

Characterization and Three-Dimensional Modeling of Soil Variability for Evaluating Safety of Dam Infrastructure

Geo-Omaha 2024



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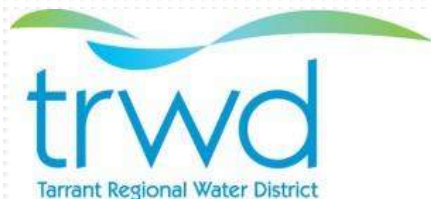
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Geosyntec Consultants



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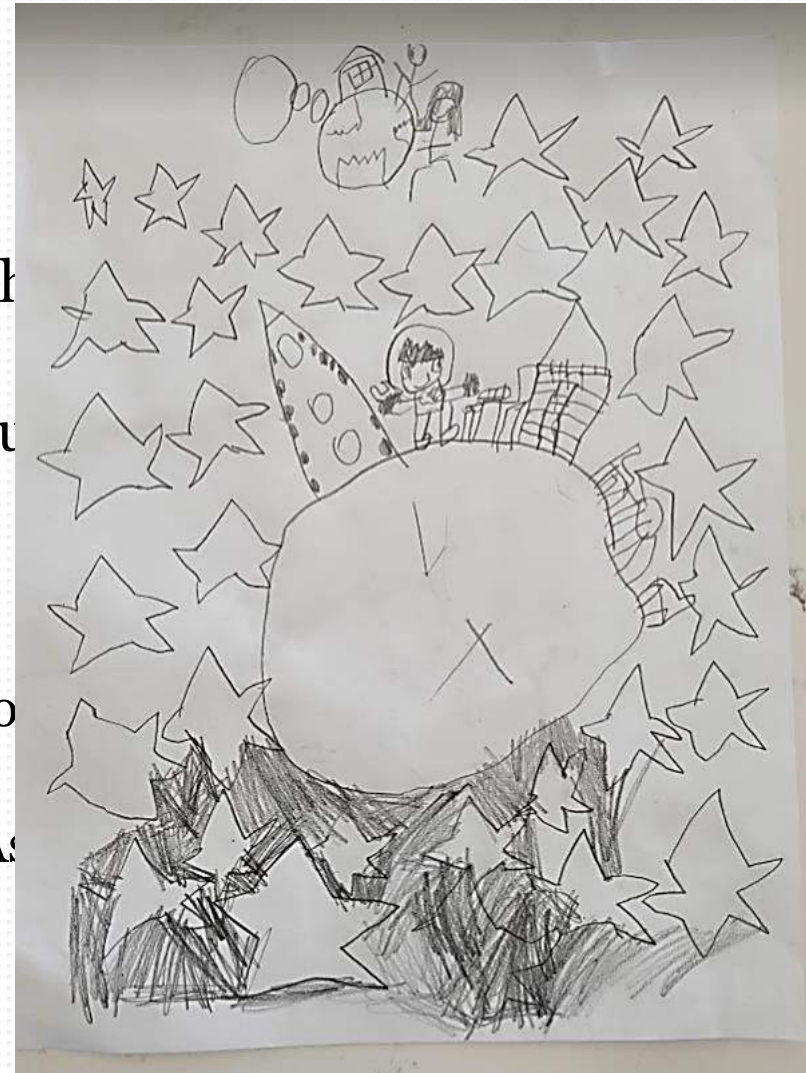


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Assistant Professor
BITS Pilani



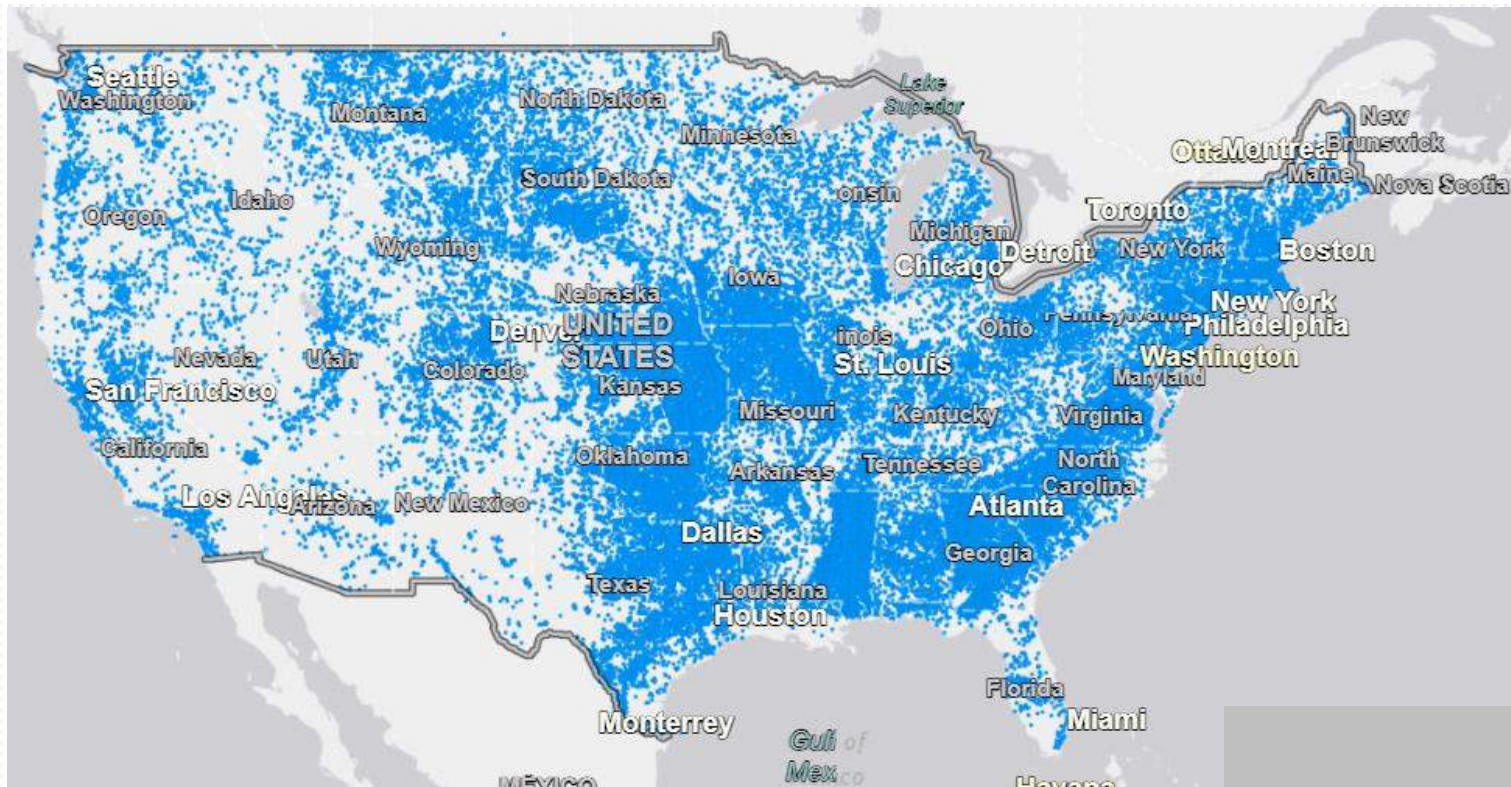
Presentation Outline

1. Introduction and Background
2. Development of Framework for ch
3. Geotechnical Studies – Eagle Mou
 - Hazard Quantification
 - Soil Vulnerabilities and Critical Zo
 - Slope Stability and Liquefaction As
4. Summary and Conclusions



Introduction

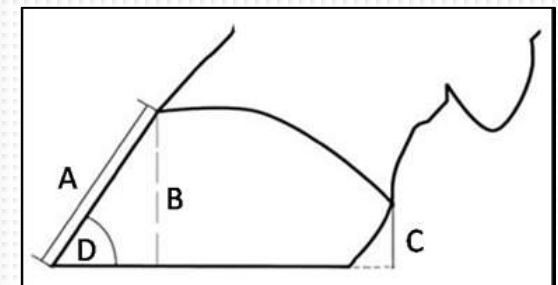
- ❑ Dams are one of the most critical infrastructures with a complex interplay among different disciplines.
- ❑ More than 90,000 dams in the nation, with an average of 62 years.



Source: National Inventory of Dams

Introduction

- Several factors play a key role in the performance of an earthen infrastructure.



Introduction

Hydraulic Fill Dams: Extensive hydraulic mining in the United States, followed by the discovery of gold in California in 1849, led to the utilization of the hydraulic fill procedure for the construction of dams



Fort Peck Dam



Lower San Fernando Dam

Introduction

Hydraulic Fill Dam Failures are major catastrophic failures that result in property damage, lives, and the environment.



Mount Polley TSF Failure, Canada, 2014



Cadia TSF Failure, Australia, 2018



Samarco Fundao TSF Failure, Brazil, 2015

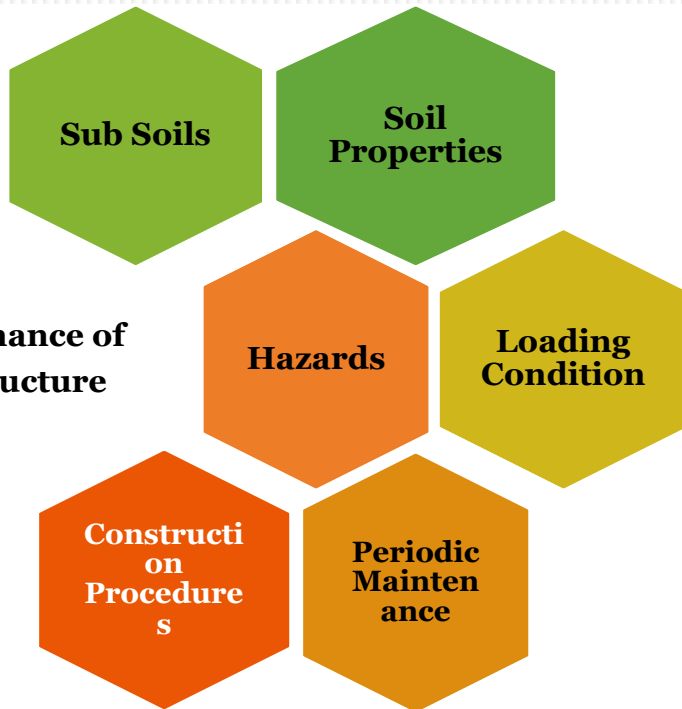


Brumadinho TSF Failure, Brazil, 2019



Merriespruit TSF Failure, South Africa, 1994

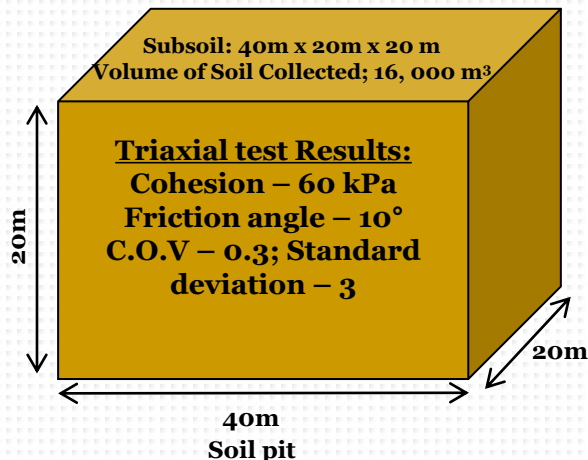
Introduction



Uncertainties with current practices

➤ Constrained Soil Investigation

Works – Limited Characterization



Required volume of soil to be tested for having 98% confidence on soil properties?



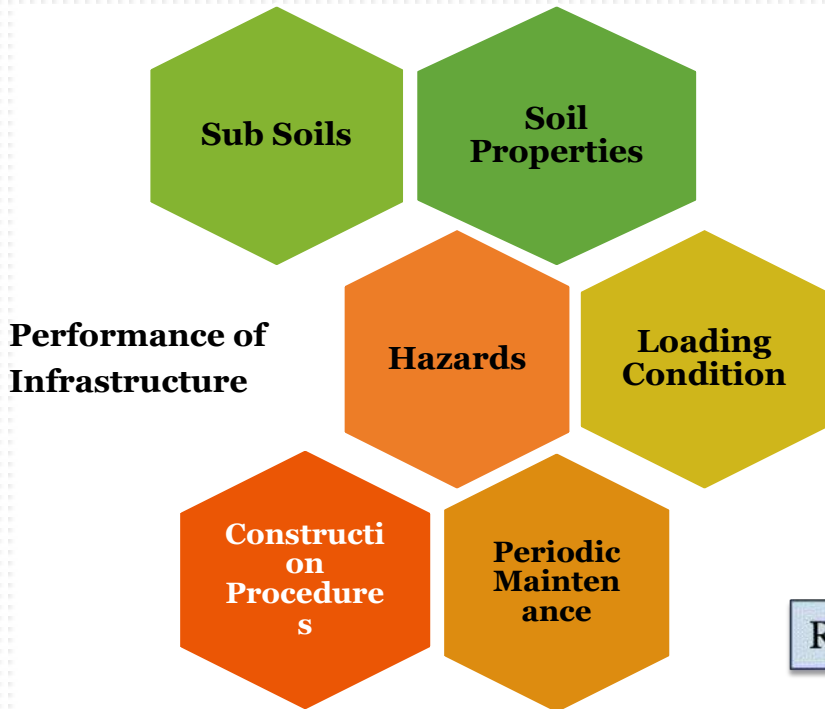
Gosset
(1876-1937)

$$T_0 = \frac{\bar{X} - \mu_0}{S/\sqrt{n}}$$

Volume of soil to test:
160,000 cm³

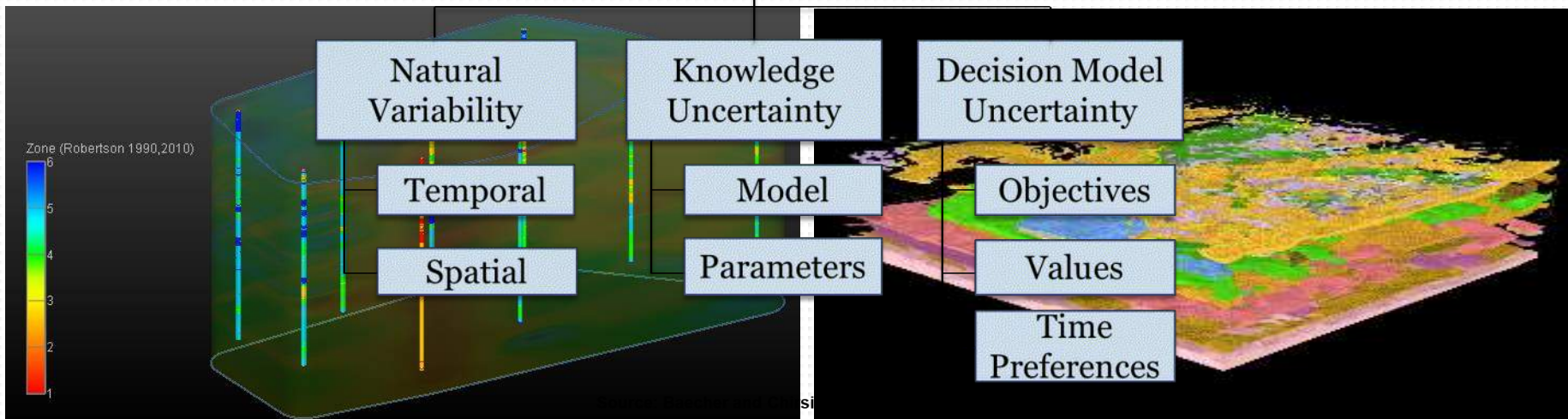
~ 240 Triaxial tests

Introduction



Uncertainties with current practices

- **Constrained Soil Investigation Works – Limited Characterization**
- **Assessments based on 2D Models**
- **Models and Hazards Uncertainty**
- **Not accounting for geochemical and mineralogy present in soils.....**

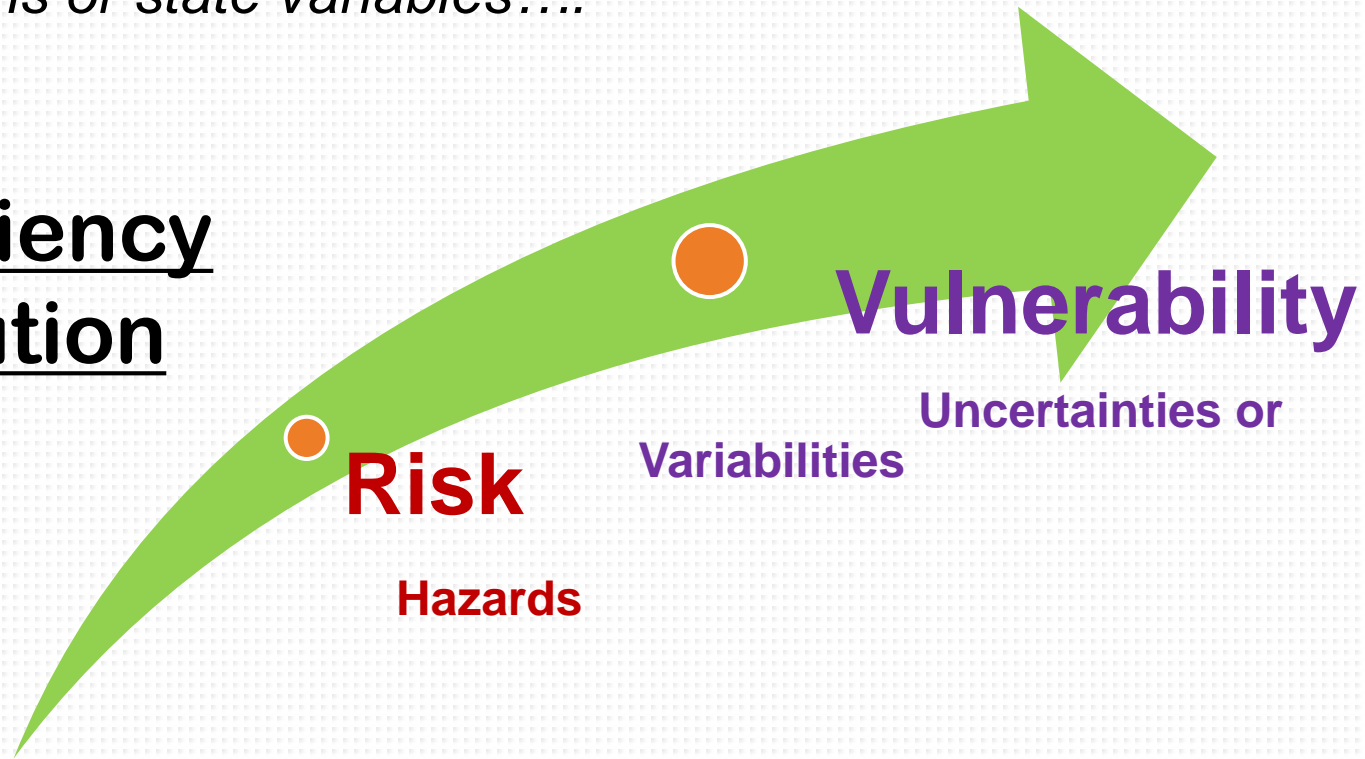


Introduction

Resiliency Definition

Holling (1973) has first described resiliency as a “measure of the persistence of systems and their ability to absorb change and disturbance and still maintain the same relationships between populations or state variables....

Resiliency
solution



Introduction and Risk Framework

In geotechnical engineering, the resiliency metric can be addressed using Factor of Safety or Probability of Failure....

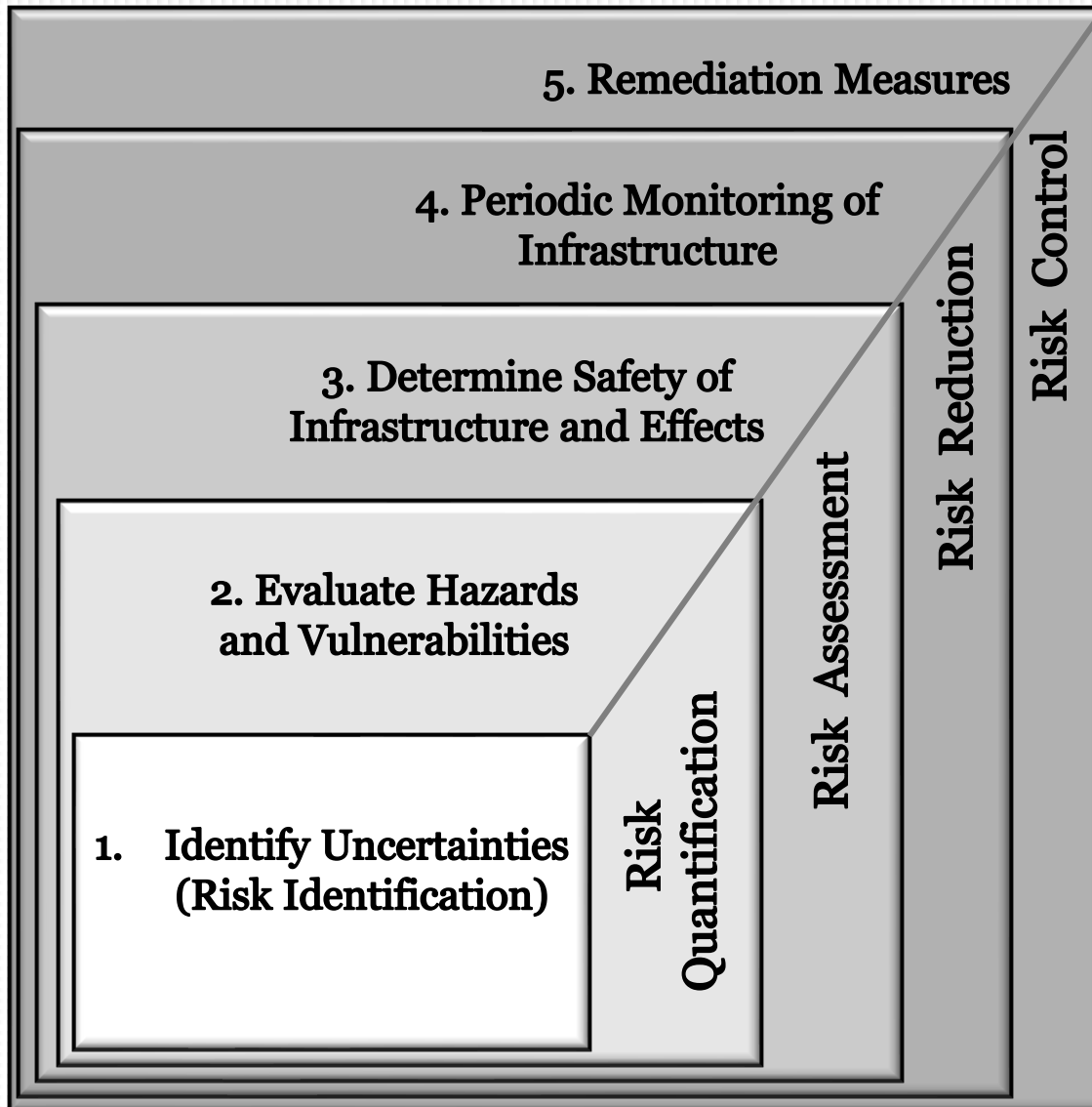
Risk

- **Natural hazards:**
Earthquakes, Tornadoes, Climatic Effects, Flooding, Drought, and others
- **Man-made hazards:** Induced Seismicity (Fracking, Blasting), Measurement errors, Model errors, Poor QA/QC practices, Design limitations and others

Vulnerability

- **Variabilities** and **Uncertainties** in soil properties
- Identifying **localized critical zones** compared to global
- **Assessing** condition of the Infrastructure

Risk-Based Framework



**Geotechnical Data
(Material Characterization and
Performance Evaluation)**



**Check for Data Stationarity
and Normal Distribution**



**Detrending/
Transformations (*Box-Cox*)**



**Geostatistical
Analysis**



**Variogram Modeling
(*Model correlation*)**



**Kriging Analysis
(*Perform predictions*)**

Introduction and Risk Framework

Geostatistical Theory



**Prof. Danie G. Krige
(1919 – 2013)**

- Mining Engineer and Geostatiscian
- University of Witwatersrand, SA
- Developed empirical work for locating Ores in 1950's.



**Prof. Georges Matheron
(1930 – 2000)**

- French Mathematician and Geologist
- Centre de Geostatistique
- Developed mathematical formulation of empirical work in 1970's.

Geostatistical Theory

Geostatistical Analysis

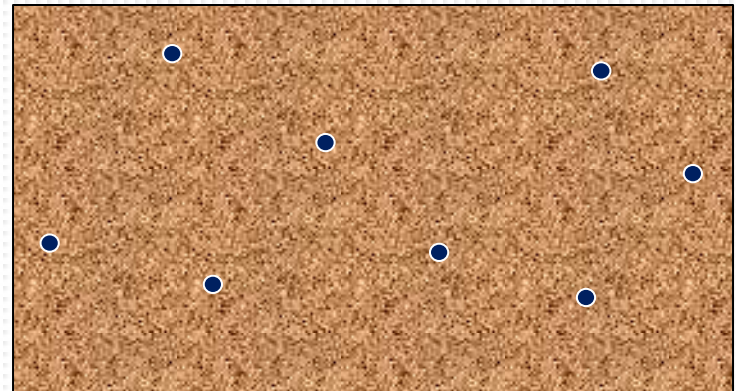
- Developed from theory of **Regionalized random variables**

Regionalized variable:

$$z(x_i) ; x_i \in D ; i = 1 \dots n$$

Random function model:

$$Z = (Z(x))_{x \in D}$$

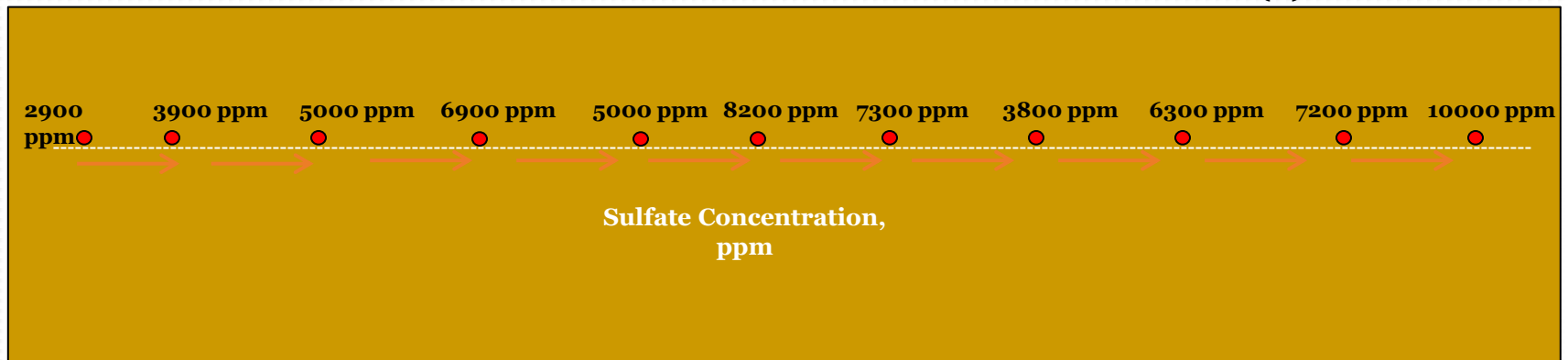
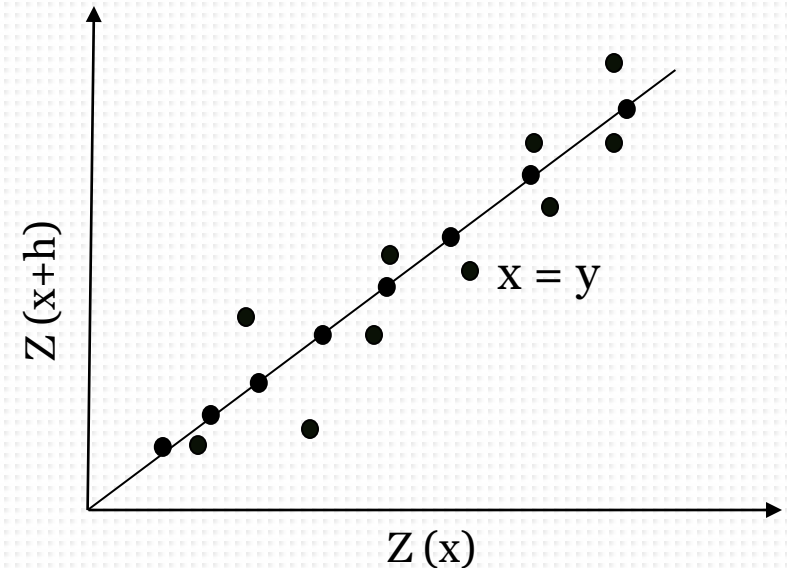


