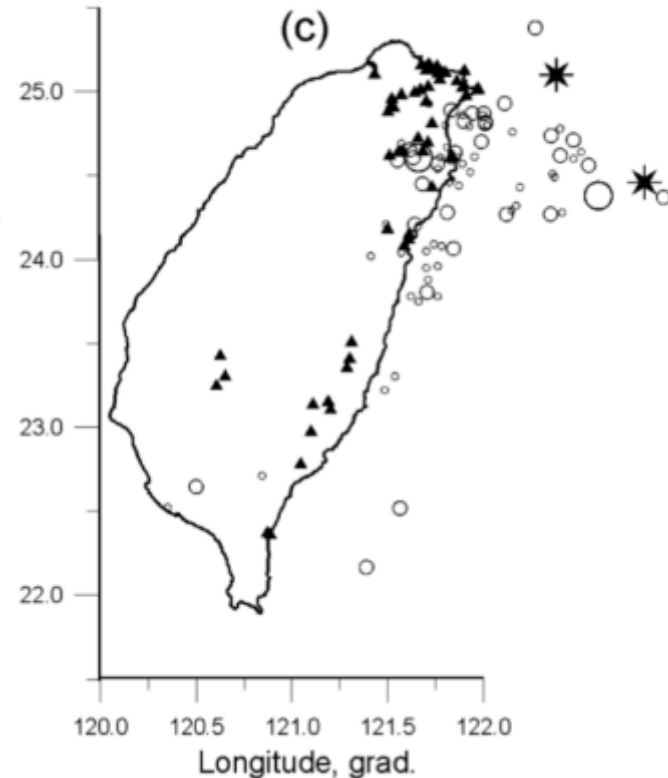
Shallow Taiwan



Shallow offshore



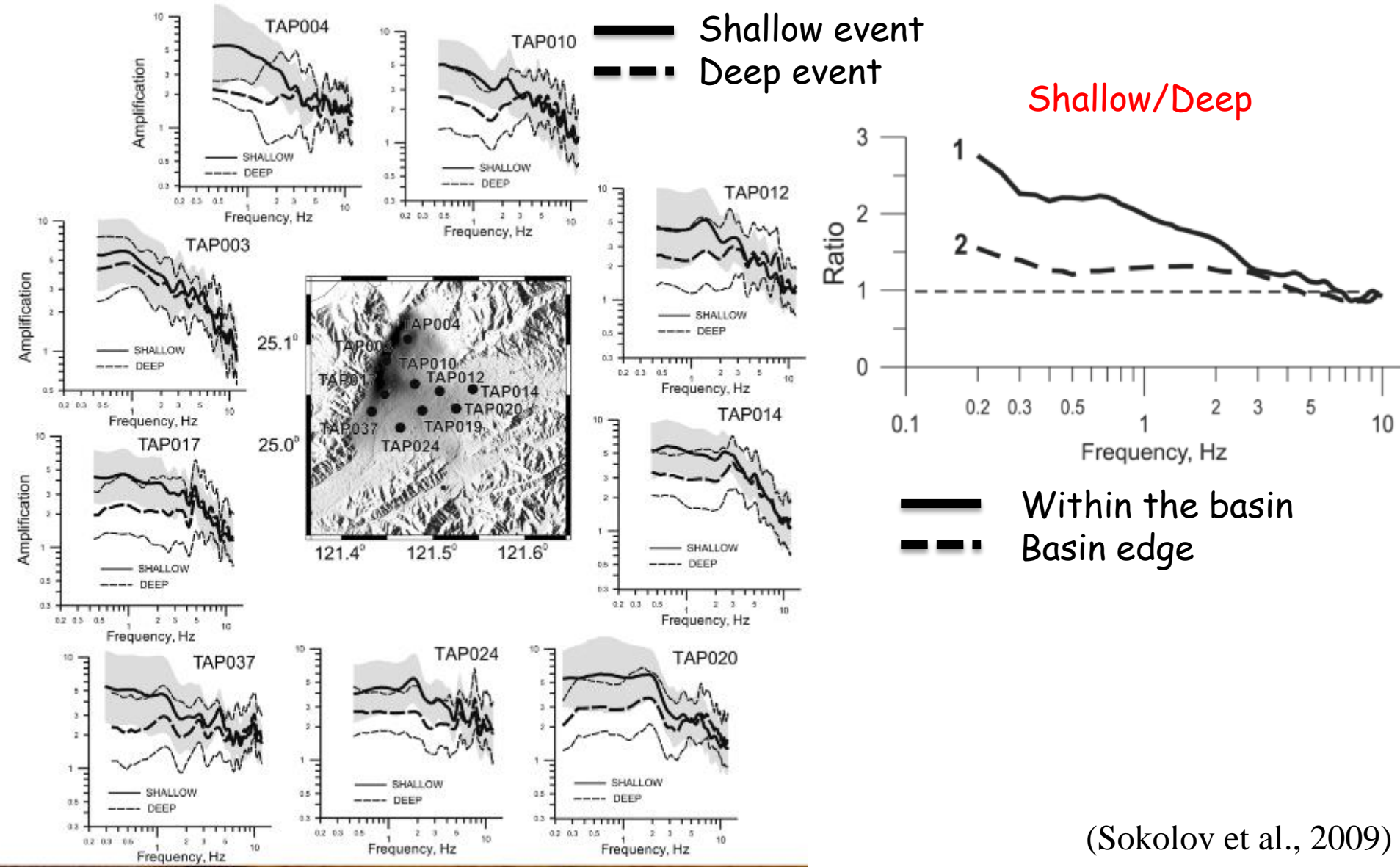
Deep Taiwan



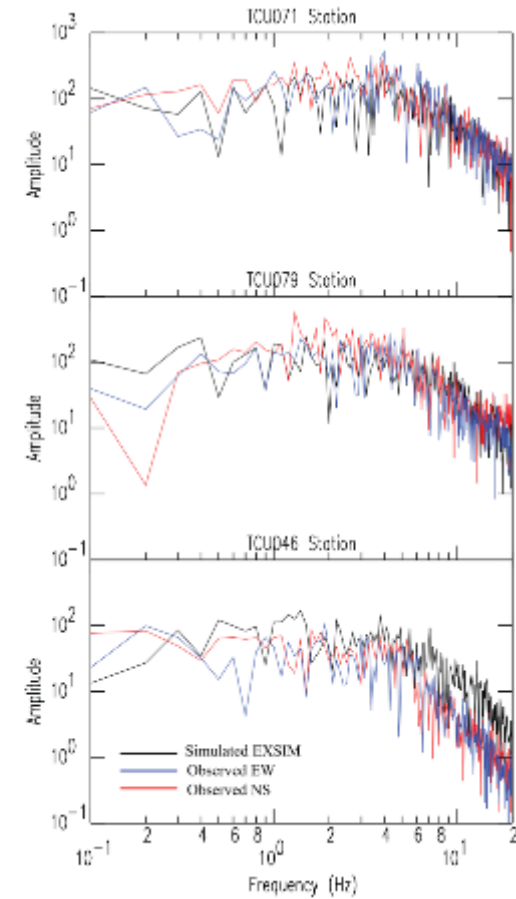
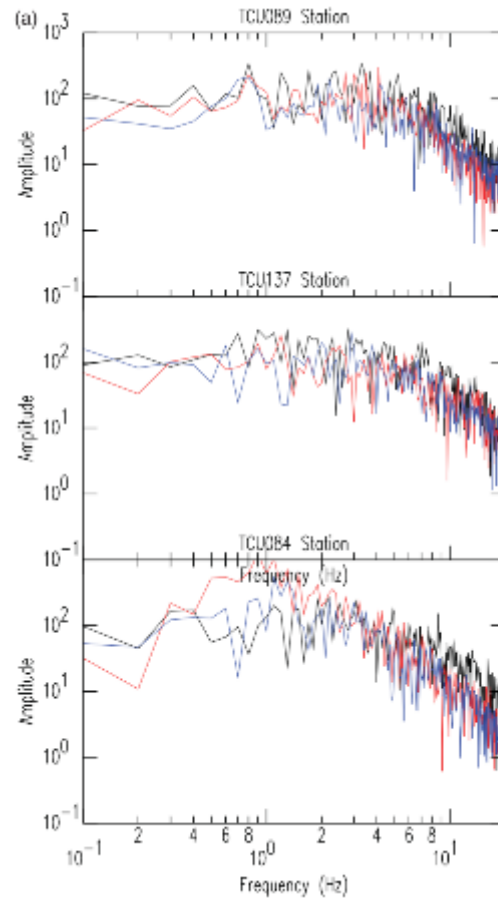
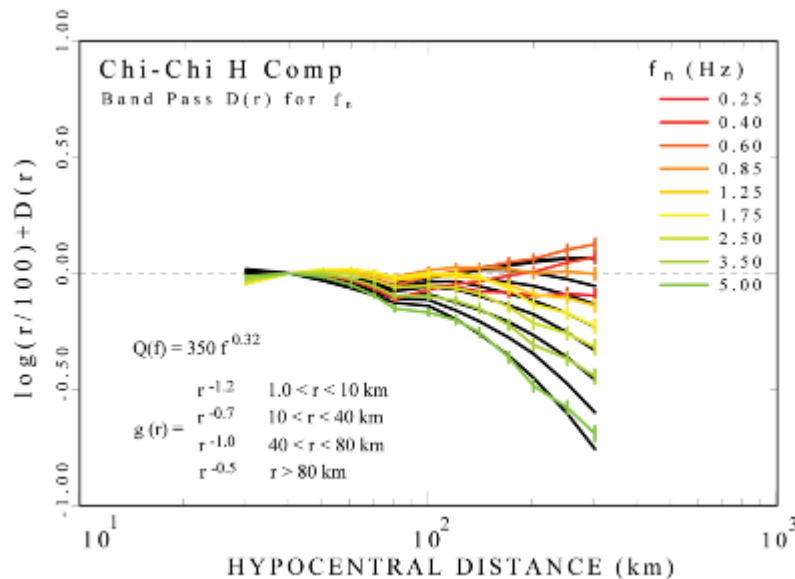
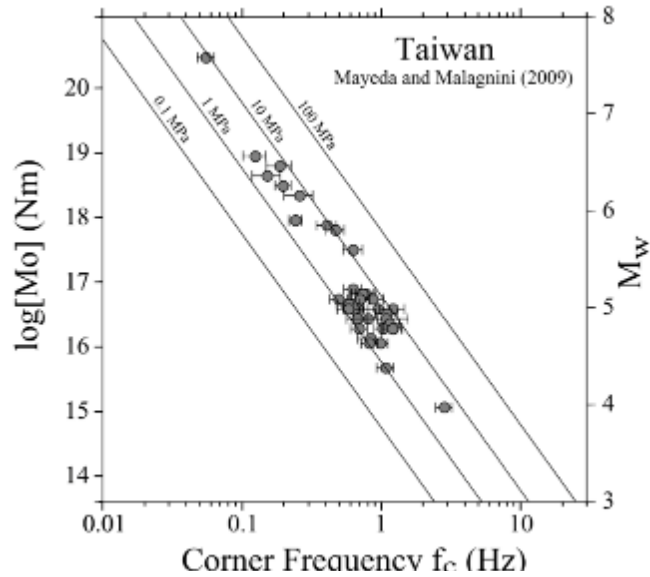
Solve source scaling from different regions with three attenuation models.

(Sokolov et al., 2006)

Introductions



Introductions



Site Correction from ETF

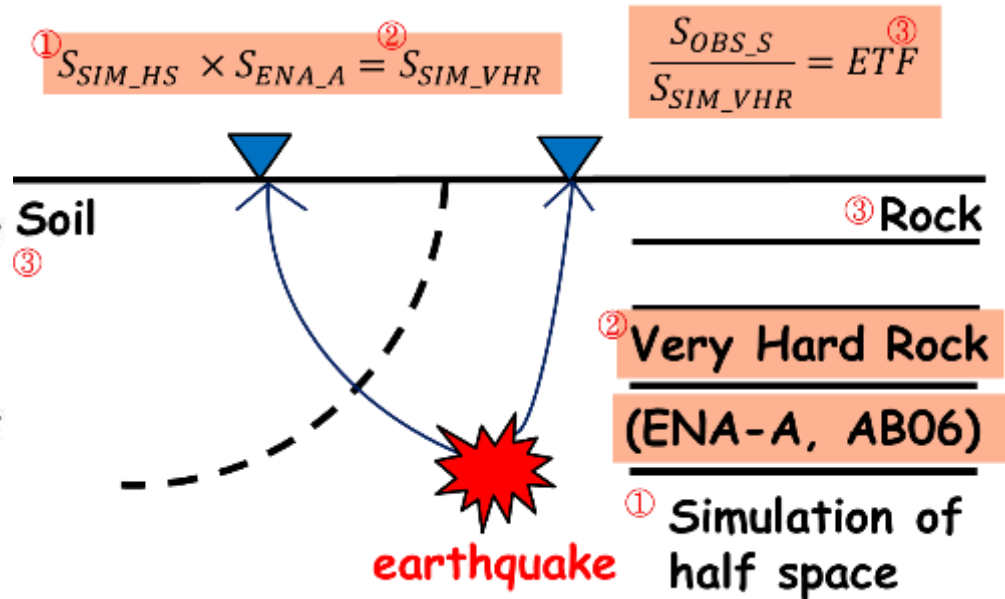
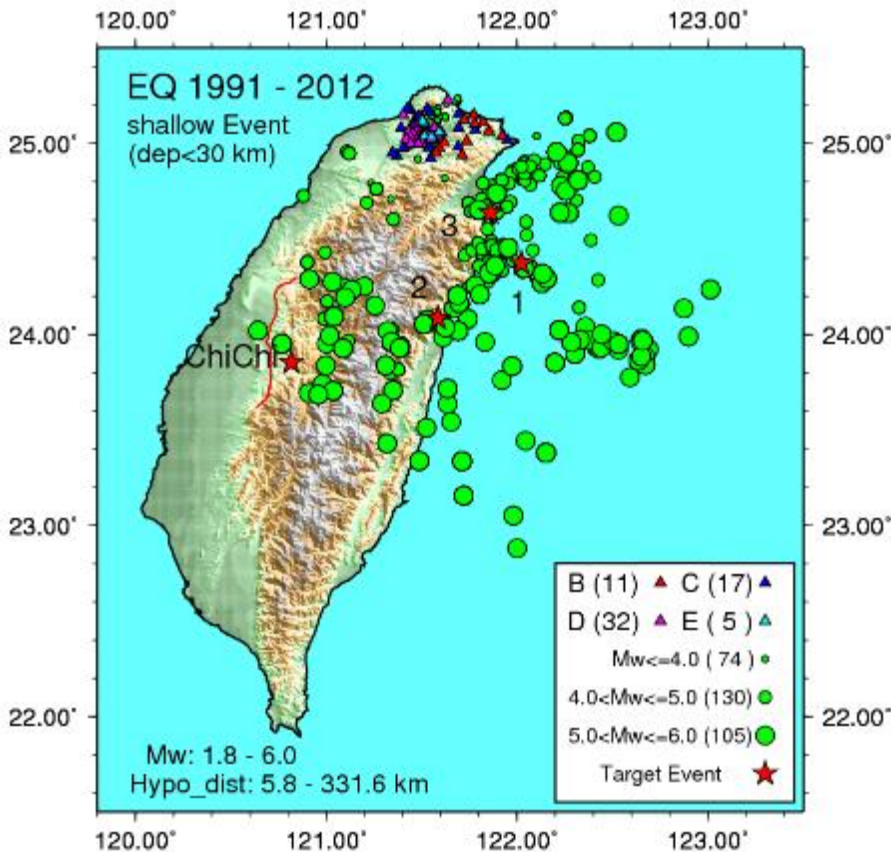
- Review the FAS/PSA based methods for Taiwan.

Parameters	Sokolov et al. (2009)	D'amico et al. (2012)	Huang et al. (2017)
Source spectrum model	Single corner frequency ω^{-2}	Single corner frequency ω^{-2}	Single corner frequency ω^{-2}
Stress parameter, $\Delta\sigma$ (bars)	Zone ST: increase from 100 for M=5.0 to 300 for M=7.0 Zone SO: 100 Zone DT: 300	Mw =5.5, 60 Mw =6.5, 80 Mw =7.6, 90	Mw <5.5, 60 5.5<Mw <6.5, 80 Mw >6.5, 90
Shear-wave velocity, β_s (km/s)	3.6	3.2	3.6
Density, ρ_s (gm/cc)	2.8	2.8	2.8
Geometric spreading, $\frac{1}{R^b}$: b=	1.0 (1-50km) 0.0 (50-170km) 0.5 (>170km)	1.2 (1-10km) 0.7 (10-40km) 1.0 (40-80km) 0.5 (>80km)	1.0 (1-50km) 0.0 (50-170km) 0.5 (>170km)
Quality factor, Q	Zone ST: $80f^{0.9}$ Zone SO: $120f^{0.8}$ Zone DT: $60f^{1.0}$	$350f^{0.32}$	Zone ST: $80f^{0.9}$ Zone SO: $120f^{0.8}$ Zone DT: $60f^{1.0}$

Parameters	Sokolov et al. (2009)	D'Amico et al. (2012)	Huang et al. (2017)
Site amplification, $A(f)$	-	Boore & Joyner (1997) Generic Rock ($V_{s30}=520\text{m/s}$) Generic Soil ($V_{s30}=270\text{m/s}$)	ENA-A Empirical Transfer Function (ETF)
Kappa, κ_0 (sec)	0.01	0.05	0.01
Duration	-	-	Lee et al. (2015) Combined duration source, duration path and duration site in one equation
Generated model for validation	FAS	PGA, FAS, PSA for Chi-Chi earthquake data	PGA, FAS for shallow earthquake including Chi-Chi data
Purpose	Construct a VHR response and compared site response for shallow and deep earthquakes	Construct stochastic simulation model based on small earthquake database, validation with Chi-Chi earthquake data	Construct ETF as site corrected method for stochastic simulation

Site Correction from ETF

Empirical Transfer Function (ETF)
based site correction of stochastic
simulation (Huang et al., 2017).

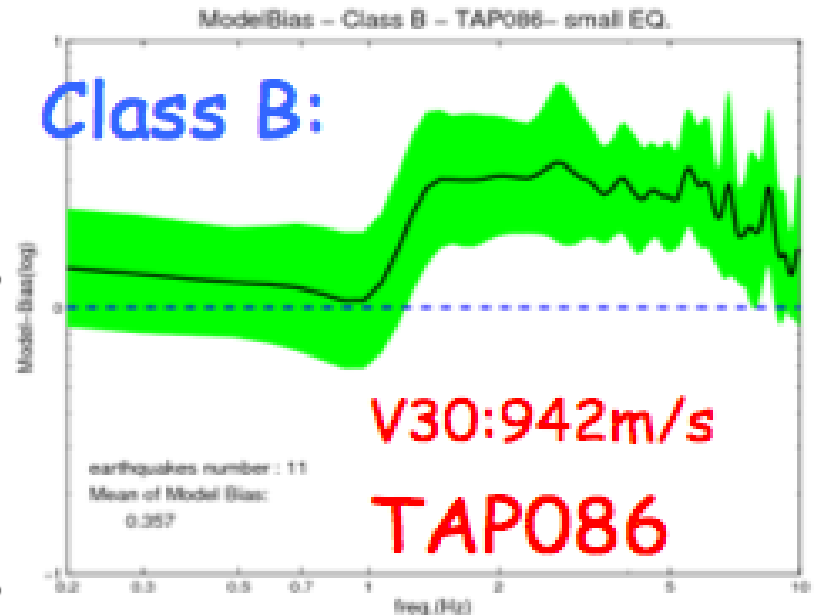
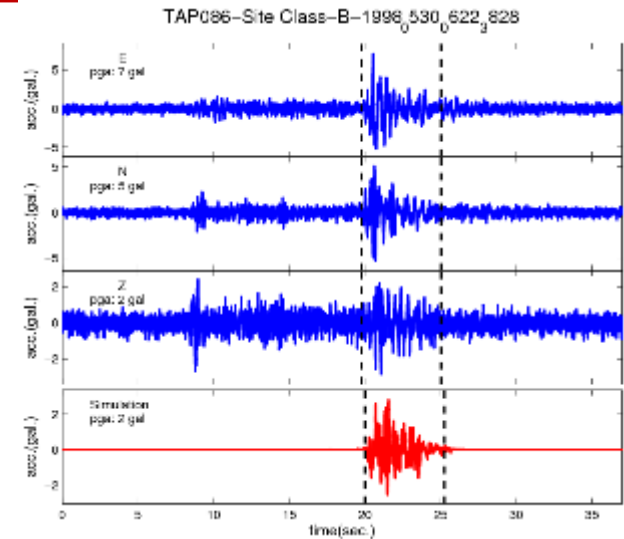
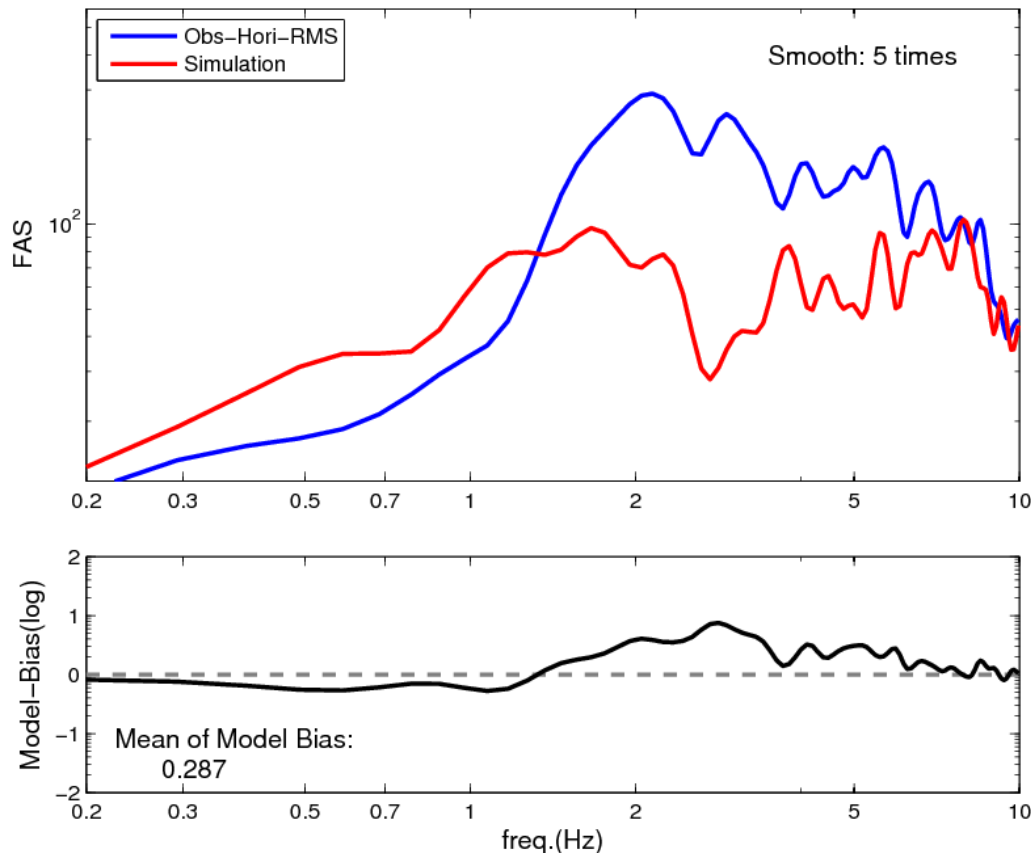


Constructing shallow ETF based on
Very Hard Rock response.

Site Correction from ETF

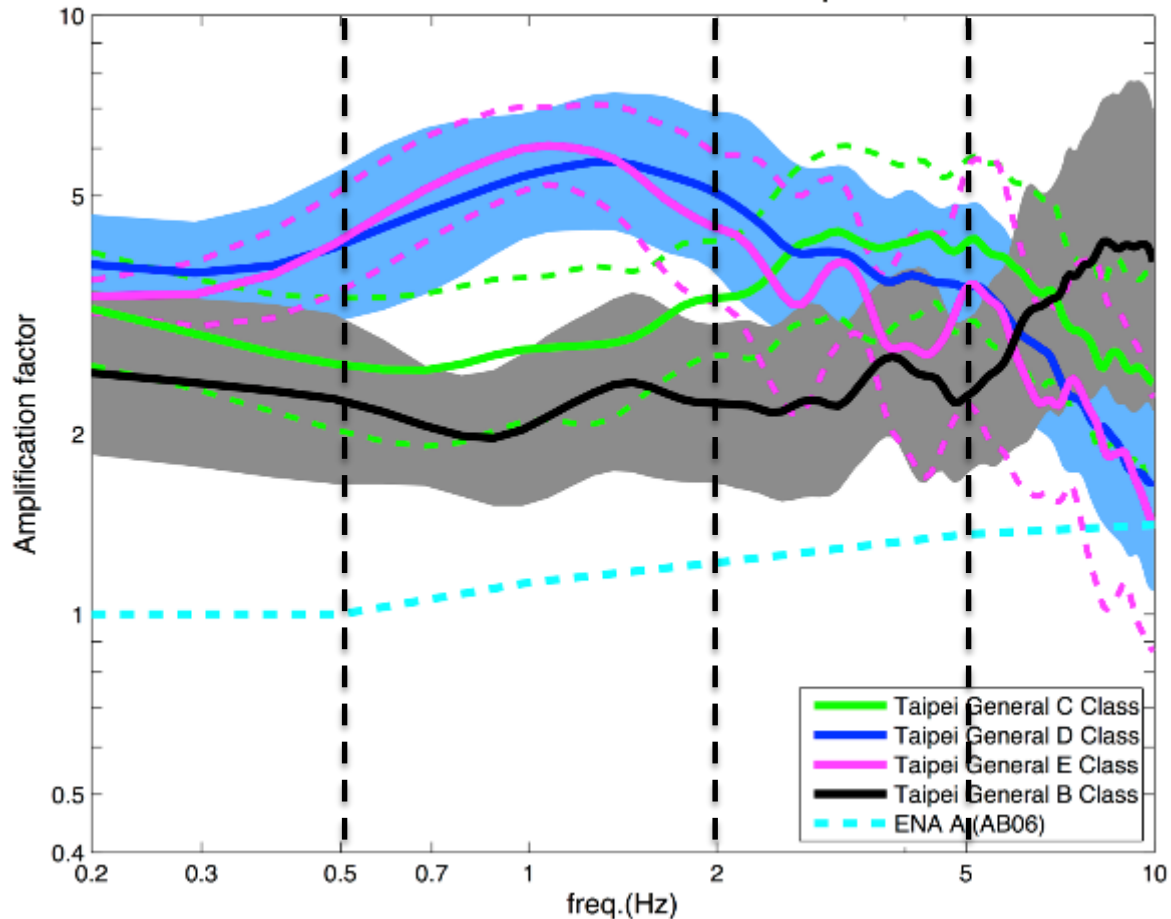
Empirical Transfer Function (ETF)
based site correction of stochastic
simulation (Huang et al., 2017).