- Explains **spatial variability** of the random variable
- **Spatial continuity** is an essential feature in understanding spatial description of a random variable or any earth science materials
- **h-scatter plots**

Geostatistical Theory

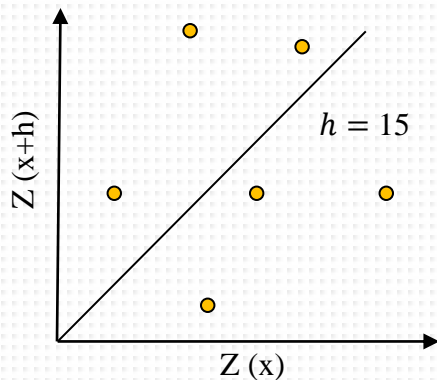
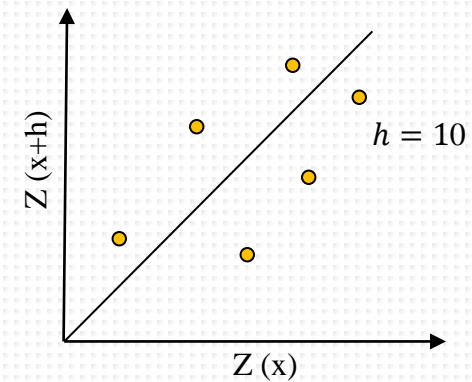
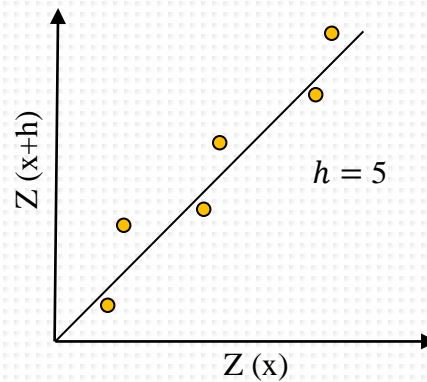
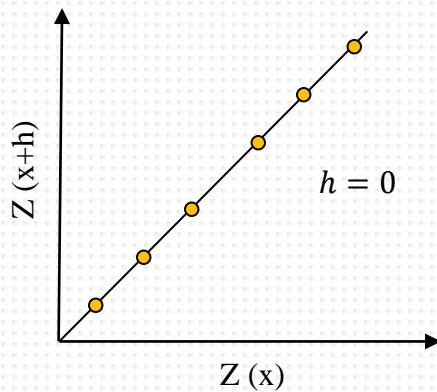
Geostatistical Analysis: h-scatter plots

- Plot of $Z(x)$ vs $Z(x+h)$
 - x : Random variable
 - h : lag distance
- $h = 0; (Z(x), Z(x))$
- $h = 2m; (Z(x), Z(x+2))$



Geostatistical Theory

Geostatistical Analysis: h-scatter plots

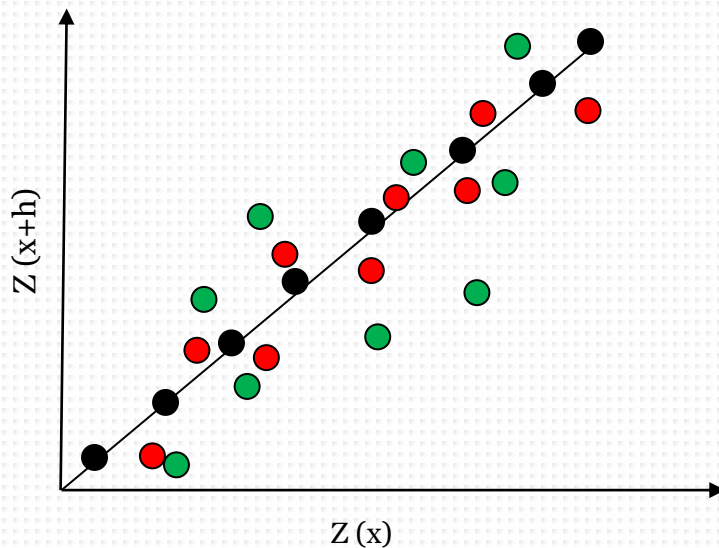


Summary of h- scatter plots:

- Correlation function, $\rho(h)$
- Covariance function, $C(h)$
- **Variogram, $\gamma(h)$**

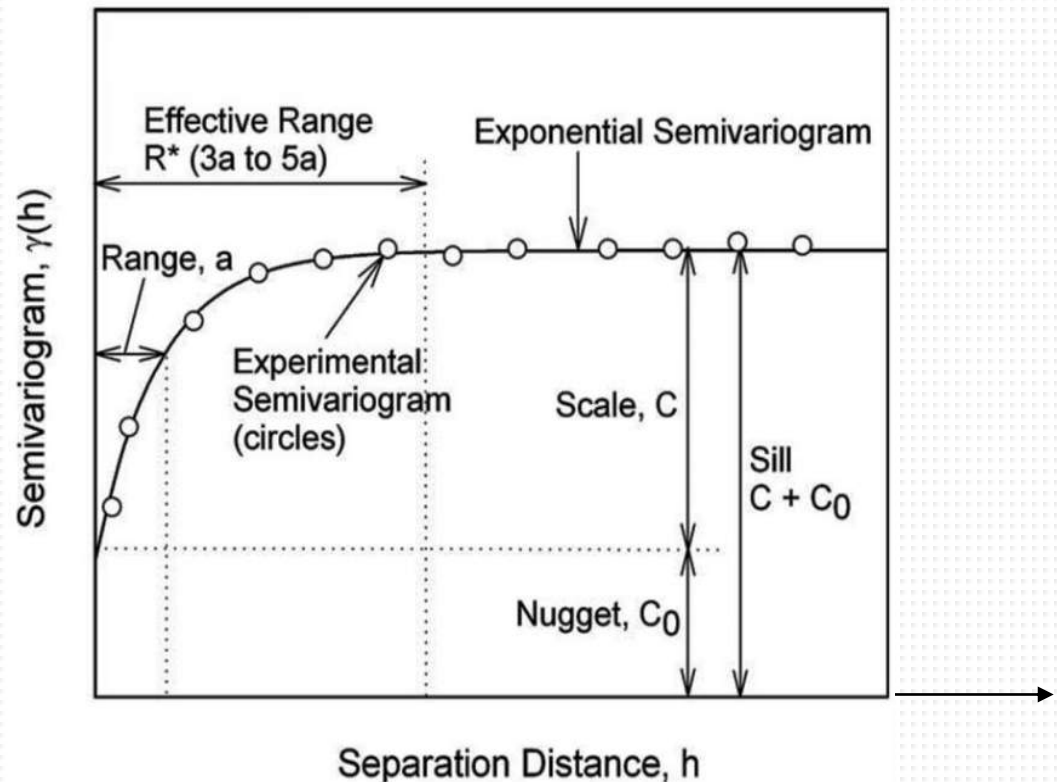
Geostatistical Theory

Geostatistical Analysis: Plot of Variogram



- $h = 0 \text{ m}; \gamma(h_1)$
- $h = 2 \text{ m}; \gamma(h_2)$
- $h = 4 \text{ m}; \gamma(h_3)$
- $h = n \text{ m}; \gamma(h_n)$

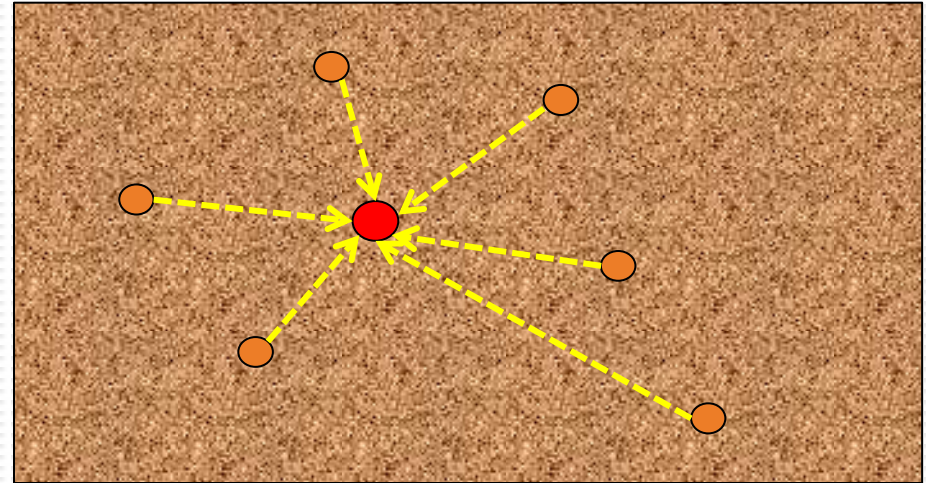
$$\gamma(h) = \frac{1}{2n(h)} \sum_{i=1}^{n(h)} [z(x_i + h) - z(x_i)]^2$$



Geostatistical Analysis

Geostatistical Analysis: Interpolation

- Different estimation procedures exist in statistics: Polygon estimation, Triangulation, Inverse distance methods, Cell declustering, Kriging.



- Kriging predicts the value of the **random variable** $z(x_0)$ as a **weighted average** of the observed data that is spatially correlated.

$$\begin{bmatrix} C_{11} & C_{12} & \cdots & C_{1n} & 1 \\ \vdots & \vdots & \ddots & \vdots & 1 \\ C_{n1} & C_{n2} & \cdots & C_{nn} & 1 \\ 1 & 1 & \cdots & 1 & 0 \end{bmatrix} \begin{bmatrix} w_1 \\ \vdots \\ w_n \\ \lambda \end{bmatrix} = \begin{bmatrix} C_{x1} \\ \vdots \\ C_{xn} \\ 1 \end{bmatrix}$$

Development of 3D Model



Eagle Mountain Structures

Main Dam

- Main Dam Crest (41)
- Main Dam Downstream Toe (29)
- Main Dam Far Downstream (11)

Levee

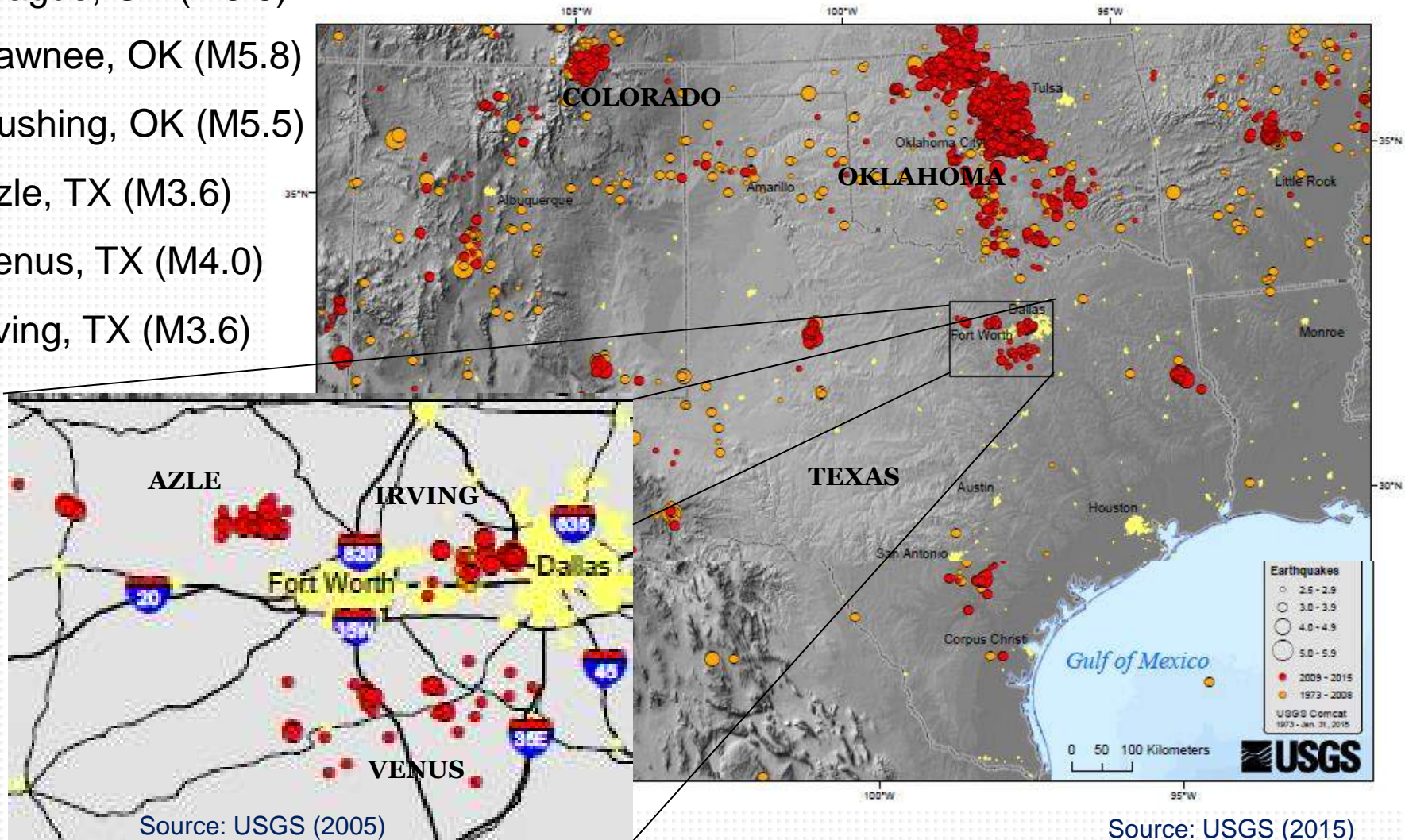
- Levee Crest (17)
- Levee Upstream (3)
- Levee Downstream Toe (9)
- Levee Far Downstream (4)

* (Number) indicate total SCPT's performed



HAZARD Quantification

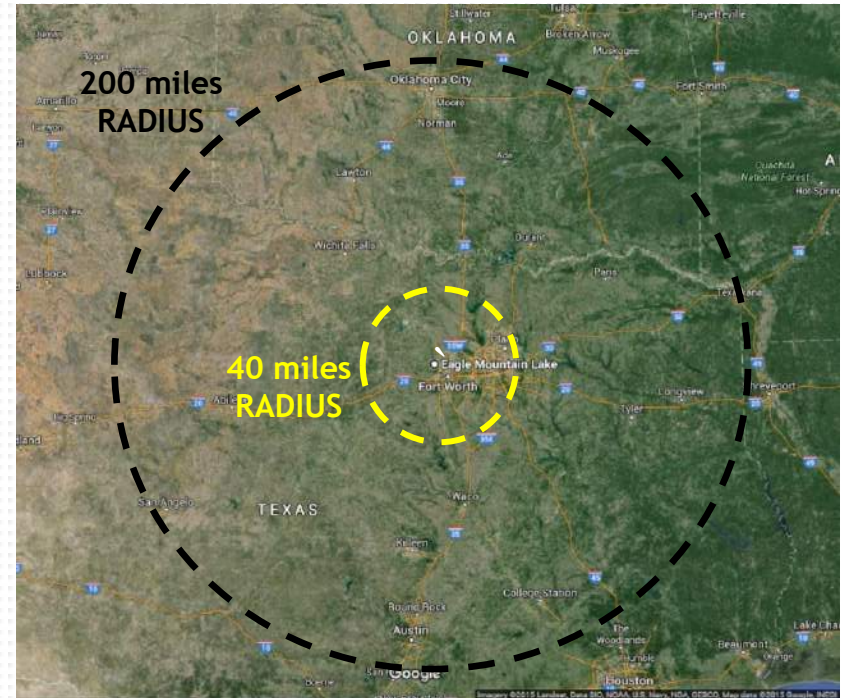
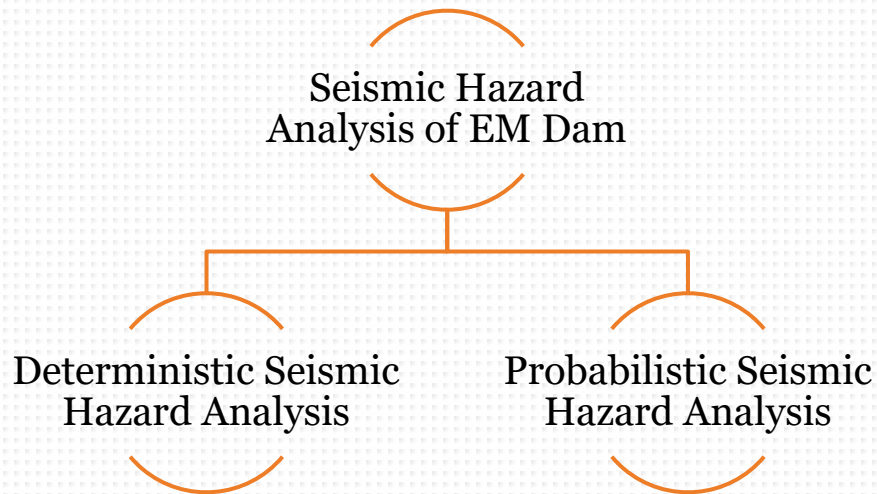
- Prague, OK (M5.6)
- Pawnee, OK (M5.8)
- Cushing, OK (M5.5)
- Azle, TX (M3.6)
- Venus, TX (M4.0)
- Irving, TX (M3.6)



Source: USGS (2005)

Source: USGS (2015)

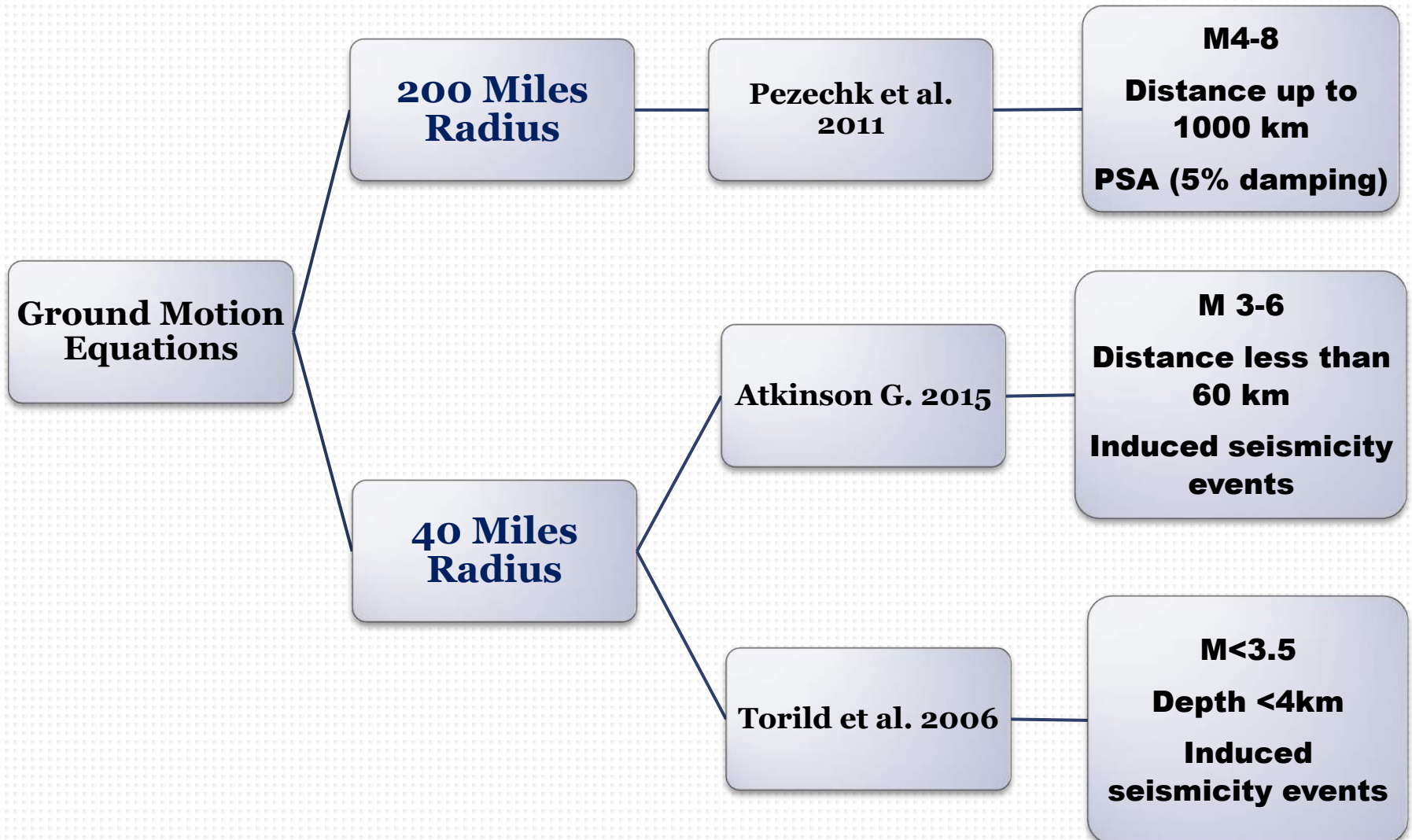
• Evaluation of Seismic Parameters



- Selection of earthquakes sources up to 200 miles radius (USGS, 2007-2015)
- Seismic analysis using data up to 200 miles radius and 40 miles radius

Seismic Hazard Analysis

GROUND MOTION PREDICTING EQUATIONS FOR EAGLE MOUNTAIN DAM



PSH TASKS PERFORMED

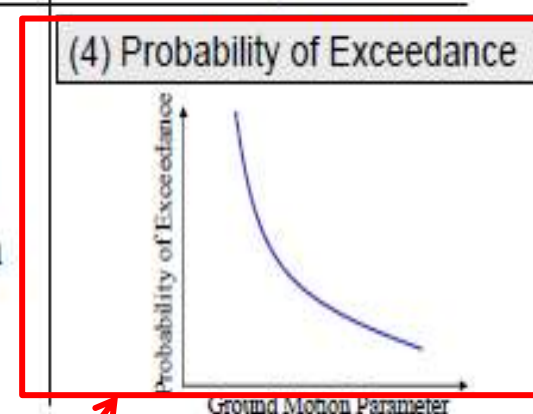
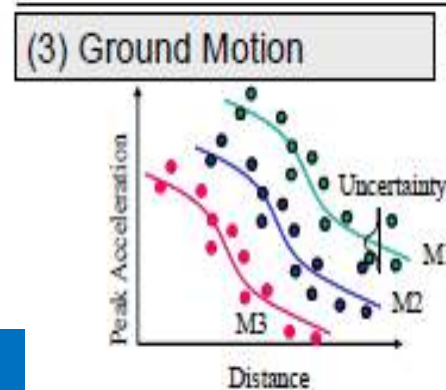
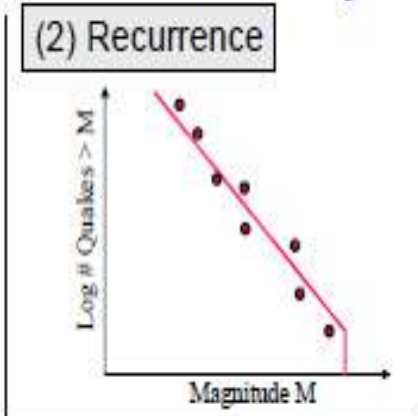
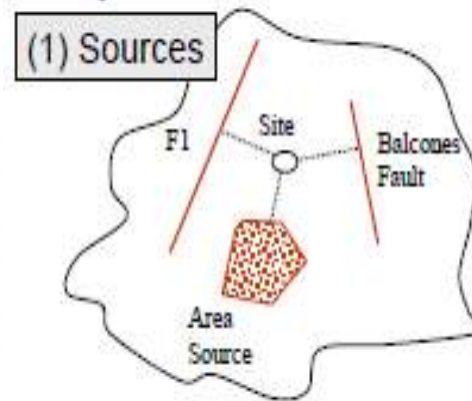
For Each Approach:

200-40 miles radius

Consists of four primary steps:

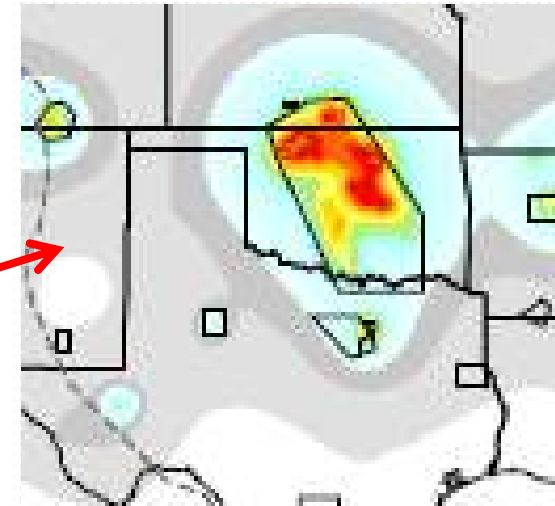
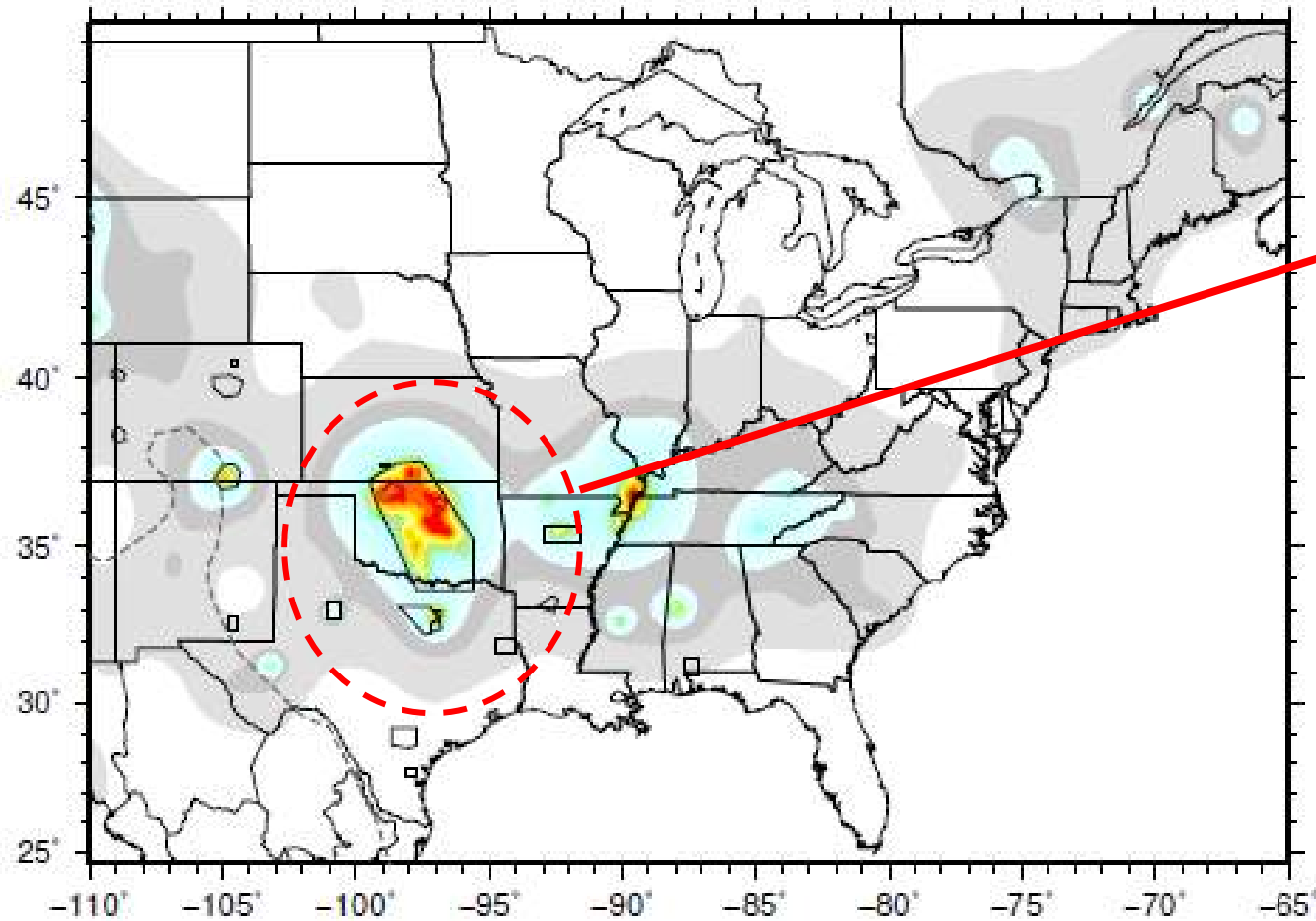
1. Identification and characterization of all sources
2. Characterization of seismicity of each source
3. Determination of motions from each source
4. Probabilistic calculations

PSHA characterizes uncertainty in location, size, frequency, and effects of earthquakes, and combines all of them to compute probabilities of different levels of ground shaking



The earthquake hazard for the site is a $PGA=0.28g$ with a 2% probability of being exceeded in a 50-year period.