TAP086-FAS-Site Class-B-1998_530_622_828 -EQ.

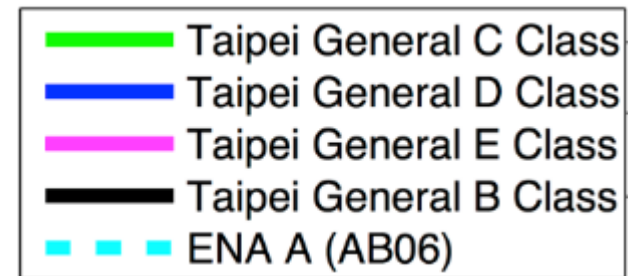


Site Correction from ETF

General Transfer Functions in Taipei Basin



General ETF of Taipei Basin for site class B to E

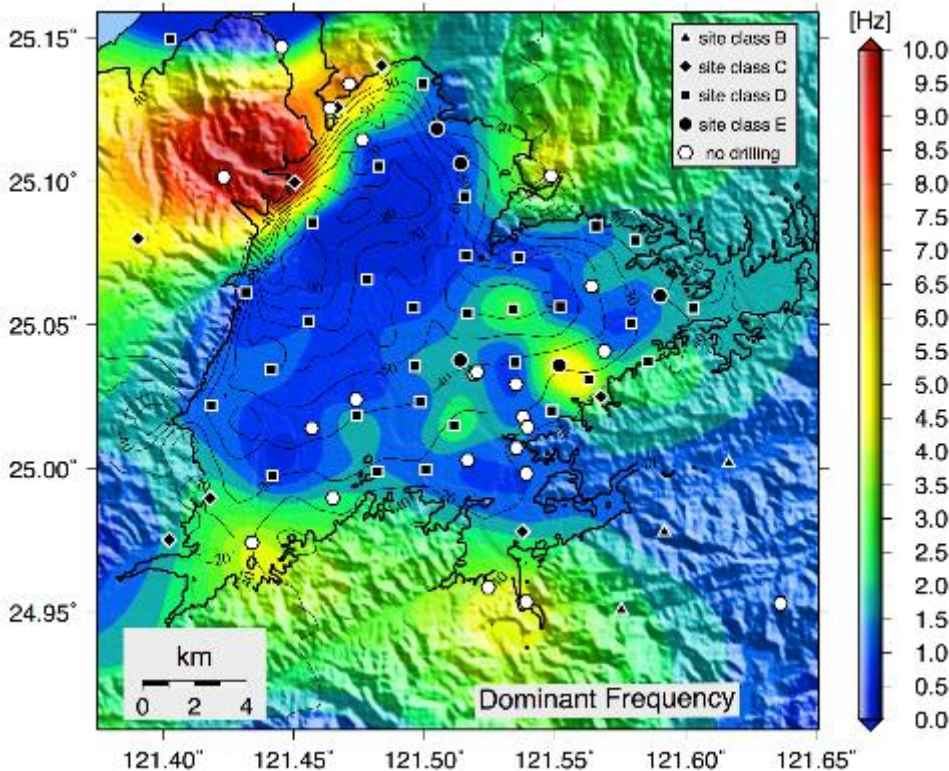


Site Correction from ETF

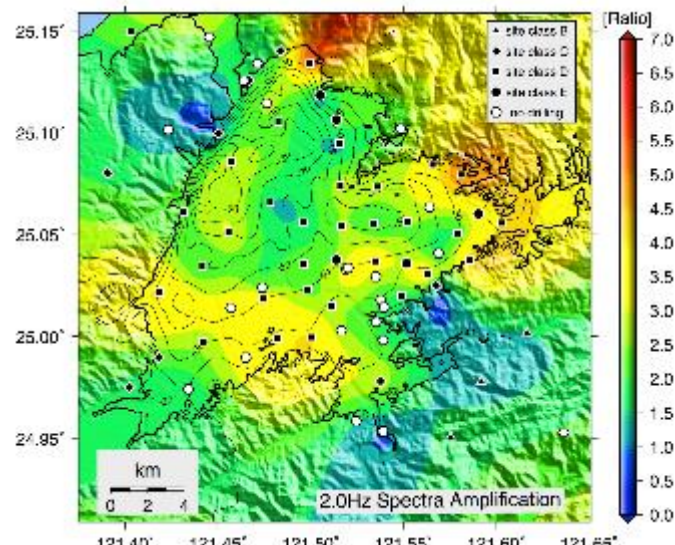
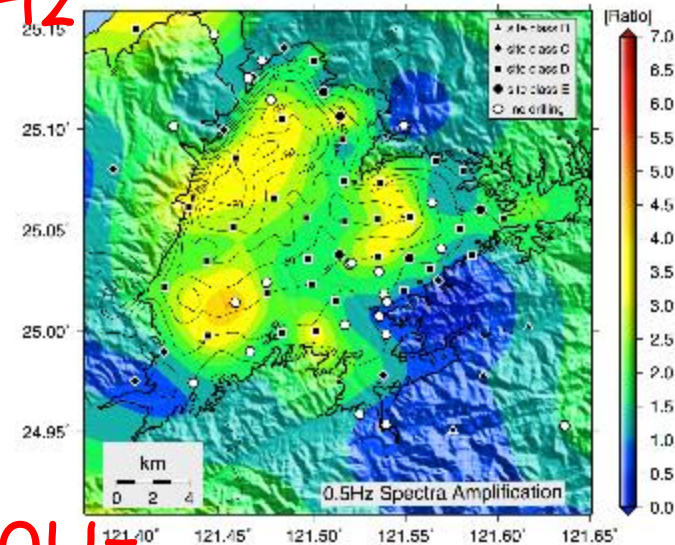
Empirical Transfer Function (ETF)
based site correction of stochastic
simulation (Huang et al., 2017).

AMP_0.5Hz

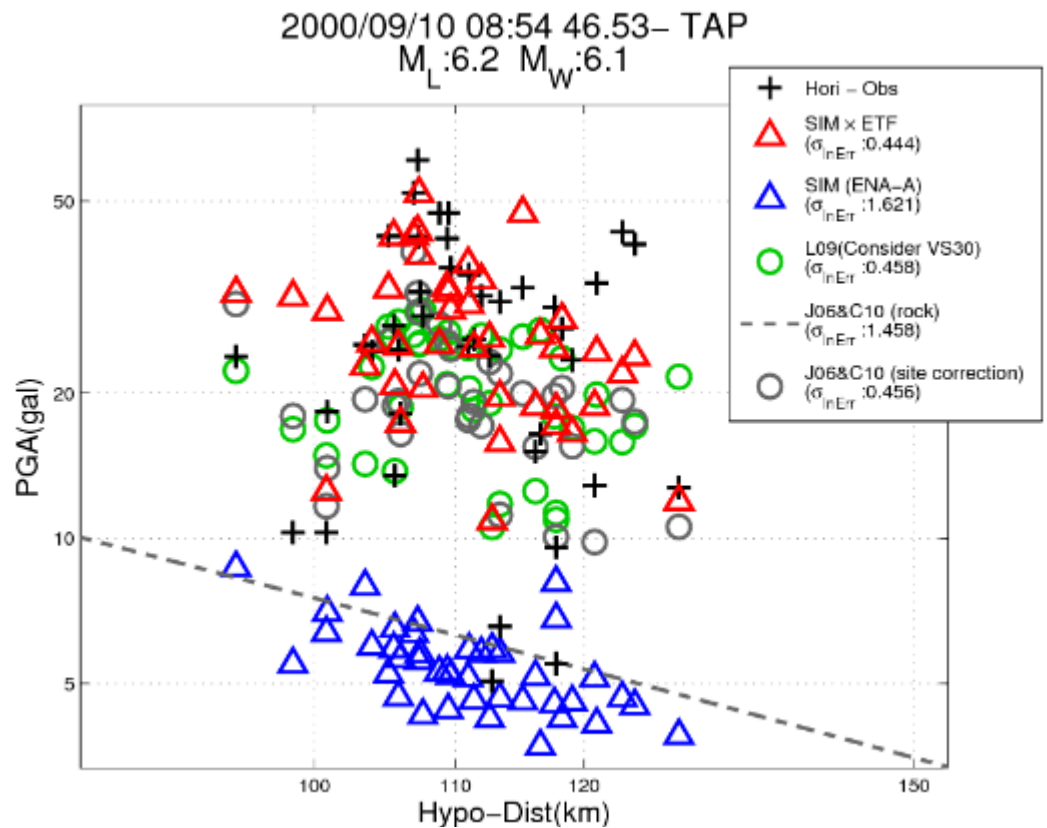
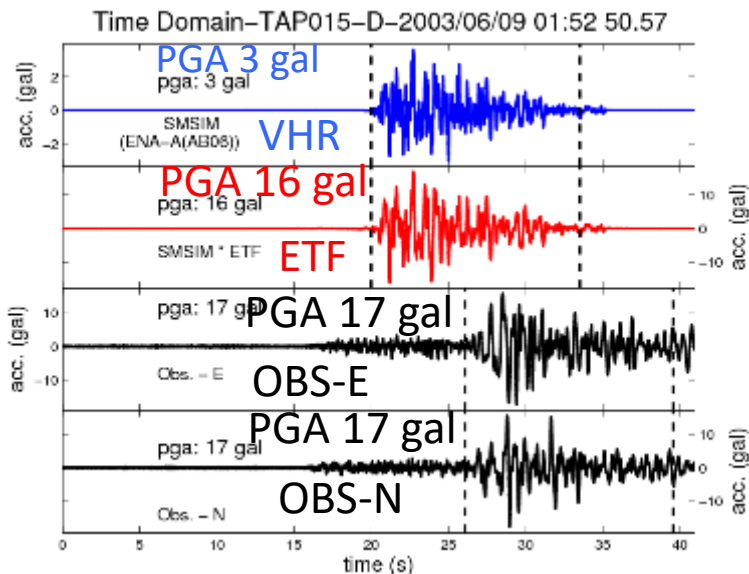
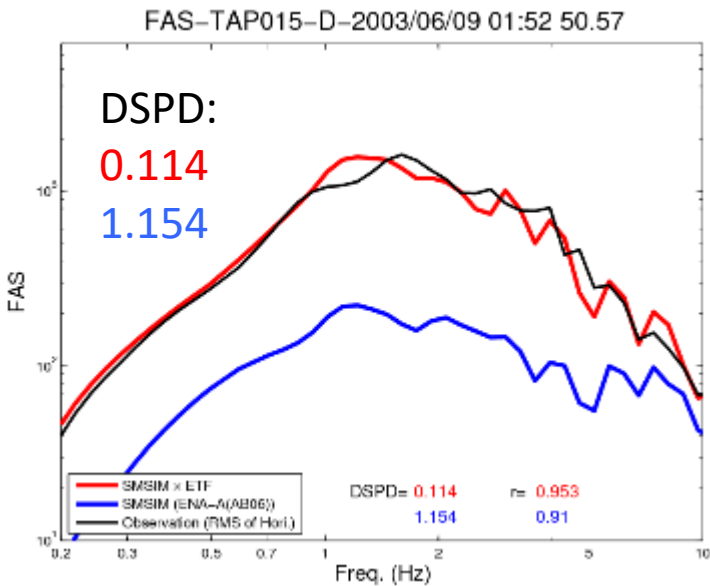
Dominant Frequency



AMP_2.0Hz



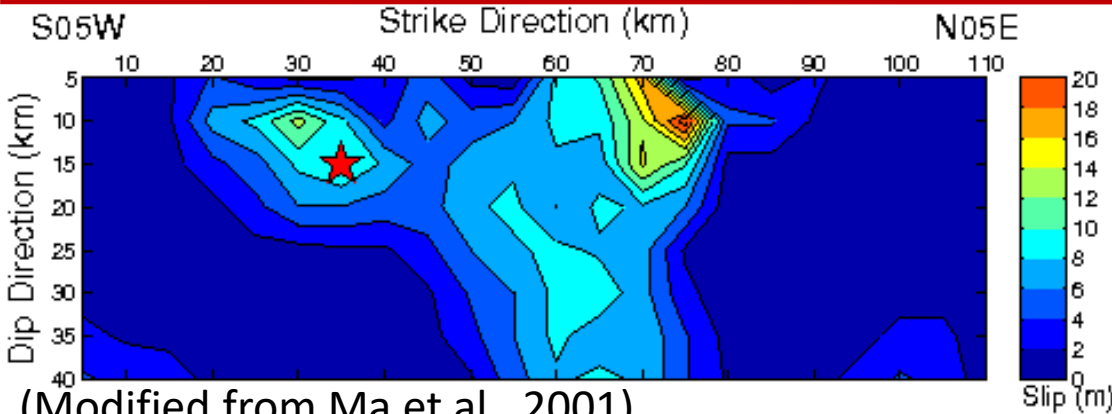
Site Correction from ETF



Observation Empirical Transfer Function
VHR Simulation (ETF) based site correction
ETF Correction of stochastic simulation
GMPE(L09)
GMPE(J06&C10)

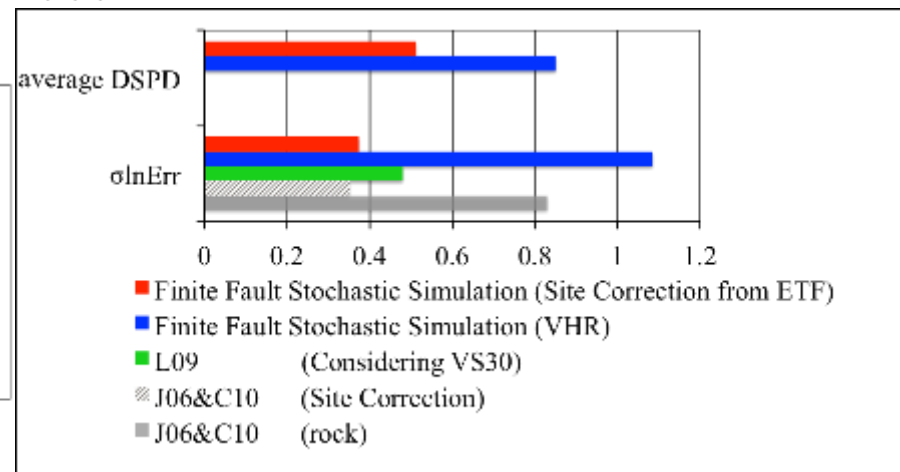
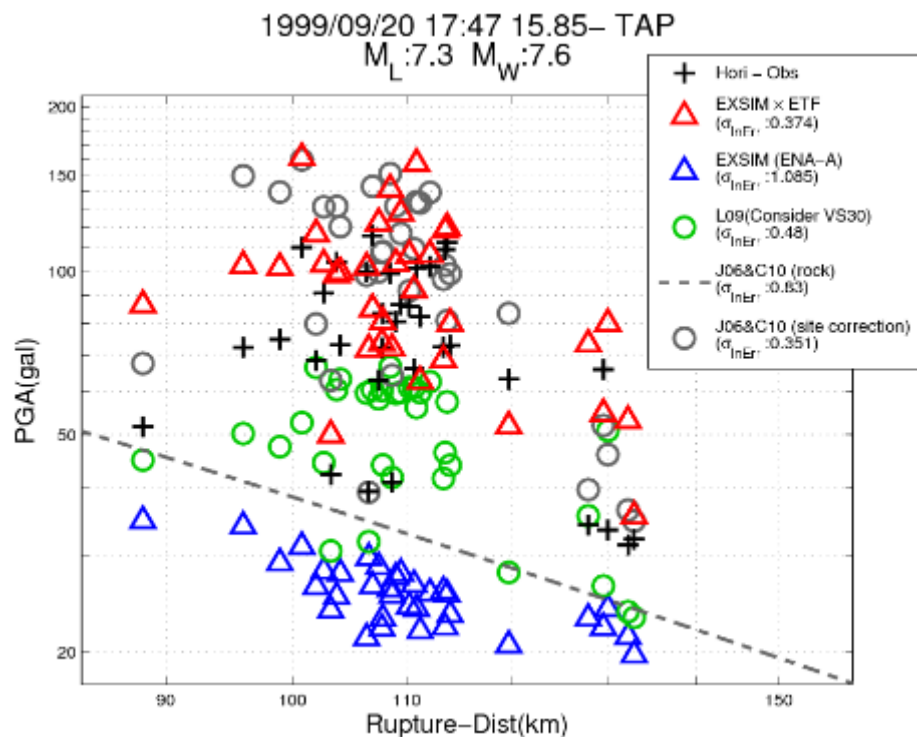
(Huang et al., 2017)

Site Correction from ETF



ETF based site correction could also applied to finite fault simulation.

(Modified from Ma et al., 2001)



(Huang et al., 2017)

Site Correction from ETF

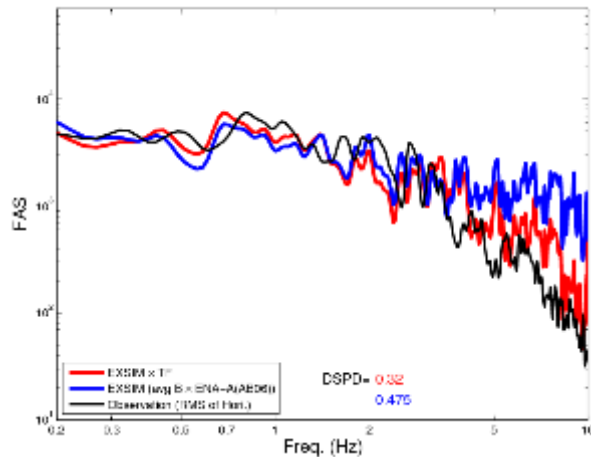
Class B: 1999_0921 Mw7.6 depth 8km

TAP067

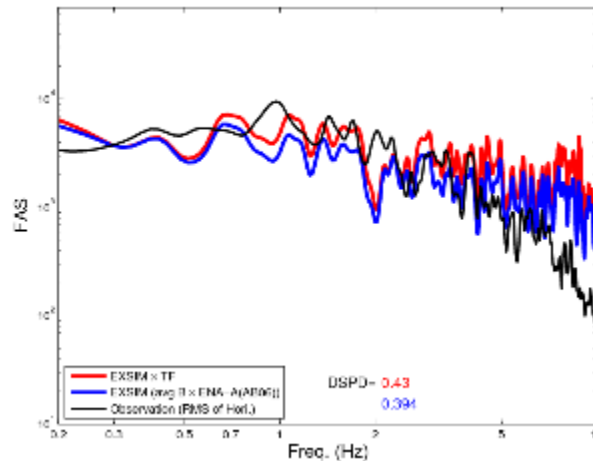
TAP075

TAP086

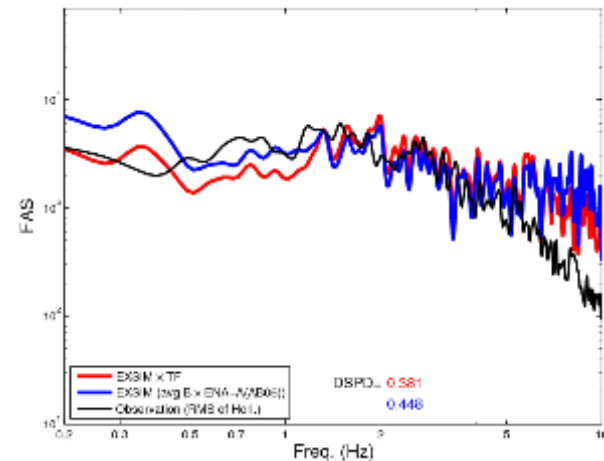
FAS-TAP067-B-1999 0920 1747 1585



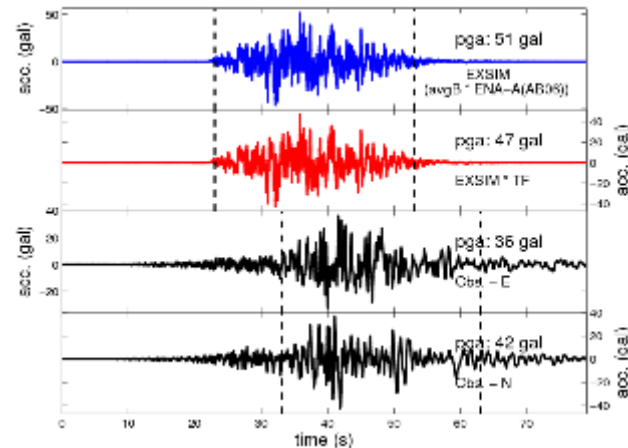
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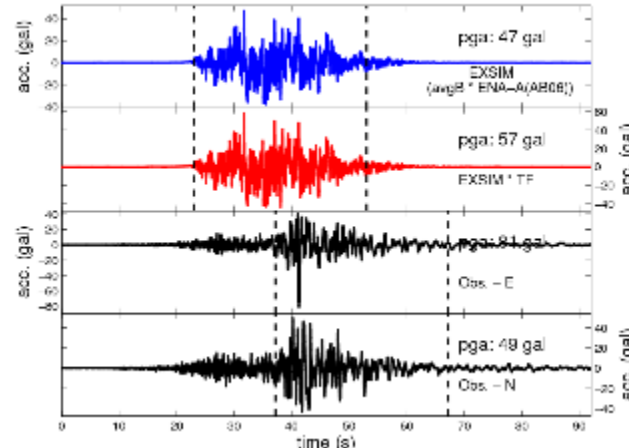
FAS-TAP086-B-1999 0920 1747 1585



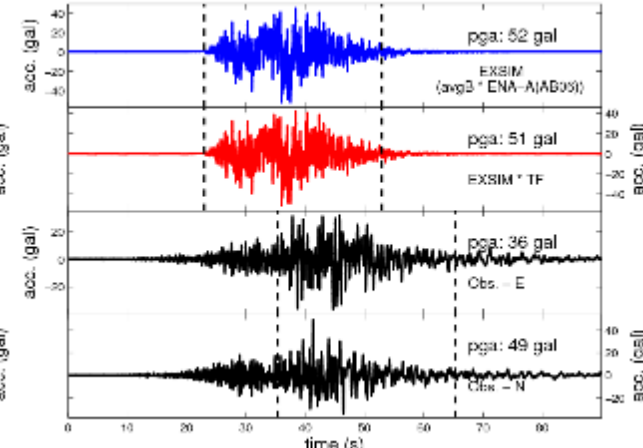
Time Domain-TAP067-B-1999 0920 1747 1585



Time Domain-TAP075-B-1999 0920 1747 1585



Time Domain-TAP086-B-1999 0920 1747 1585



Site Correction from ETF

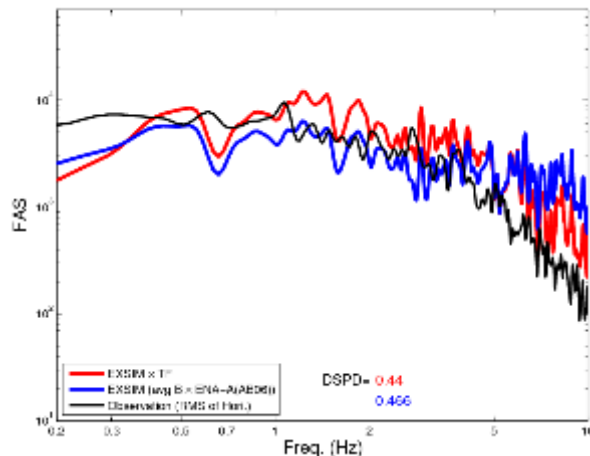
Class C: 1999_0921 Mw7.6 depth 8km

TAP047

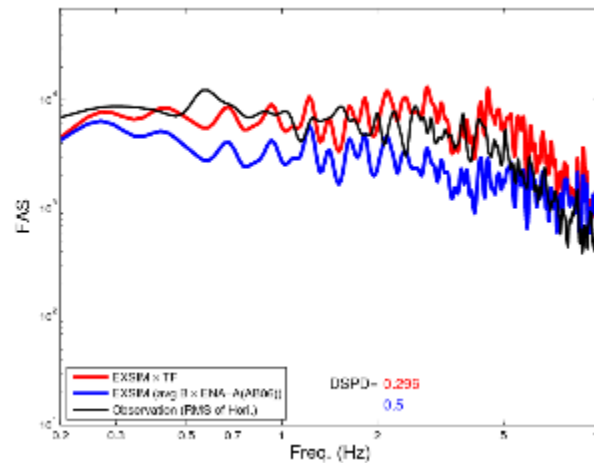
TAP052

TAP094

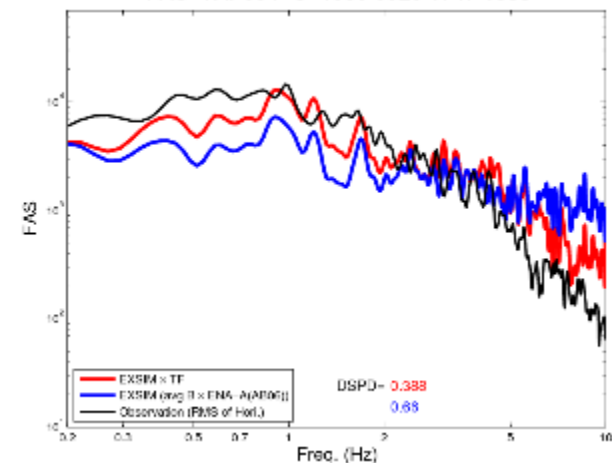
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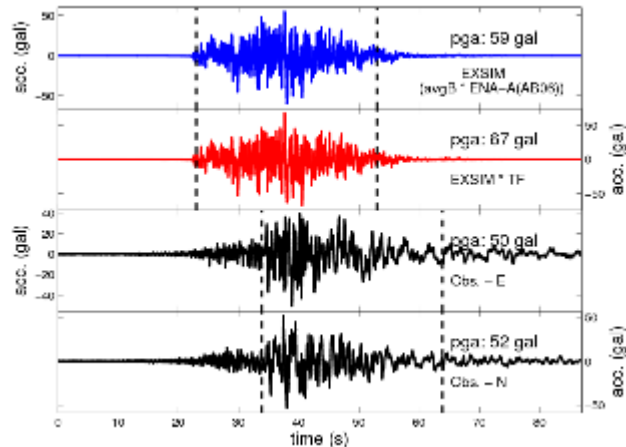
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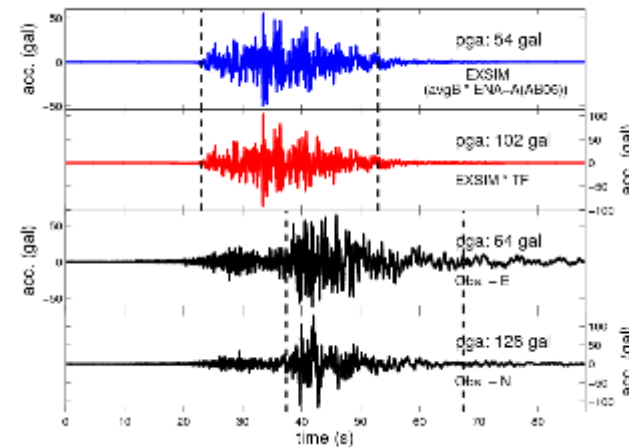
FAS-TAP094-C-1999 0920 1747 1585



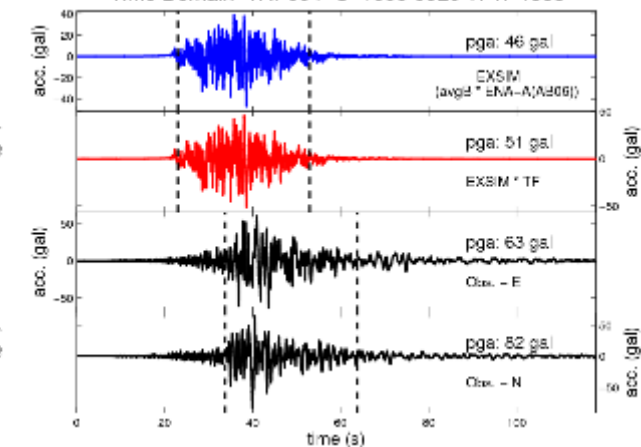
Time Domain-TAP047-C-1999 0920 1747 1585



Time Domain-TAP052-C-1999 0920 1747 1585



Time Domain-TAP094-C-1999 0920 1747 1585



Site Correction from ETF

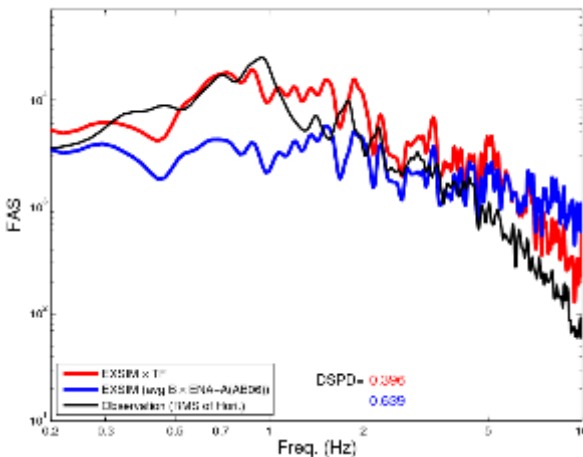
Class D: 1999_0921 Mw7.6 depth 8km

TAP007

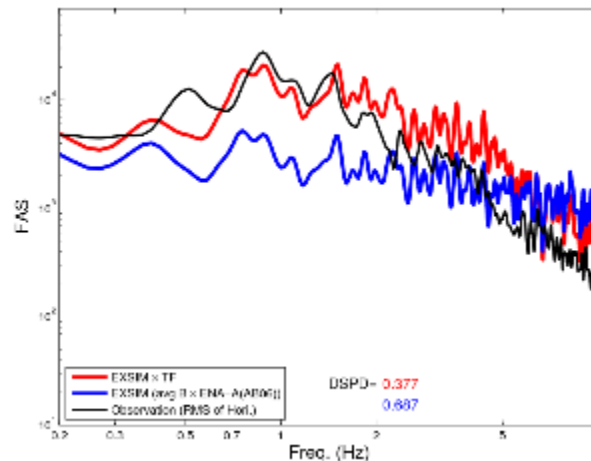
TAP090

TAP095

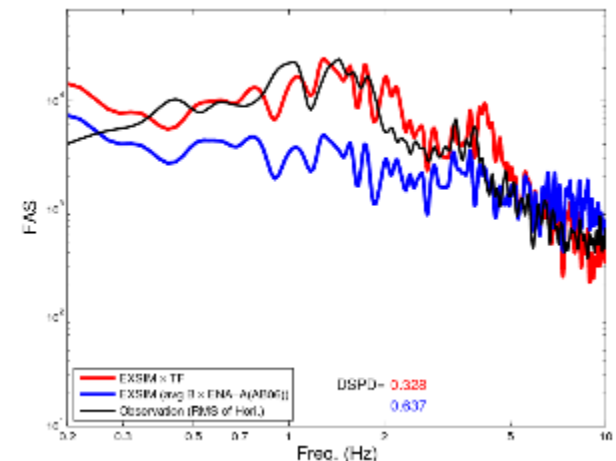
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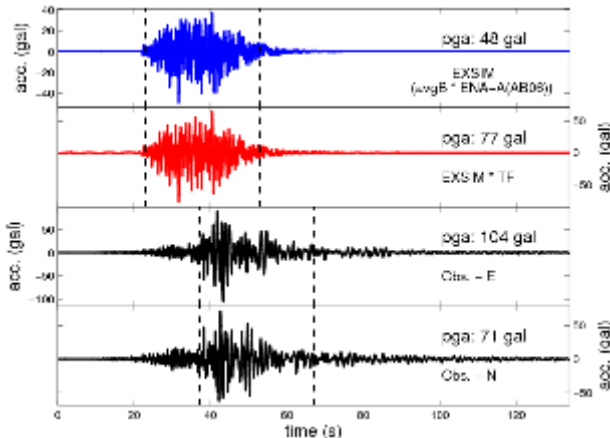
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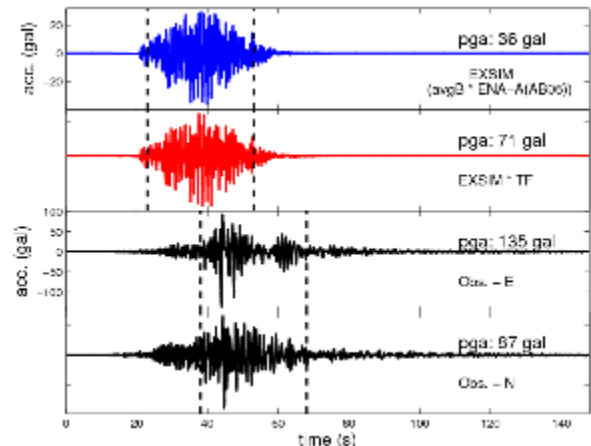
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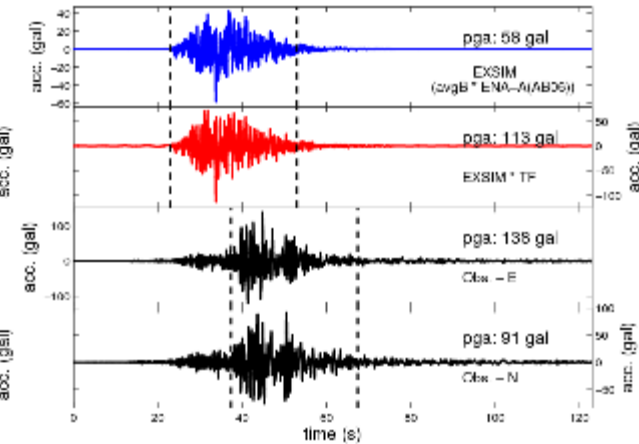
Time Domain-TAP007-D-1999 0920 1747 1585



Time Domain-TAP090-D-1999 0920 1747 1585

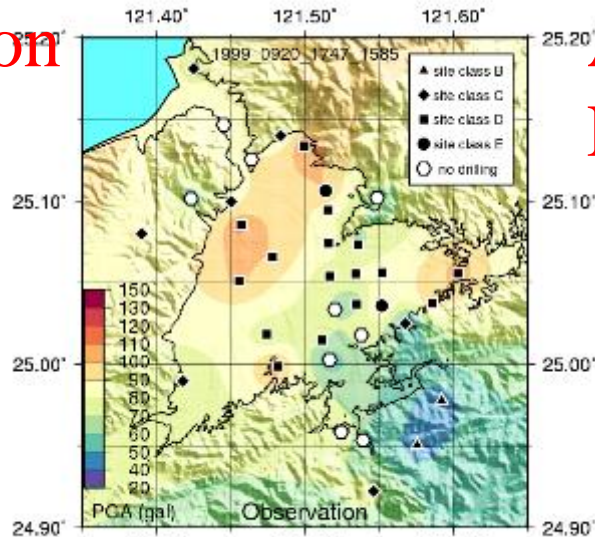


Time Domain-TAP095-D-1999 0920 1747 1585

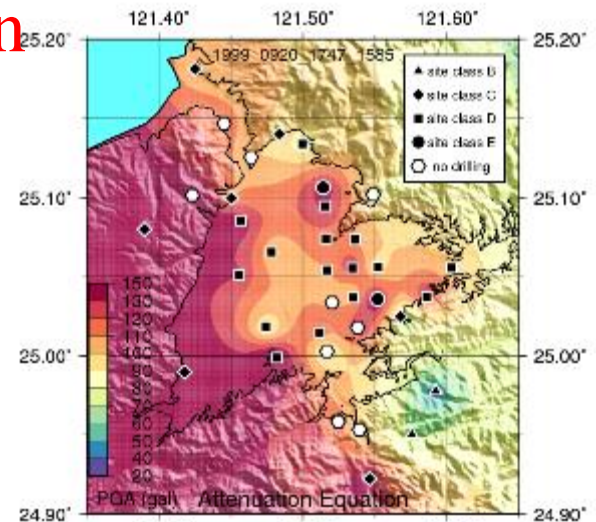


Site Correction from ETF

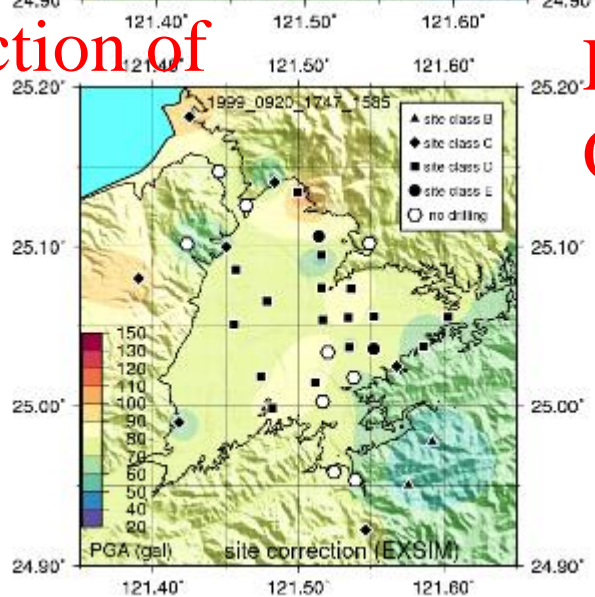
Observation



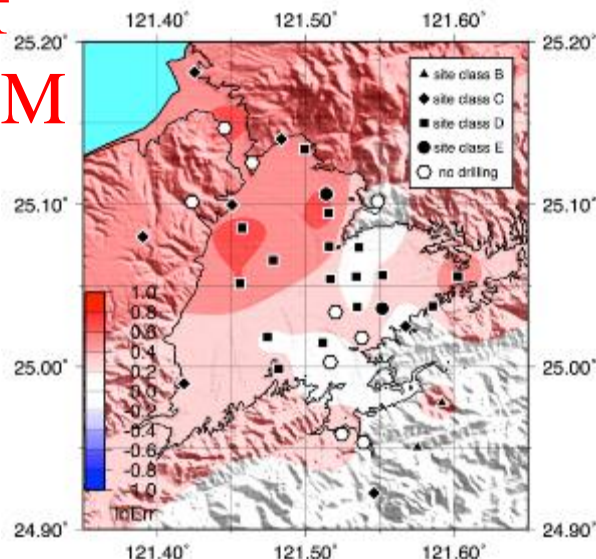
Attenuation Equation



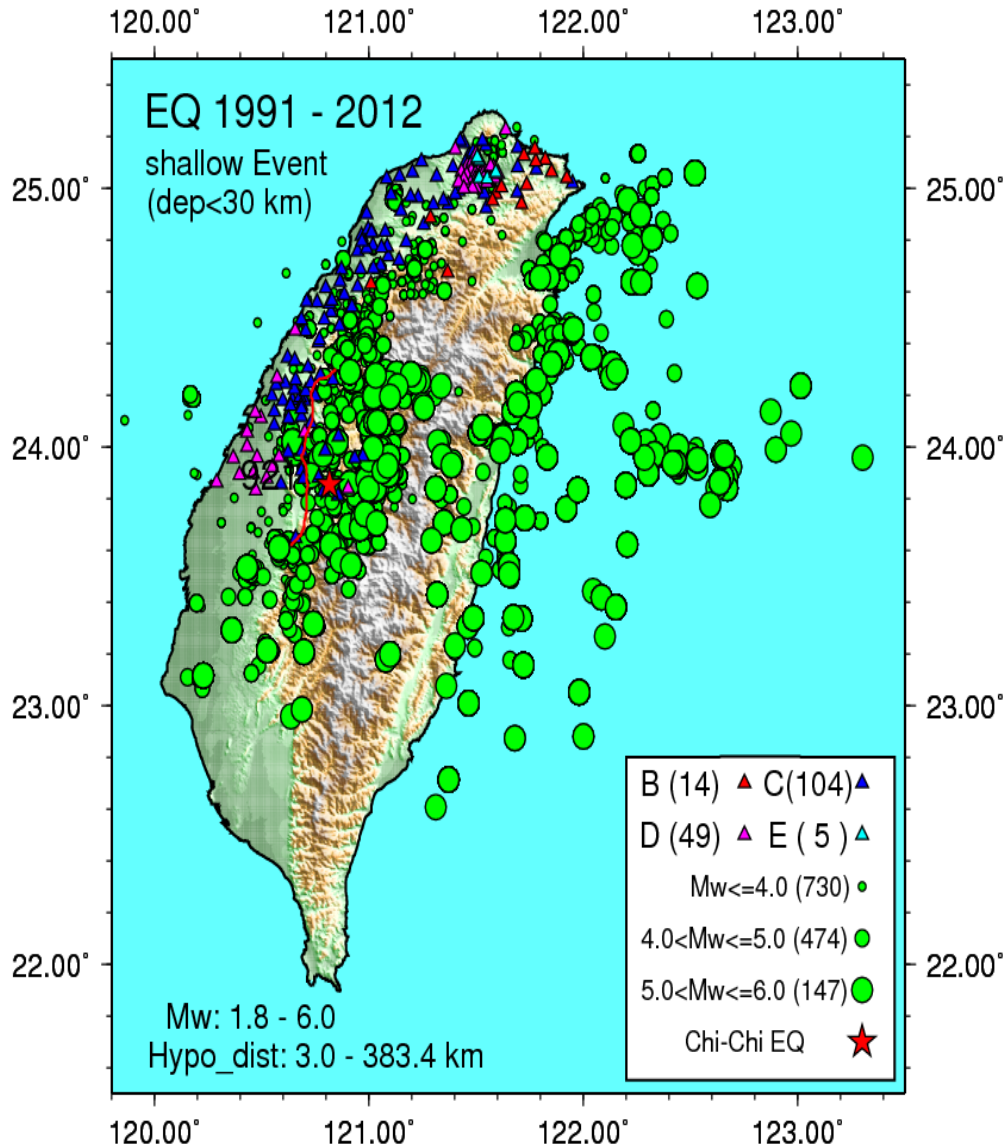
Site correction of EXSIM



Residual of OBS/EXSIM



Site Correction from ETF

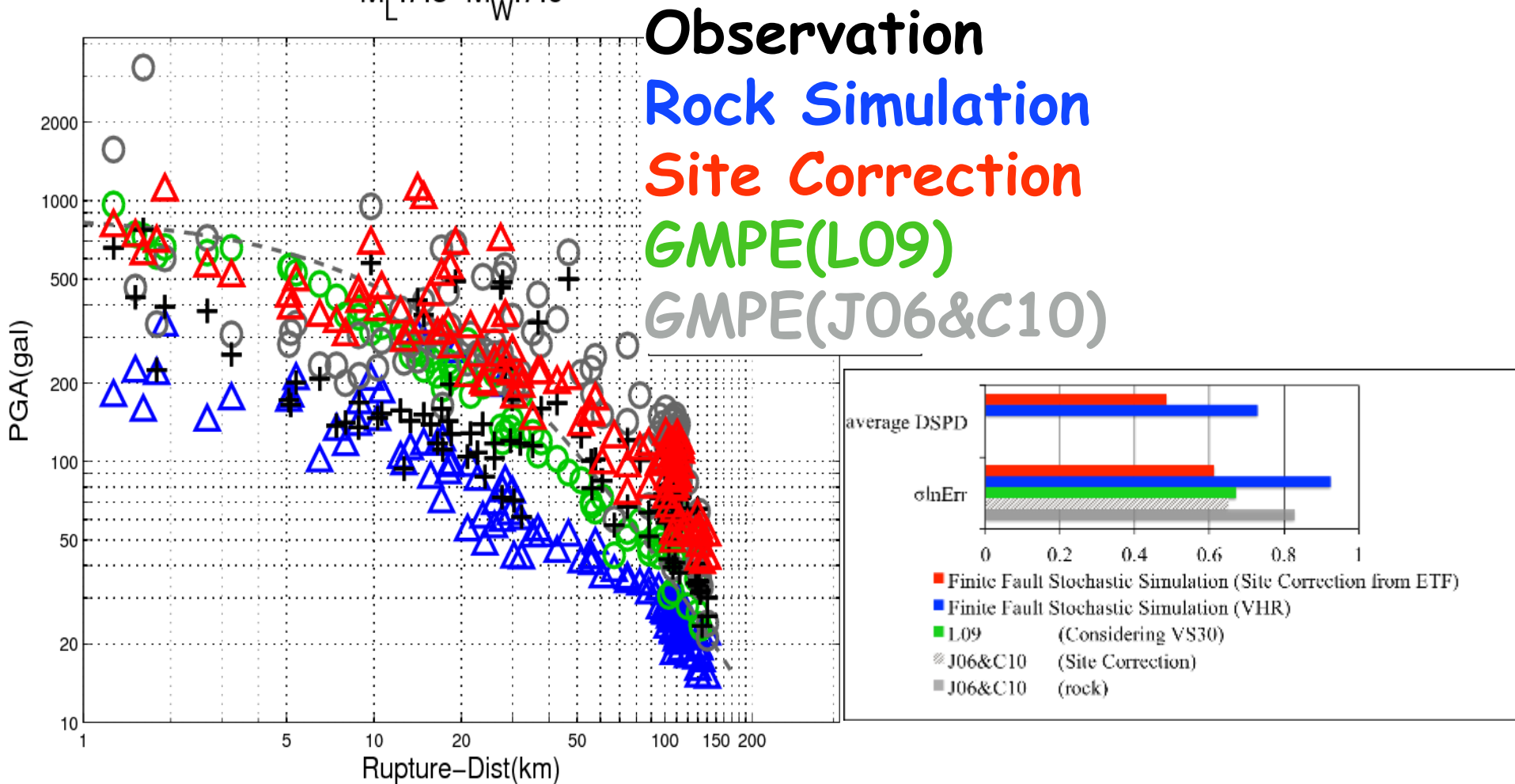


Database of
Small earthquake:
1991 ~ 2012

Mw < 6.0
Focal Depth < 30 km
1351 Events

Site Correction from ETF

P-Sokolov2009 – 1999/09/20 17:47 15.85– TAP, TCU
 $M_L: 7.3$ $M_W: 7.6$



Applications- identify possible ground motion range from random asperity model

$$A_a = 22\% * S_a = 968 \text{ km}^2$$

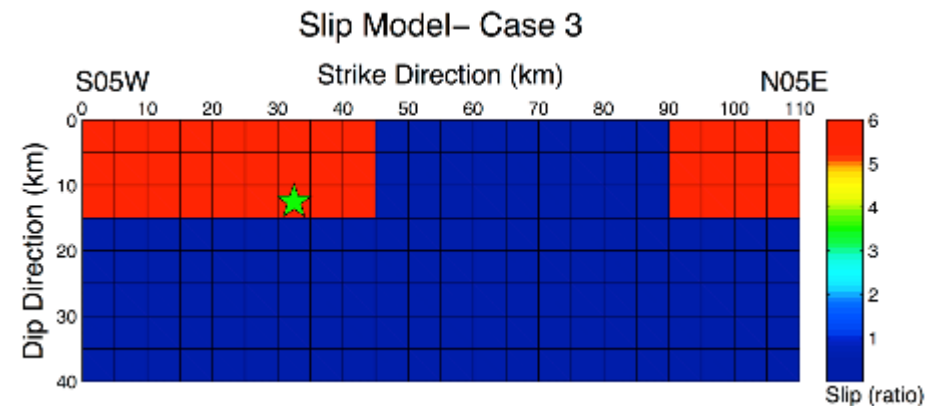
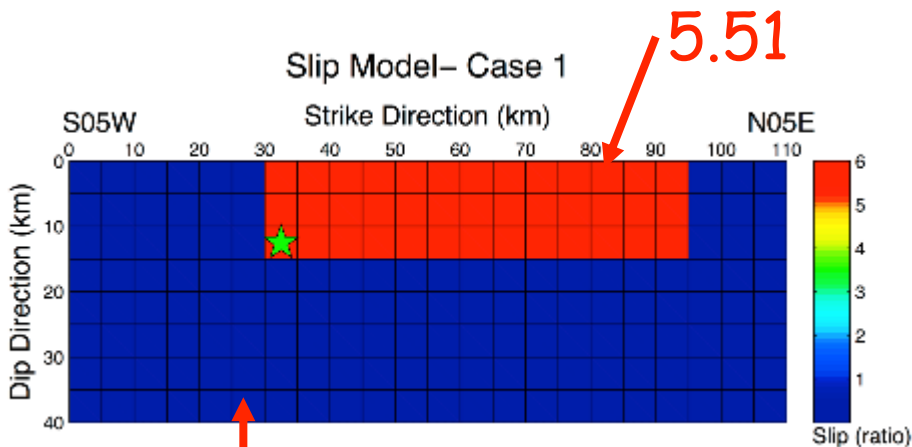
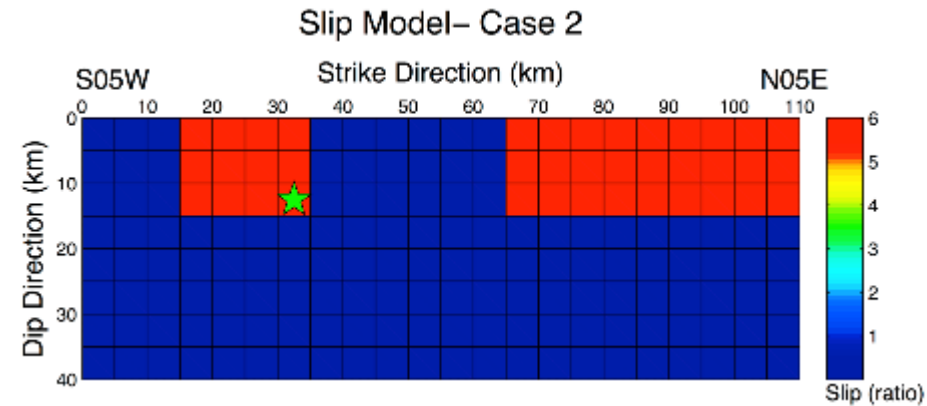
$$= 39 \text{ Subfaults.}$$

A_a : Area of Asperity.