VALIDATION OF PSHA



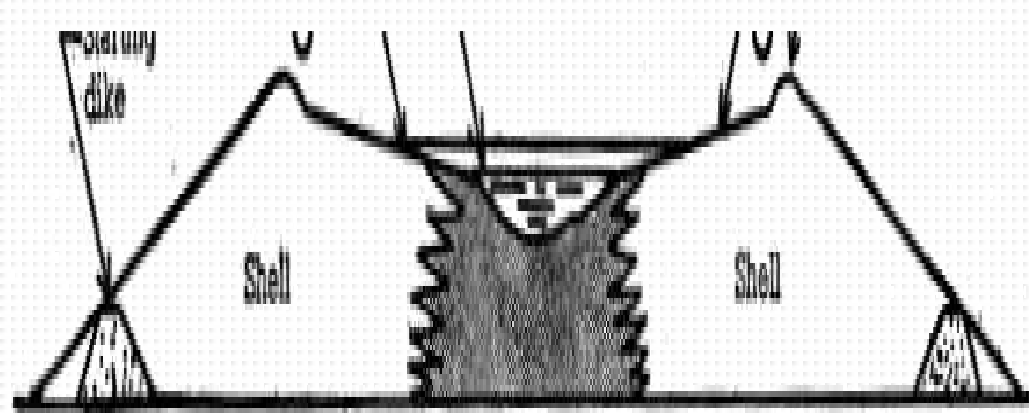
The earthquake hazard at EGM is 0.2g of 1% probability of exceedance in one year (USGS, 2016)



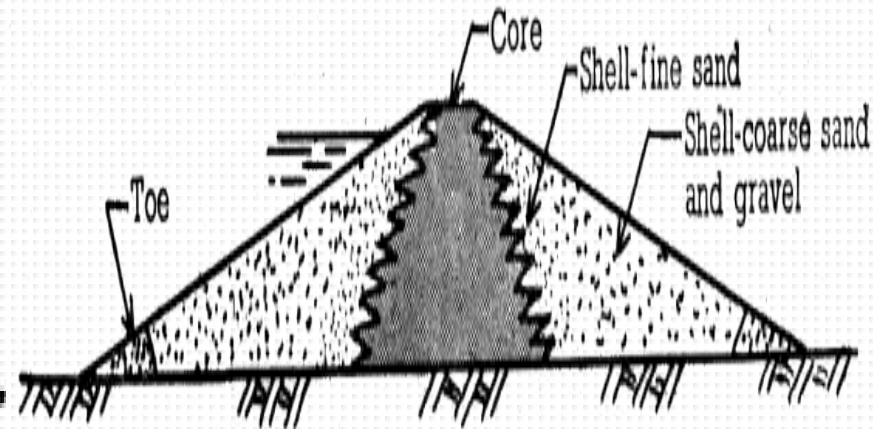
pga for 1% probability of exceedance in one year

Vulnerability of EM Structures

- Aging infrastructure- Constructed in 1930's
- Construction process – Hydraulic technique
- Uncertainties in deposited material and high variability



Source: Hsu 1988



Source: Hsu 1988

Dikes at Toe
(PIPES)
Sedimentation

Raise the core up
to the level of
shells)

Coarse soil
settles squeezing
the core

As soon as the
shell raises, core
narrows and
deepens

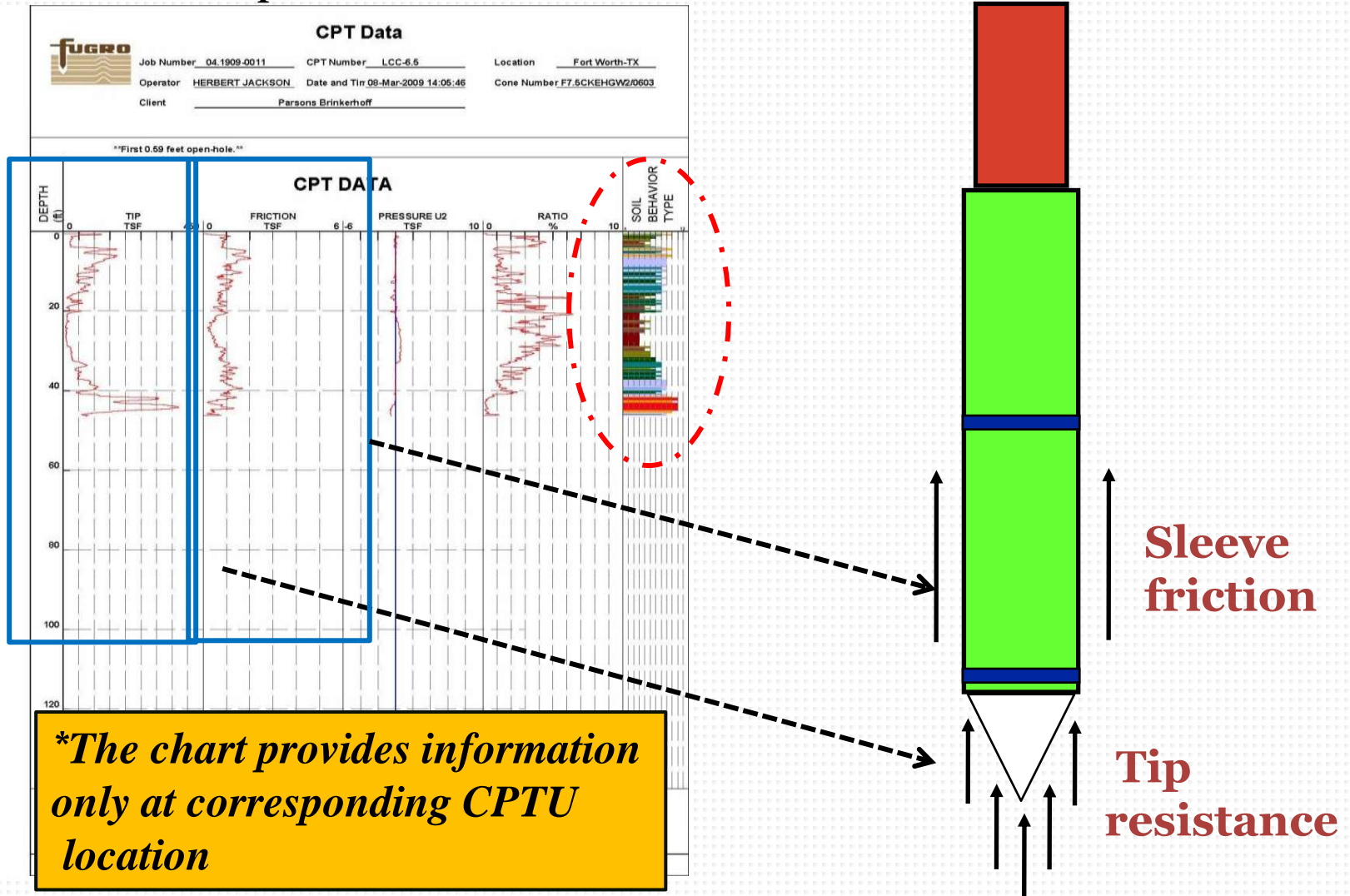
CORE ZONE
WITH JAGGED
EDGES

Hydraulic Fill Process

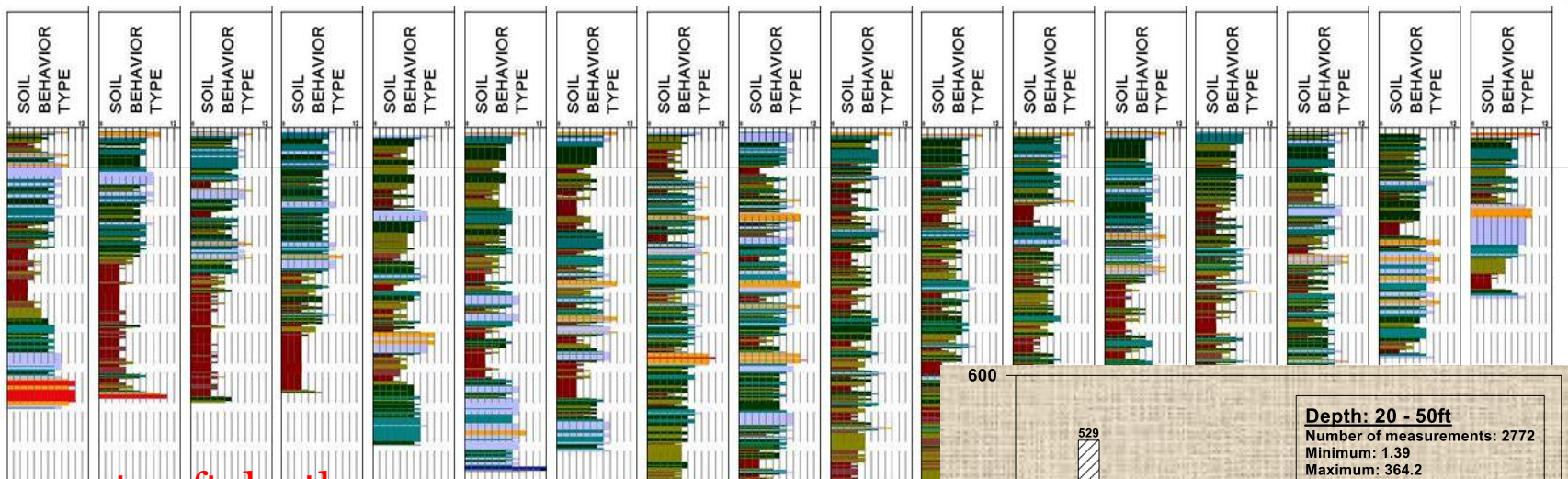
Soil Variability
encountered in HF
dams is HIGH
(Sands, Silts and
Clays)

Hydraulic Fill Structures- CPT Data

CPT Record performed on Crest

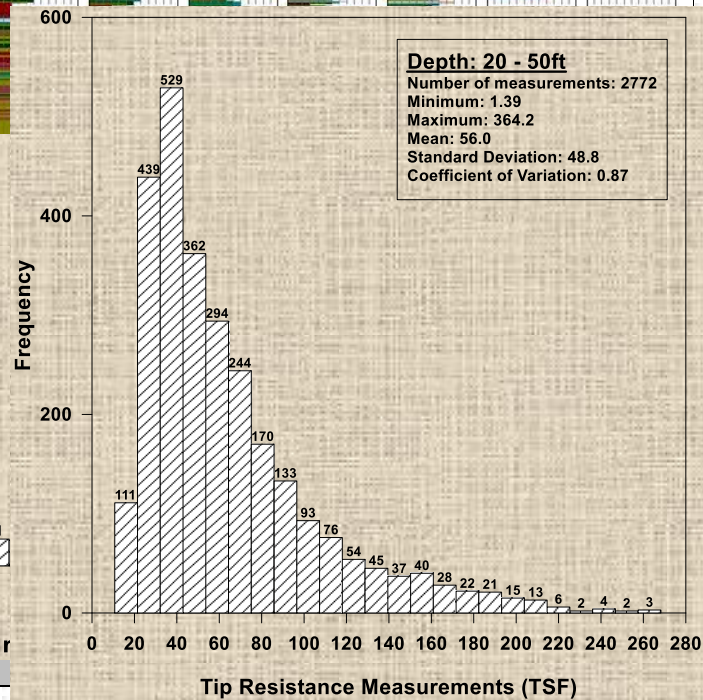
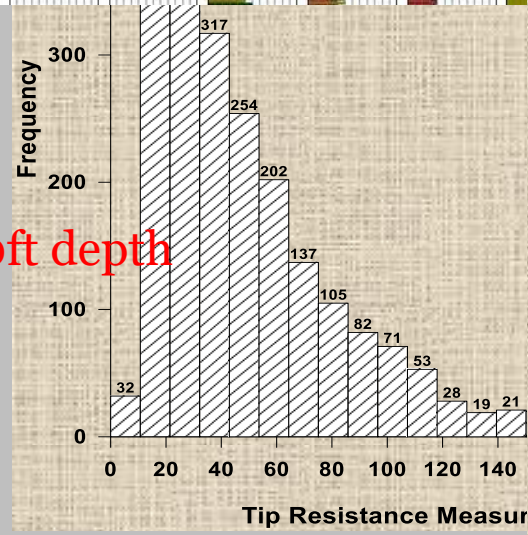


Hydraulic Fill Structures- CPT Profiles



0 to 5ft depth
5 to 20ft depth

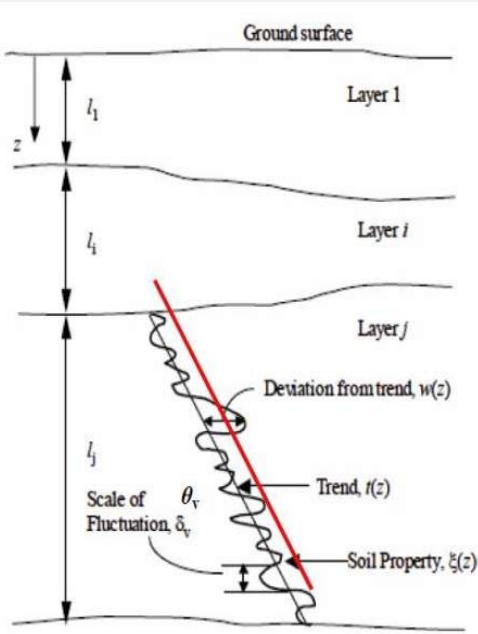
20 to 50ft depth



Spatial Variability Analysis

Geostatistical Approach – Data evaluation, Stationarity, Variogram, Kriging Analysis, Validation

Data Evaluation



Spatial variation of soil properties (Davidovic et al., 2010)

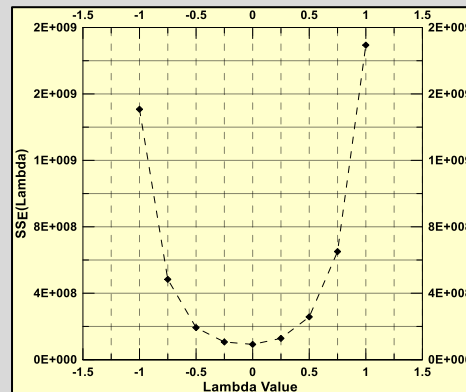
Stationarity

Constant mean and variance in data

- Analysis of Variance – constant mean
- Bartlett's test – constant variance
- Joint probability distribution – histograms & Shapiro wilk test

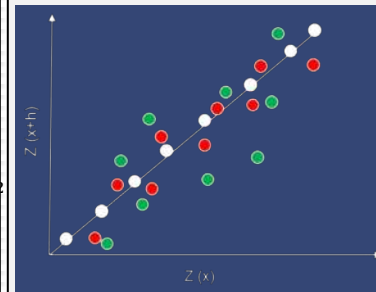
$$g_i = b_0 + b_1X_i + b_2Y_i + \varepsilon_i$$

$$g_i = b_0 + b_1X_i + b_2Y_i + b_3X_i^2 + b_4X_iY_i + b_5Y_i^2$$

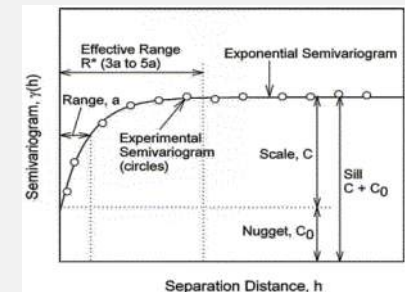


Variogram, Kriging, & Validation

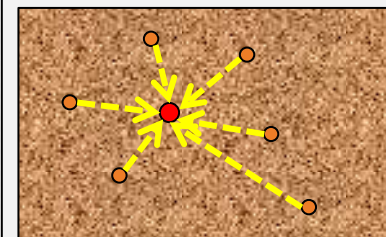
$$\gamma(h) = \frac{1}{2n(h)} \sum_{i=1}^{n(h)} [z(x_i + h) - z(x_i)]^2$$



h-s scatter plot



Variogram

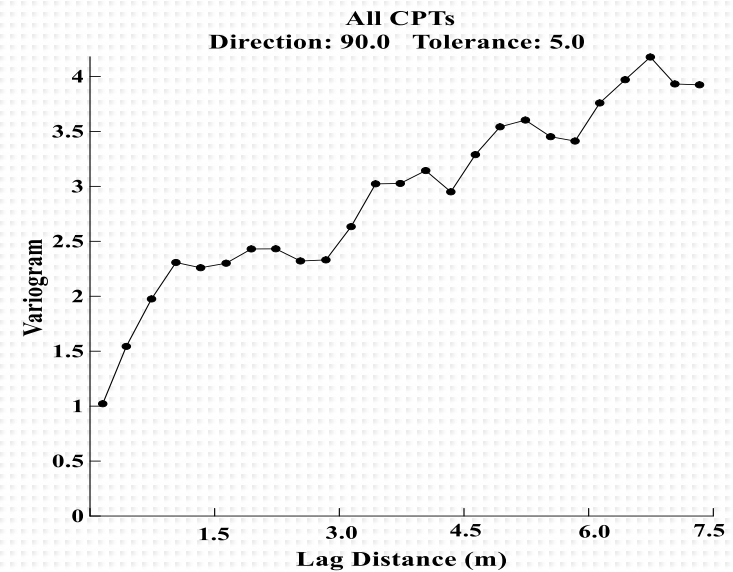
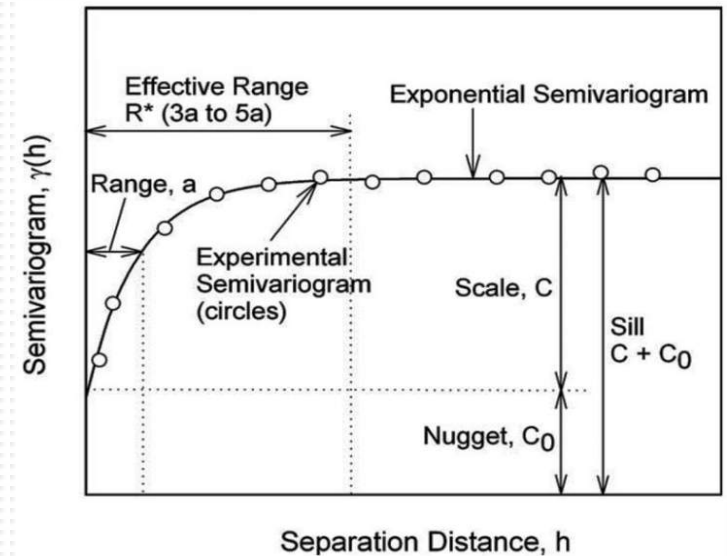


Ordinary Kriging

$$\begin{bmatrix} C_{11} & C_{12} & \dots & C_{1n} & 1 \\ \vdots & \vdots & \ddots & \vdots & 1 \\ C_{n1} & C_{n2} & \dots & C_{nn} & 1 \\ 1 & 1 & \dots & 1 & 0 \end{bmatrix} \begin{bmatrix} w_1 \\ \vdots \\ w_n \\ \lambda \end{bmatrix} = \begin{bmatrix} C_{x1} \\ \vdots \\ C_{xn} \\ 1 \end{bmatrix}$$

Eagle Mountain Structures- CPT Profiles

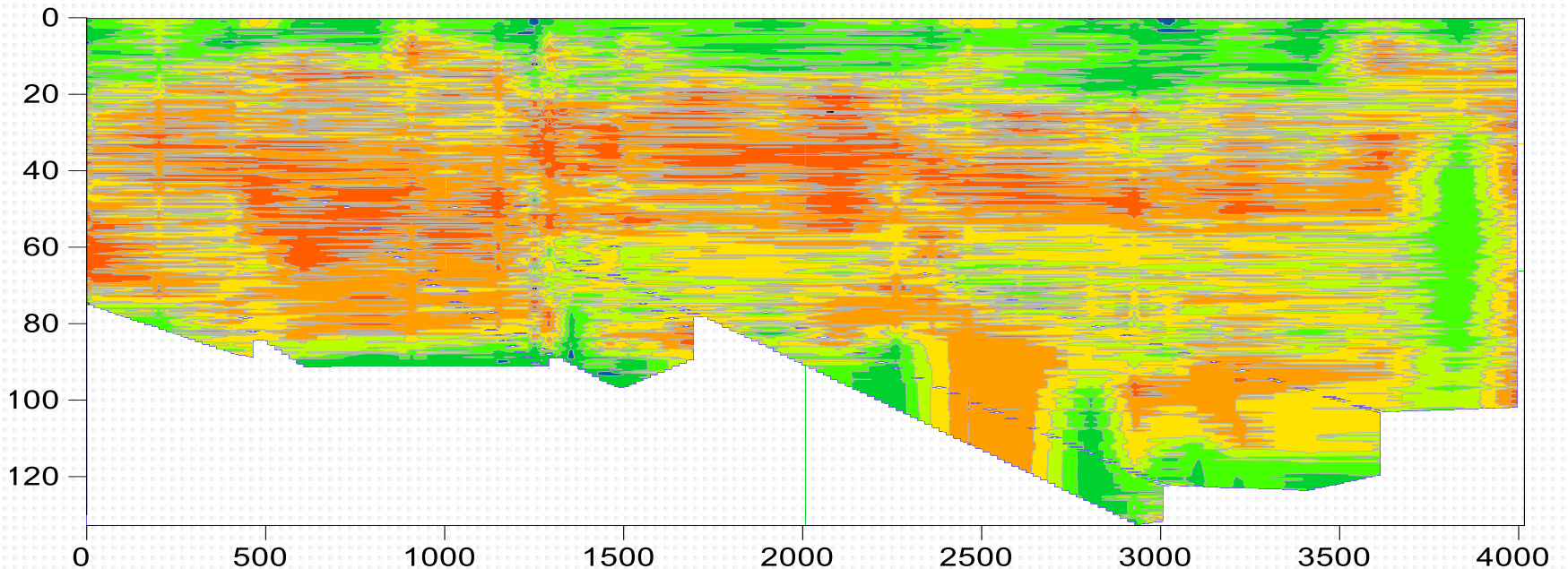
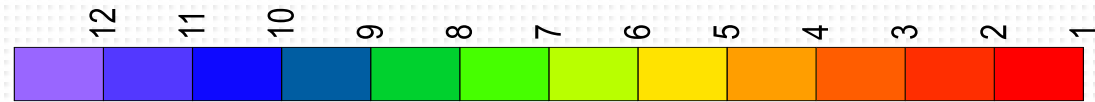
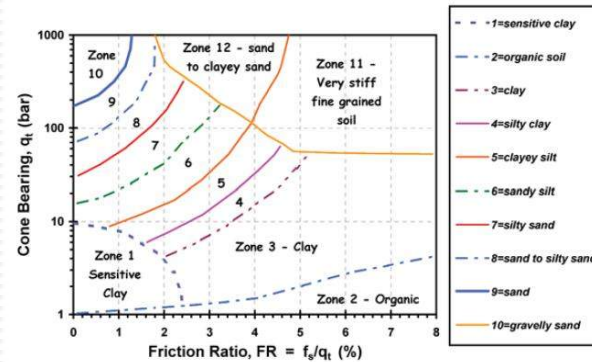
CPT No	Distance	Depth (m)	Spatial Variability Models				Variance
			Nugget	Range	Scale	Sill	
1	0.0	22.9	0.8	0.9	2.0	2.7	4.6
2	61.0	24.1	1.2	0.9	1.6	2.7	3.3
3	121.9	26.7	1.5	1.7	2.1	3.6	3.6
4	144.8	27.2	0.6	0.9	1.8	2.4	2.9
5	182.9	27.9	0.7	1.4	2.4	3.0	3.6
6	243.8	27.3	1.3	2.7	2.2	3.5	4.0
7	276.0	27.2	0.5	0.8	1.3	1.8	2.1
8	304.0	27.0	0.6	0.5	1.3	1.9	2.3
9	350.9	27.4	0.7	2.7	2.0	2.6	3.0
10	381.4	27.8	1.8	4.1	3.9	5.8	4.9
11	393.9	28.0	0.7	1.4	2.9	3.5	3.8
12	413.2	23.3	1.5	0.5	2.0	3.5	4.0
13	446.4	29.4	1.0	1.9	2.8	3.7	4.3
14	459.7	29.5	0.3	0.7	2.8	3.1	3.6
15	520.7	27.2	1.5	6.4	3.1	4.6	3.8
16	581.6	26.4	0.9	2.4	2.1	3.0	3.4
17	642.6	28.2	1.5	2.9	3.4	4.9	4.6
18	688.3	29.4	0.8	3.9	3.4	4.2	3.7
19	718.8	25.8	1.0	0.5	10.5	11.5	3.3
20	749.3	25.8	1.2	3.6	1.8	3.0	2.8
21	795.0	26.5	2.3	4.8	3.6	5.9	4.4
22	855.9	35.3	0.7	4.5	2.5	3.2	3.3
23	892.5	40.5	1.0	5.2	3.3	4.3	3.6
24	919.9	40.1	0.9	5.2	2.4	3.3	2.8
25	945.4	34.5	0.8	4.9	3.2	4.0	3.0
26	981.0	35.3	1.1	4.7	1.7	2.8	3.0
27	1041.9	37.7	0.9	5.3	2.3	3.2	2.6
28	1102.9	36.5	0.5	1.1	1.8	2.3	2.8
29	1224.1	31.1	0.3	0.4	1.6	1.9	2.2