S_a : Total Area of Fault.

(follow Japan's Recipe:

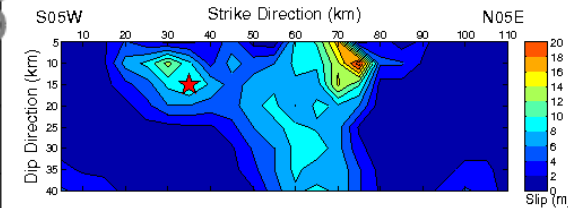
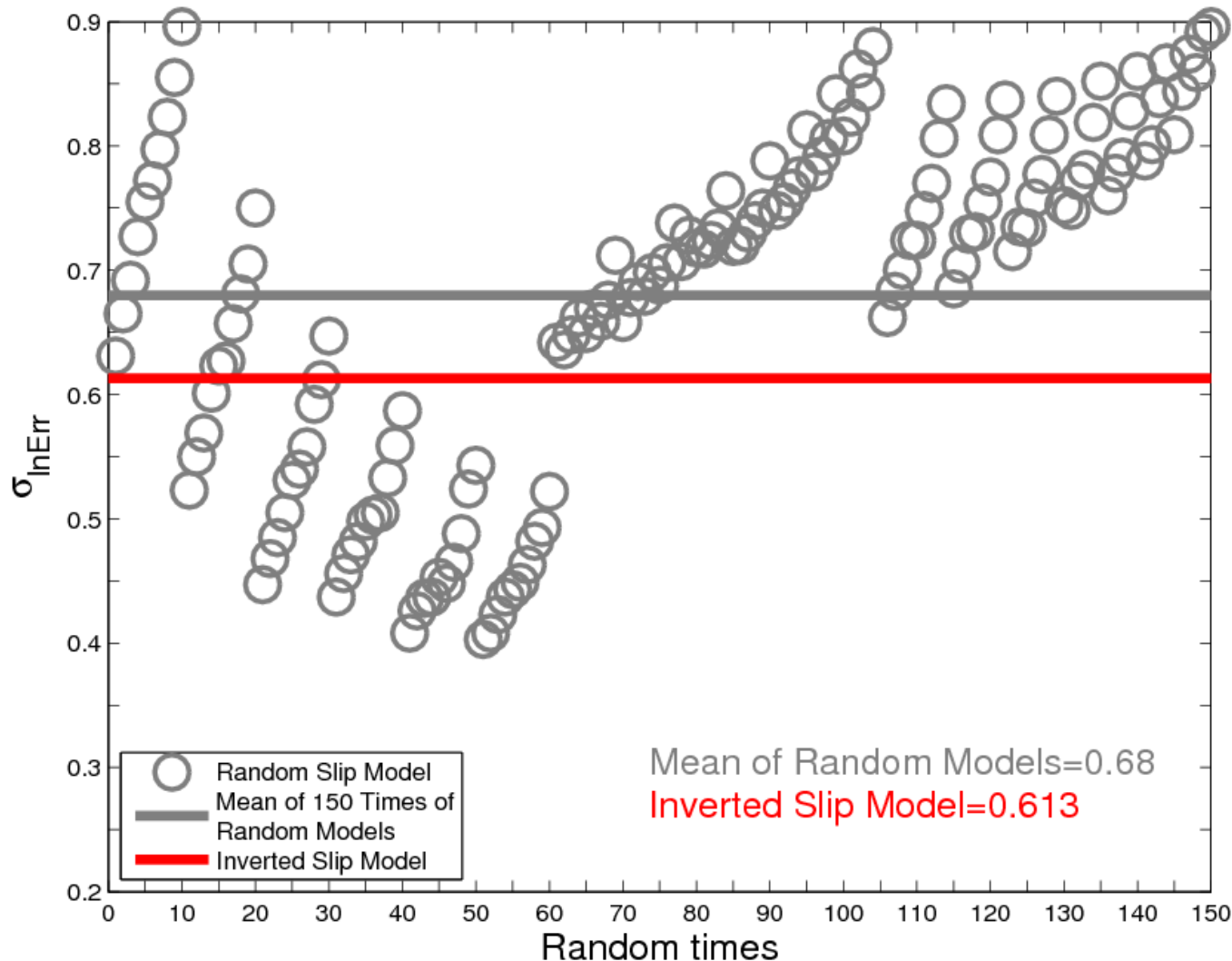
Irikura et al., 2004; NIED, 2009; Irikura and Miyake, 2011)



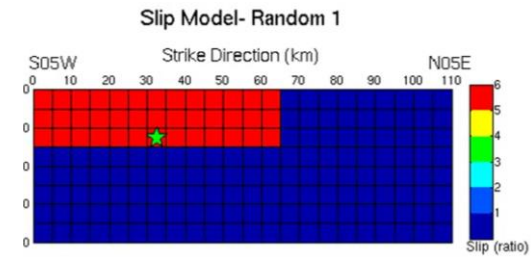
Slip Ratio for each subfaults
= 1

Applications- identify possible ground motion range from random asperity model

$\sigma_{\ln Err}$ in TAP, TCU region for 921 EQ

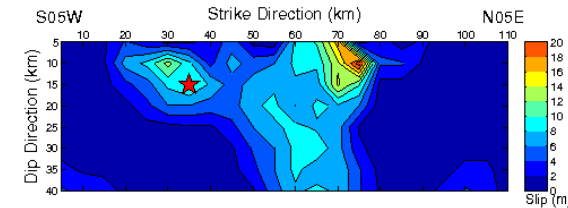
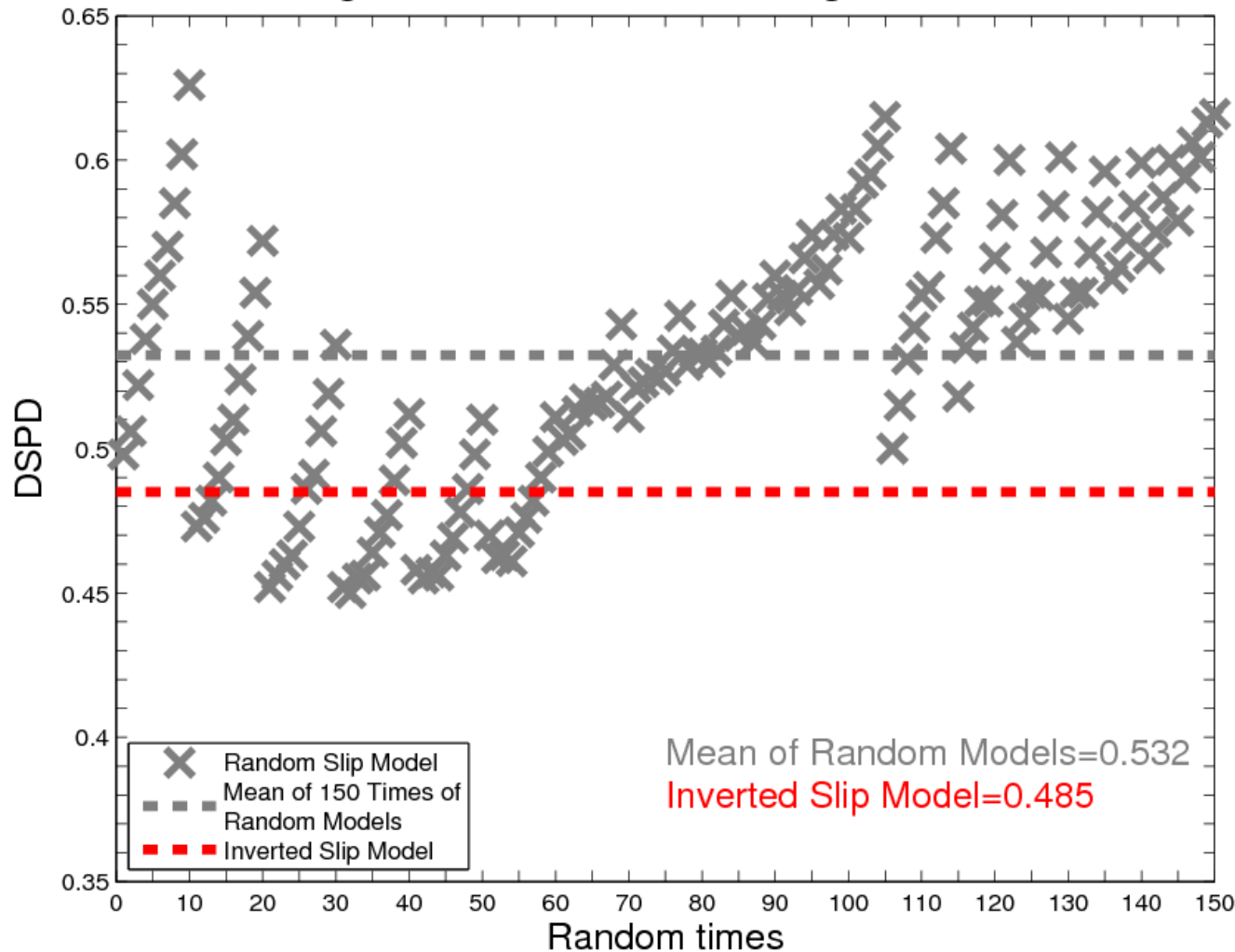


(Modified from
Ma et al., 2001)

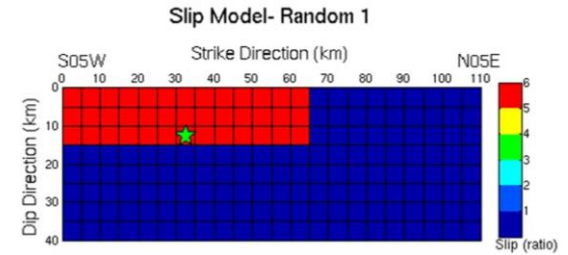


Applications- identify possible ground motion range from random asperity model

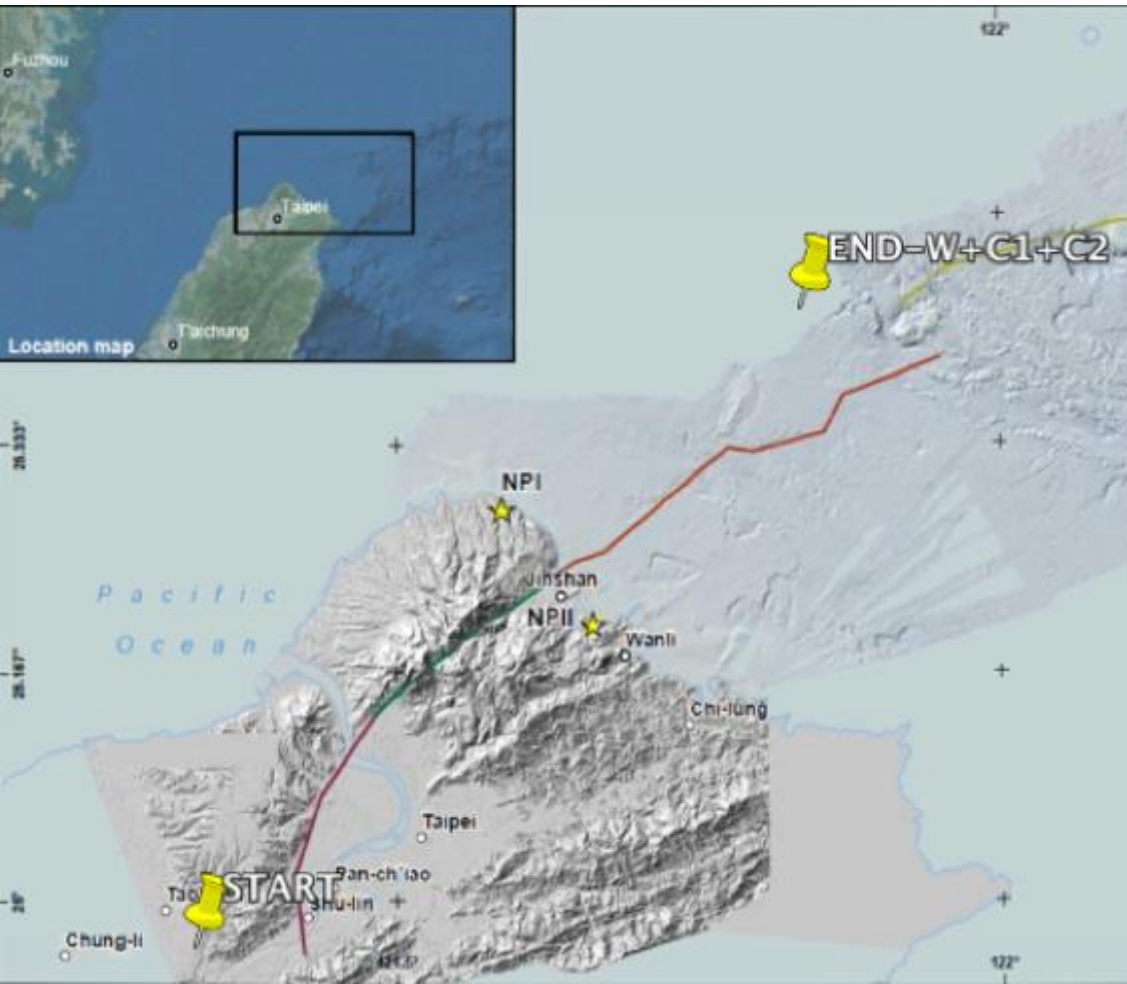
Average DSPD in TAP,TCU region for 921 EQ



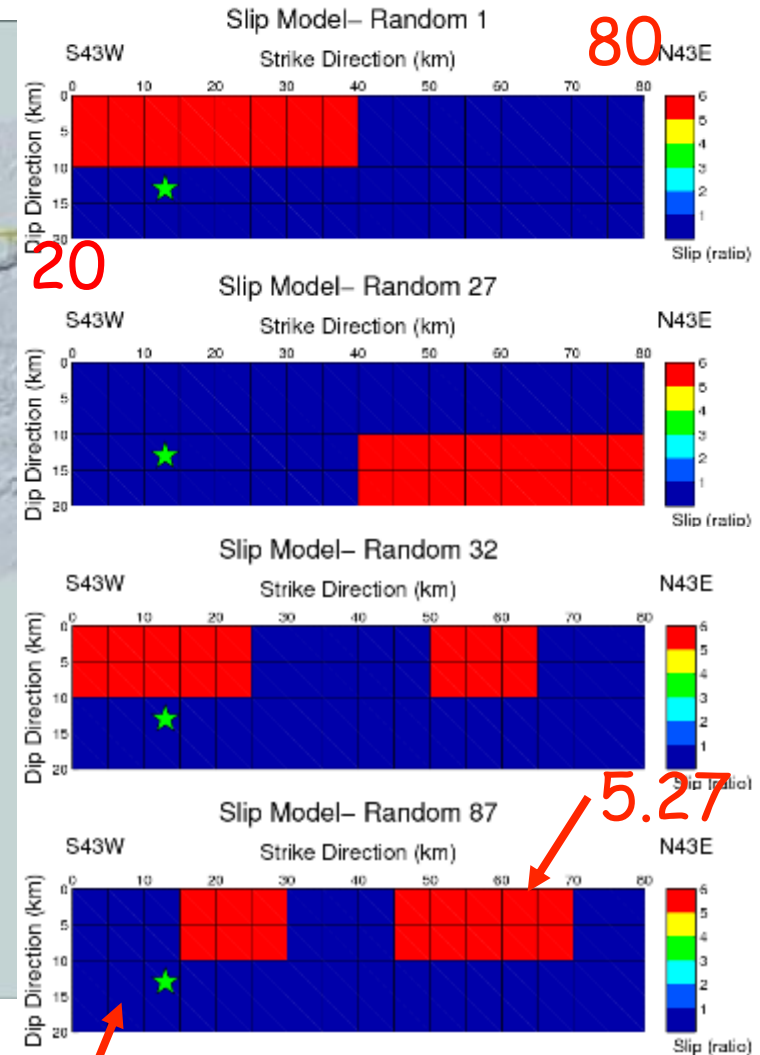
(Modified from
Ma et al., 2001)



Applications- identify possible ground motion range from random asperity model

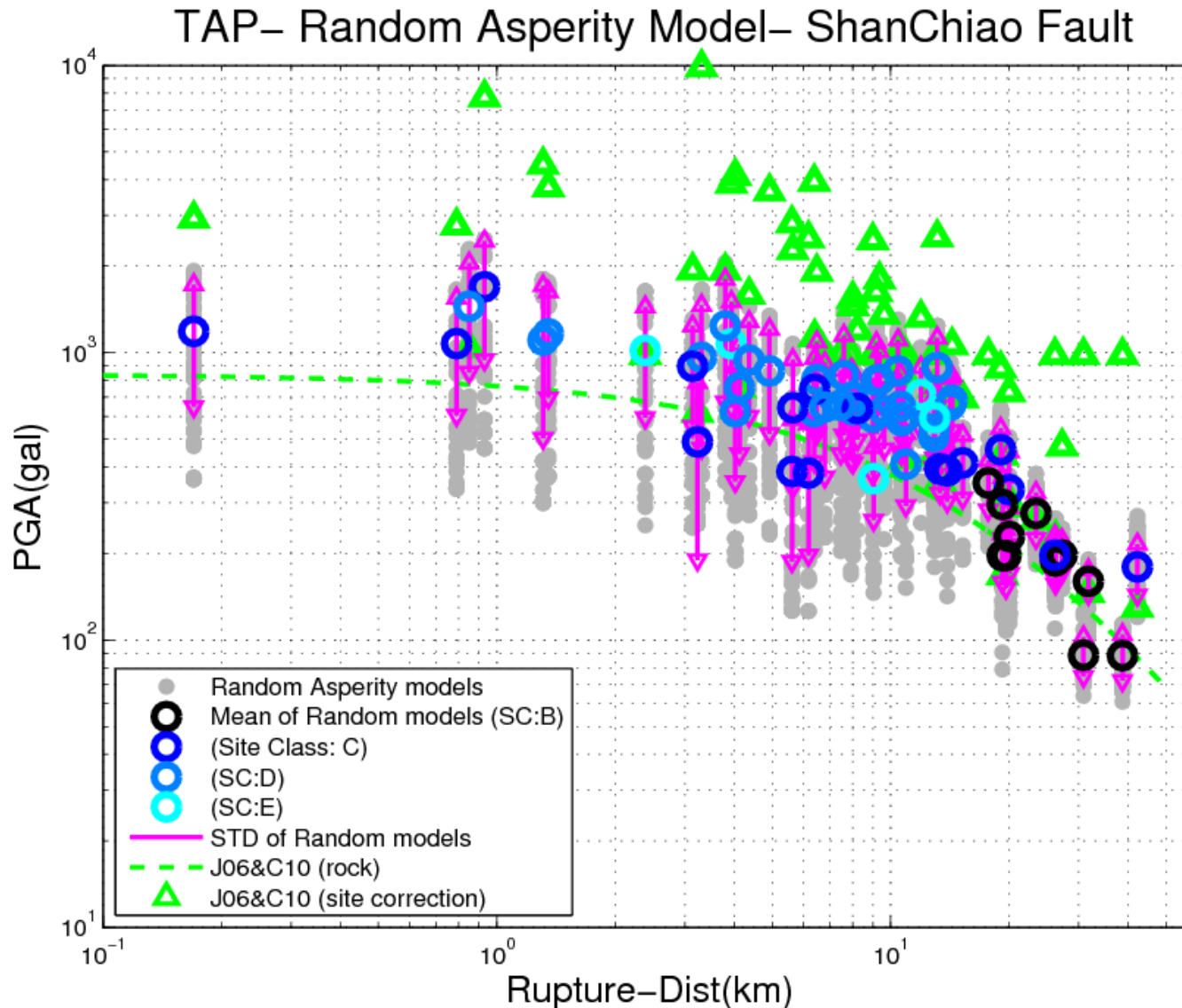


$M_w=7.15$



Slip Ratio for each subfaults= 1

Applications- identify possible ground motion range from random asperity model



Applications- applied to EEW in SANTA from grid search point source simulation

Load Time : Tue Nov 14 03:07:47 2017

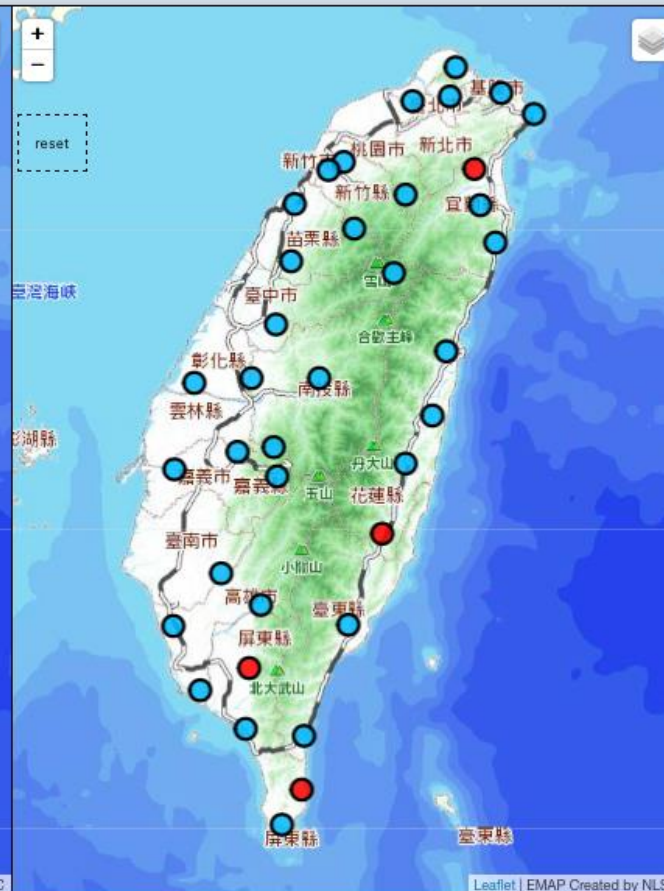
Seismic Array of NCREE in TAIwan
(SANTA)



CWB data link

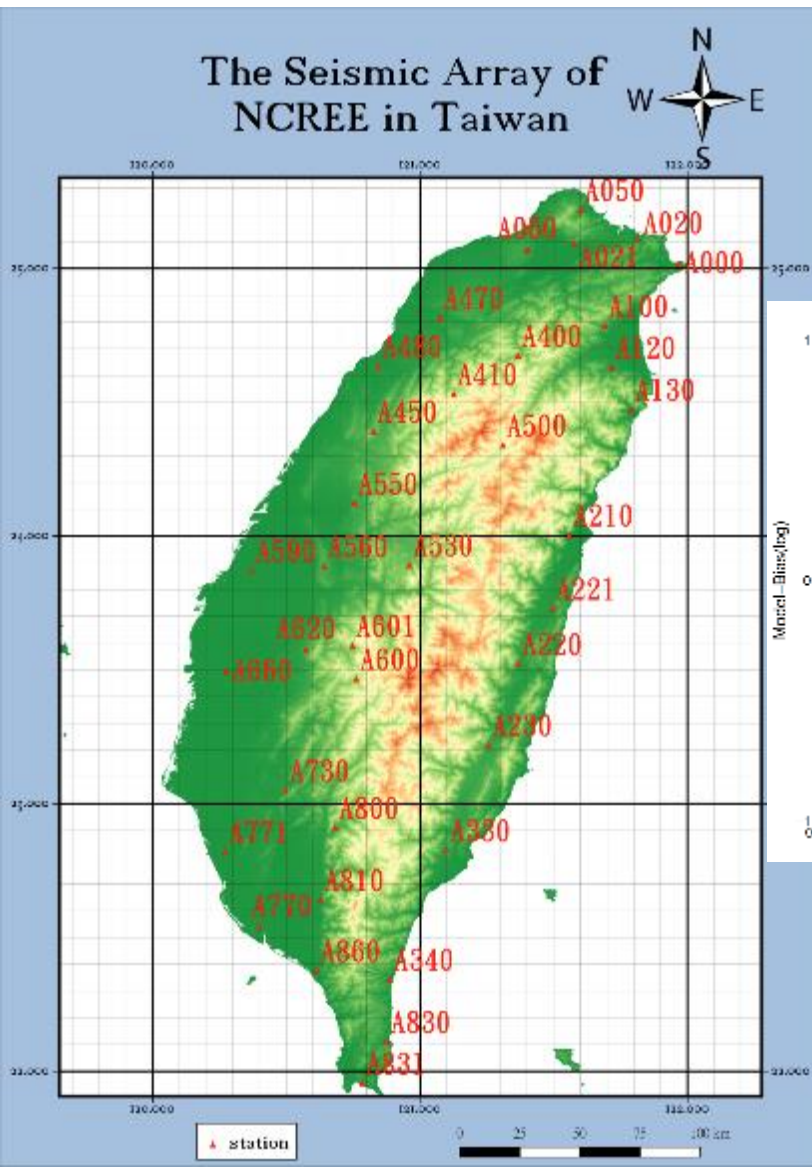
Strong Motion (SM)

Broadband (BB)



A000	A480	B000	
A020	A500	B020	B500
A021	A530	B021	B530
A050	A550	B050	B550
A060	A560	B060	B560
A100	A590	B100	
A120	A600	B120	B600
A130	A601	B130	B601
A210	A620	B210	B620
A220	A660	B220	B660
A221	A730	B221	B730
A230	A770	B230	B770
A330	A771	B330	
A340	A800	B340	B800
A400	A810	B400	B810
A410	A830	B410	B830
A450	A831	B450	B831
A470	A860	B470	B860
A471		B471	

Applications- applied to EEW in SANTA from grid search point source simulation



Grid Scheme:

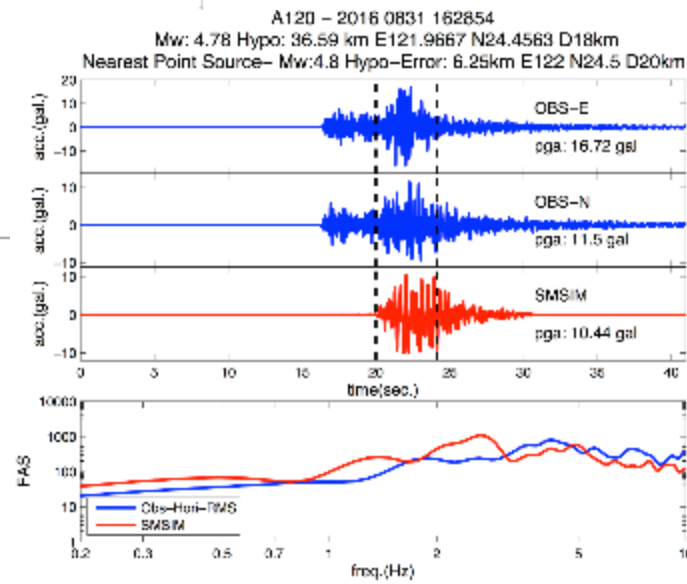
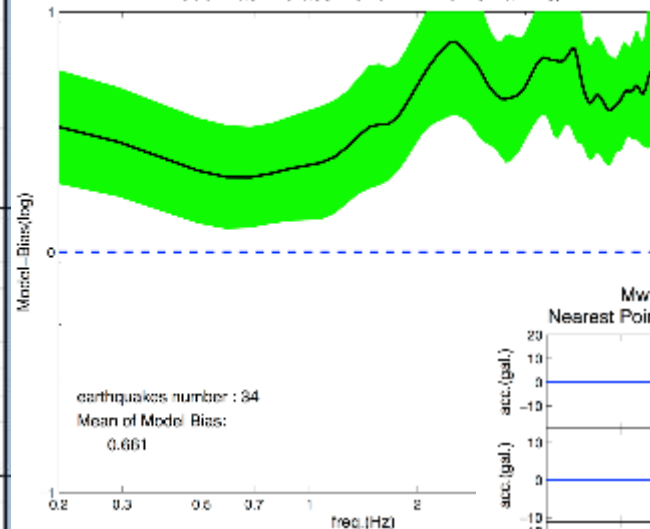
Size- 10km*10km*5km (Depth to 60km)

Mw- 4.0-7.0 (0.2 interval)

Source numbers for one station:

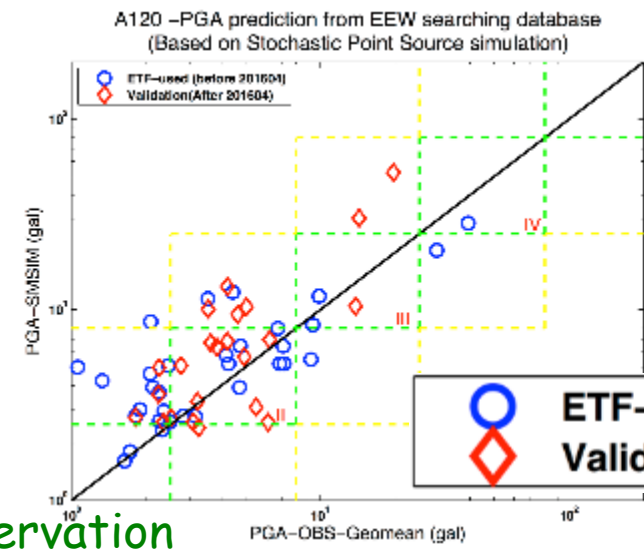
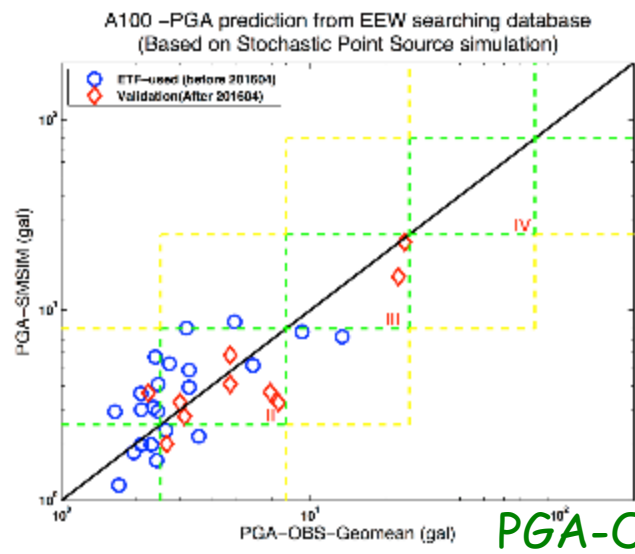
300 288

ModelBias - Class None - A120- small EQ.



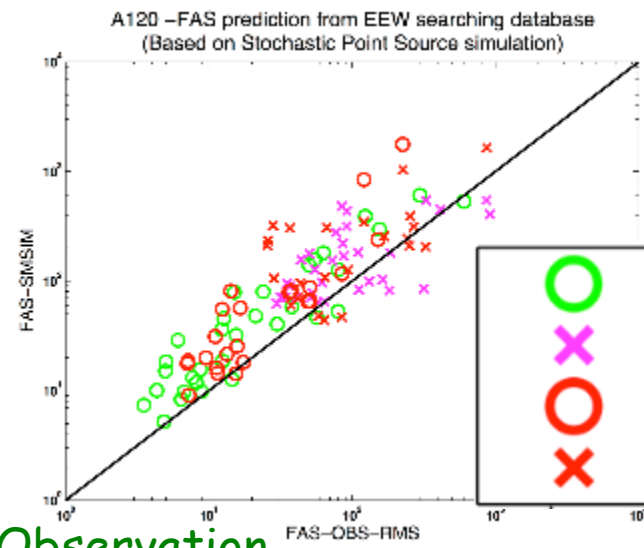
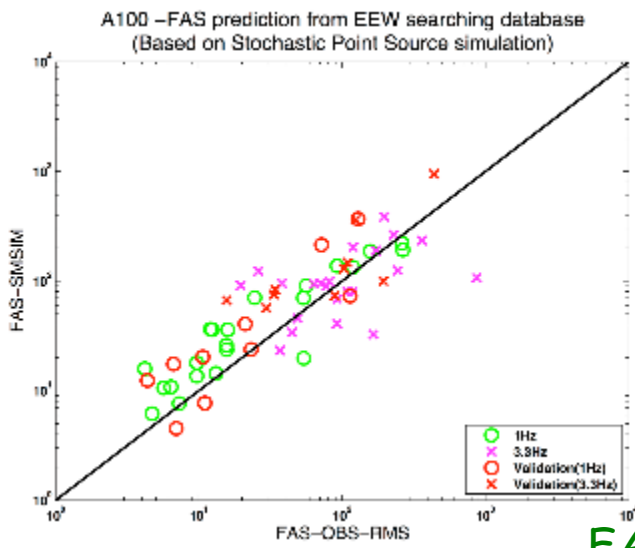
Applications- applied to EEW in SANTA from grid search point source simulation

PGA-SMSIM



PGA-Observation

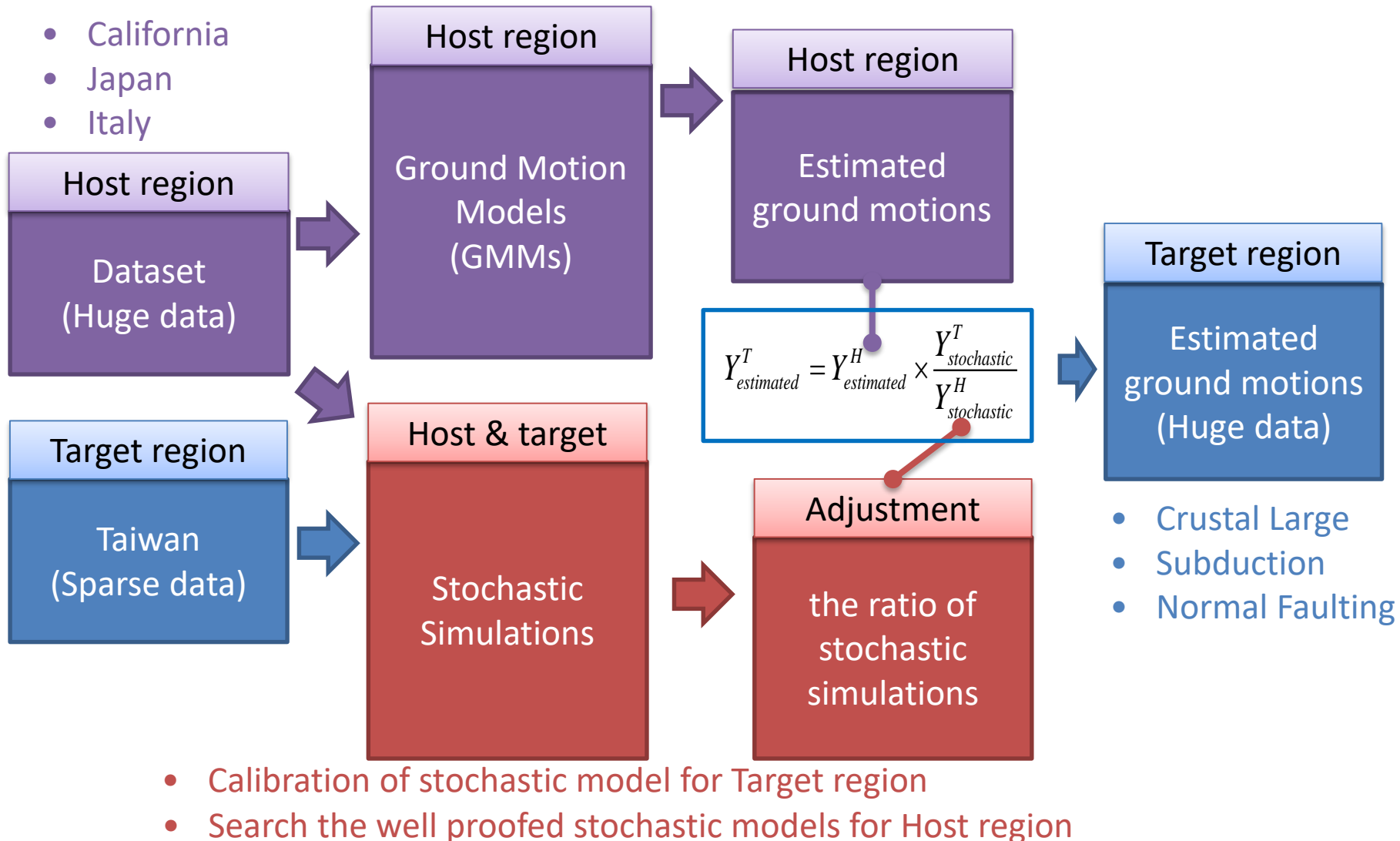
FAS-SMSIM



FAS-Observation

Applications- host to target adjustment factor for GMPE

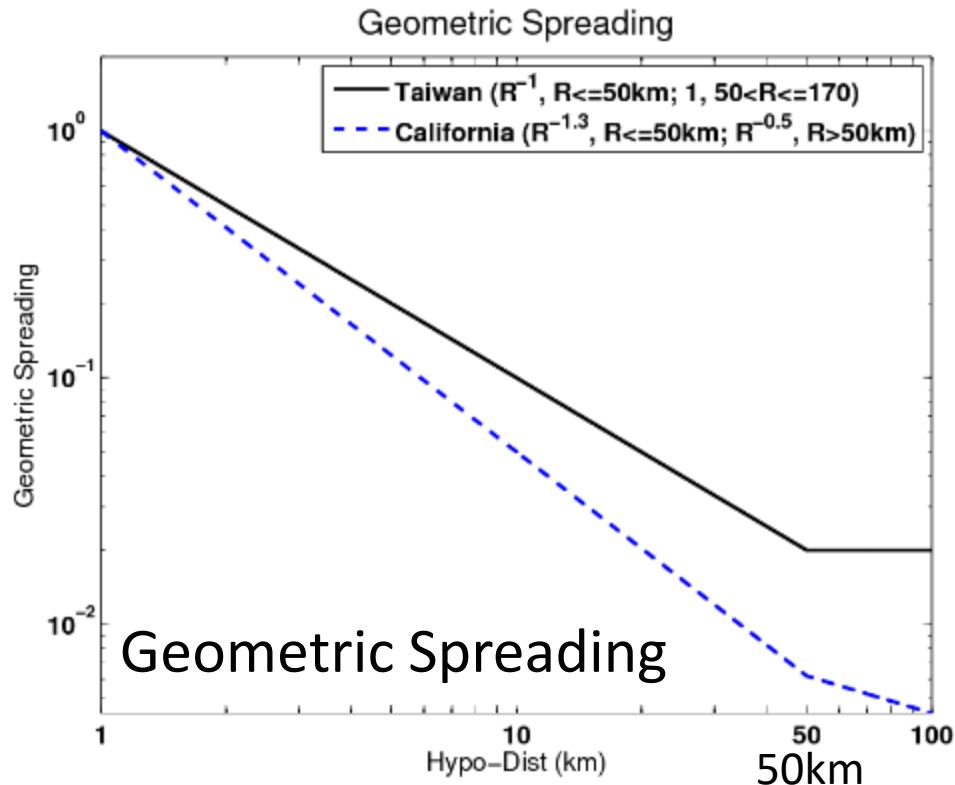
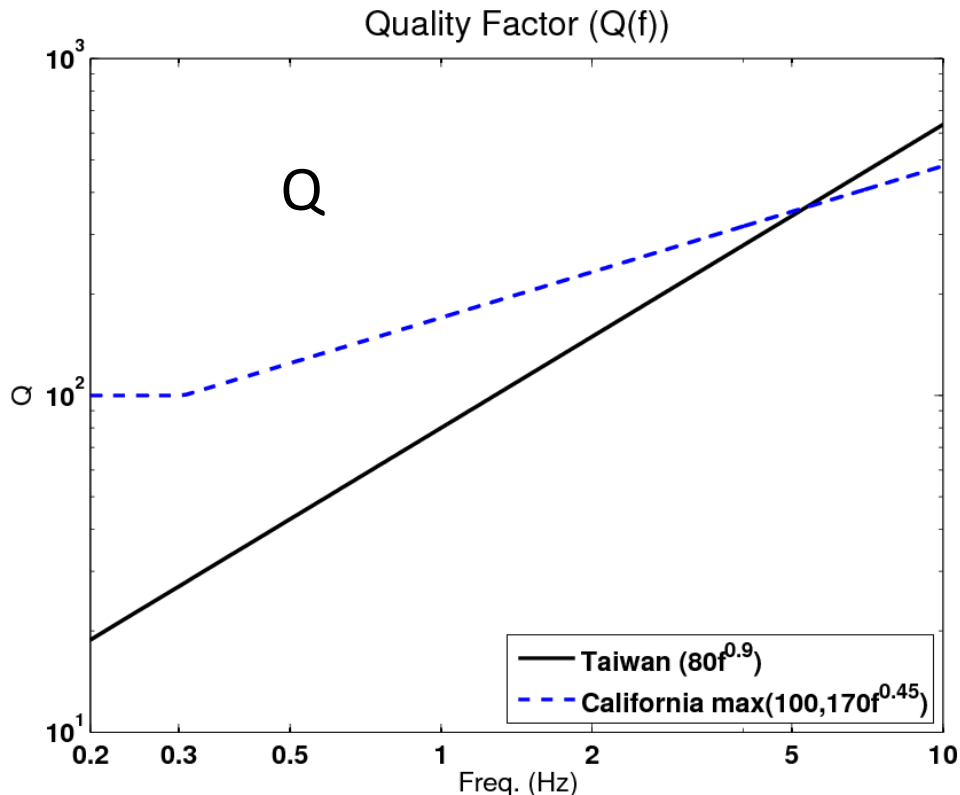
Hybrid Empirical Method (HEM)



Applications- host to target adjustment factor for GMPE

*From Stochastic Simulation models

Case study for shallow earthquake of **California & Taiwan**



Faster attenuation from California against Taiwan

Applications- host to target adjustment factor for GMPE

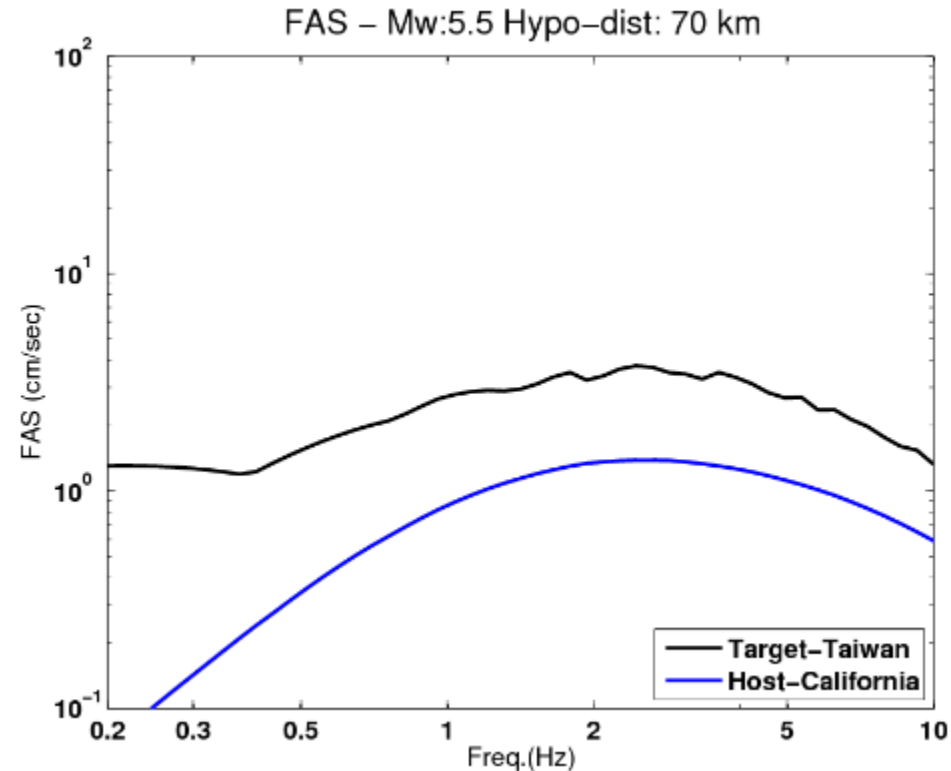
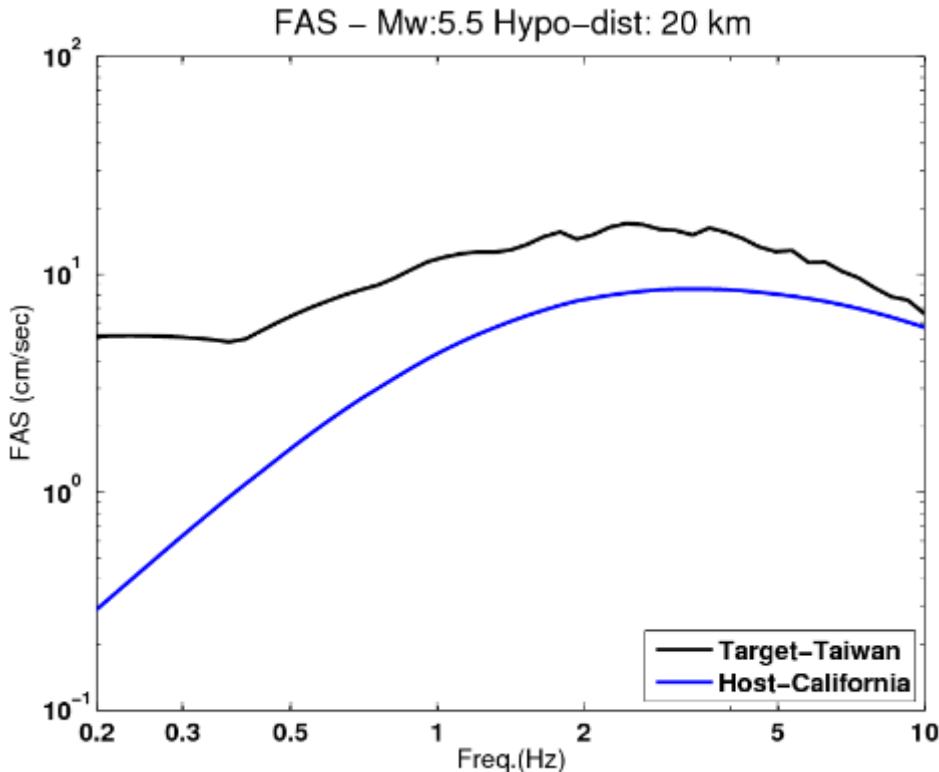
*From Stochastic Simulation models

Case study for shallow earthquake of **California & Taiwan**



Mw 5.5 Hypo-Dist: 20km

Mw 5.5 Hypo-Dist: 70km



FAS of Ground motion simulation were larger in Taiwan than in California in 0.2-10 Hz.

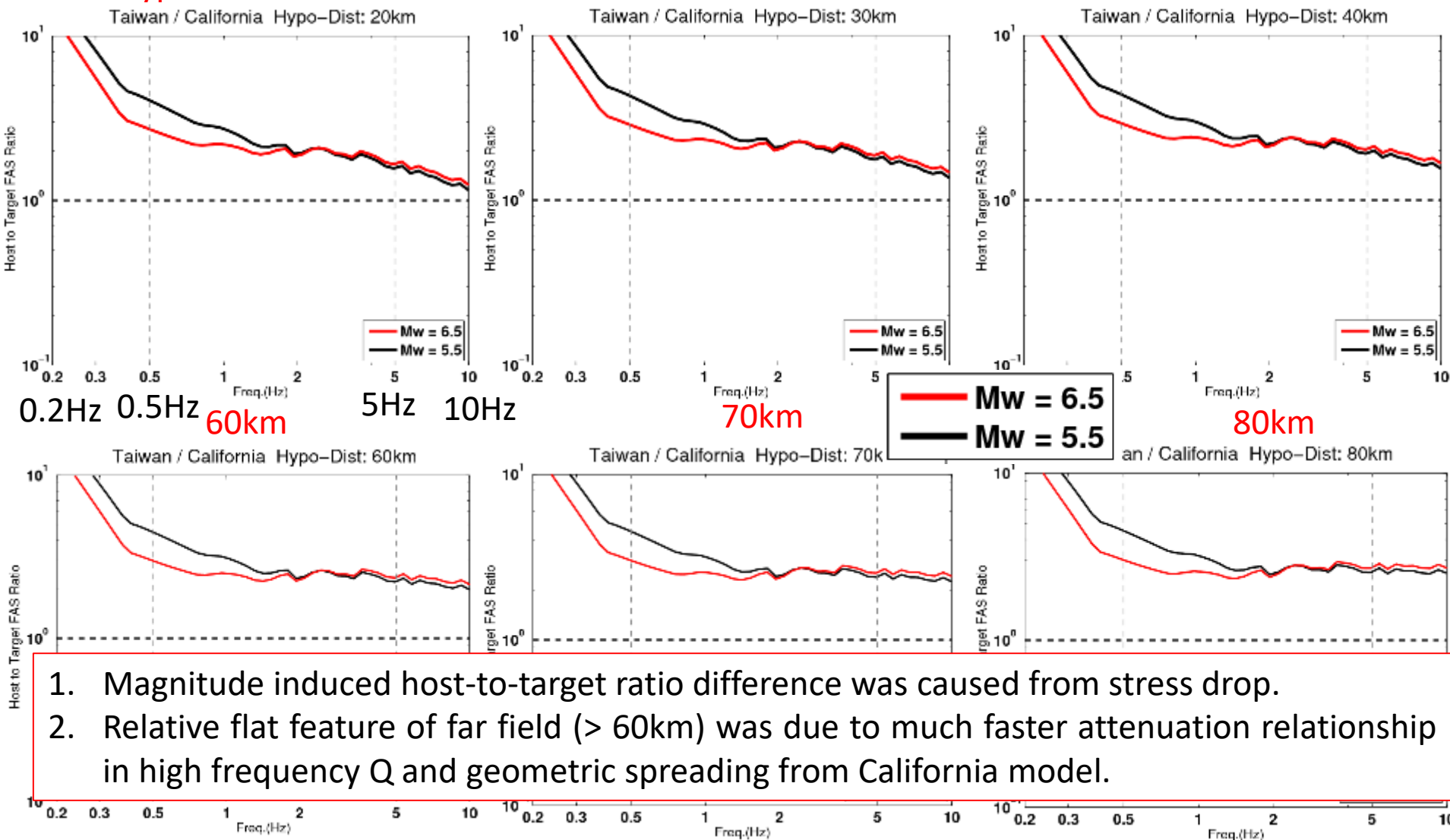
Applications- host to target adjustment factor for GMPE

*From Stochastic Simulation models Case study for shallow earthquake of Taiwan / California

Hypo-Dist 20km

30km

40km

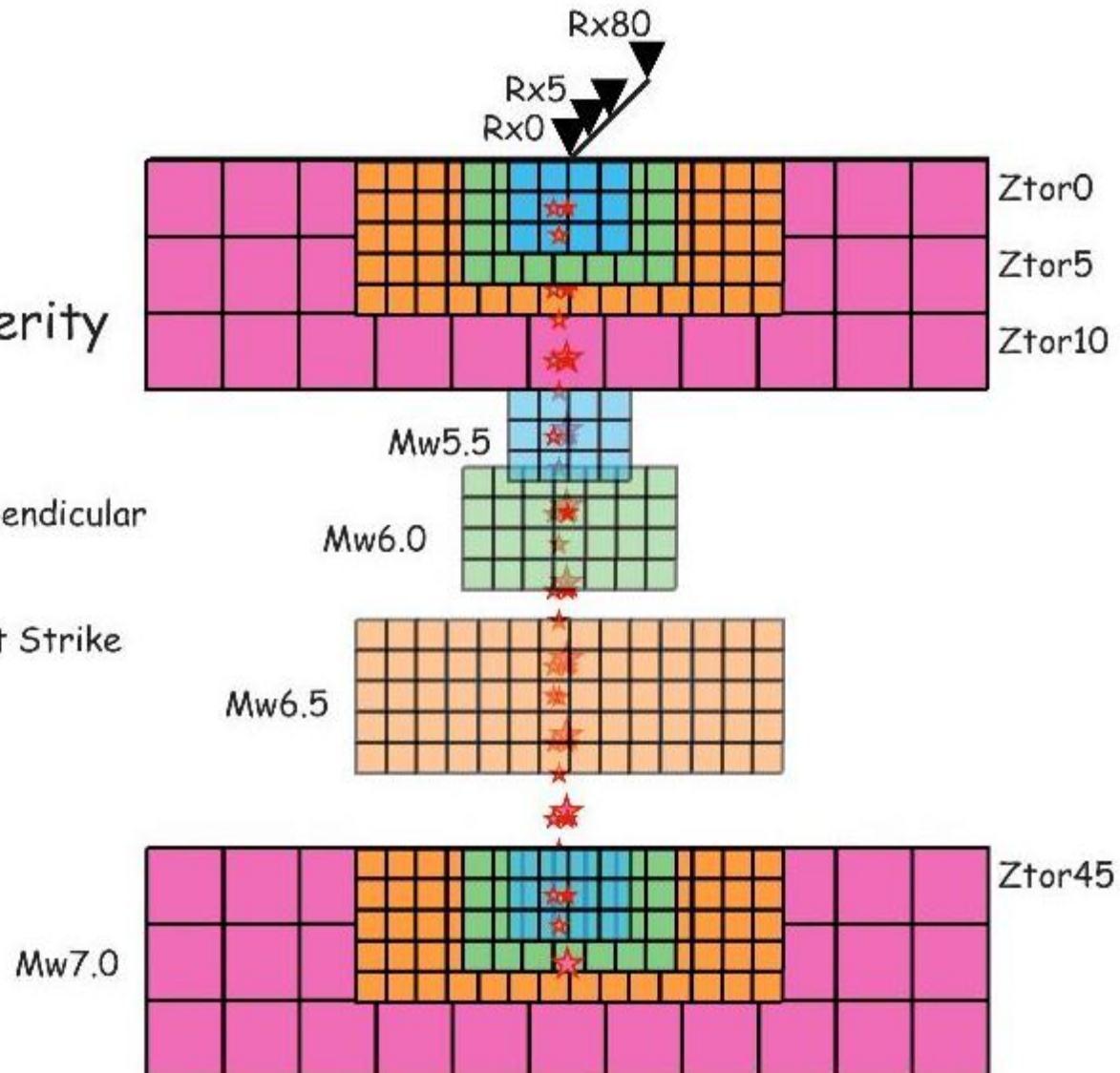


1. Magnitude induced host-to-target ratio difference was caused from stress drop.
2. Relative flat feature of far field (> 60km) was due to much faster attenuation relationship in high frequency Q and geometric spreading from California model.

Applications- simulating depth scaling relation for GMPE

Strike Slip
equally distributed asperity

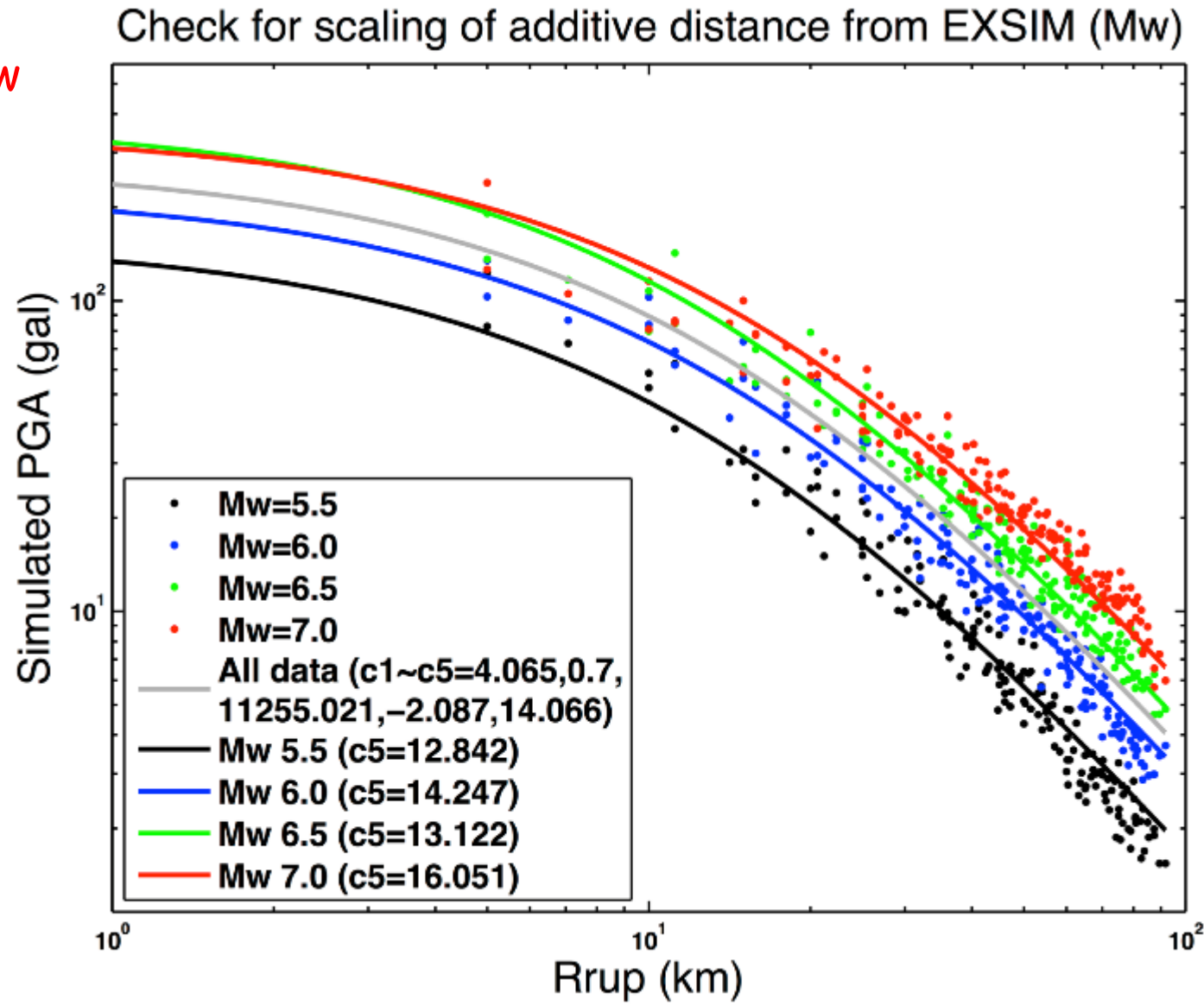
Fault Perpendicular
Fault Strike



Applications- simulating depth scaling relation for GMPE

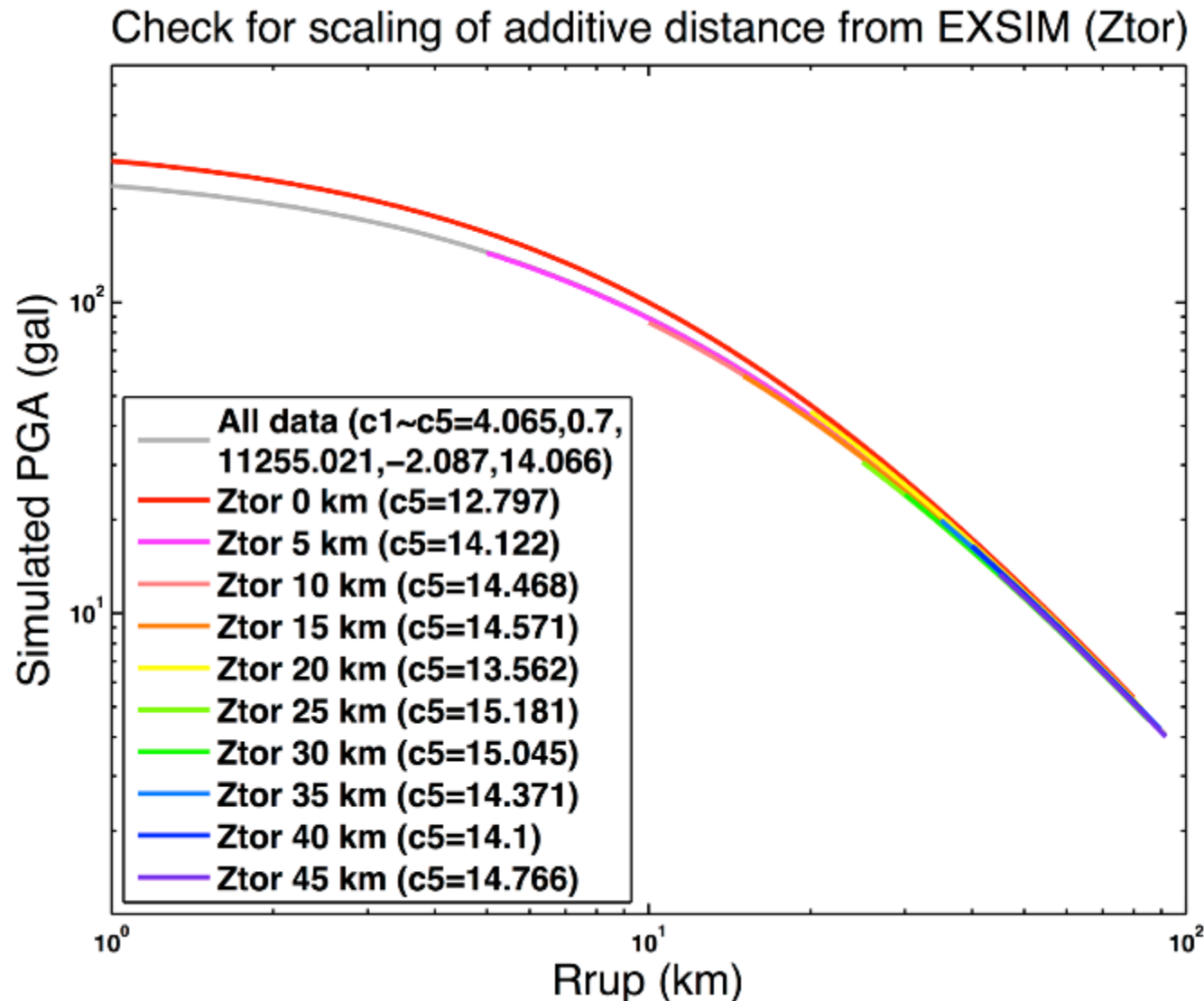
Relation with Mw
(PGA)

1. $c_1 \sim c_5$ are fitted from all data first.
2. Fix $c_1 \sim c_4$, regress c_5 for different dataset



Applications- simulating depth scaling relation for GMPE

Relation with Ztor
(PGA)



Applications- simulating depth scaling relation for GMPE

Range of case Ry

Greater than average

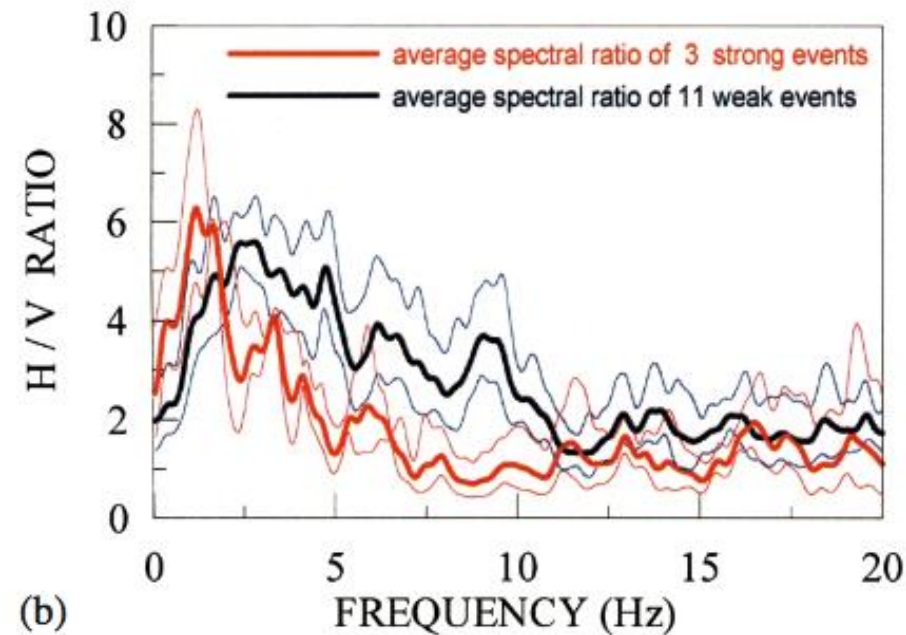
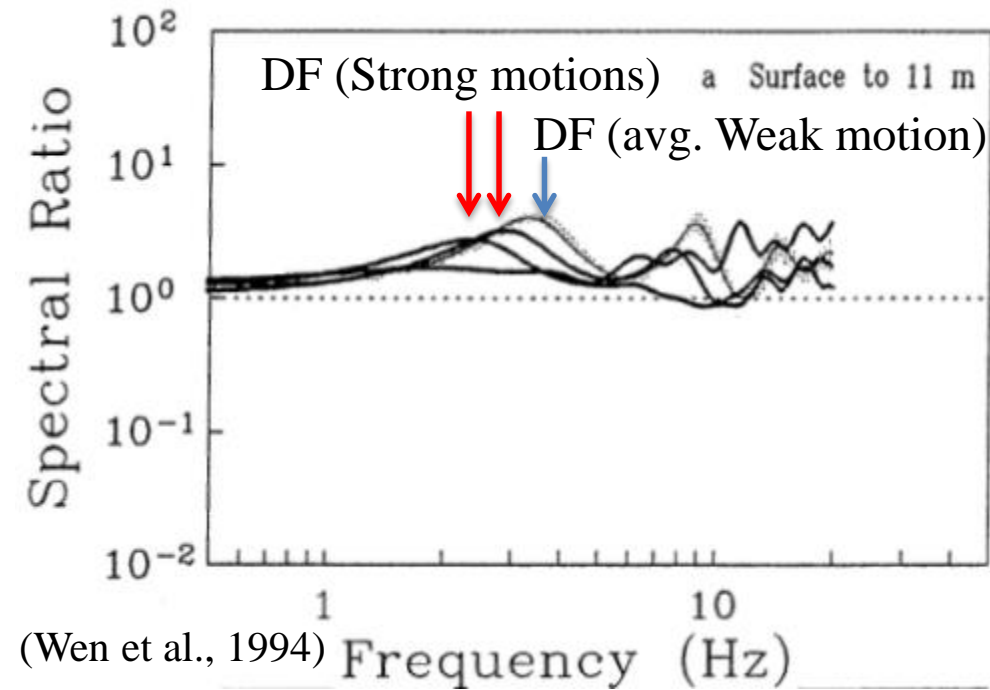
Lower than average

c5 value	All data	Mw 5.5	Mw 6.0	Mw 6.5	Mw 7.0	
PGA	14.1	12.8	14.2	13.1	16.1	14.9-17.1
PSA 0.2 sec	16.2	15.2	16.3	15.6	17.8	18.2-20.1
PSA 2 sec	13.5	12.4	13.6	12.9	14.9	15.8-17.6

c5 value	Ztor 0	Ztor 5	Ztor 10	Ztor 15	Ztor 20	
PGA	12.8	14.1	14.5	14.5	13.6	14.7-17
PSA 0.2 sec	14.7	16.1	16.6	16.6	16.7	17.8-19.7
PSA 2 sec	12.0	13.5	13.8	13.8	14.0	15.4-17.4

c5 value	Ztor 25	Ztor 30	Ztor 35	Ztor 40	Ztor 45
PGA	15.2	15.0	14.4	14.1	14.8
PSA 0.2 sec	16.7	16.7	16.8	17.1	17.3
PSA 2 sec	13.7	13.9	14.1	14.3	14.7

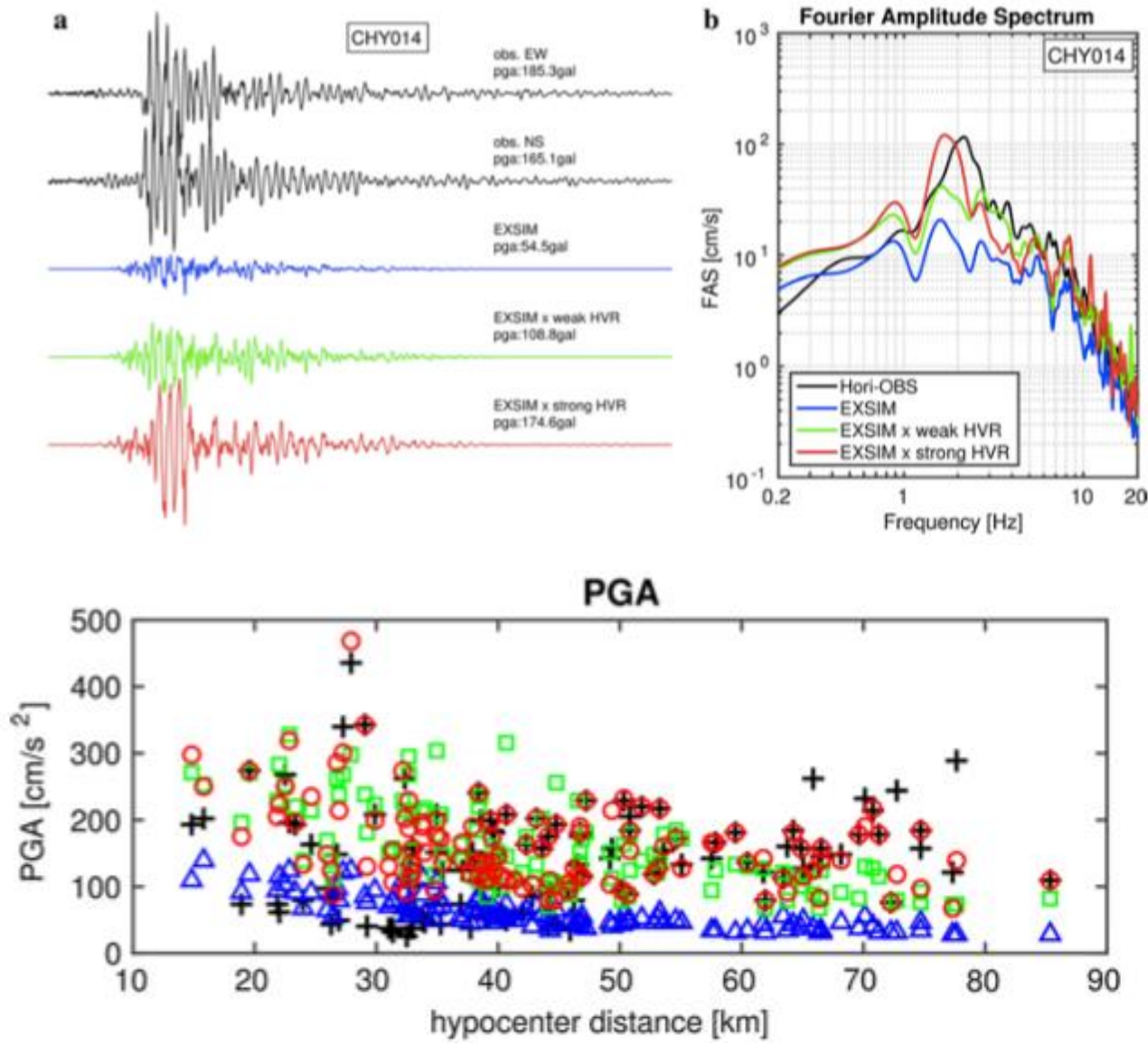
Applications-High Frequency Ground Motion Simulation (with nonlinearity)



Dominant frequency (DF) drop from LSST array in Taiwan using spectral ratio method (Soil to Rock).

DF drop & de-amplification of high frequency from LSST array in Taiwan using HVSR.

Applications-High Frequency Ground Motion Simulation (with nonlinearity)



Observation

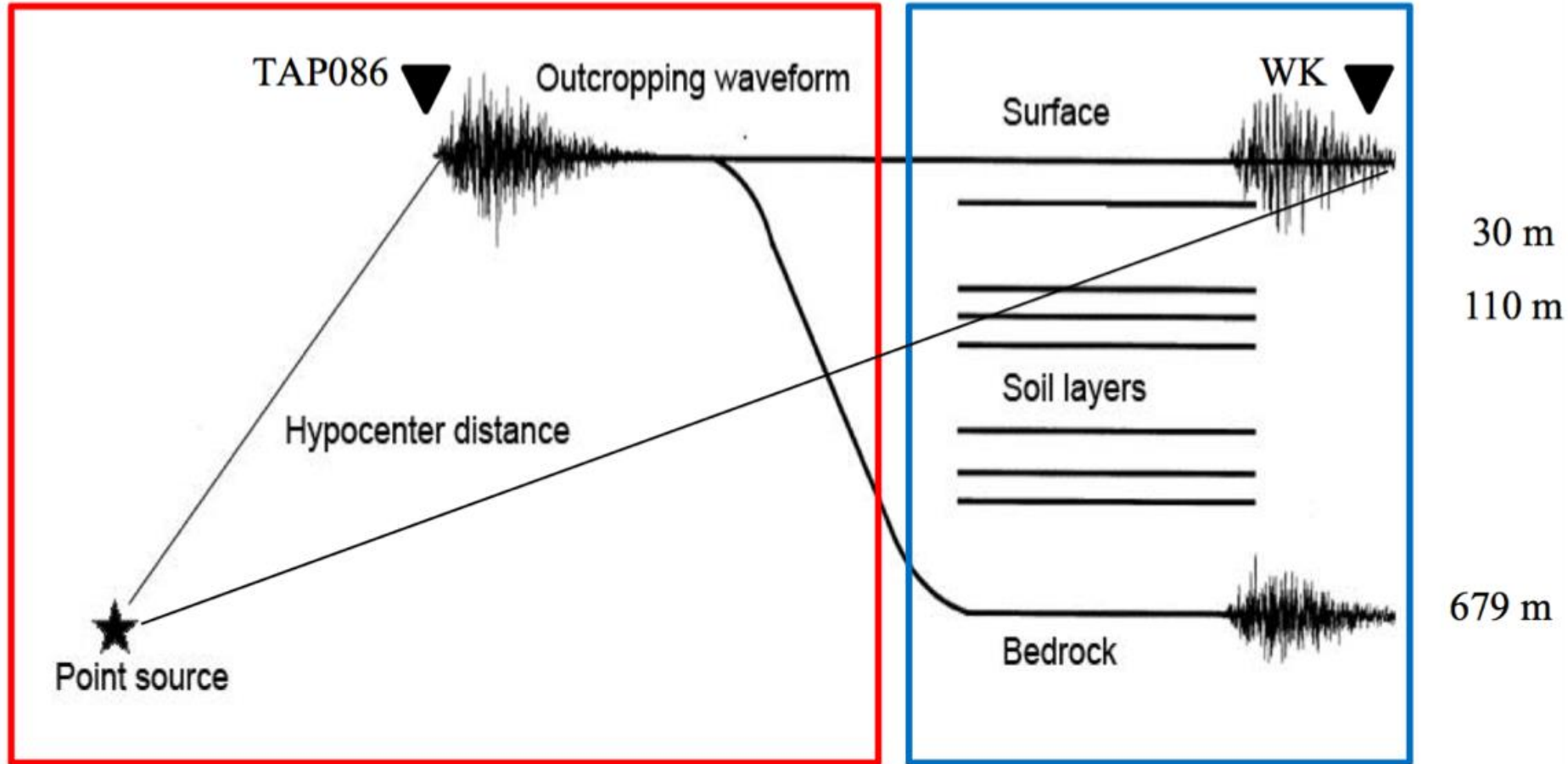
VHR Simulation

Site Correction with
HVSr of weak motions

Site Correction with
HVSr of main shock

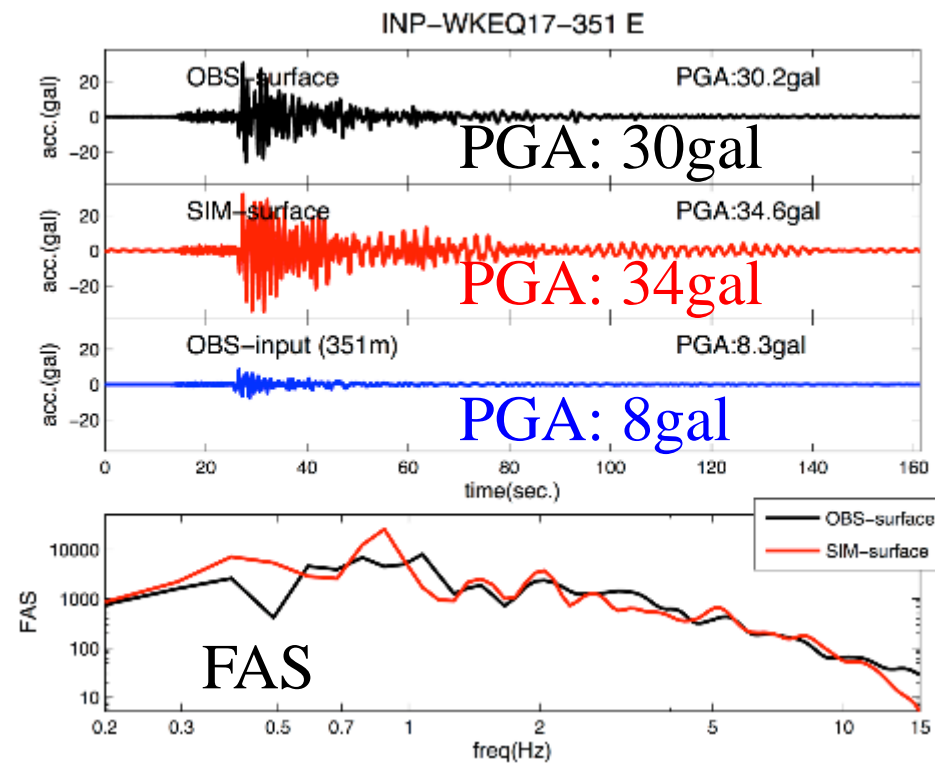
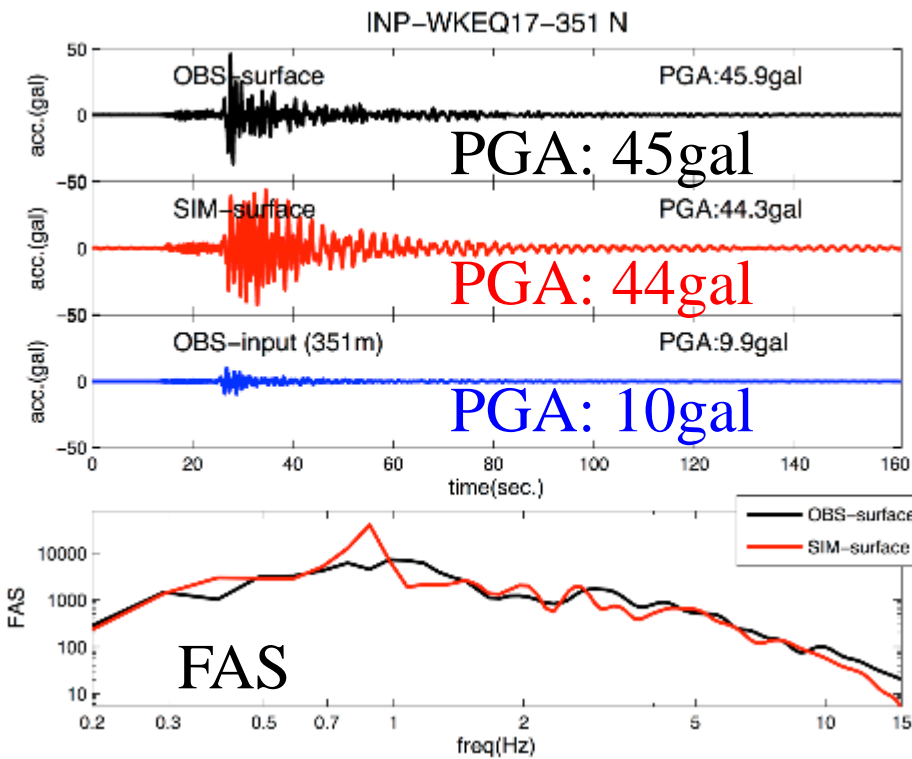
(Chen et al., 2017)