Main Dam Crest- SBT Profile



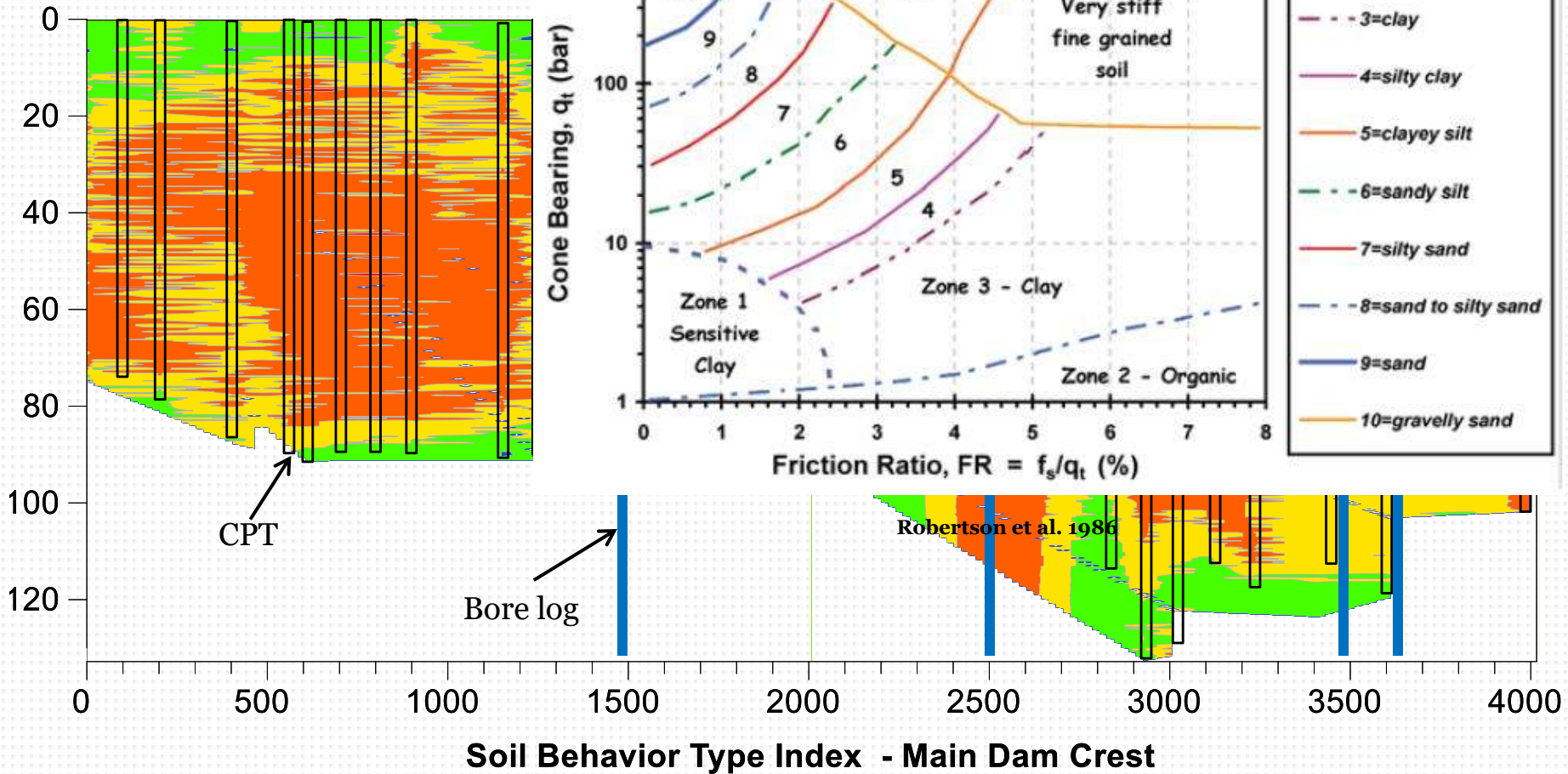
Main Dam CPT Layout



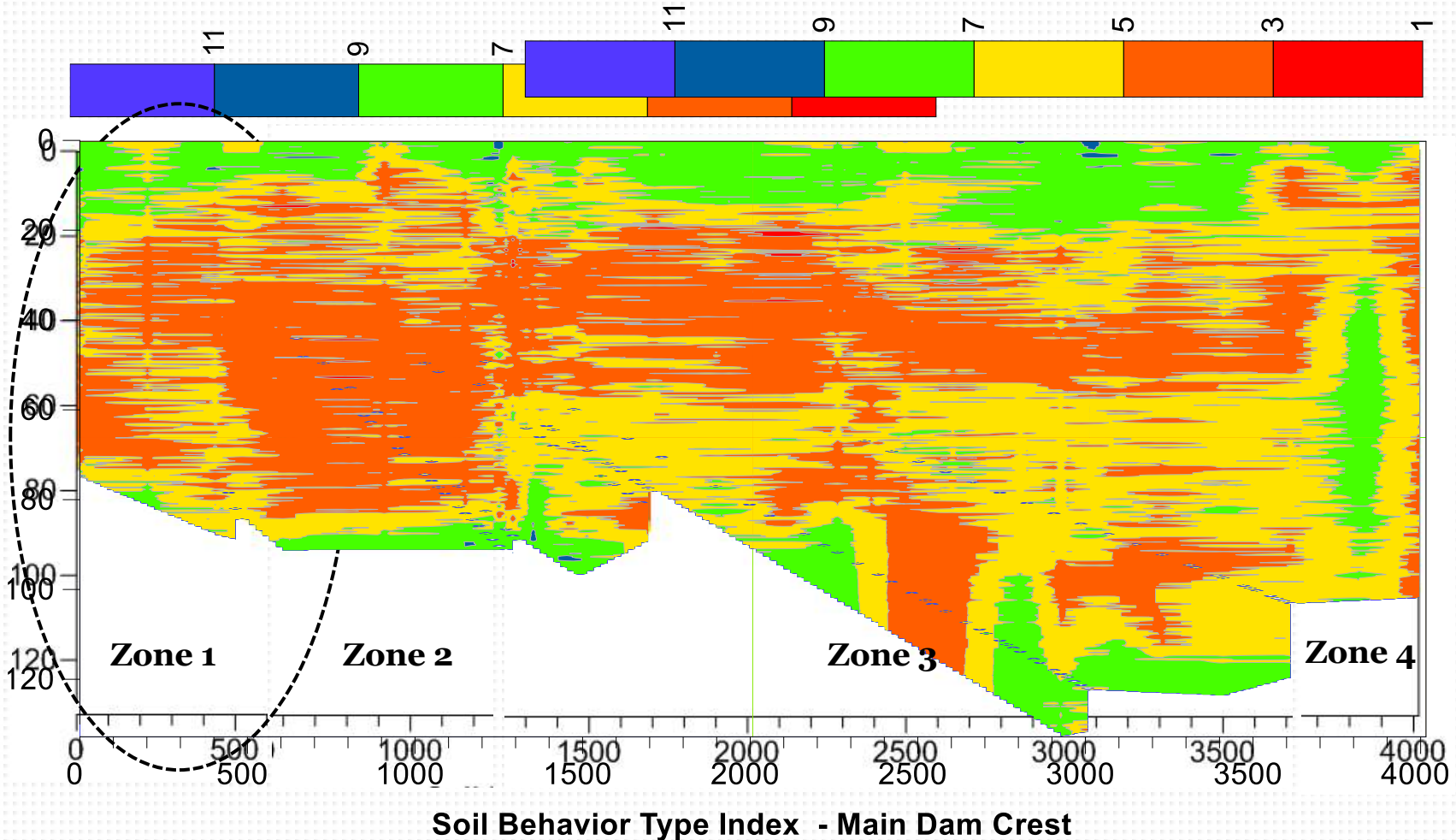
Soil Behavior Type Index - Main Dam Crest

Main Dam Crest- SBT Profile

Zones 1, 2: Sensitive Clays
 Zones 3, 4: Clayey soil
 Zones 5, 6: Clayey Silt to Sandy Silt
 Zones 7,8: Sandy soil
 Zones 9, 10: sand to gravelly sand
 Zones 11, 12: fine grained soil to clayey sand



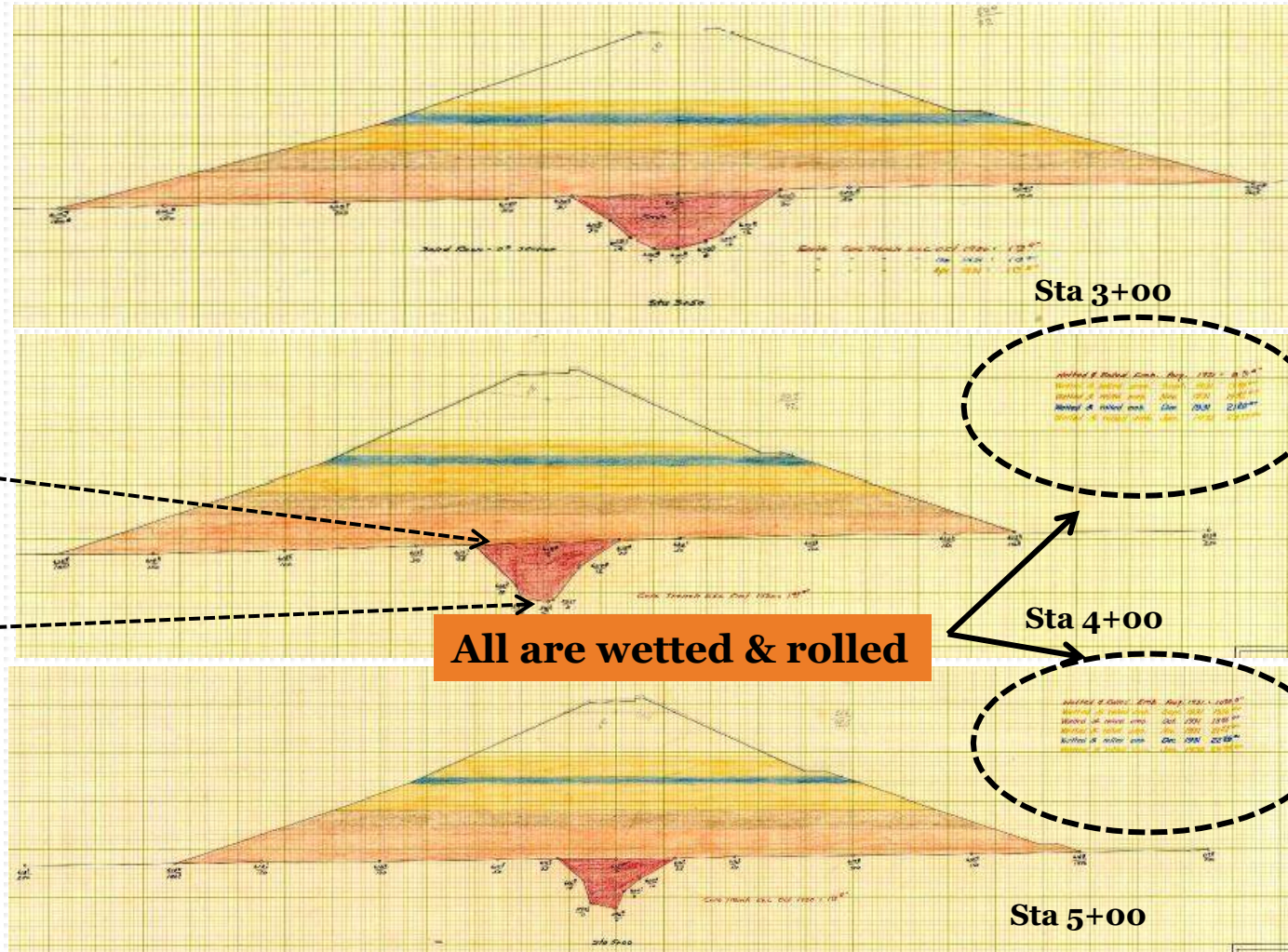
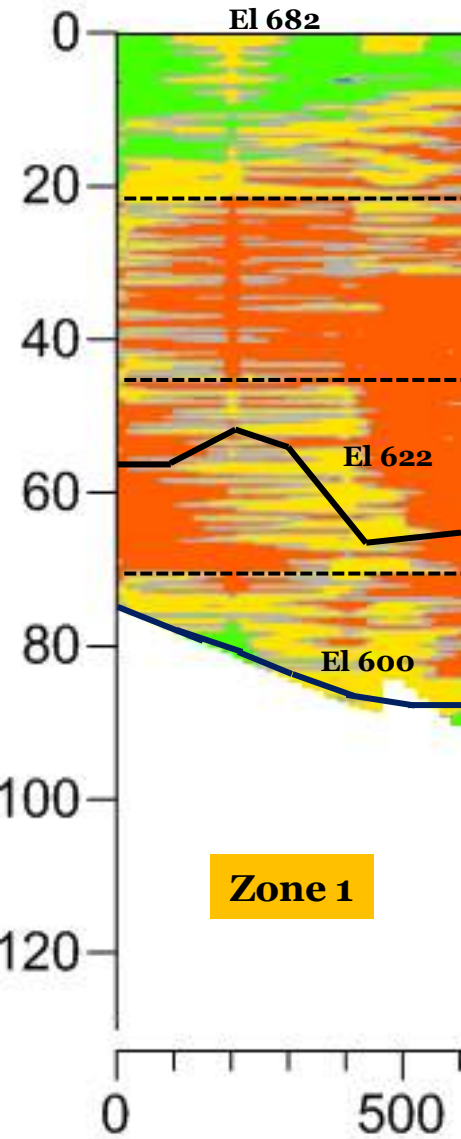
Main Dam Crest- SBT Profile



Key Observations: 4 zones

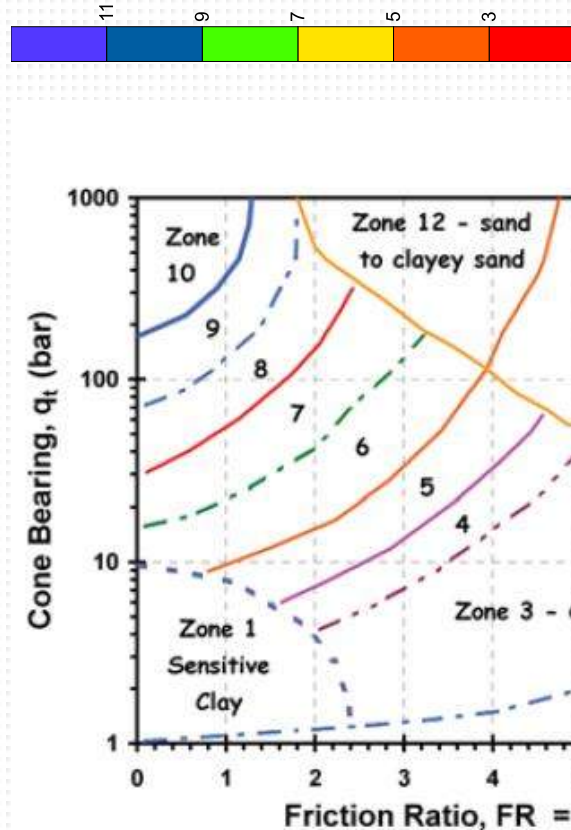
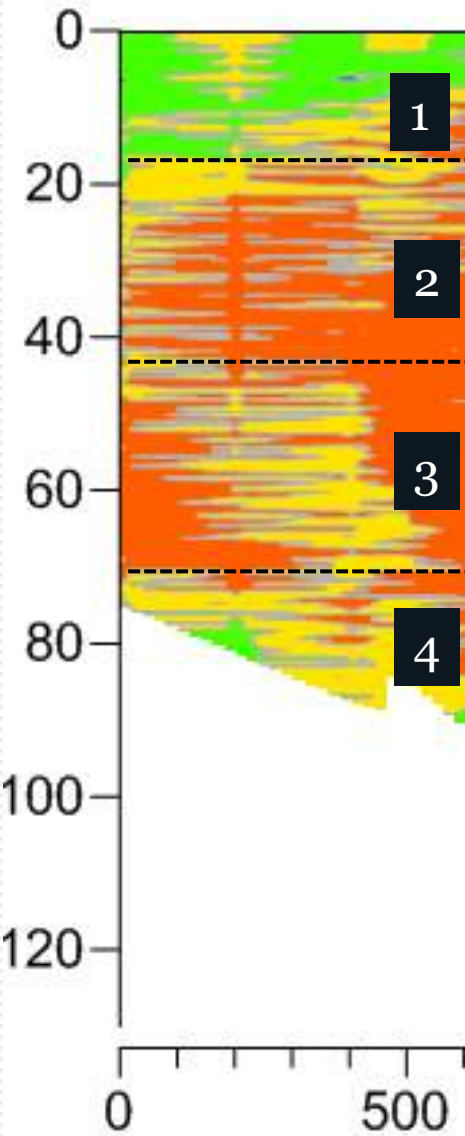
0 to 500ft ; 500 to 1200ft; 1200 to 3800ft; 3800 to 4000ft

Main Dam Crest- SBT Profile



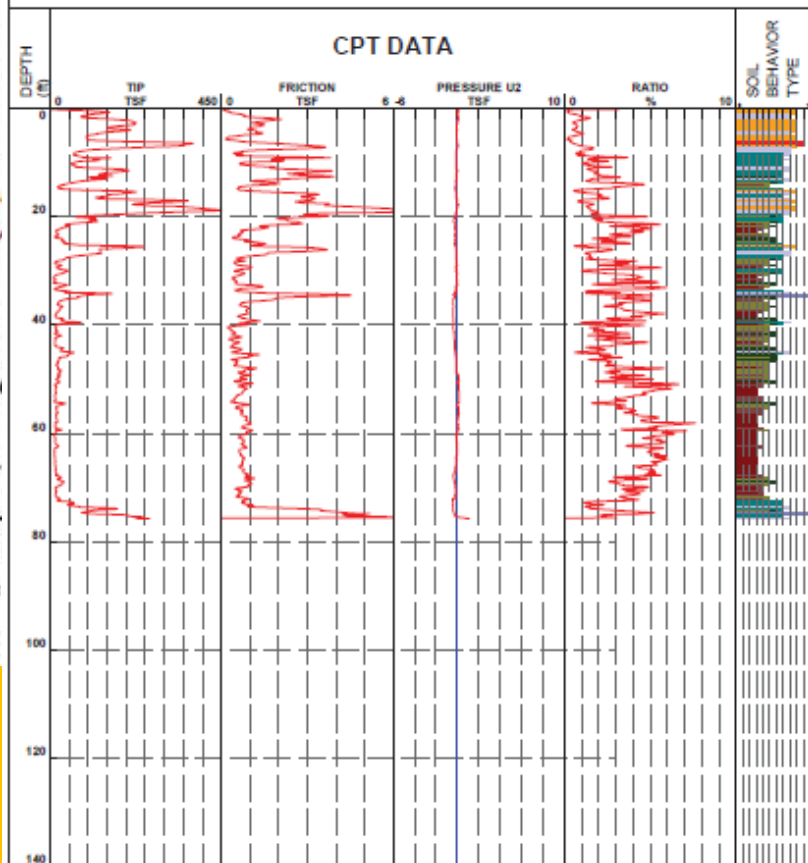
Original & Progress construction drawings

Main Dam Crest- SBT Profile



CPT Data

Job Number: 04.1909-0011 CPT Number: DCC-01 Location: Fort Worth-TX
 Operator: HERBERT JACKSON Date and Time: 03-Mar-2009 07:38:33 Cone Number: FT.5CKEHEGV2/0603
 Client: Parsons Brinkerhoff



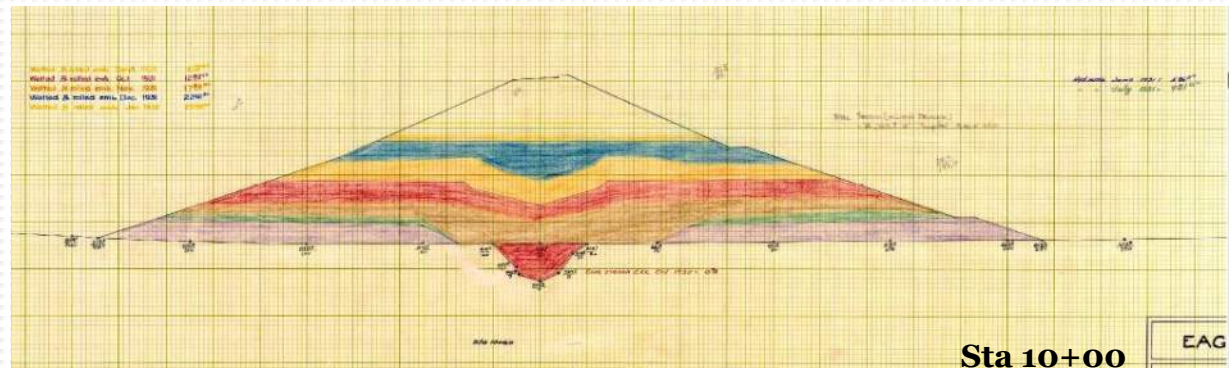
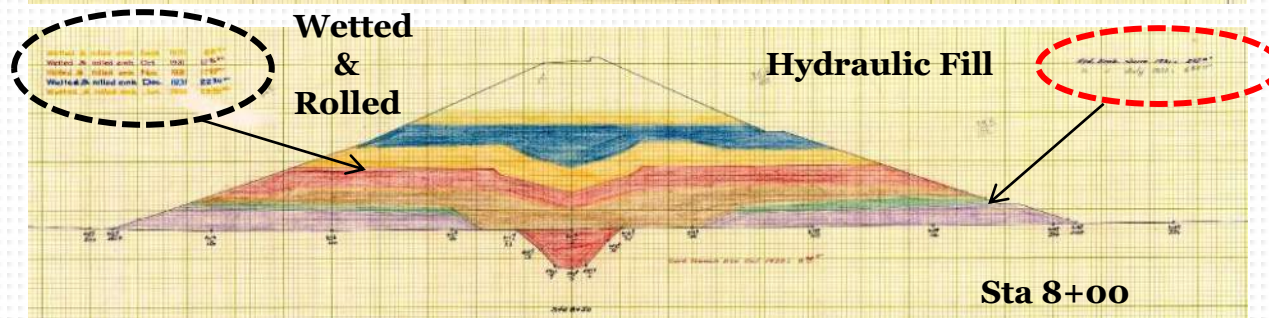
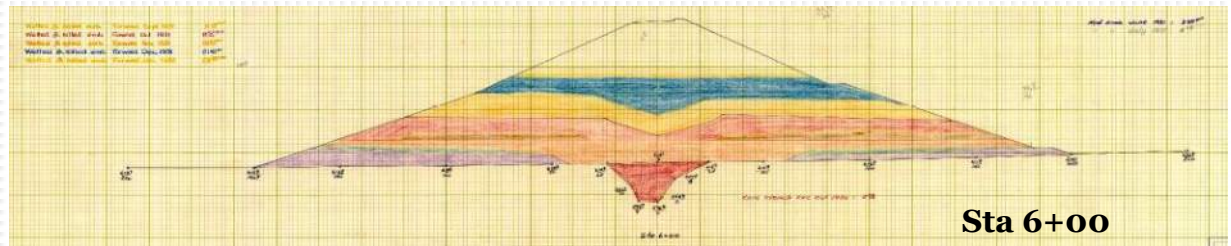
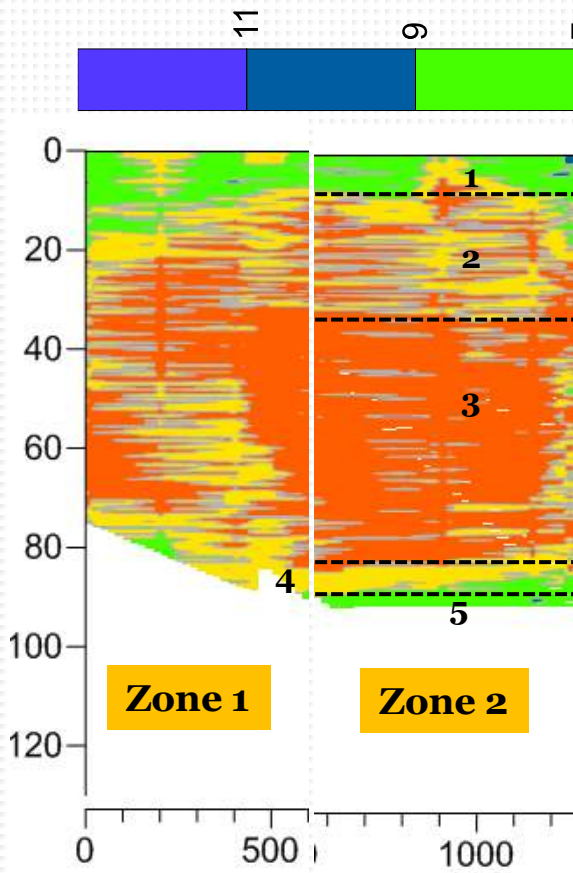
- Classification**
1. Mixtures of sand & silt
 2. Mixtures of silt & clay
 3. Mixture of clay & silt
 4. Mixture of silt & sand

Legend for Soil Behavior Type (SBT):

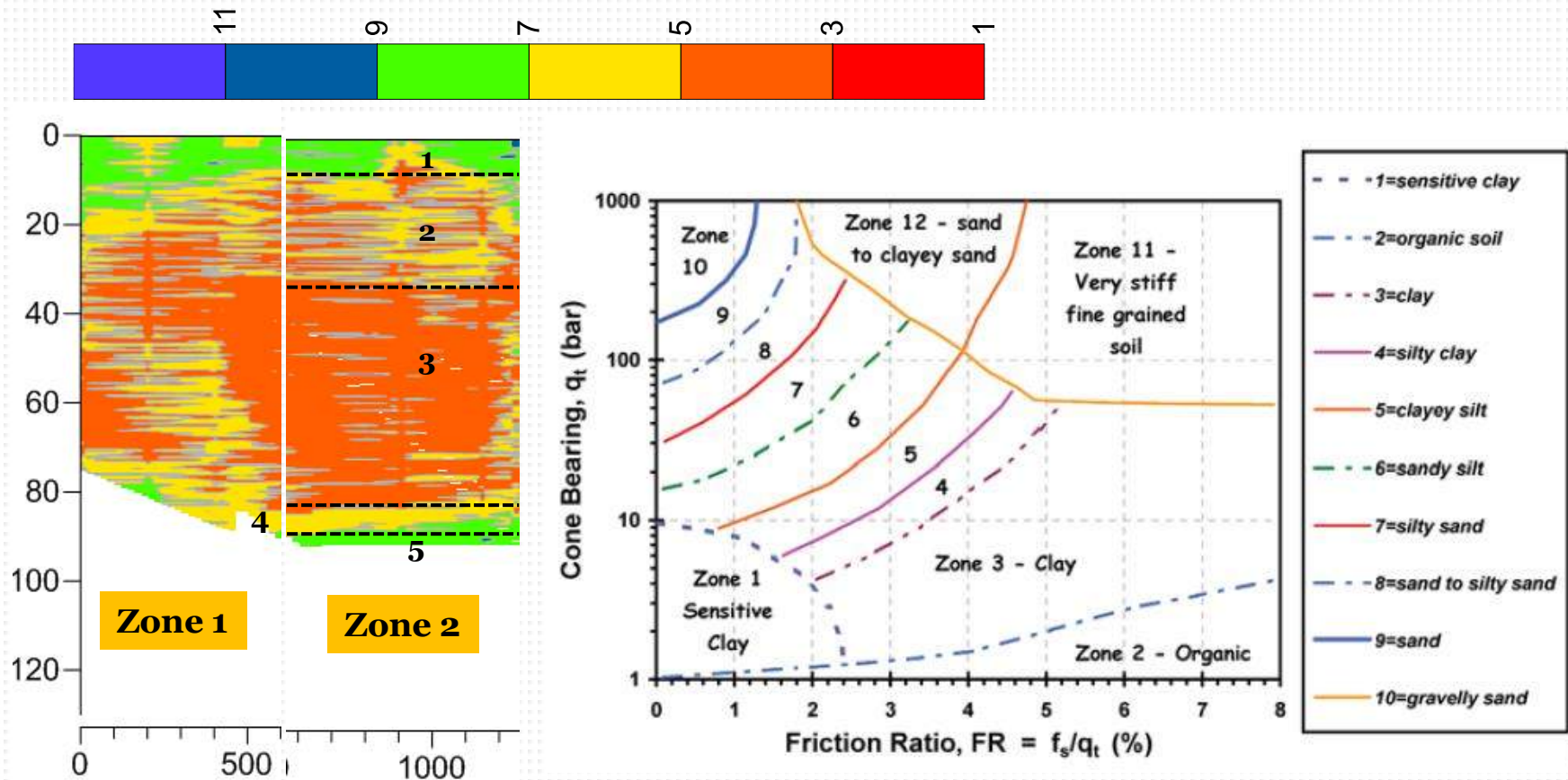
- 1 - sensitive fine grained
- 2 - organic material
- 3 - clay
- 4 - silty clay to clay
- 5 - clayey silt to silty clay
- 6 - sandy silt to clayey silt
- 7 - silty sand to sandy silt
- 8 - sand to silty sand
- 9 - sand
- 10 - gravelly sand to sand
- 11 - very stiff fine grained (*)
- 12 - sand to clayey sand (*)

Robertson et al. 1985 * Overconsolidated or Cemented

Main Dam Crest- SBT Profile



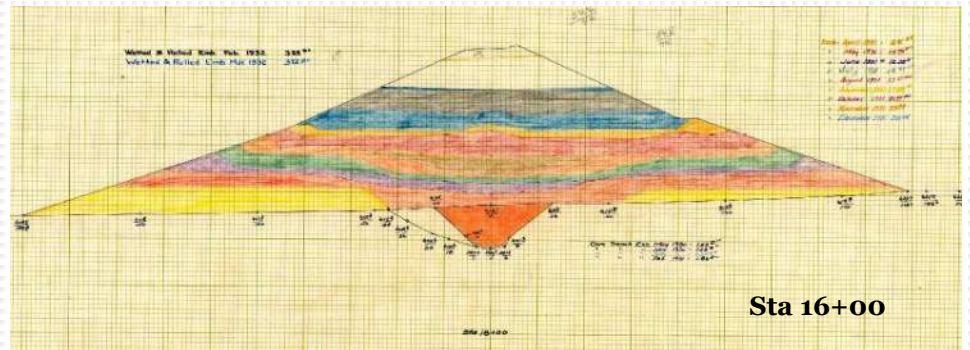
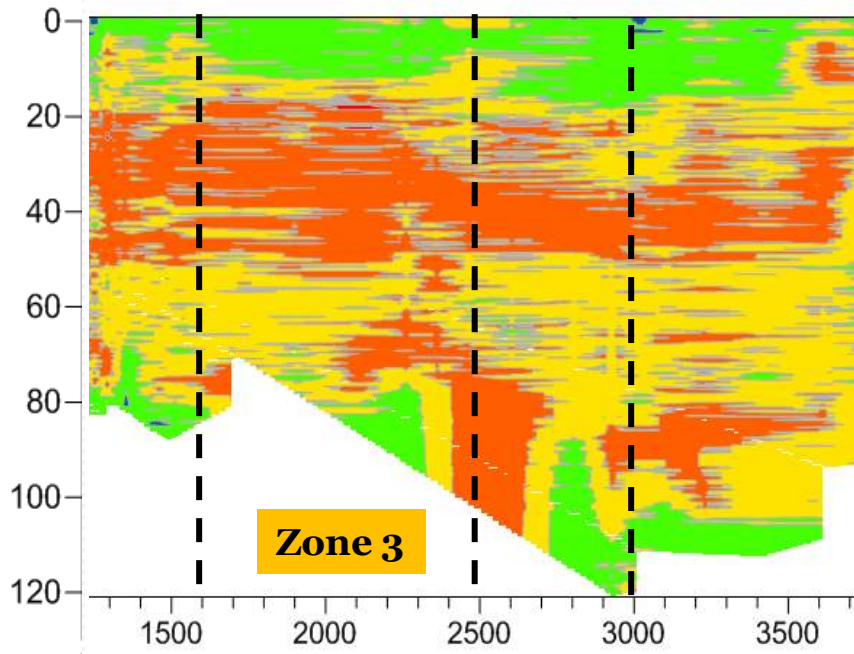
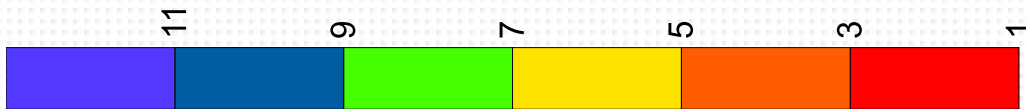
Main Dam Crest- SBT Profile



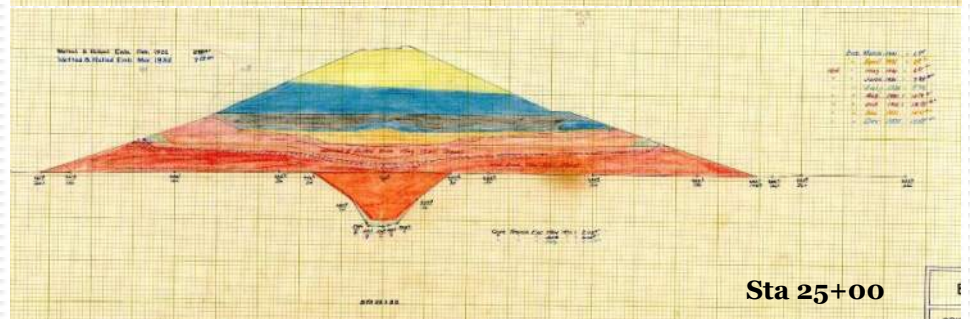
Classification

1. Mixtures of silt & sand
2. Mixtures of silt & clay
3. Mostly clay with silt lenses
4. Mixture of silt & sand layers

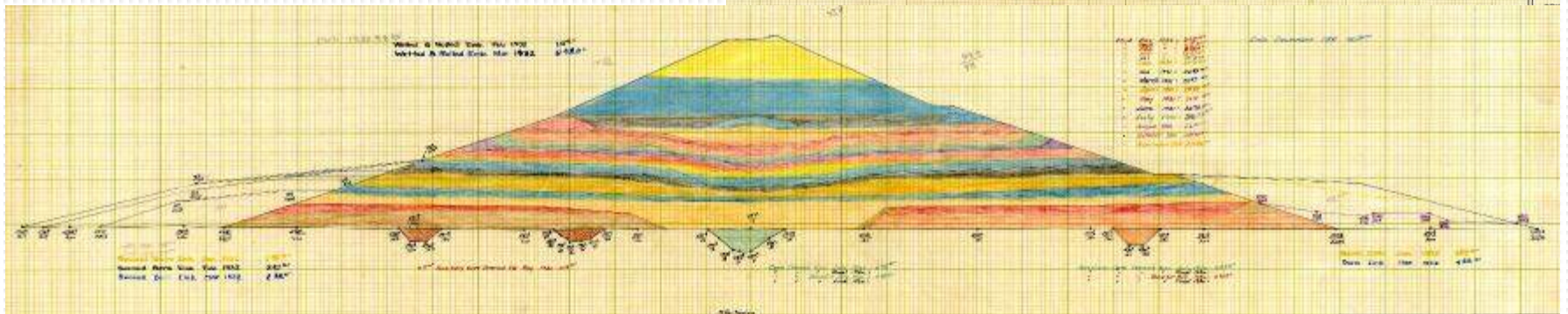
Main Dam Crest- SBT Profile



Sta 16+00



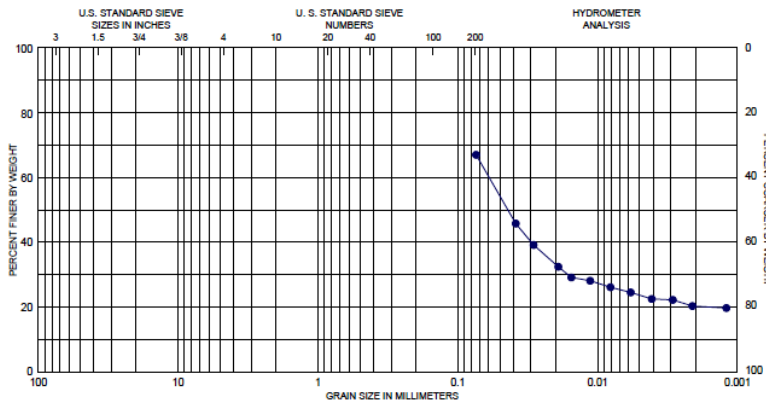
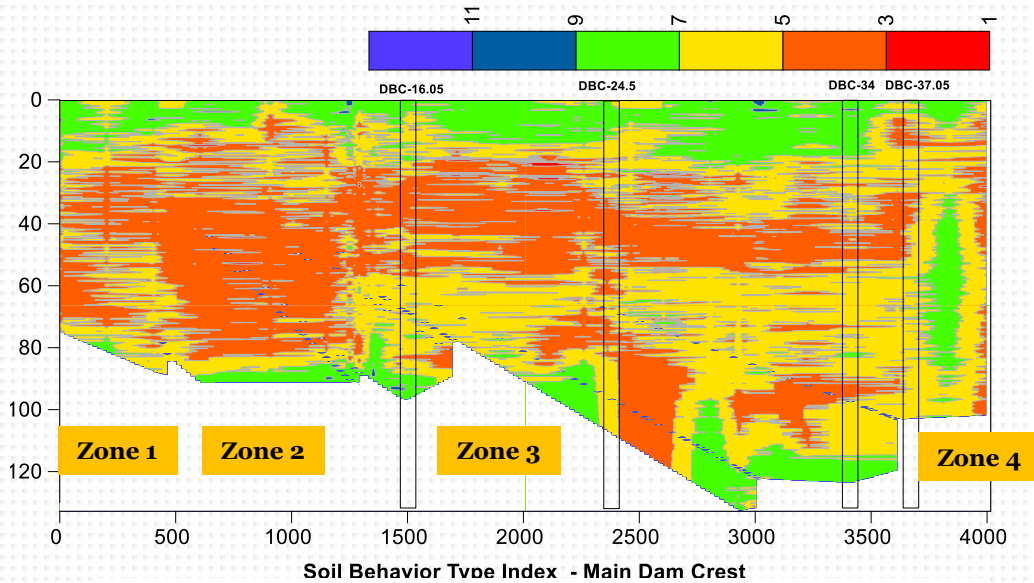
Sta 25+00



Sta 30+00

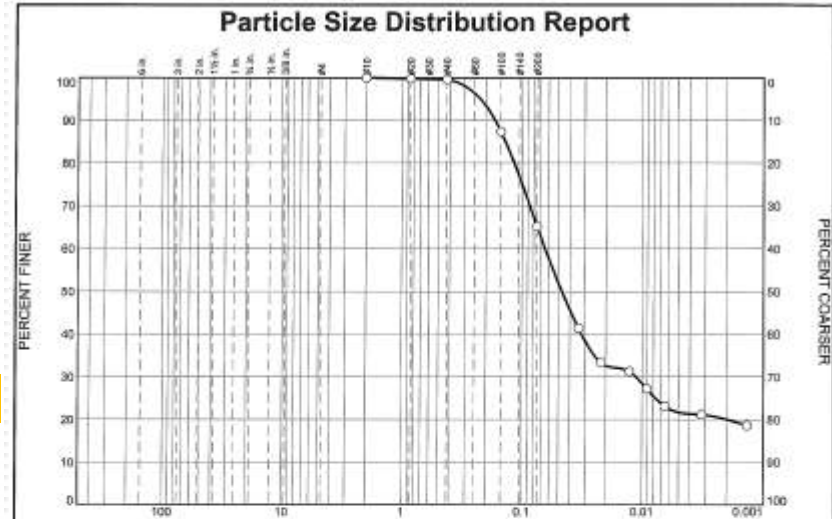
EAGLE MT. DAM

Main Dam Crest- SBT Profile



GRAVEL			SAND			SILT or CLAY		
Coarse	Fine		Coarse	Medium	Fine			
SYMBOL	BORING	DEPTH, FT	S_u	S_c	D_{50}	S_w	CLASSIFICATION	
●	DBC-16.05 P3	62			0.04		Sandy Lean Clay (CL), red	

GRAIN SIZE CURVE



% +3"	% Grain Size - mm					SH	% Fines	Clay
	Coarse	Fine	Coarse	Medium	Fine			
0	0	0	0	0	35	43	22	

SIEVE SIZE	PERCENT FINER	SPEC.* PERCENT	PASS? (X=NO)
#10	100		
#20	100		
#40	100		
#100	87		
#200	65		

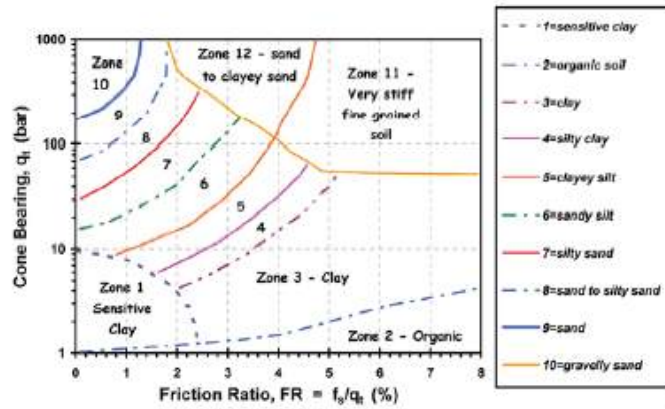
Material Description		
Brown, Sandy CLAY, with fine sand, moist, (CL-ML)		
PL= 15	Atterberg Limits LL= 21	P _I = 6
Coefficients		
D ₉₀ = 0.1677	D ₈₅ = 0.1371	D ₆₀ = 0.0642
D ₅₀ = 0.0465	D ₃₀ = 0.0112	D ₁₅ =
D ₁₀ =	C _u =	C _c =
Classification		
USCS= CL-ML	AASHTO=	
Remarks		

Location: DBC 16.05 Depth: 55' - 57' Date: 4-15-09
 Sample Number: U-27

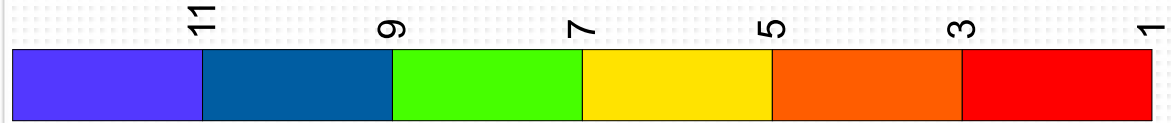
STL Engineers Dallas, TX	Client: Parsons Brinckerhoff Project: Eagle Mountain Dam Phase 3A Fort Worth, Texas
	Project No: 09-1398 Figure

Tested By: Brian Martinez Checked By: Elie A. Ghannoum

Main Dam Crest- SBT Profile



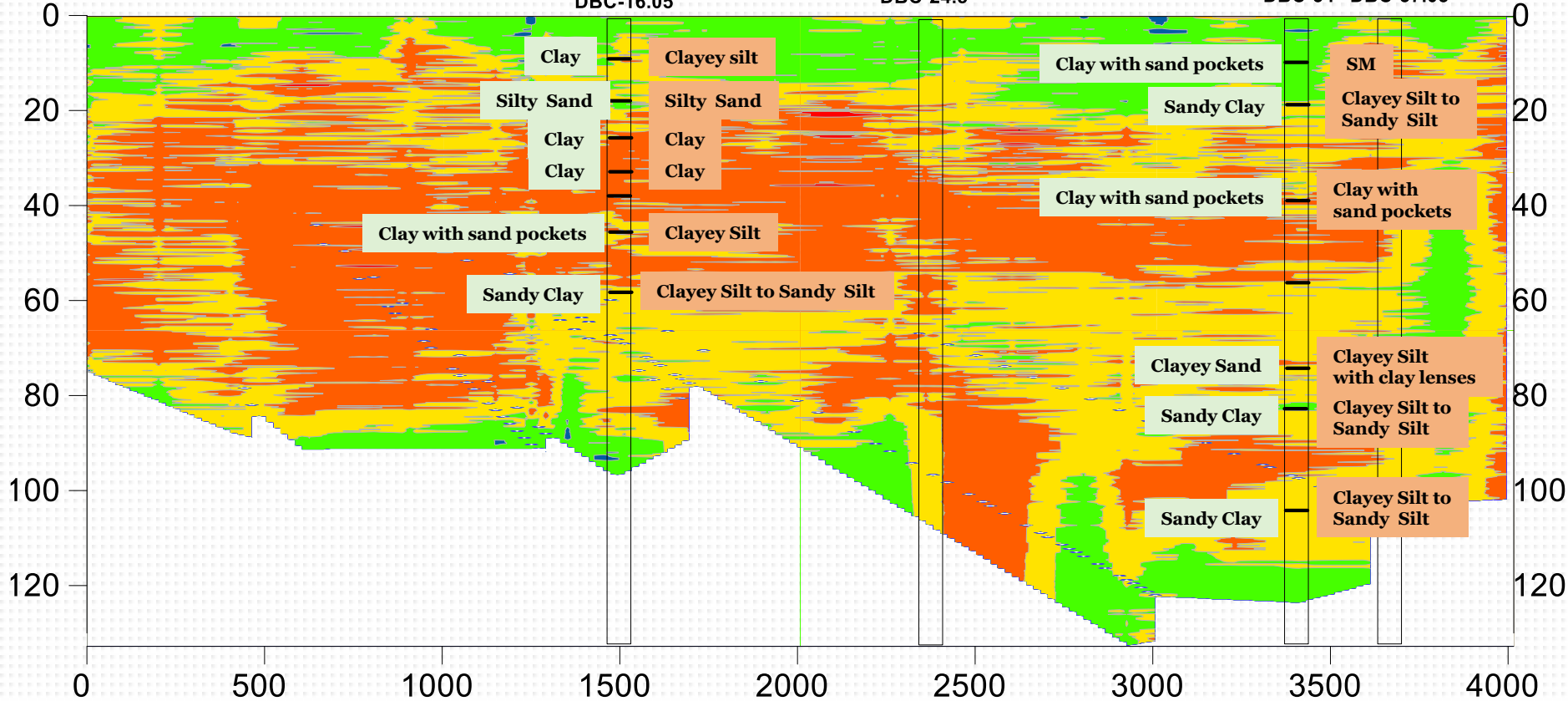
Laboratory Data
 Kriging predictions



DBC-16.05

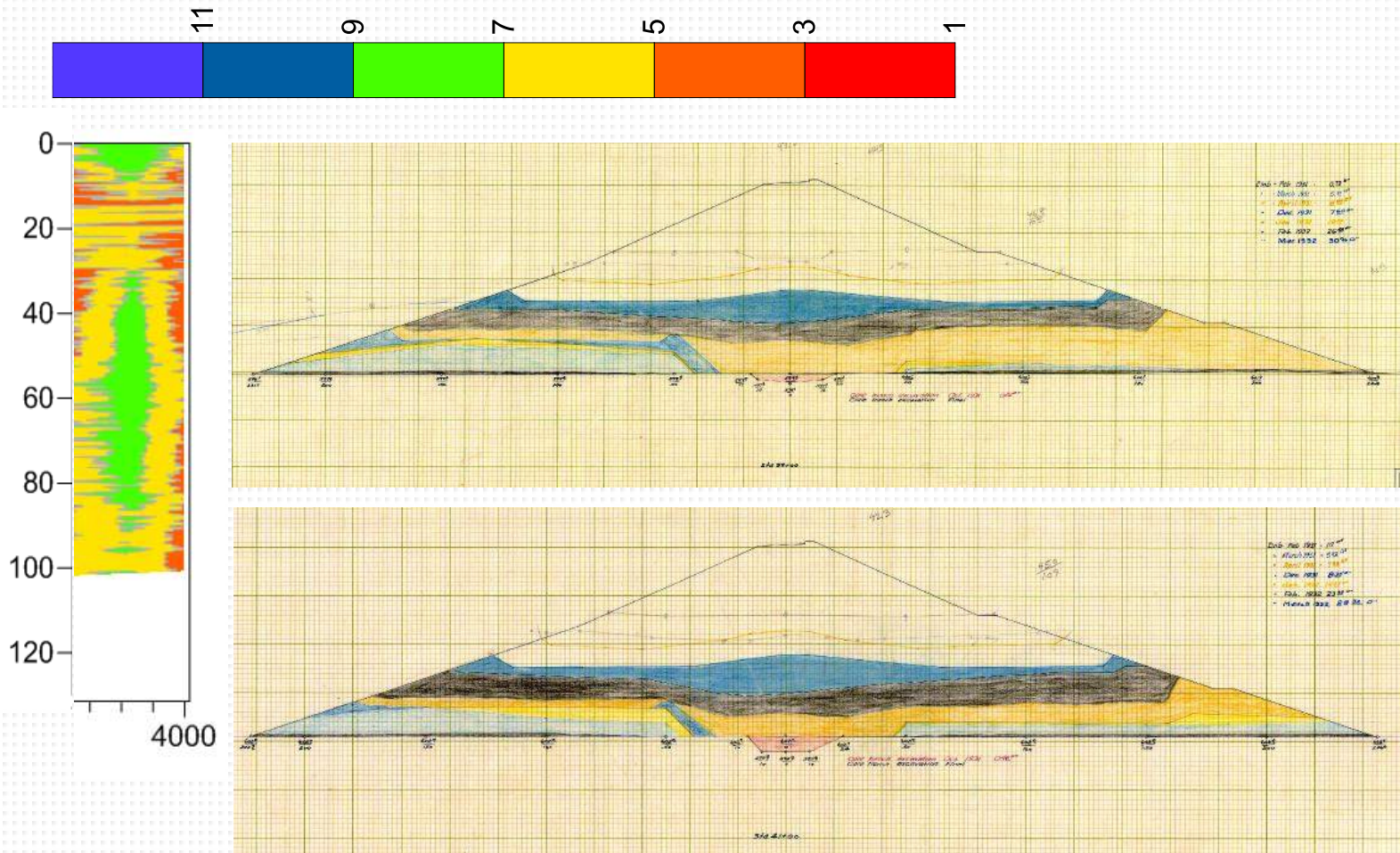
DBC-24.5

DBC-34 DBC-37.05



Soil Behavior Type Index - Main Dam Crest

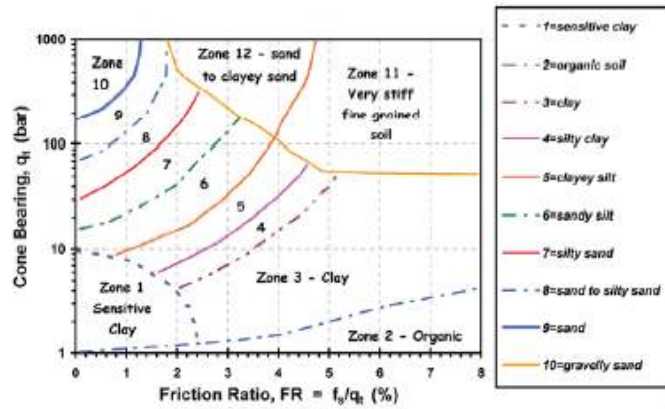
Main Dam Crest- SBT Profile



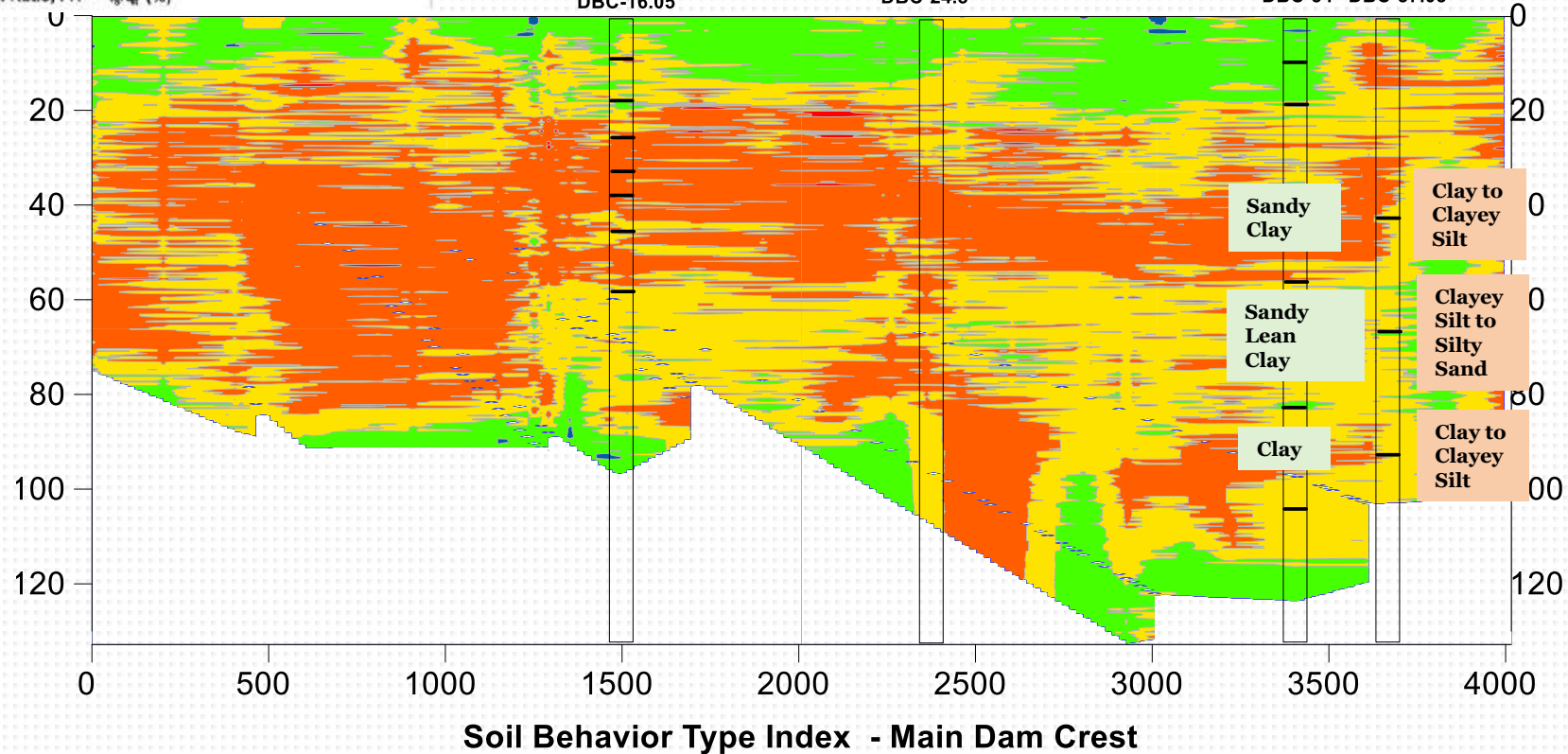
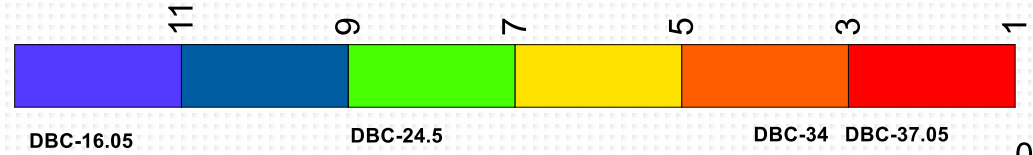
Sta 39+00

Sta 41+00

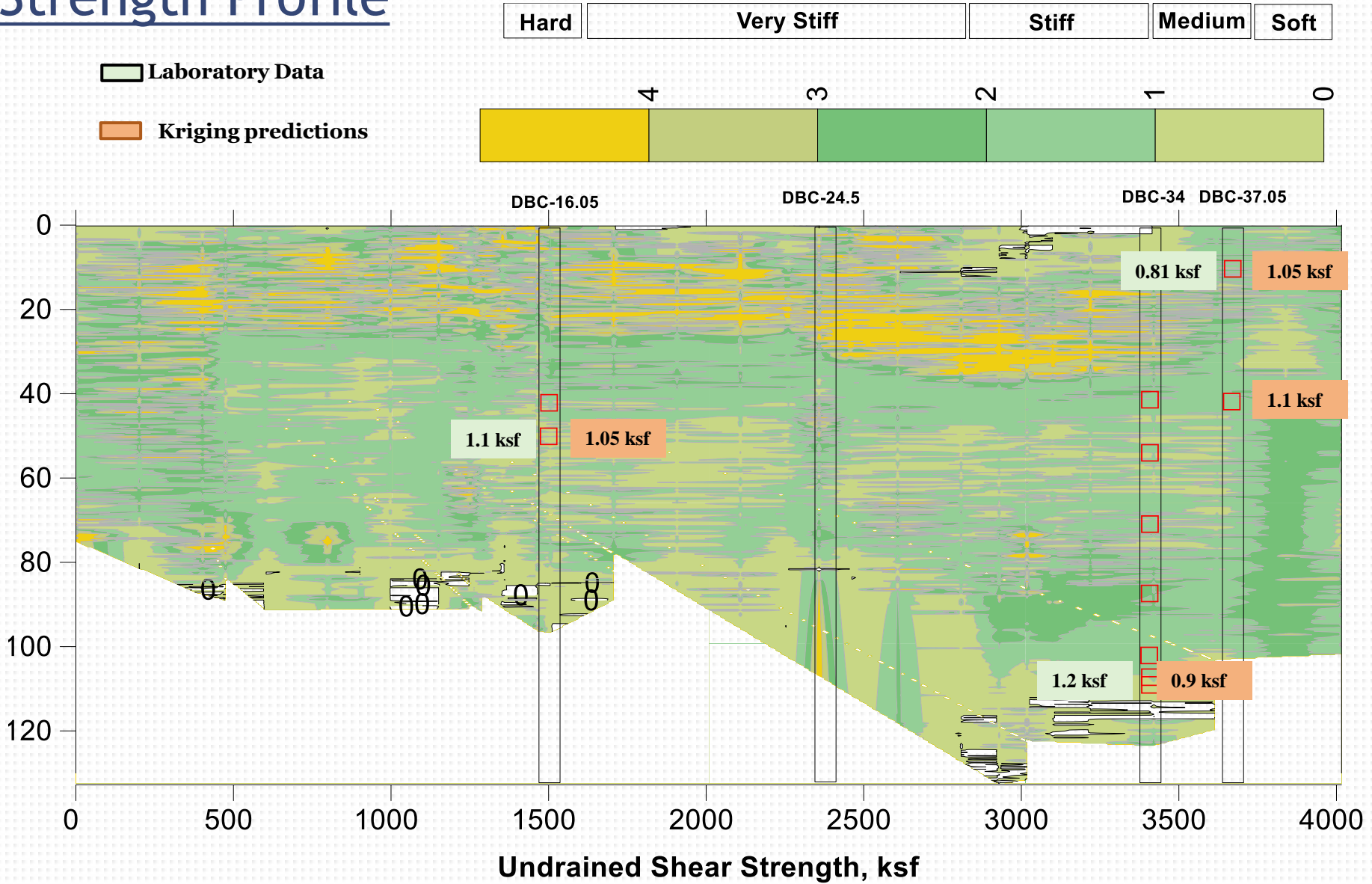
Main Dam Crest- SBT Profile



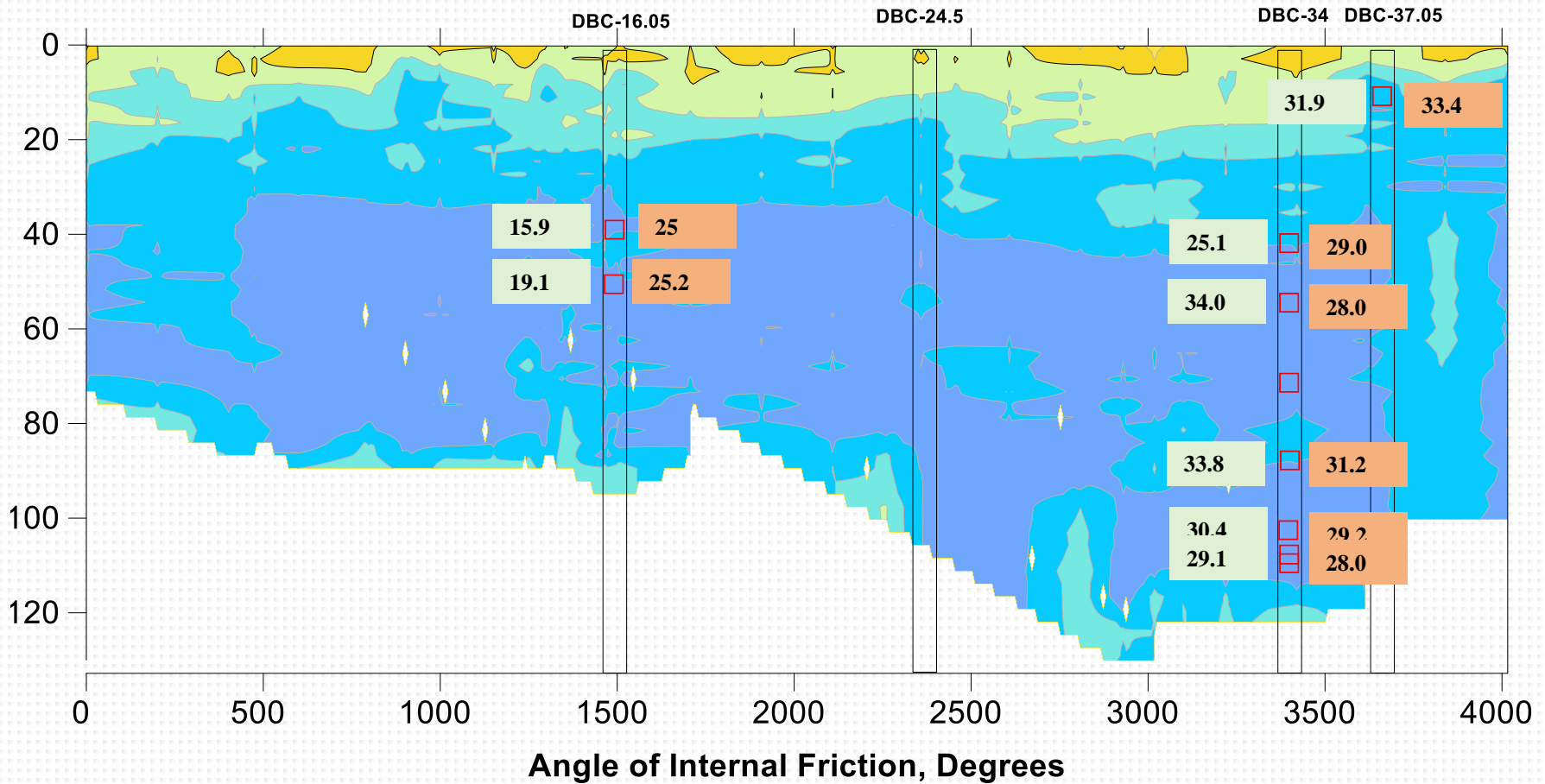
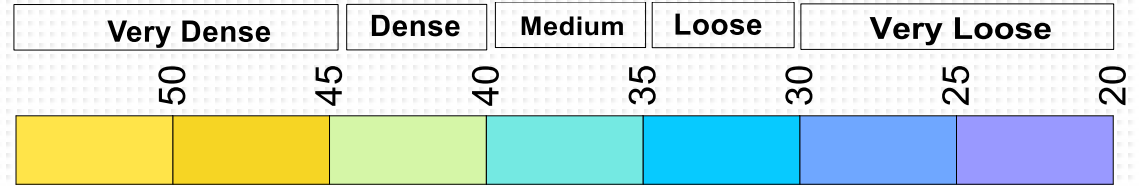
Laboratory Data
 Kriging predictions