Applications-High Frequency Ground Motion Simulation (with nonlinearity)



Applications-High Frequency Ground Motion Simulation (with nonlinearity)

Validation of structures of WK downhole from equivalent linear method



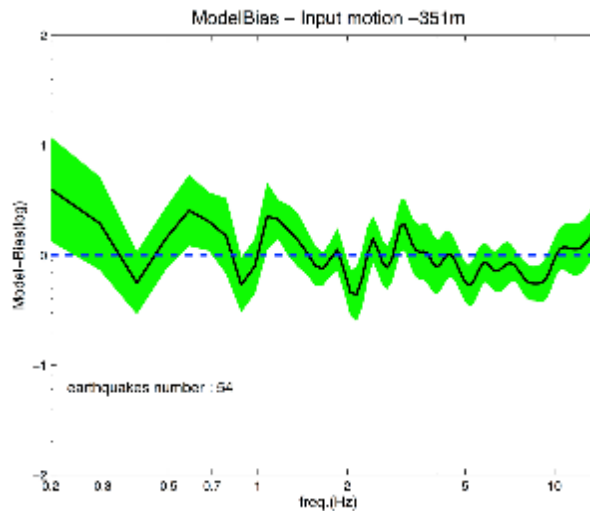
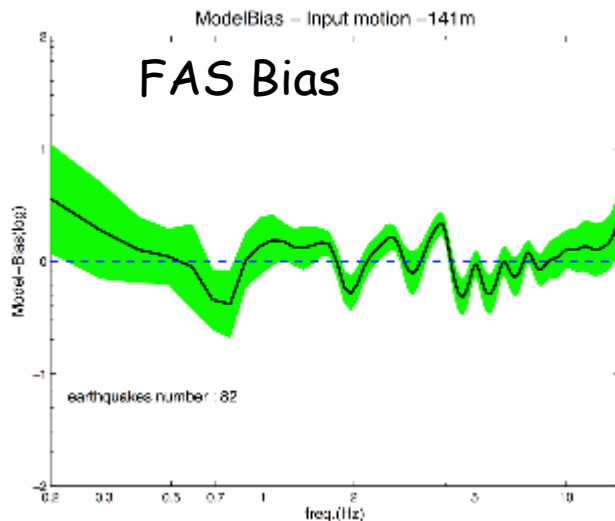
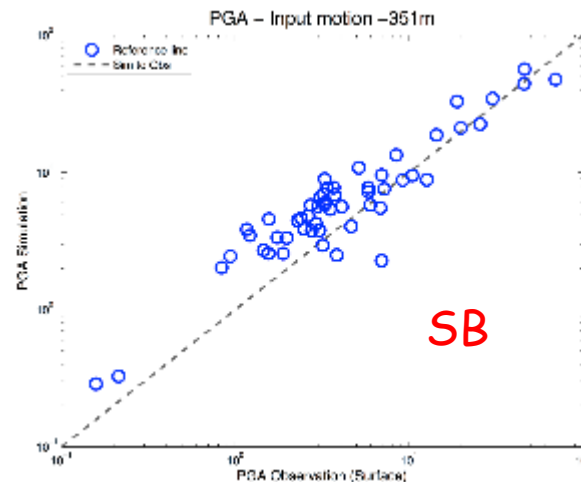
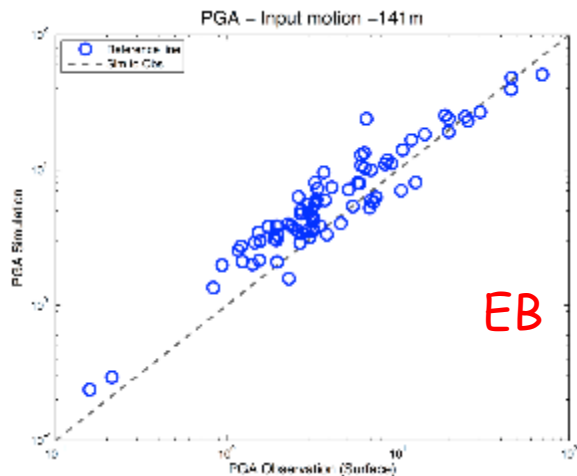
Observation (free field)

Simulation (to free field)

Input Motion (Observation, SB)

Applications-High Frequency Ground Motion Simulation (with nonlinearity)

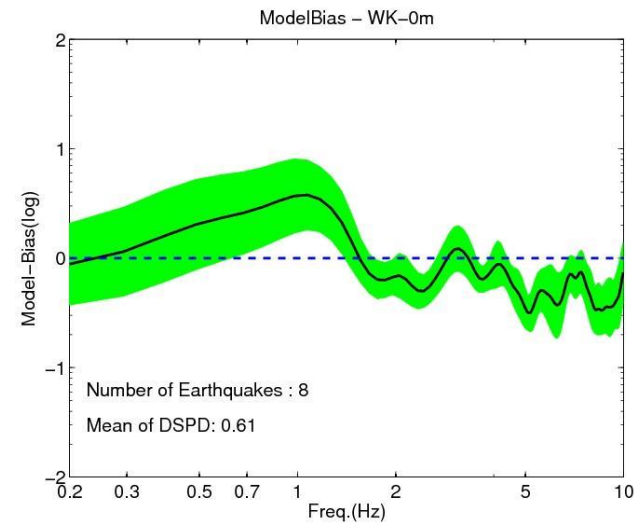
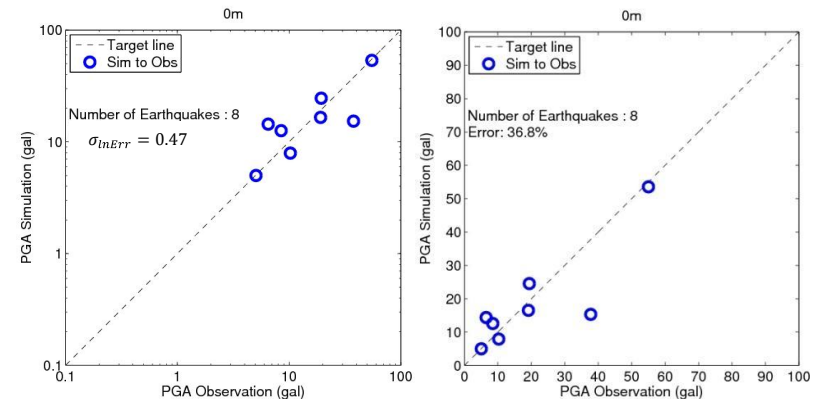
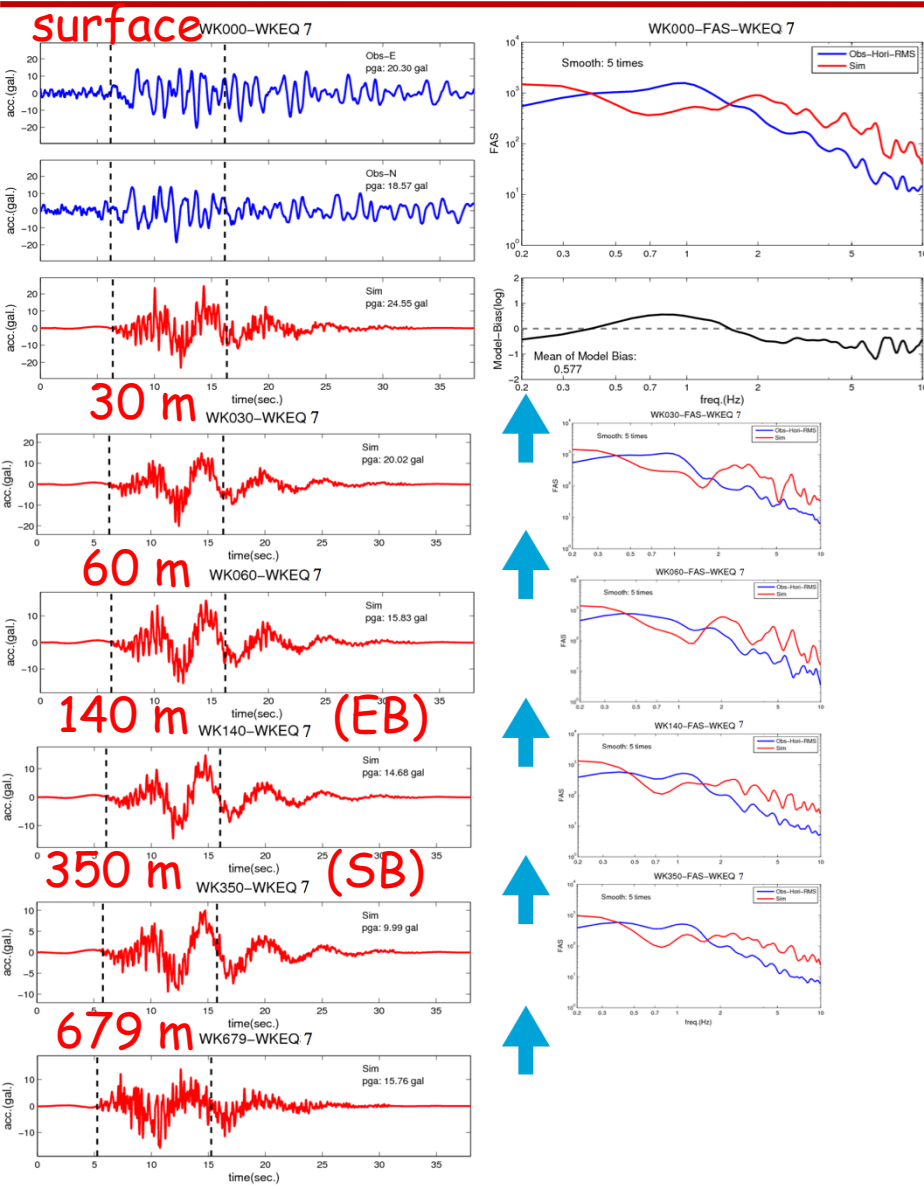
Input motion from observation in SB-351m and EB-141m



Velocity and geological structure were suitable for WK borehole to predict ground motion from both EB and SB

Applications-High Frequency Ground Motion Simulation (with nonlinearity)

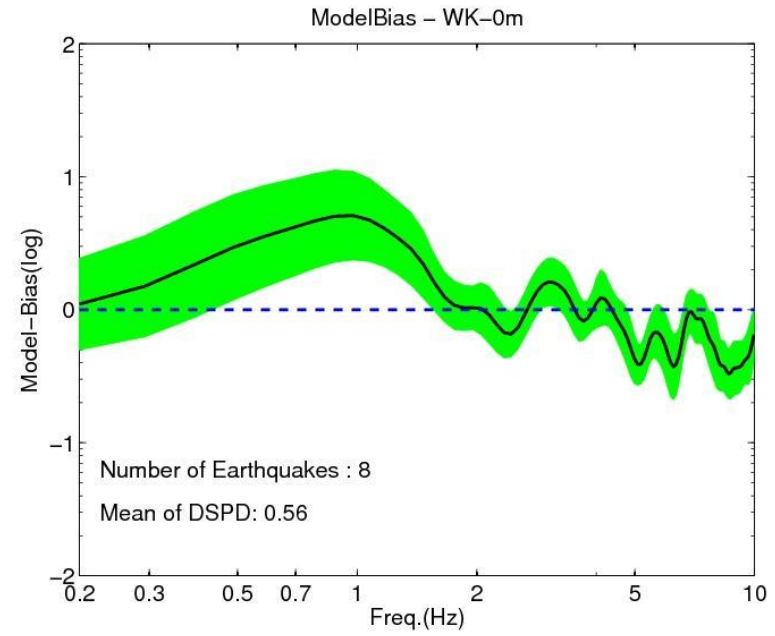
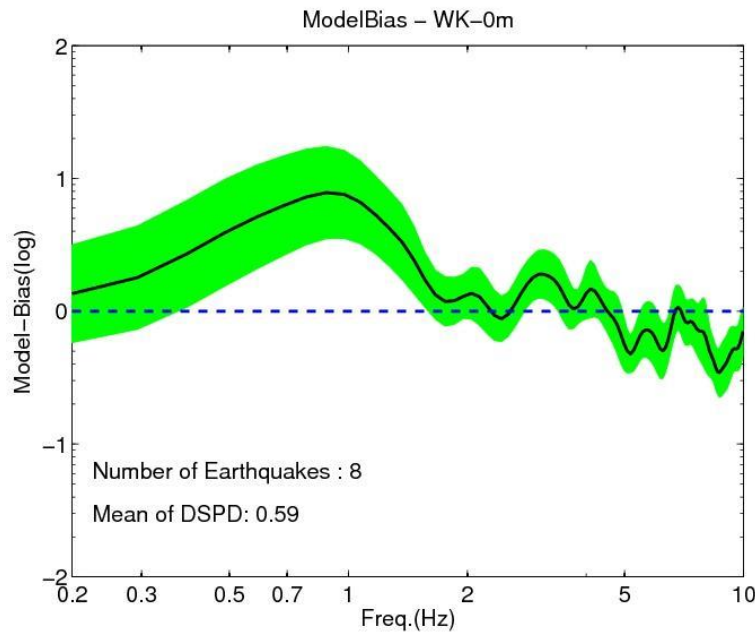
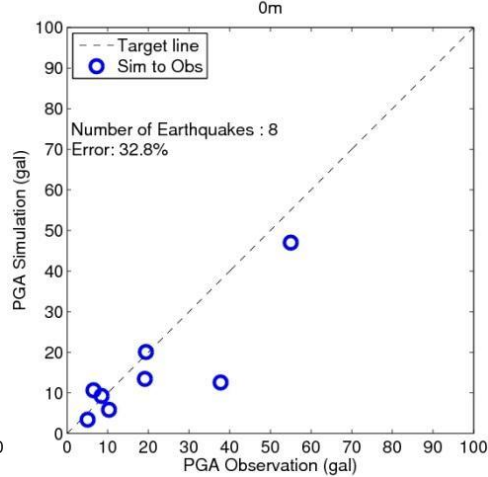
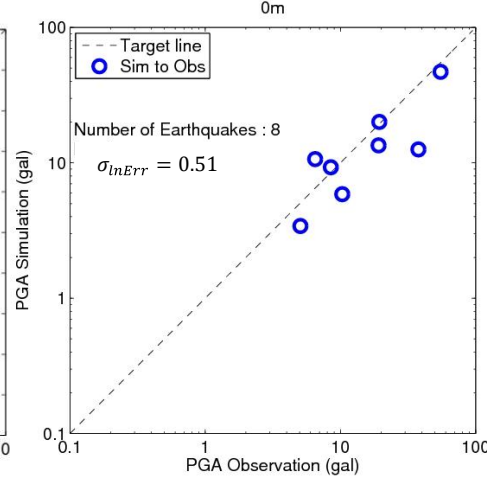
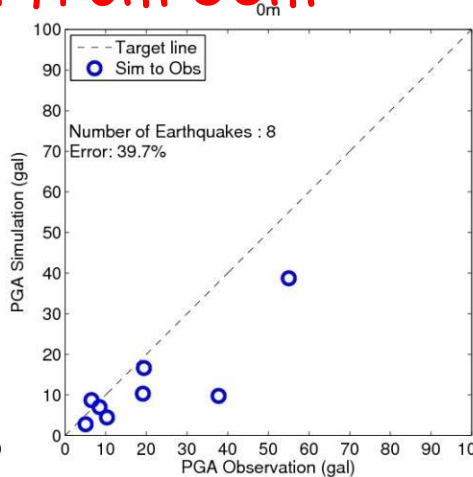
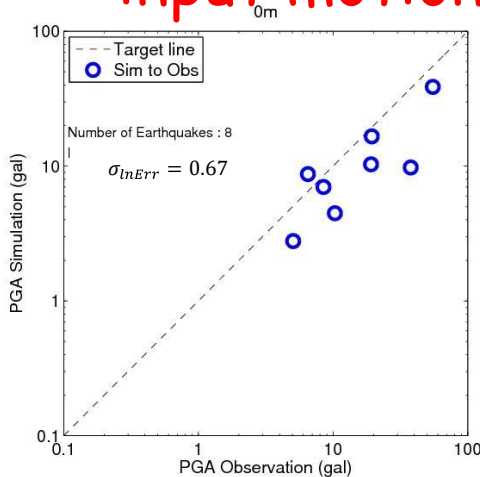
Example of simulations, input motion from SMSIM on geological bedrock (679m)



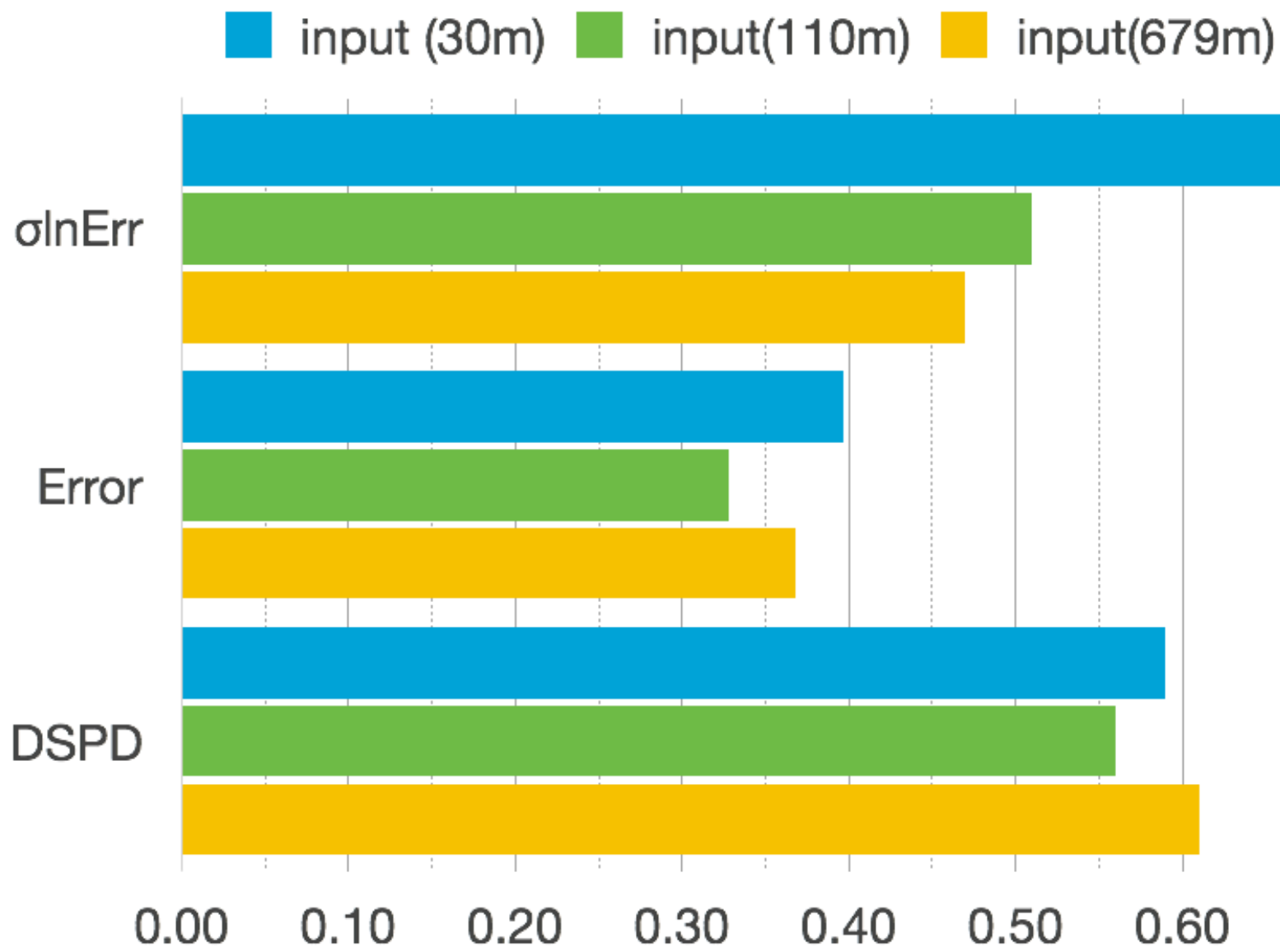
Applications-High Frequency Ground Motion Simulation (with nonlinearity)

input motion from 30m

from Engineering bedrock (EB) (110m)



Applications-High Frequency Ground Motion Simulation (with nonlinearity)



Thanks for your attention

Applications- host to target adjustment factor for GMPE

Acceleration spectrum

$$Y(M_0, R, f) = E(M_0, f)P(R, f)G(f)$$

$$E(M_0, f) = \text{Const} \cdot M_0 S(M_0, f) \quad S(M_0, f) = \frac{4\pi^2 f^2}{R_1(1 + (f/f_0)^2)}$$

Source term

$$f_0 = 4.9 \times 10^6 \beta (\Delta\sigma/M_0)^{1/3}$$

$$\log_{10} M_0 = 1.5M_w + 16.1$$

$$\text{Const} = \frac{R_{\theta\phi} \cdot V \cdot F}{4\pi\rho\beta^3} = \frac{0.777818e^{-20}}{4\pi\rho\beta^3}$$

$$P(R, f) = \exp[-\pi f R / Q(f) \beta]$$

Path term

$$G(f) = \text{Amp}(f) \text{Damp}(f)$$

Site term

$$\text{Amp}(f) = Af^3 + Bf^2 + Cf + D$$

$$\text{Damp}(f) = e^{-\pi\kappa_0 f}$$

Applications- host to target adjustment factor for GMPE

Acceleration spectrum (nature log)

*Levenberg-Marquardt algorithm

$$\ln Y = \ln \left(\frac{\text{Constant}}{4\pi\rho\beta^3} \cdot \frac{\text{Source term}}{R_1(1 + (f/f_0)^2)} \cdot \text{Site term} (Af^3 + Bf^2 + Cf + D) \right) \\ + 2.3 \cdot \underbrace{(1.5M_w + 16.1)}_{\ln(M_0)} - \underbrace{\frac{\pi f R}{Q(f)\beta}}_{\text{Path term}} - \underbrace{\pi\kappa_0 f}_{\text{Site term}}$$

Select inverted parameters (optionally)