Main Dam Crest- Undrained Shear Strength Profile



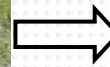
Main Dam Crest- Effective Friction Angle



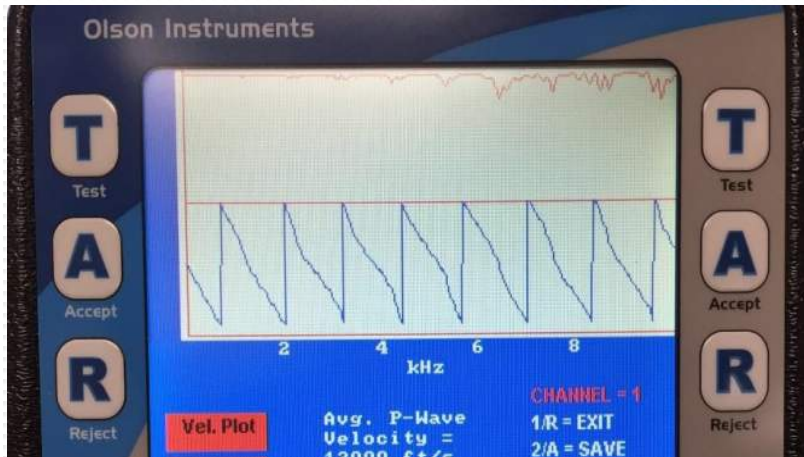
Geophysical Tests on Dam



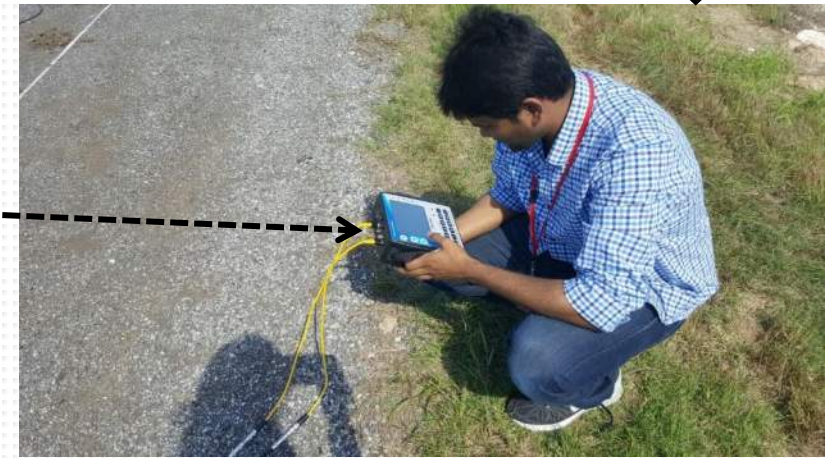
Acoustic coupling



Constant energy impact

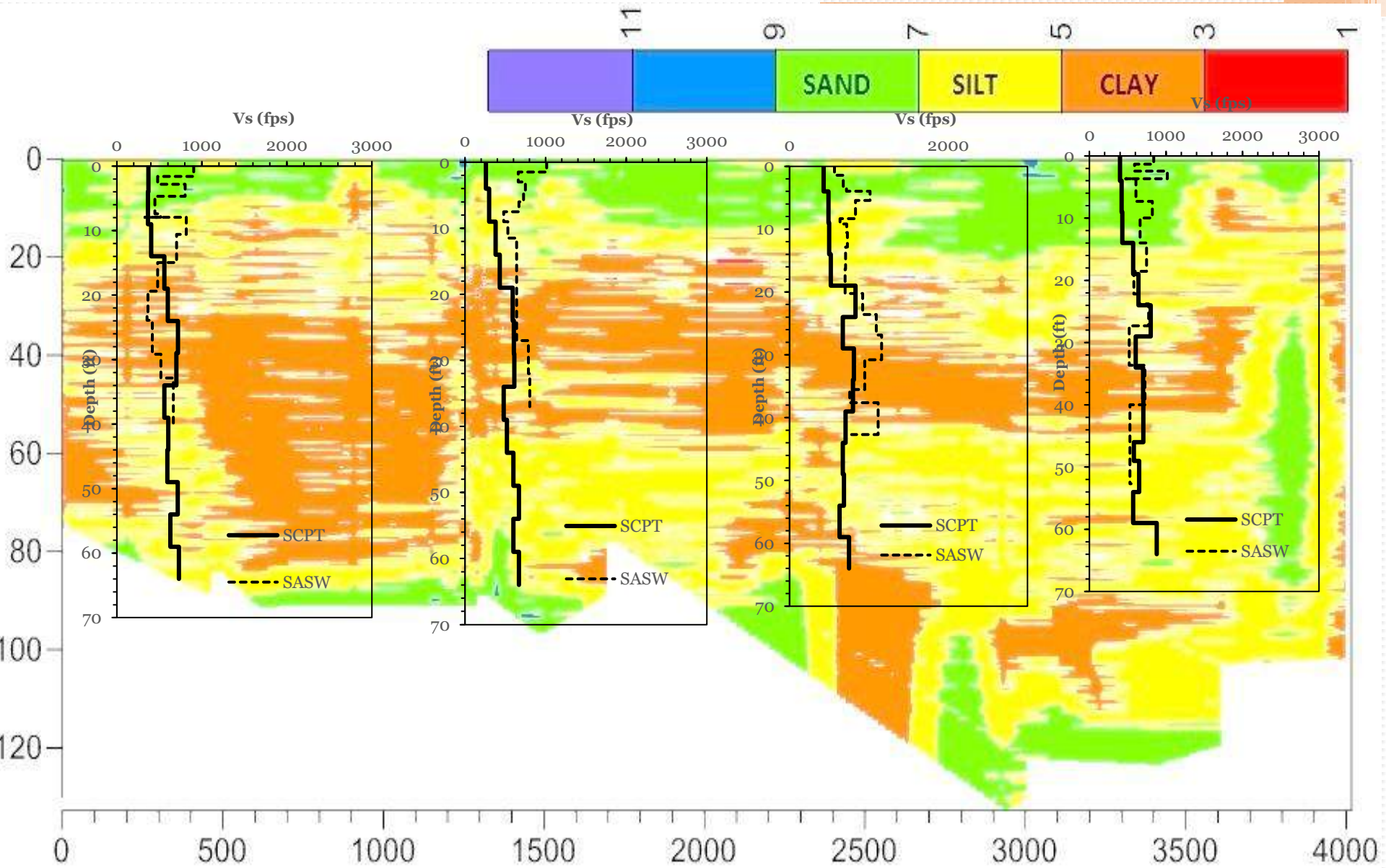


Phase and Coherence Data

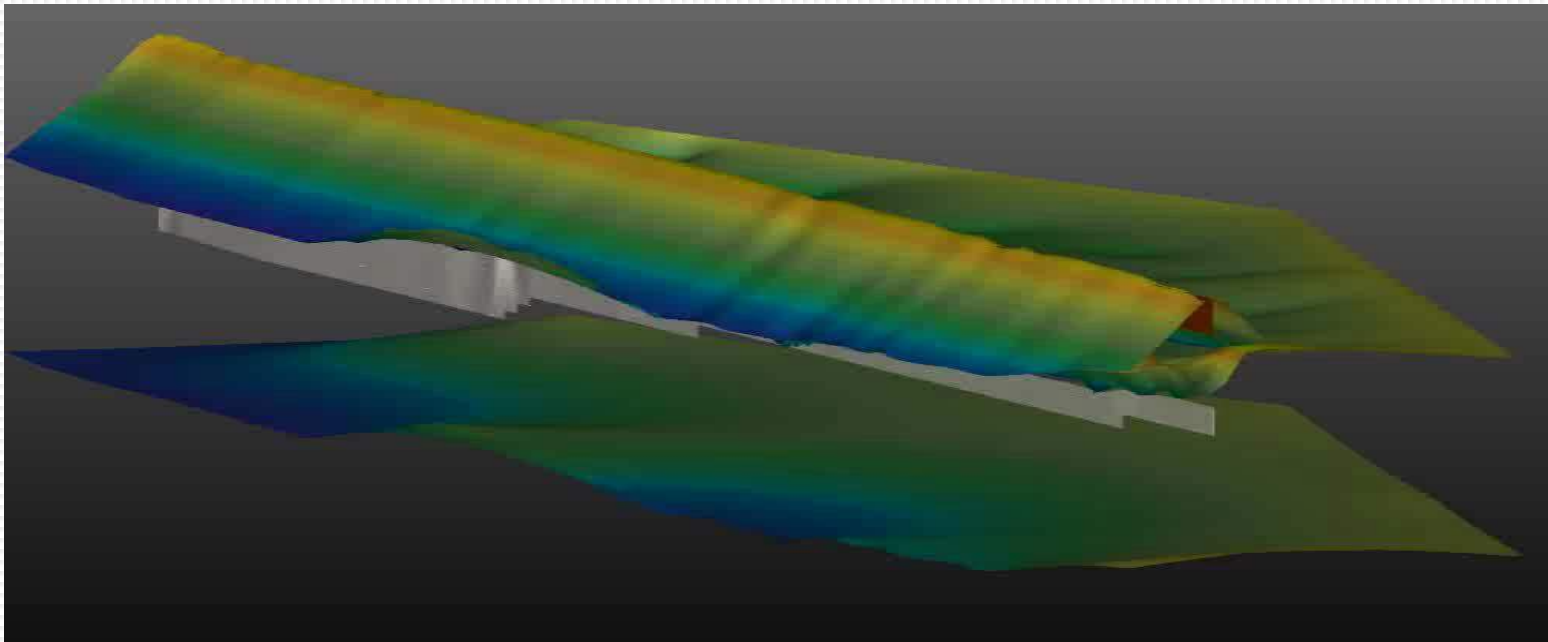
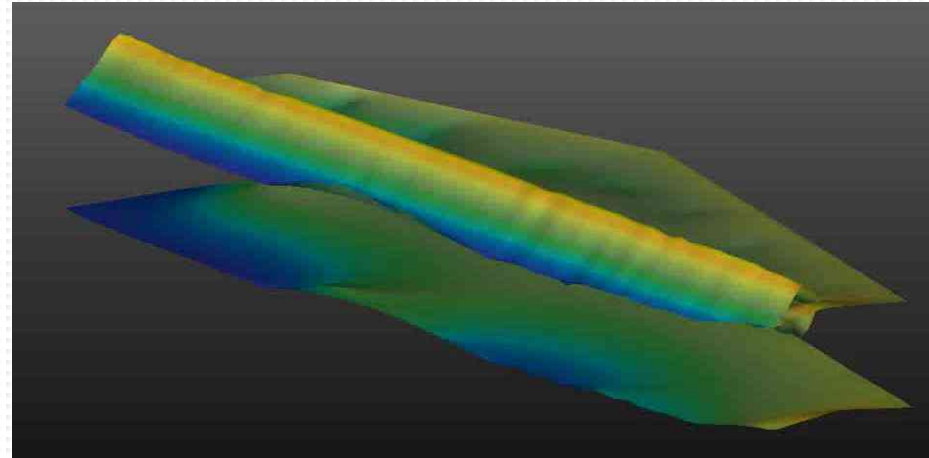
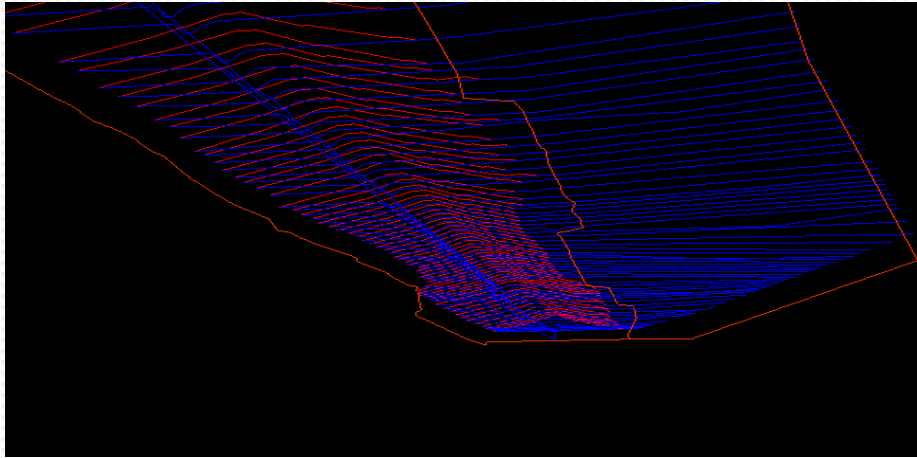


Accept/ Reject Test

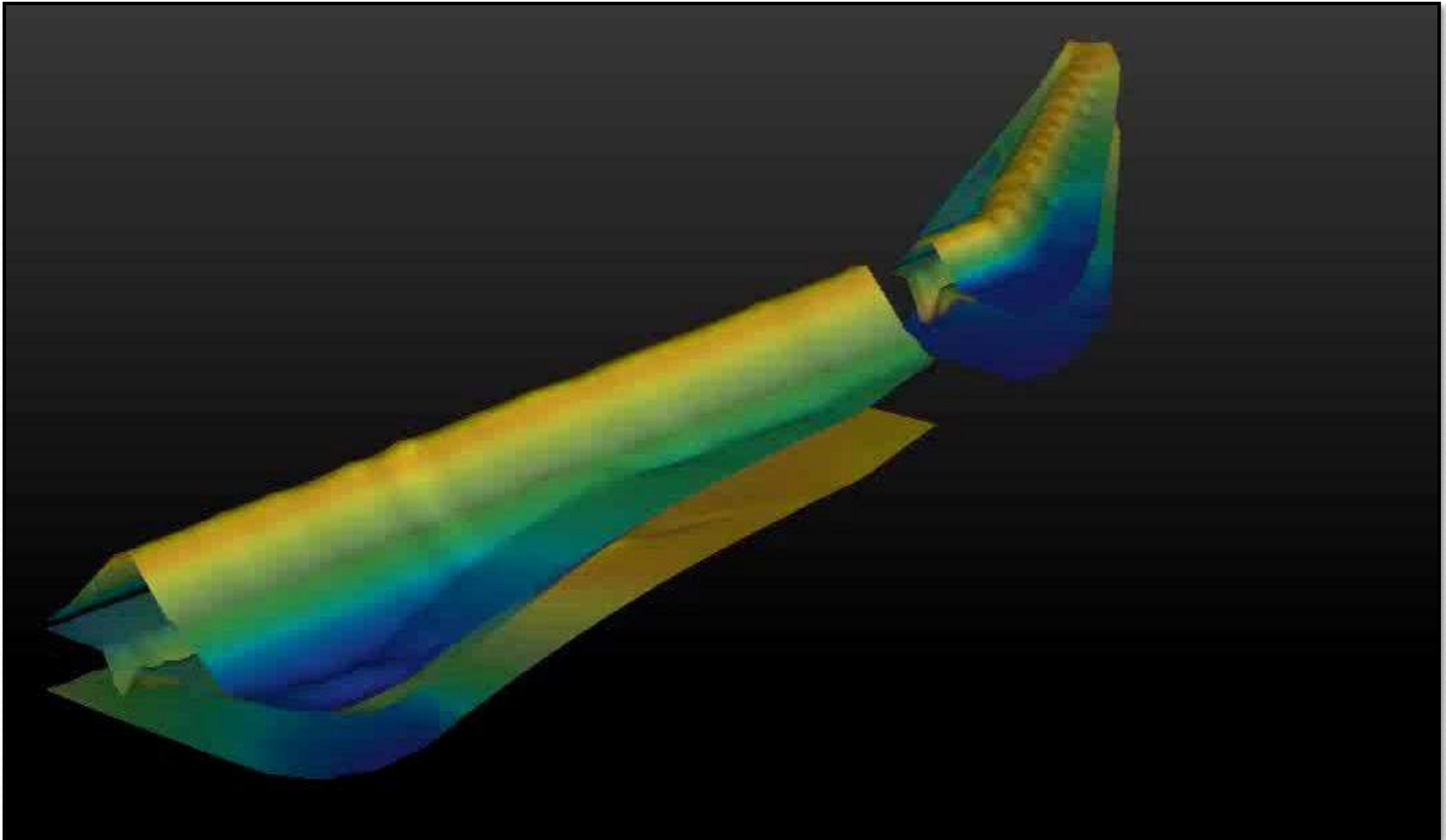
- Each SASW test for each receiver spacing was repeated for 4 times.
- For 1 location (2 ft, 4 ft, 8 ft): 12 SASW tests



3D Model Generation

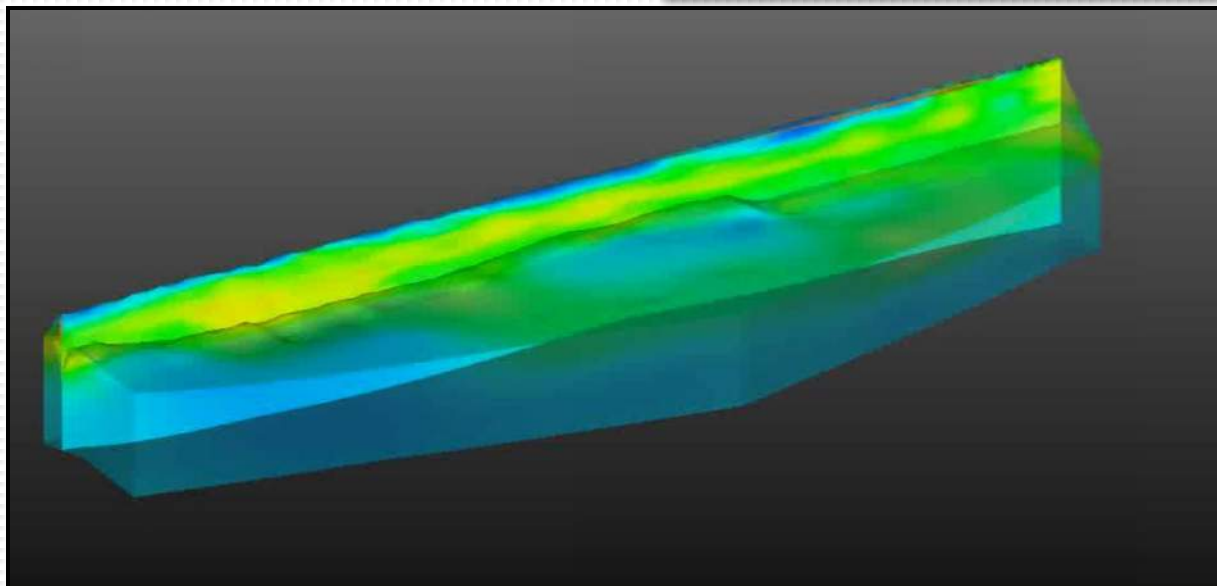
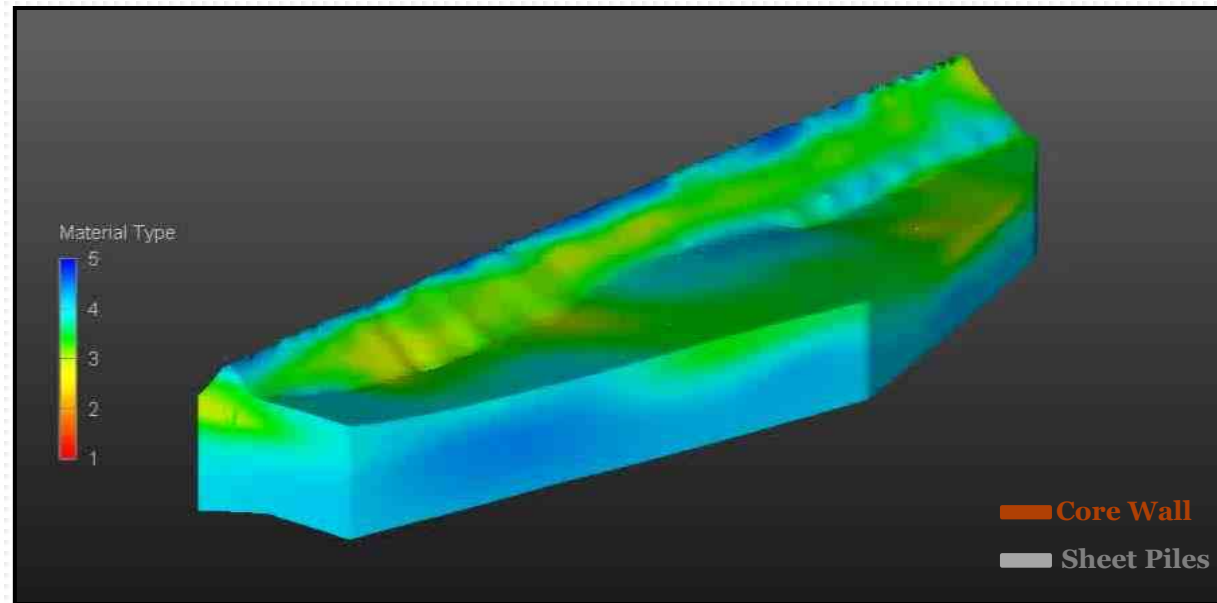


3D Model Generation



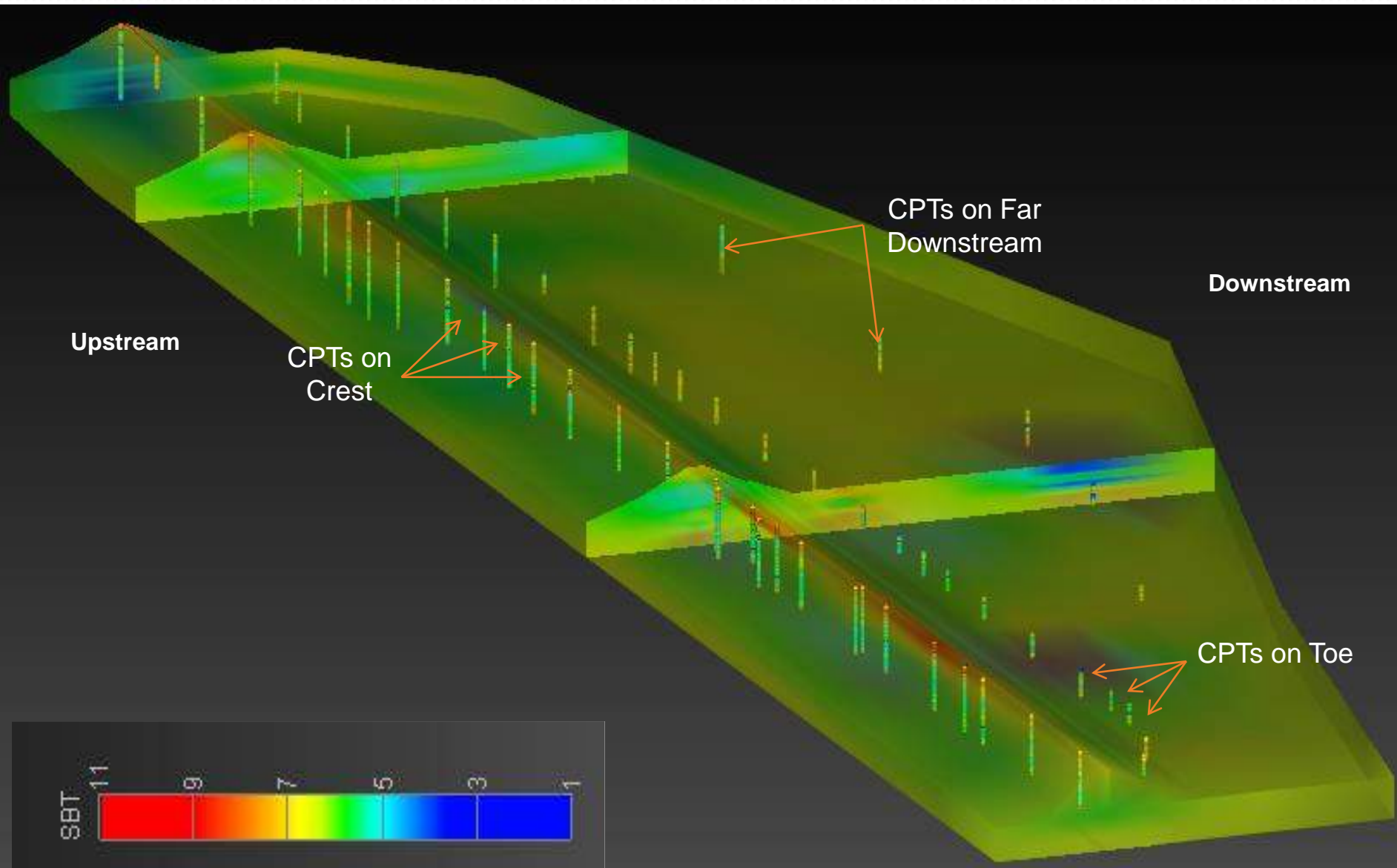
Spatial Variability of Soils in EM Dam

Material Type	Soil Behavior Type
1	Sensitive, fine grained
2	Organic soils - clay; Clays - Silty clay to clay
3	Silt mixtures - clayey silt to silty clay; Sand mixtures - silty sand to sandy
4	Sands - clean sand to silty sand; Gravelly sand to dense sand; Very
5	Very stiff fine grained *

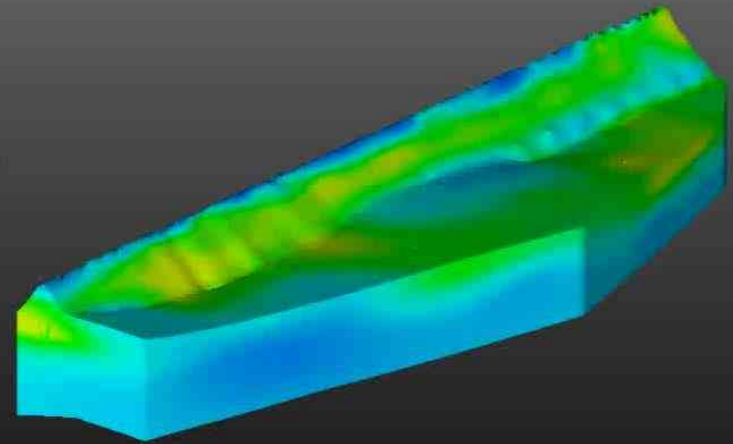


- Four construction stages identified due to the change of soil type along the dam
- Puddled Clay Core is identified after the interpolation
- Highest amount of hydraulic fill is located in Zone 3 (Information verified on PB Report, 2009, Sta. 30+00 & 37+00)
- Identification of clean sands present in the core section (Zone 3). They can cause seepage problems or can be liquefied.