Hessian matrix

$$\begin{bmatrix} \frac{\partial^2 \ln y}{\partial Q^2} & \frac{\partial^2 \ln y}{\partial Q \partial \eta} & \frac{\partial^2 \ln y}{\partial Q \partial f_0} & \cdot & \cdot & \frac{\partial^2 \ln y}{\partial Q \partial \kappa_0} \\ \frac{\partial^2 \ln y}{\partial Q \partial \eta} & \frac{\partial^2 \ln y}{\partial \eta^2} & \frac{\partial^2 \ln y}{\partial Q \partial \eta} & \cdot & \cdot & \frac{\partial^2 \ln y}{\partial \eta \partial \kappa_0} \\ \frac{\partial^2 \ln y}{\partial Q \partial f_0} & \cdot & \frac{\partial^2 \ln y}{\partial f_0^2} & \cdot & \cdot & \frac{\partial^2 \ln y}{\partial f_0 \partial \kappa_0} \\ \cdot & \cdot & \cdot & \cdot & \cdot & \cdot \\ \frac{\partial^2 \ln y}{\partial Q \partial \kappa_0} & \cdot & \cdot & \cdot & \cdot & \frac{\partial^2 \ln y}{\partial \kappa_0^2} \end{bmatrix}$$

Partial differential for each parameters

$(Q, \eta, \beta, \rho, R_0, M_w, f_0, \gamma, \kappa_0, R)$

Applications- host to target adjustment factor for GMPE

*Levenberg-Marquardt algorithm

Hessian matrix *
$$\begin{bmatrix} 1+\lambda & 1 & 1 & 1 & 1 & 1 \\ 1 & 1+\lambda & 1 & 1 & 1 & 1 \\ 1 & 1 & 1+\lambda & 1 & 1 & 1 \\ 1 & 1 & 1 & 1+\lambda & 1 & 1 \\ 1 & 1 & 1 & 1 & 1+\lambda & 1 \\ 1 & 1 & 1 & 1 & 1 & 1+\lambda \end{bmatrix}$$

\Rightarrow Covar

Still Hessian form

Manually setting $\lambda = 0.001$

New matrix for next iteration

→ $p_{j+1} = p_j + \beta_{LM}(p_j)$ $P =$ Inverted Parameters

$\beta_{LM}(p) = (\ln Y_{OBS} - \ln Y) \cdot \frac{\partial y}{\partial p}$ $j =$ Iterations

CHISQ
$$\chi^2 = \sum \left(\frac{(\ln Y_{OBS} - \ln Y)^2}{SIGMA^2} \right); SIGMA = 1$$

→ Use Gauss-Jordan method to solve Covar

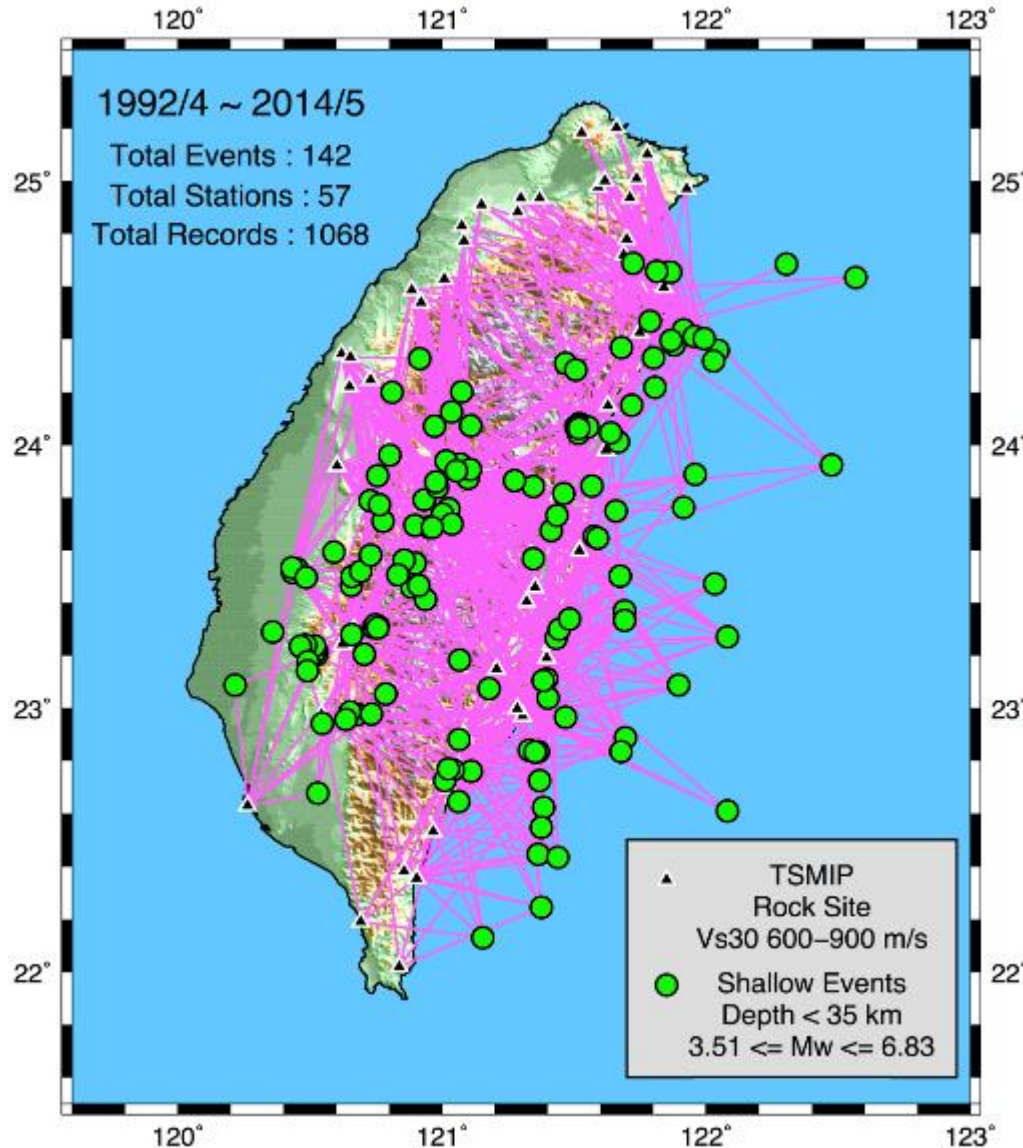
→ Calculate $\ln(Y)_{j+1}$ using p_{j+1}

→ $\lambda_{j+1} = 0.1\lambda_j$; when $\chi^2_{j+1} < \chi^2_j$ $\lambda_{j+1} = 10\lambda_j$; when $\chi^2_{j+1} \geq \chi^2_j$

→ Do while $|\chi^2_j - \chi^2_{j-1}| < tol$ & $|\chi^2_{j-1} - \chi^2_{j-2}| < tol$

Manually setting

Applications- host to target adjustment factor for GMPE



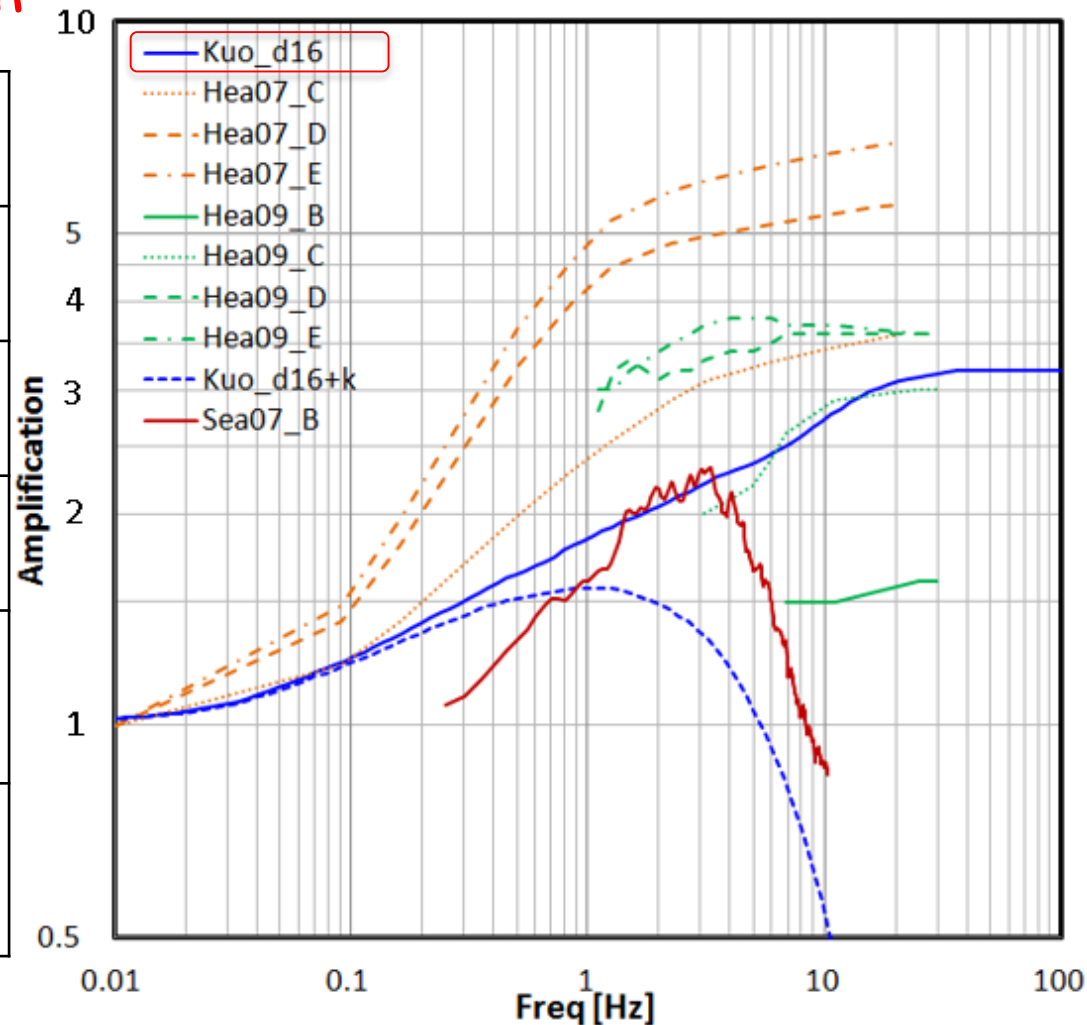
- TSMIP 1992-2014
- $M_w > 3.5$
- $R_{rup} < 100 \text{ km}$
- Rock Site
($600 \leq V_{s30} \leq 900 \text{ m/s}$)
- 142 Events
- 57 Stations
- 1068 FAS records

Applications- host to target adjustment factor for GMPE

Initial Model for inversion

$V_s (\beta)$	3.6 km/s
Density (ρ)	2.8 gm/cc
Q	$80f^{0.7}$
Kappa (κ)	0.0518
Stress drop ($\Delta\sigma$)	100 bar
Geometric spreading	$1/R$

Crustal Amplification Function (depth 16km)



(Kuo et al., 2016, Taiwan SSHAC L3, WM#2)

Applications- host to target adjustment factor for GMPE

Inverted parameters:

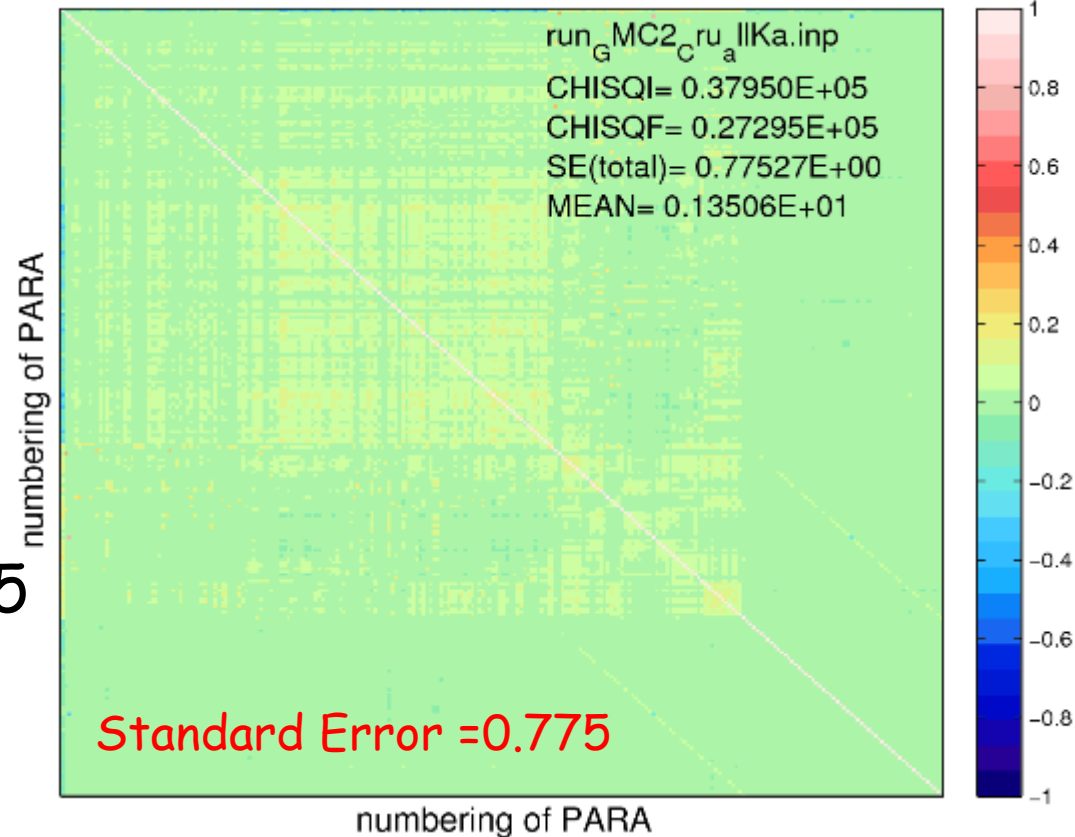
- Q, Fc, Kappa, Amplification function

Solution:

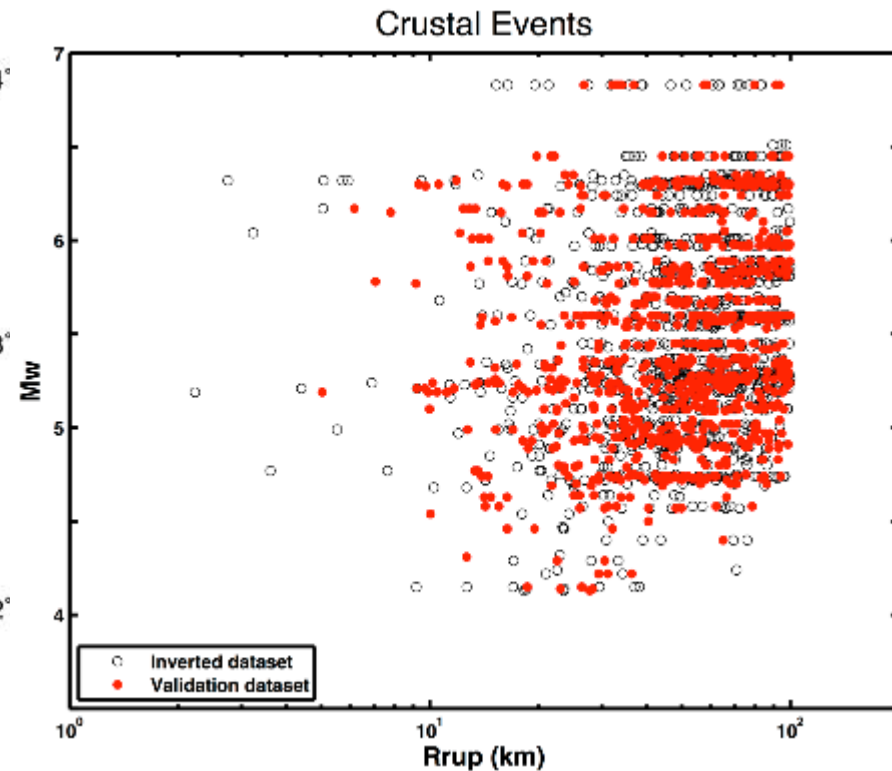
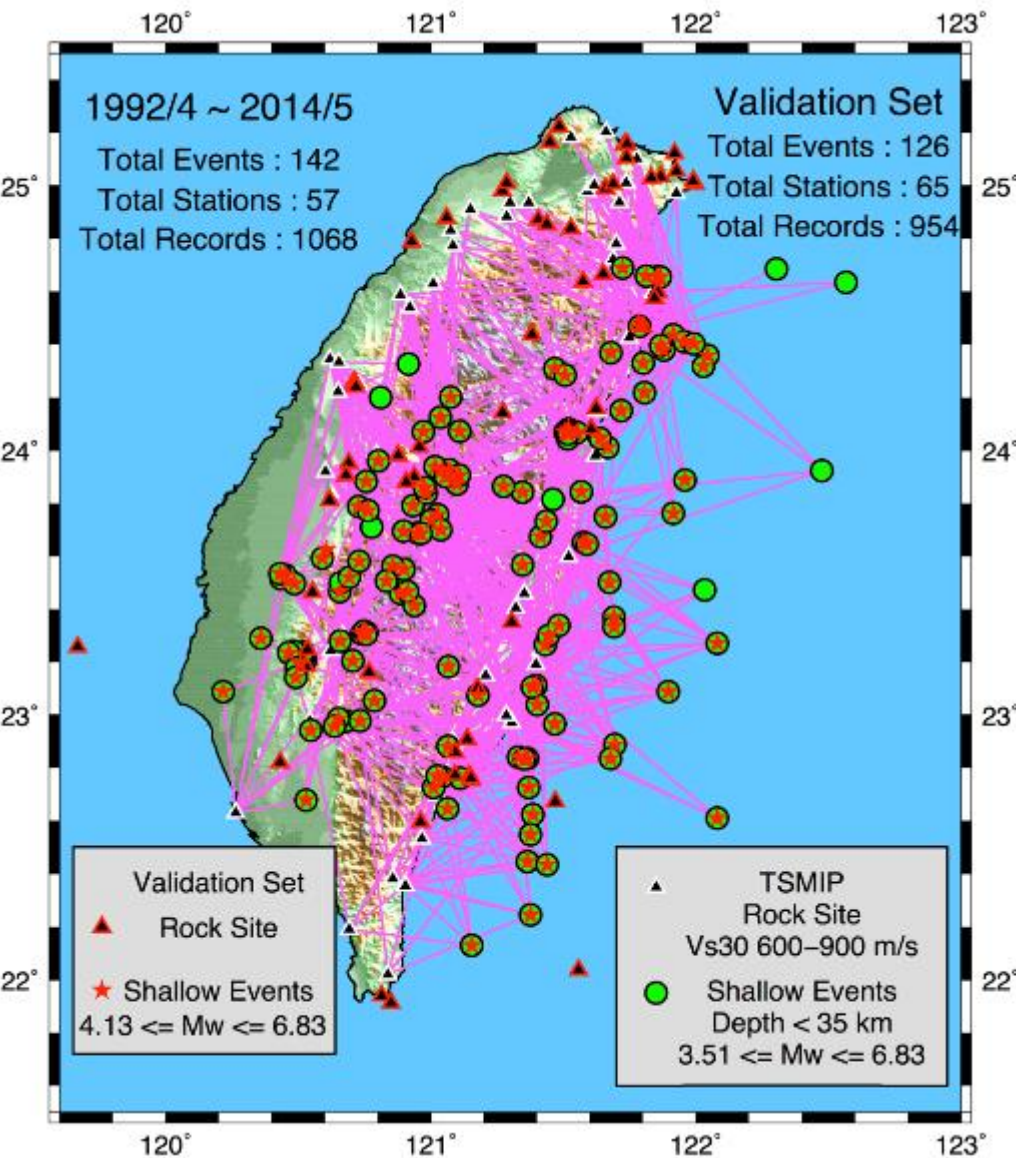
- $Q = 205f^{0.7}$
- $Kappa = 0.0398$
- Amplification (D) = 0.65

Covariance Matrix

Correlation Between Inverted Parameters



Applications- host to target adjustment factor for GMPE

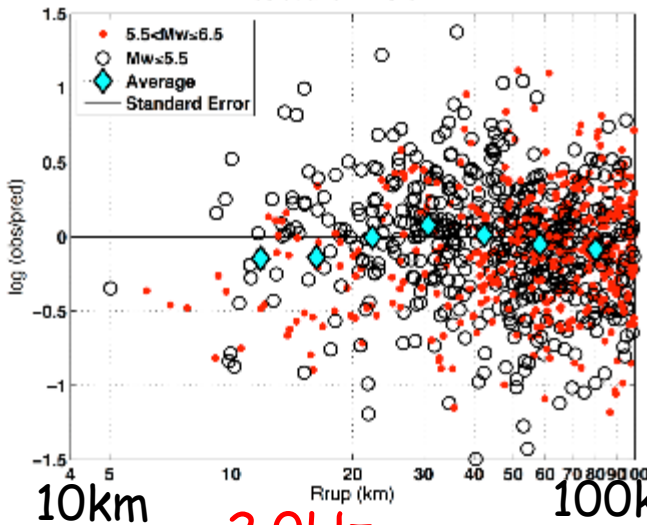


Applications- host to target adjustment factor for GMPE

Residual plots

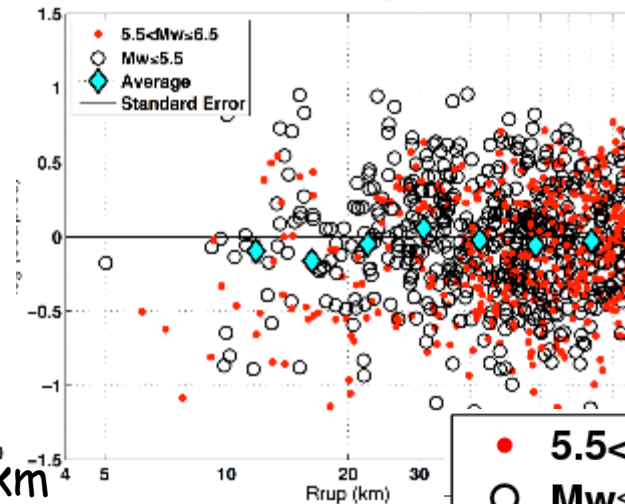
FAS 0.2Hz

Residual of FAS 0.2 Hz



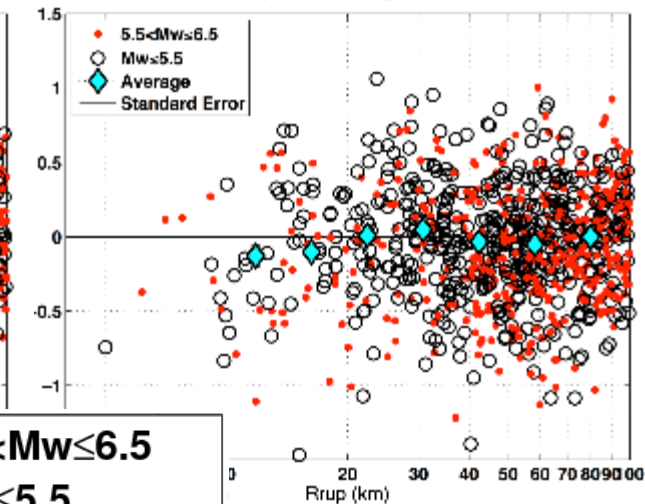
0.5Hz

Residual of FAS 0.5 Hz



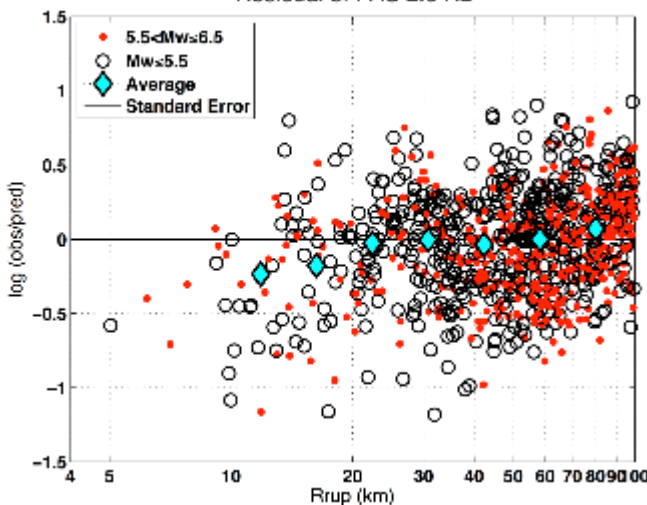
1.0Hz

Residual of FAS 1.0 Hz



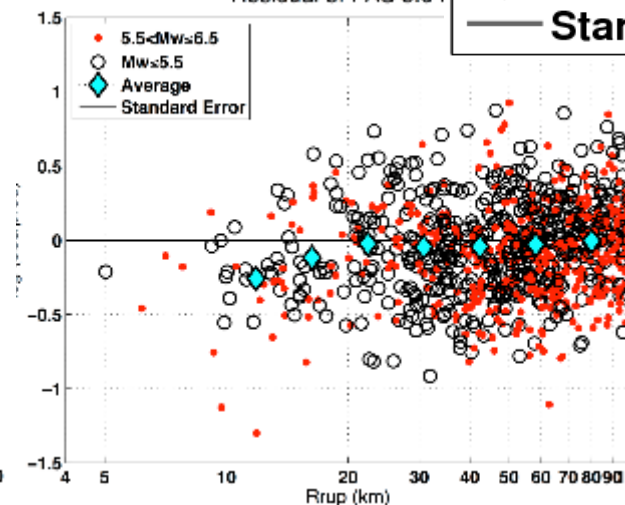
2.0Hz

Residual of FAS 2.0 Hz



5Hz

Residual of FAS 5.0 Hz



10Hz

Residual of FAS 10 Hz