3D Model Results-Main Dam

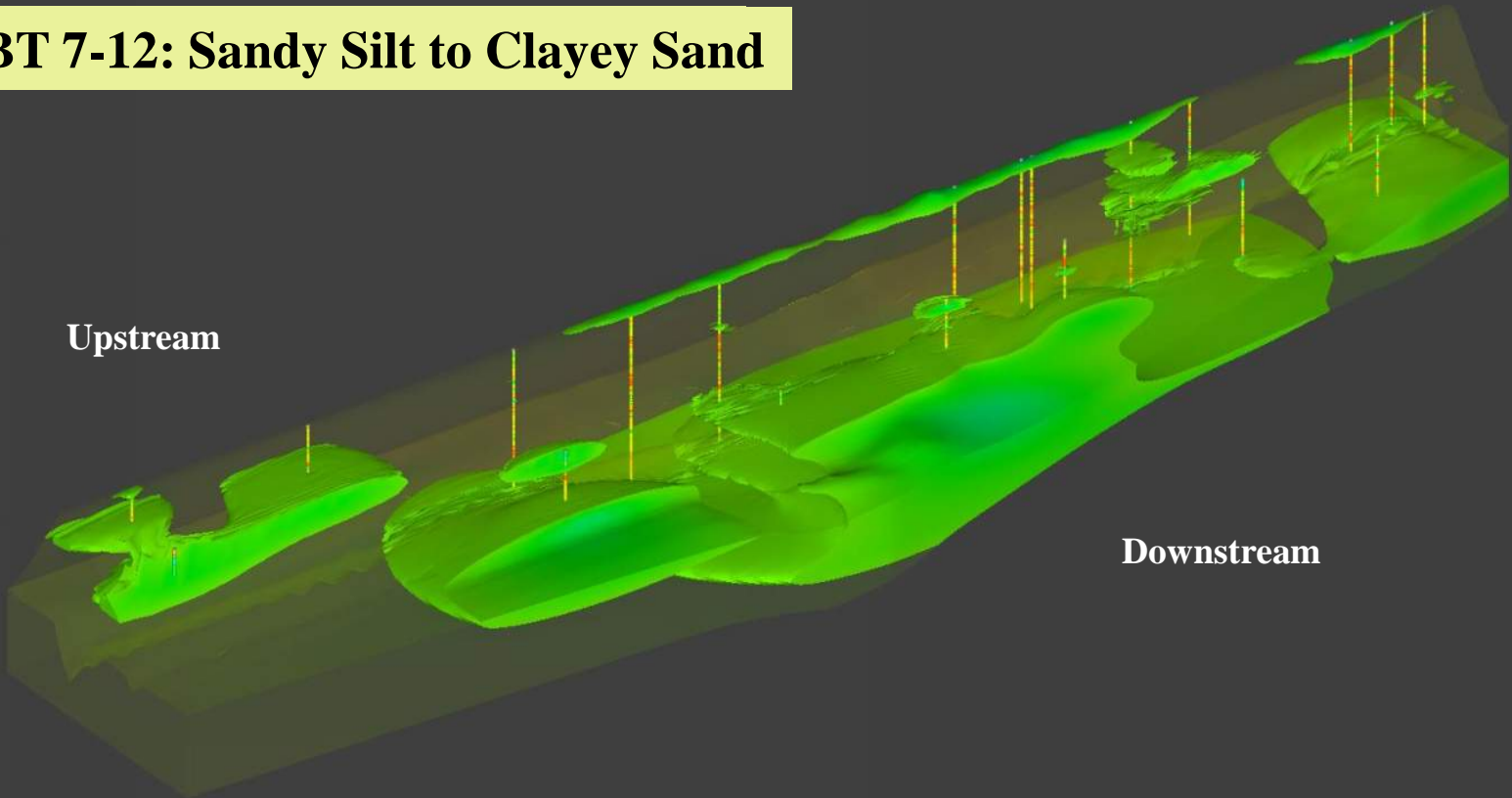


Identification of critical Zones in EM Dam



SBT 7-12: Sandy Silt to Clayey Sand

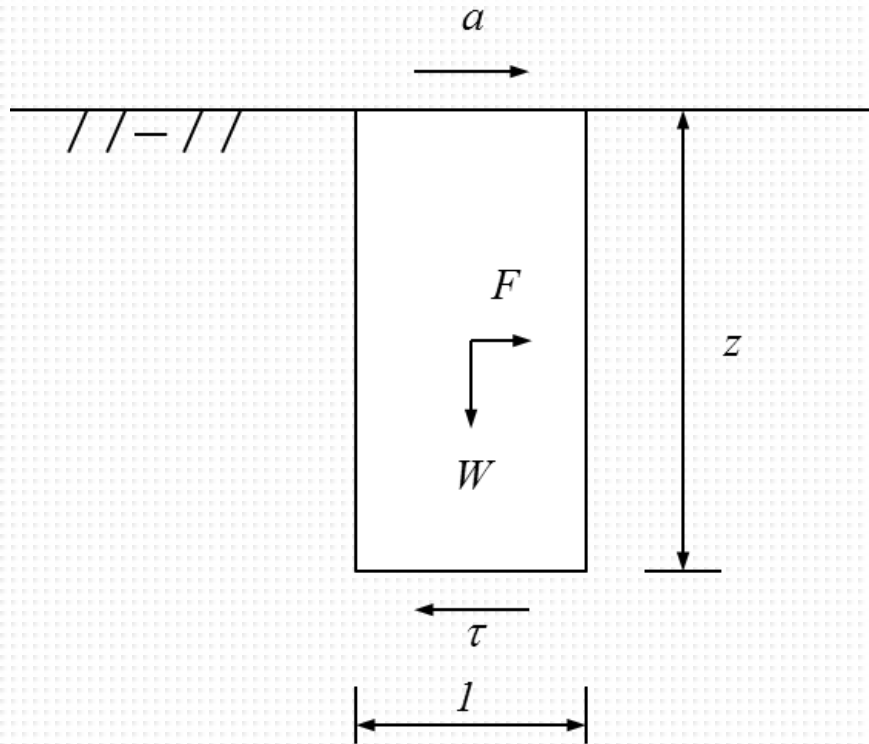
Upstream



Downstream

Liquefaction Analysis

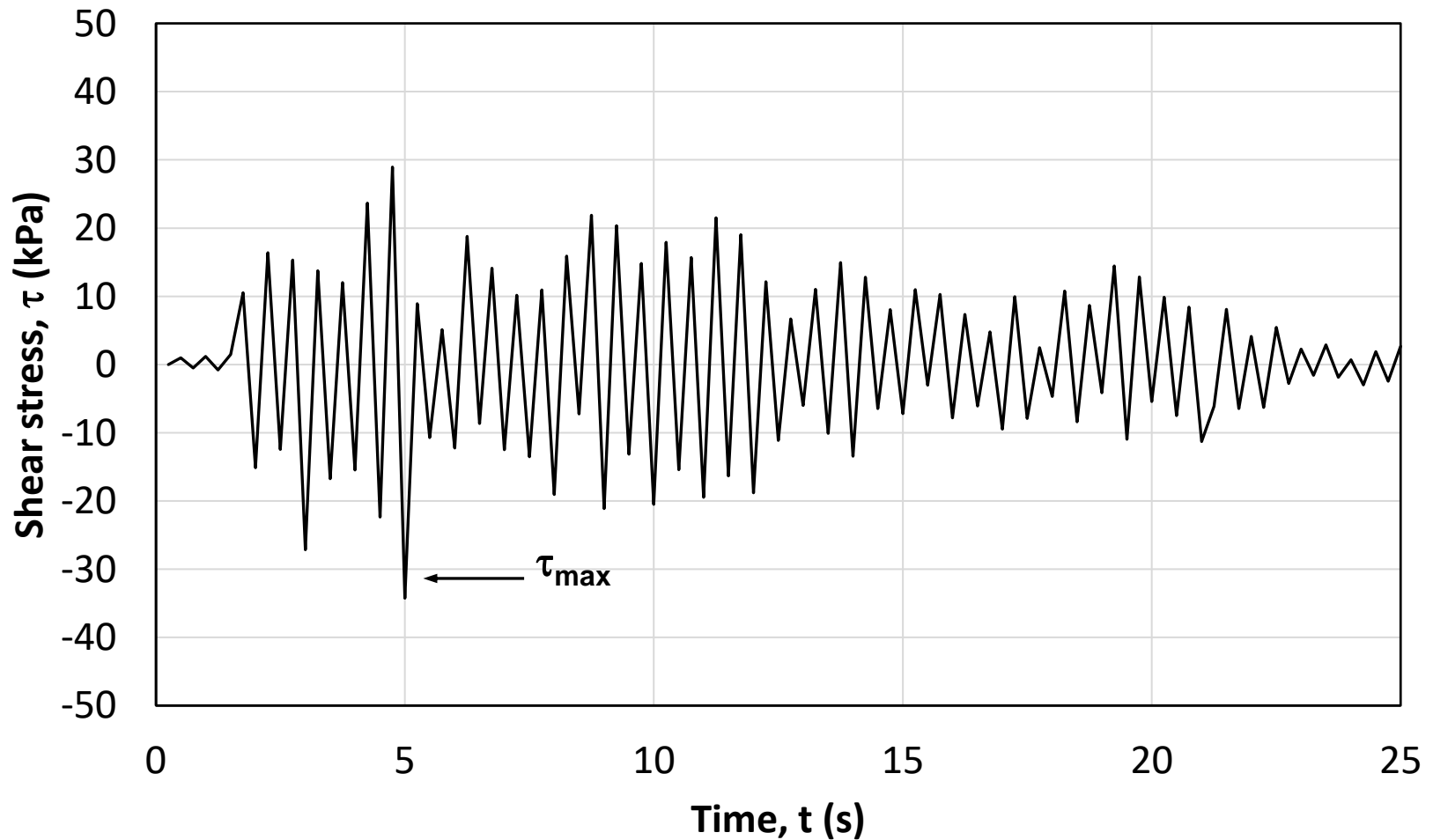
Maximum Shear Stress at Base of Rigid Soil Column



F = earthquake-induced force
 A = cross-sectional area of the rigid soil column ($A = 1$)
 m = mass of the soil column
 W = weight of the soil column
 γ = total unit weight of the soil column
 z = height of the soil column
 σ_{z0} = total overburden stress
 a = ground acceleration
 g = gravitational acceleration

$$\tau = \frac{F}{A} = \frac{ma}{1} = \frac{W}{g} a = \frac{\gamma z}{g} a = \sigma_{z0} \frac{a}{g}$$

Shear Stress Variation with Time



Cyclic Stress Ratio

Seed and Idriss (1971) converted the maximum shear stress with a non-uniform shear stress variation to a uniform cyclic shear stress:

$$\tau_{\text{cyc}} = 0.65\tau_{\text{max}}$$

Cyclic stress ratio is

$$\text{CSR} = \frac{\tau_{\text{cyc}}}{\sigma'_{z0}} = 0.65r_d \left(\frac{\sigma_{z0}}{\sigma'_{z0}} \right) \left(\frac{a_{\text{max}}}{g} \right)$$

σ'_{z0} = effective overburden stress at a depth of z

a_{max} = maximum ground acceleration

r_d = stress reduction factor

Stress Reduction Factor

The stress reduction factor was introduced by Seed and Idriss (1971) to account for the fact that the soil is not a rigid body and the shear stress decreases with depth.

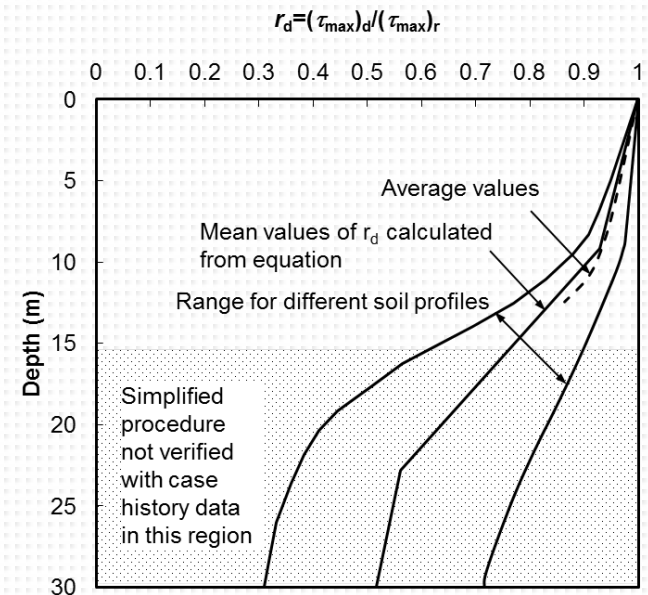
For noncritical projects, the following equations may be used to estimate the mean value of r_d :

$$r_d = 1.0 - 0.00765z \quad \text{for } z \leq 9.15 \text{ m}$$

$$r_d = 1.174 - 0.0267z \quad \text{for } 9.15 \text{ m} < z \leq 23 \text{ m}$$

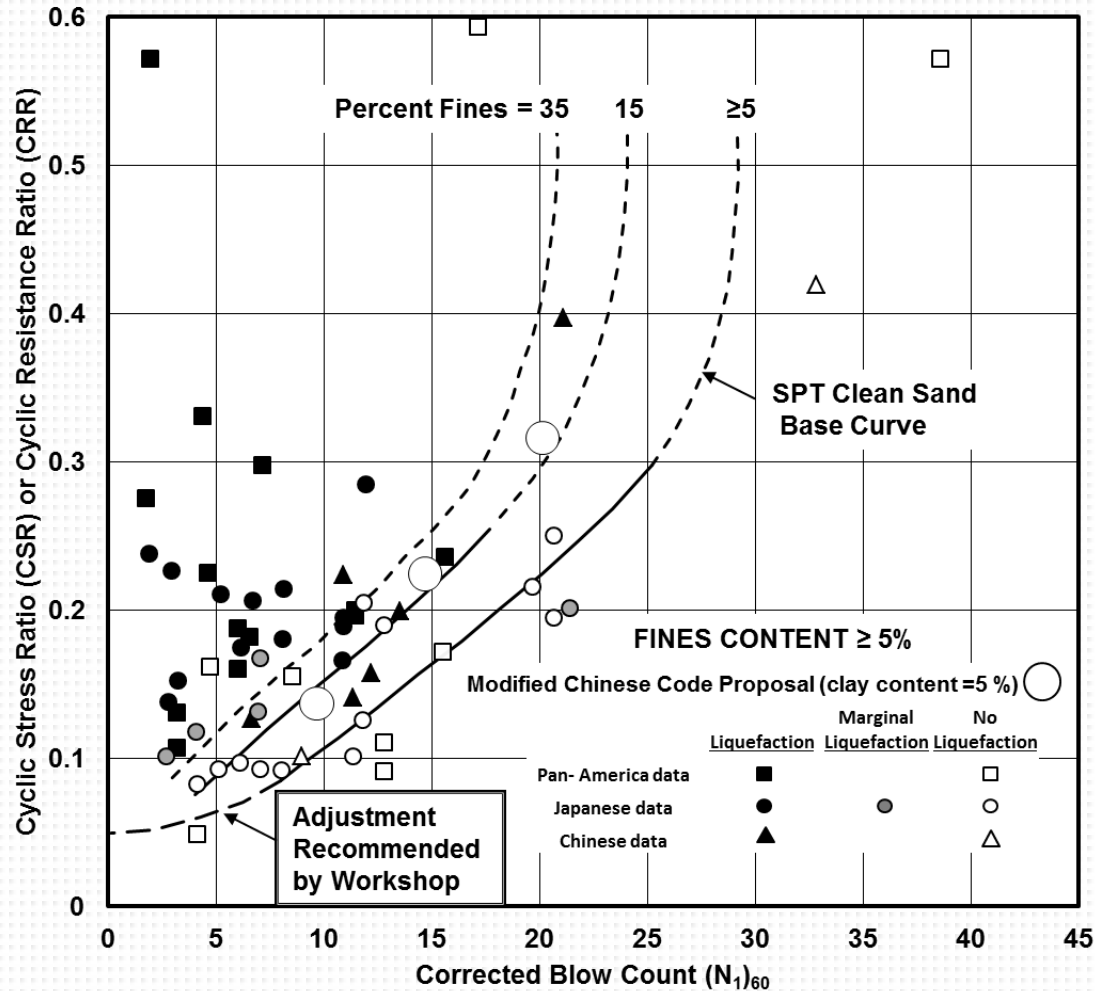
$$r_d = 0.744 - 0.008z \quad \text{for } 23 \text{ m} < z \leq 30 \text{ m}$$

$$r_d = 0.50 \quad \text{for } z > 30 \text{ m}$$



Youd and Idriss (1997)

CRR for Clean and Silty Sand at Earthquake Magnitude of 7.5



Factor of Safety against Liquefaction

$$FS = \frac{CRR_M}{CSR} = \frac{MSF \cdot CRR_{M=7.5}}{CSR}$$

CRR_M = cyclic resistance ratio at a specific magnitude of earthquake

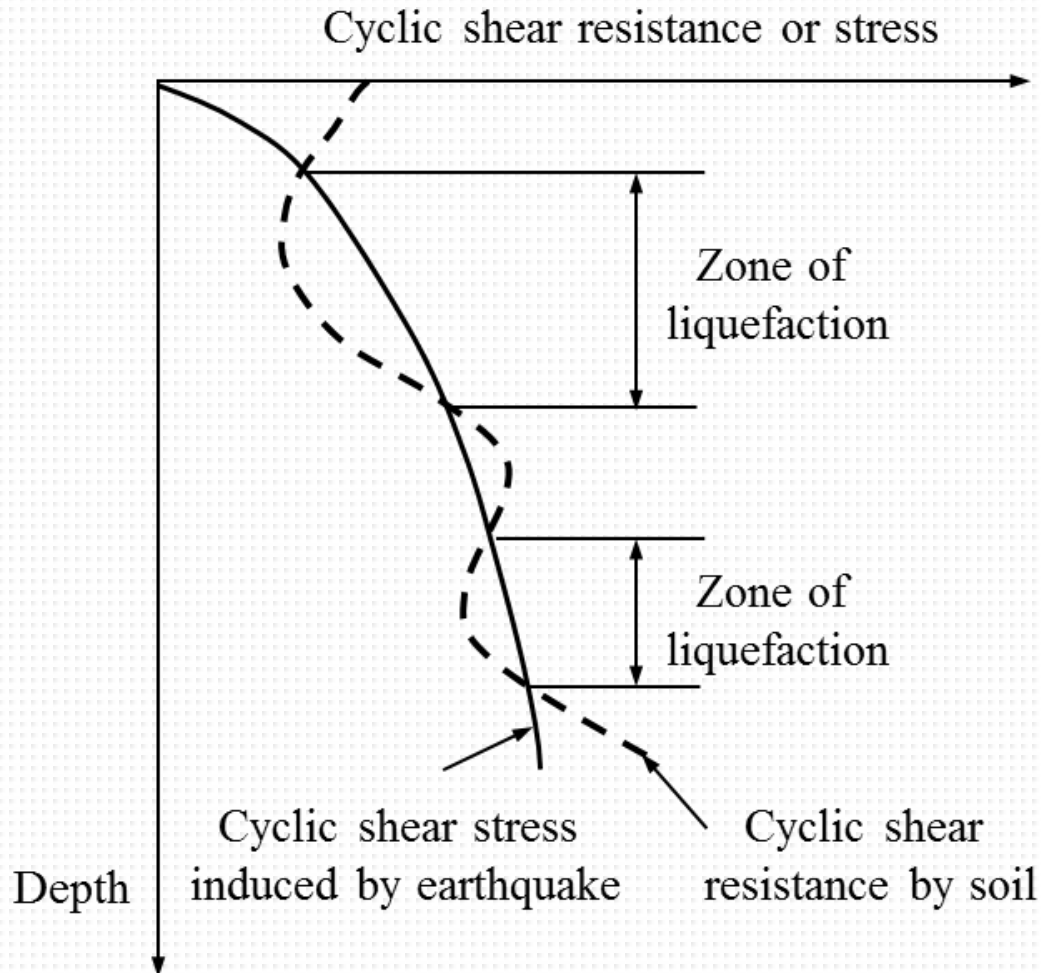
Magnitude scaling factor (MSF) (Idriss, 1999)

$$MSF = 6.9 \exp\left(-\frac{M_w}{4}\right) - 0.06 \quad \text{for } M_w > 5.2$$

$$MSF = 1.82 \quad \text{for } M_w \leq 5.2$$

M_w = moment magnitude of earthquake

Zone of Liquefaction



LIQUEFACTION

CYCLIC STRESS APPROACH

Characterization of Earthquake
Loading (External Force)

Cyclic Stress Ratio (CSR)



Seismic Hazard Analysis

- DSHA
- PSHA
- Hypothetical Scenarios

Characterization of Liquefaction
Resistance (Soil Strength)

Cyclic Resistance Ratio (CRR)

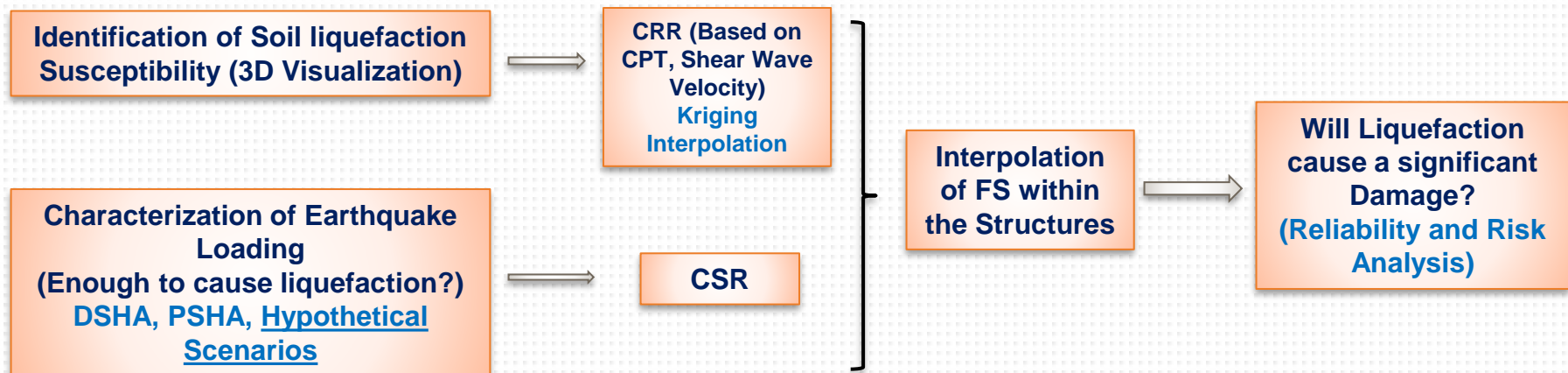


Obtained by correlation to In-Situ Test Results

- Standard Penetration Test – $(N_1)_{60}$
- Cone Penetration Test – q_{c1}
- Shear Wave Velocity – V_{s1}

$$F.S. = \frac{CRR}{CSR}$$

Liquefaction Framework:



Liquefaction Assessments

a. Actual Field Conditions

- Lake Level (LL): EI+649.0
- $a_{max}=0.3g$
- M4.0

b. HYPOTHETICAL SCENARIOS

Scenario I

- Lake Level (LL): EI+649.0
- $a_{max}=0.3g$
- M4.5, M5.5, M6.5

Scenario II

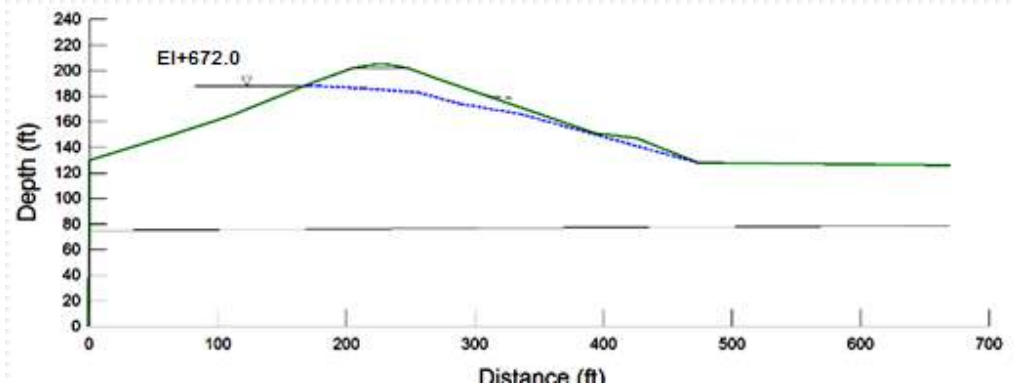
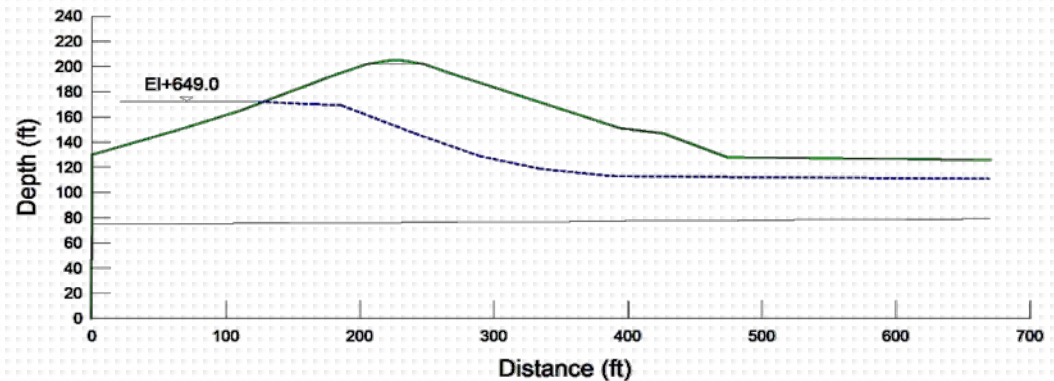
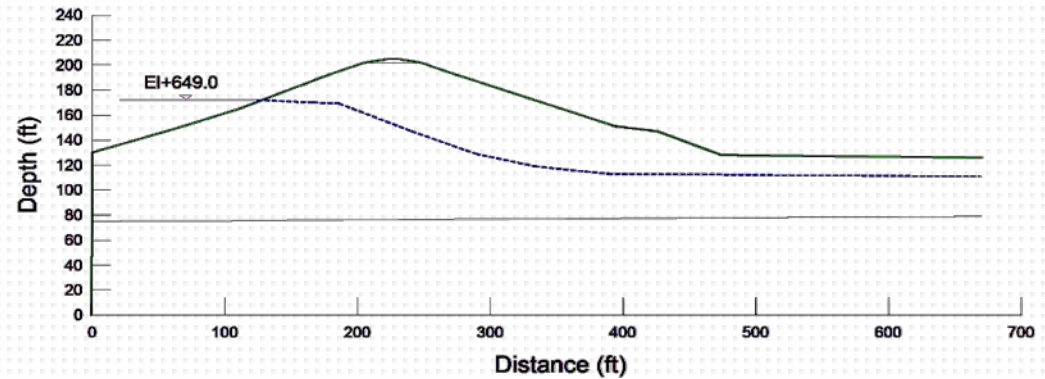
- Lake Level (LL): EI+649.0
- $a_{max}=0.4g$
- M4.5, M5.5, M6.5

Scenario III

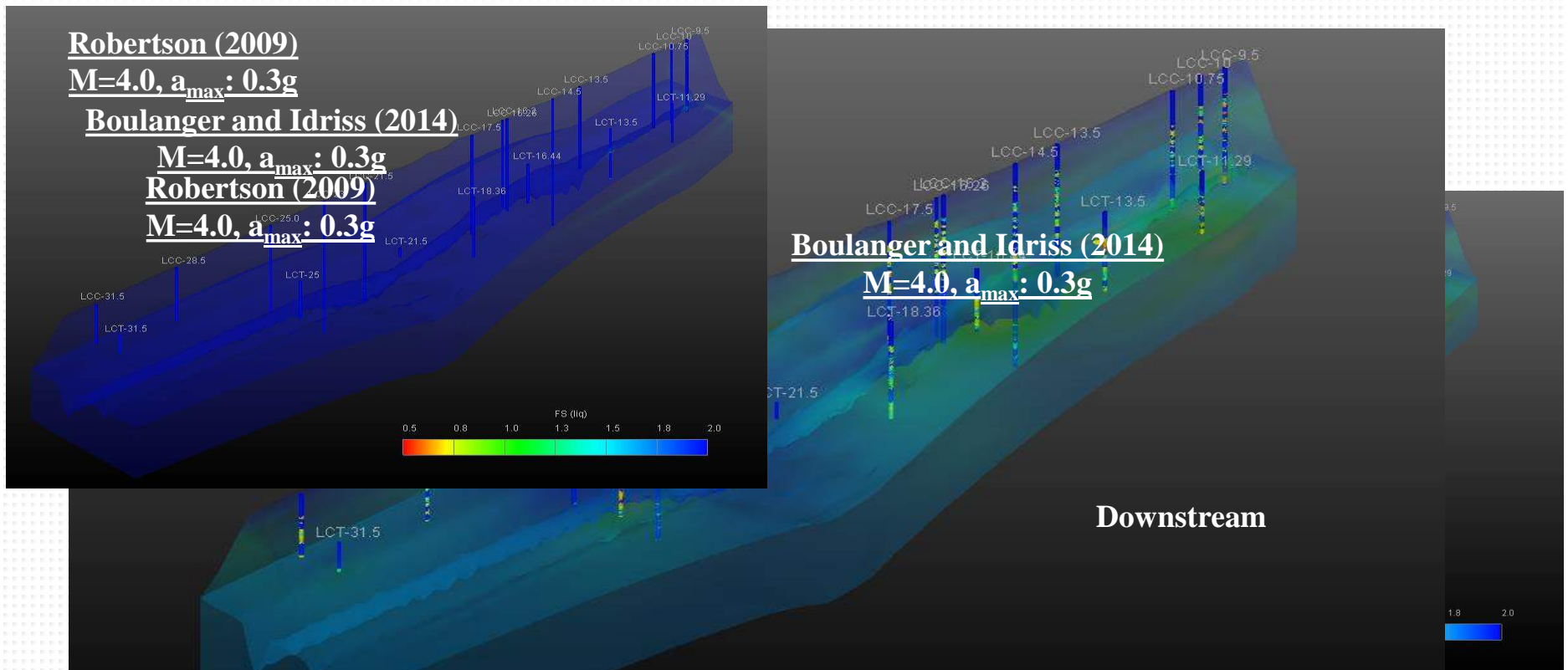
- Lake Level (LL): EI+649.0
- $a_{max}=0.5g$
- M4.5, M5.5, M6.5

Scenario IV

- Lake Level (LL): EI+672.0
- $a_{max}=0.3g$
- M4.5, M5.5, M6.5



Actual field condition: 0.3g, M4; LL: El+649.0

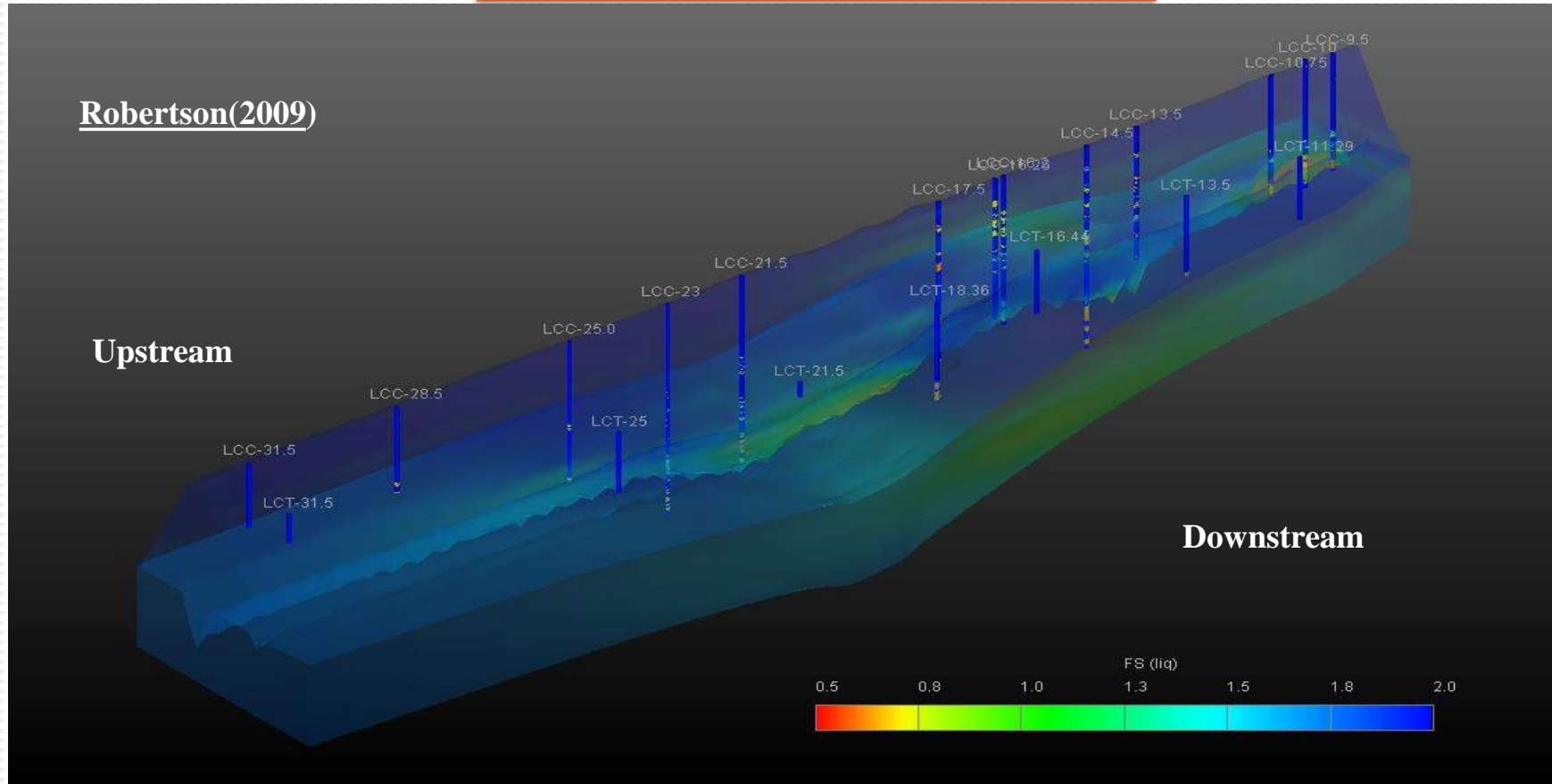


INSIGHTS FROM TWO METHODOLOGIES

- FOS values are higher than 1.5
- Levee is safe for actual field seismic conditions

Scenario I: 0.3g, M4.5, M5.5, M6.5; LL: El+649.0

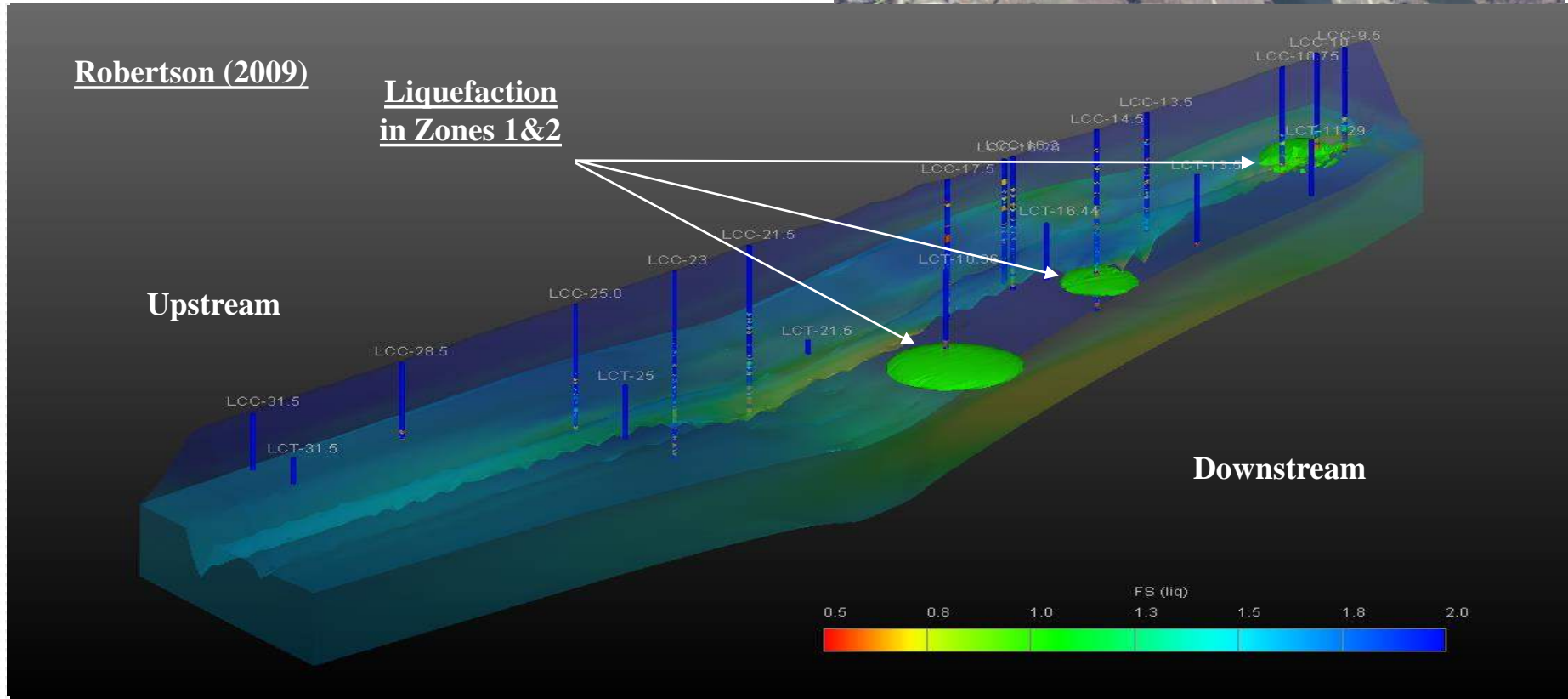
a=0.3g; M4.5 \rightleftarrows M5.5 \rightleftarrows M6.5



Major findings:
- No liquefaction has been observed.

Scenario II: 0.4g, M4.5, M5.5, M6.5; LL: El+649.0

a=0.4g; M4.5 → M5.5 → M6.5



Major findings: Liquefaction in elevation between 632 to 604 ft (Zones 1&2).

Scenario III: 0.5g, M4.5, M5.5, M6.5; LL: El+649.0

$a=0.5g; M4.5 \longrightarrow M5.5 \longrightarrow M6.5$



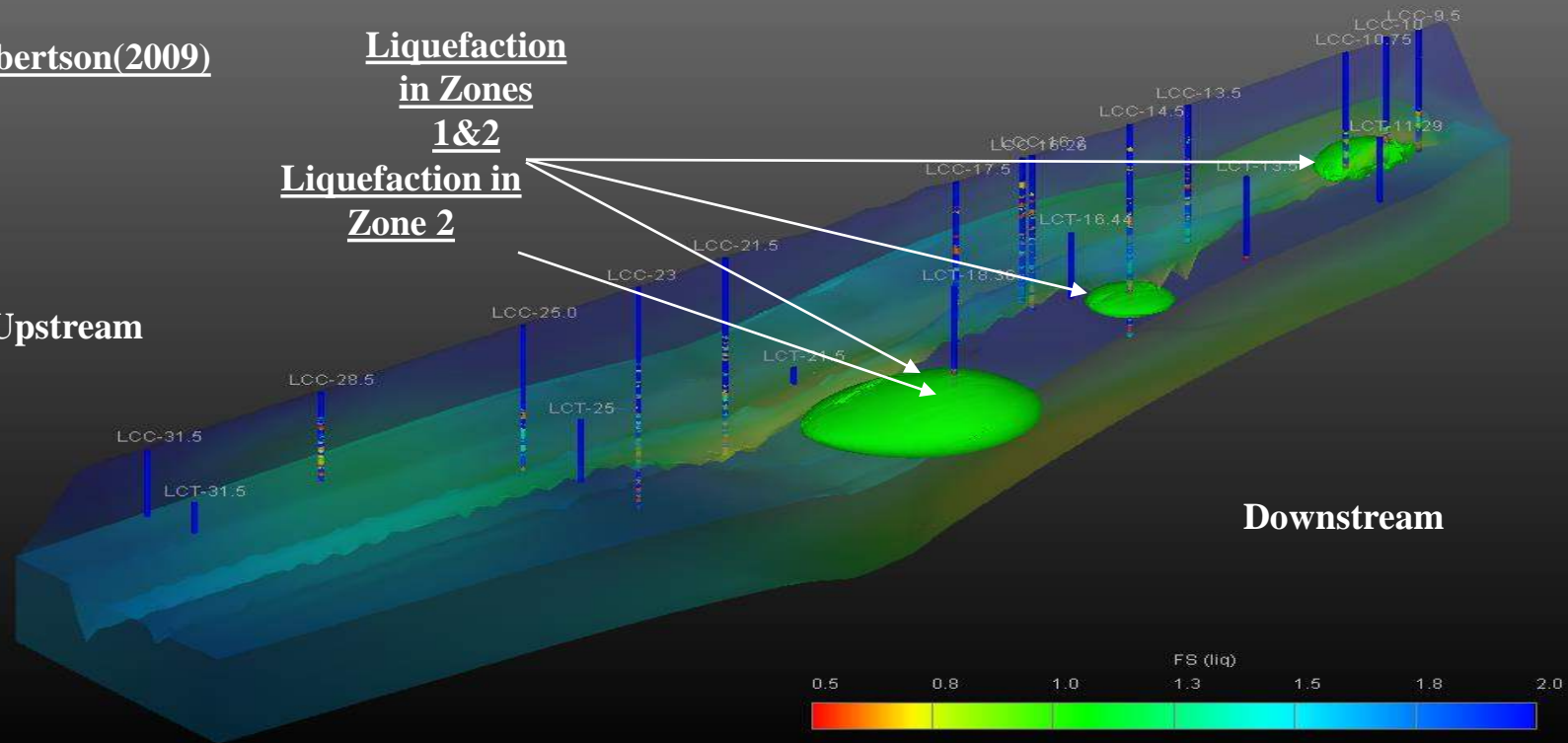
Robertson(2009)

Liquefaction
in Zones
1&2

Liquefaction in
Zone 2

Upstream

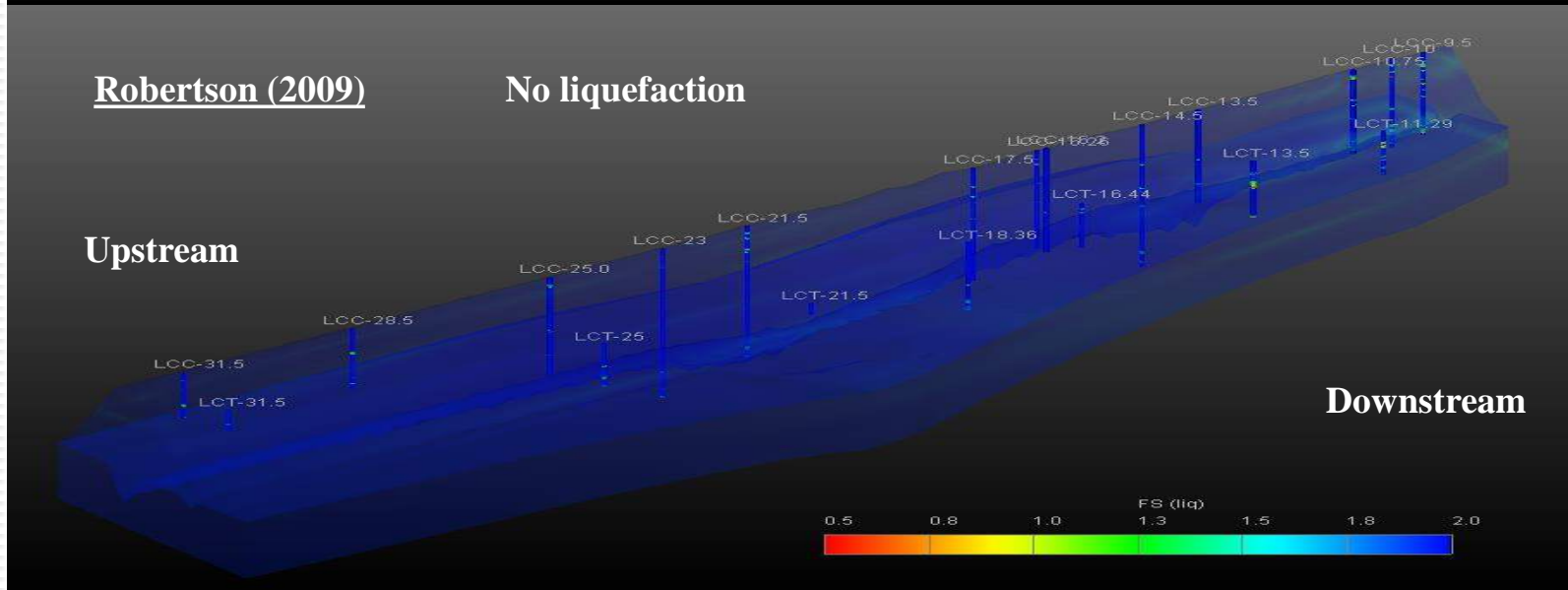
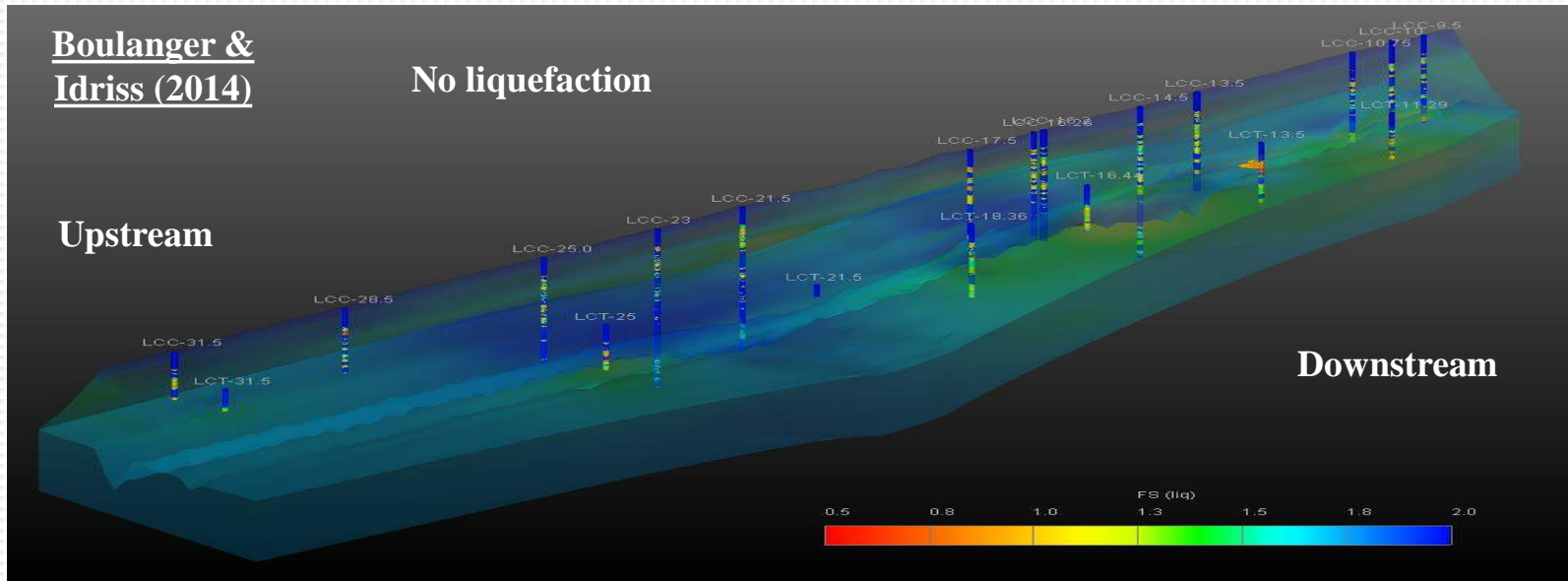
Downstream



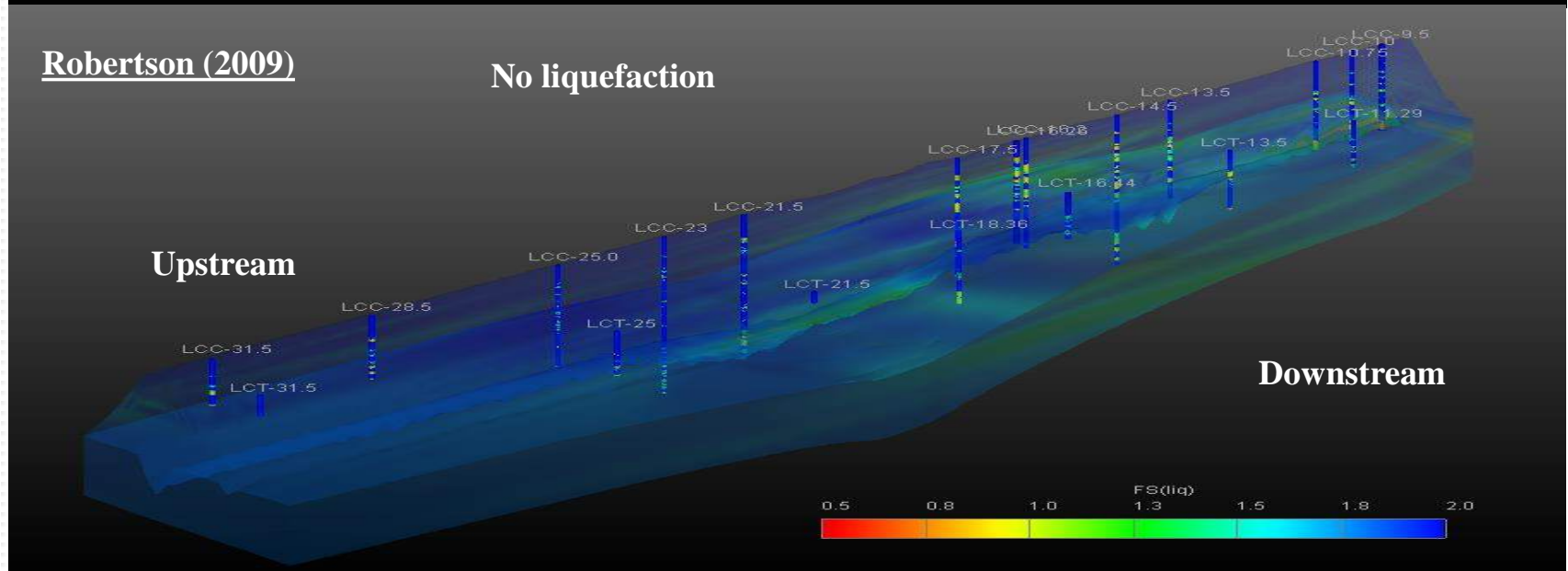
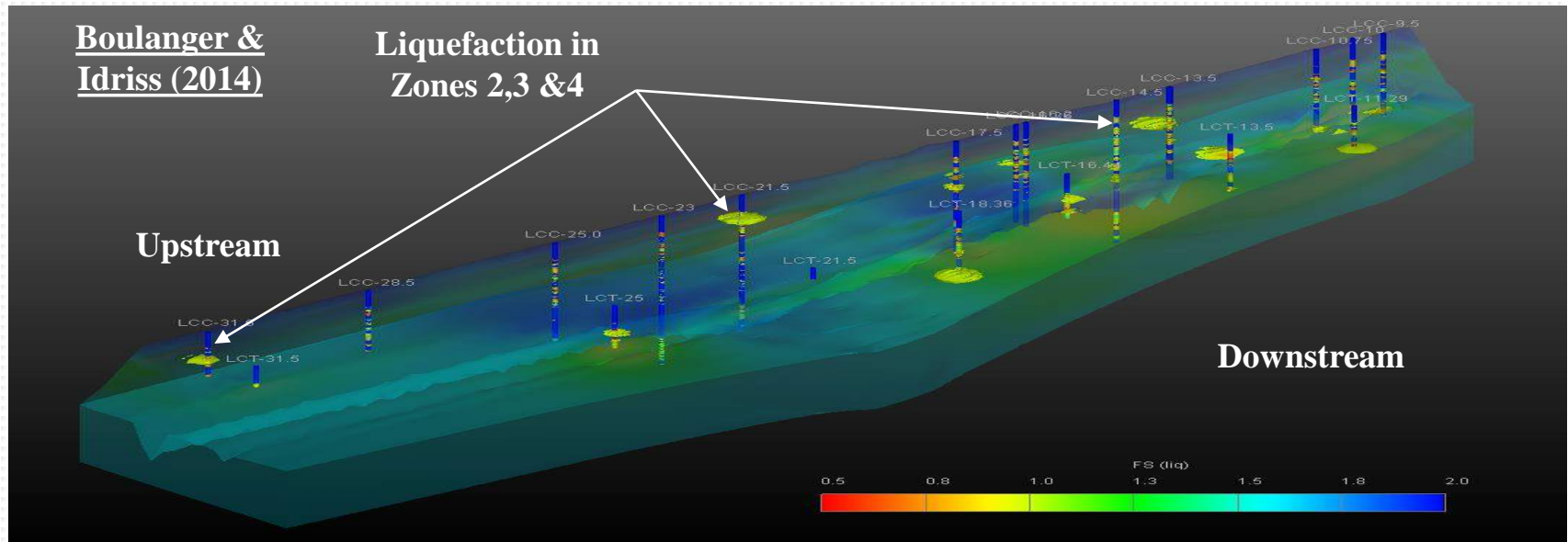
Major findings:

- Liquefaction in elevation between 632 to 590 ft (Zones 1&2).
- Soils are susceptible to liquefaction at earthquakes with higher magnitudes

Scenario IV: 0.3g, M4.5; Lake Level: El+672.0



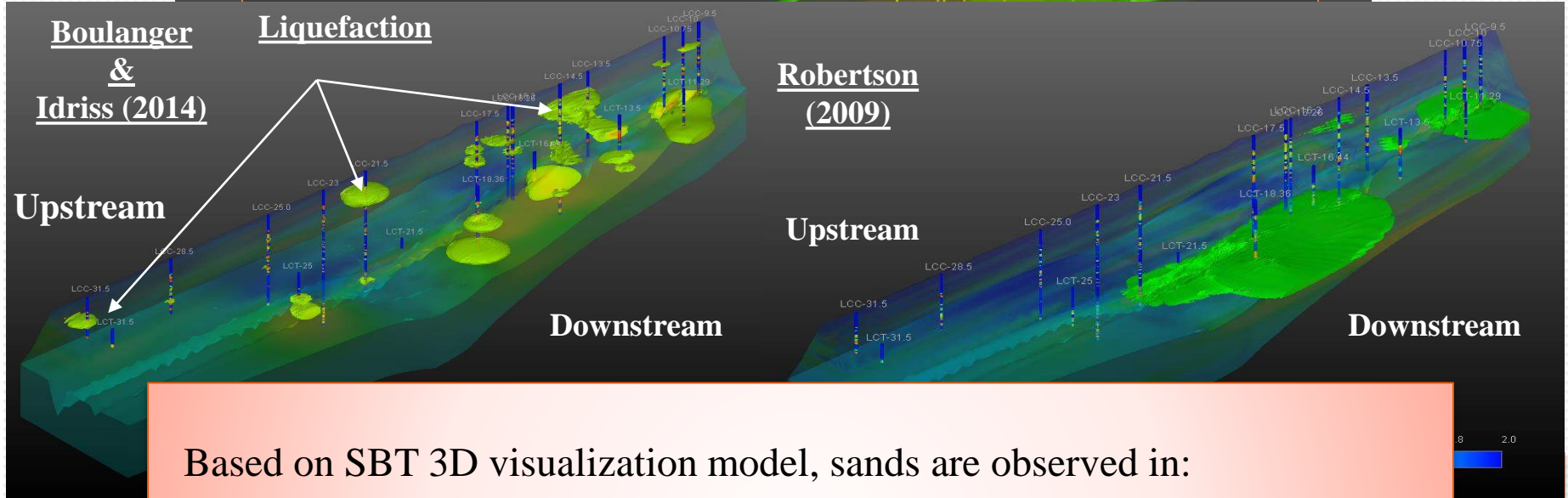
Scenario IV: 0.3g, M5.5; Lake Level: El+672.0



General Insights



a_{max} 0.3g, M6.5; Lake Level: El+672.0



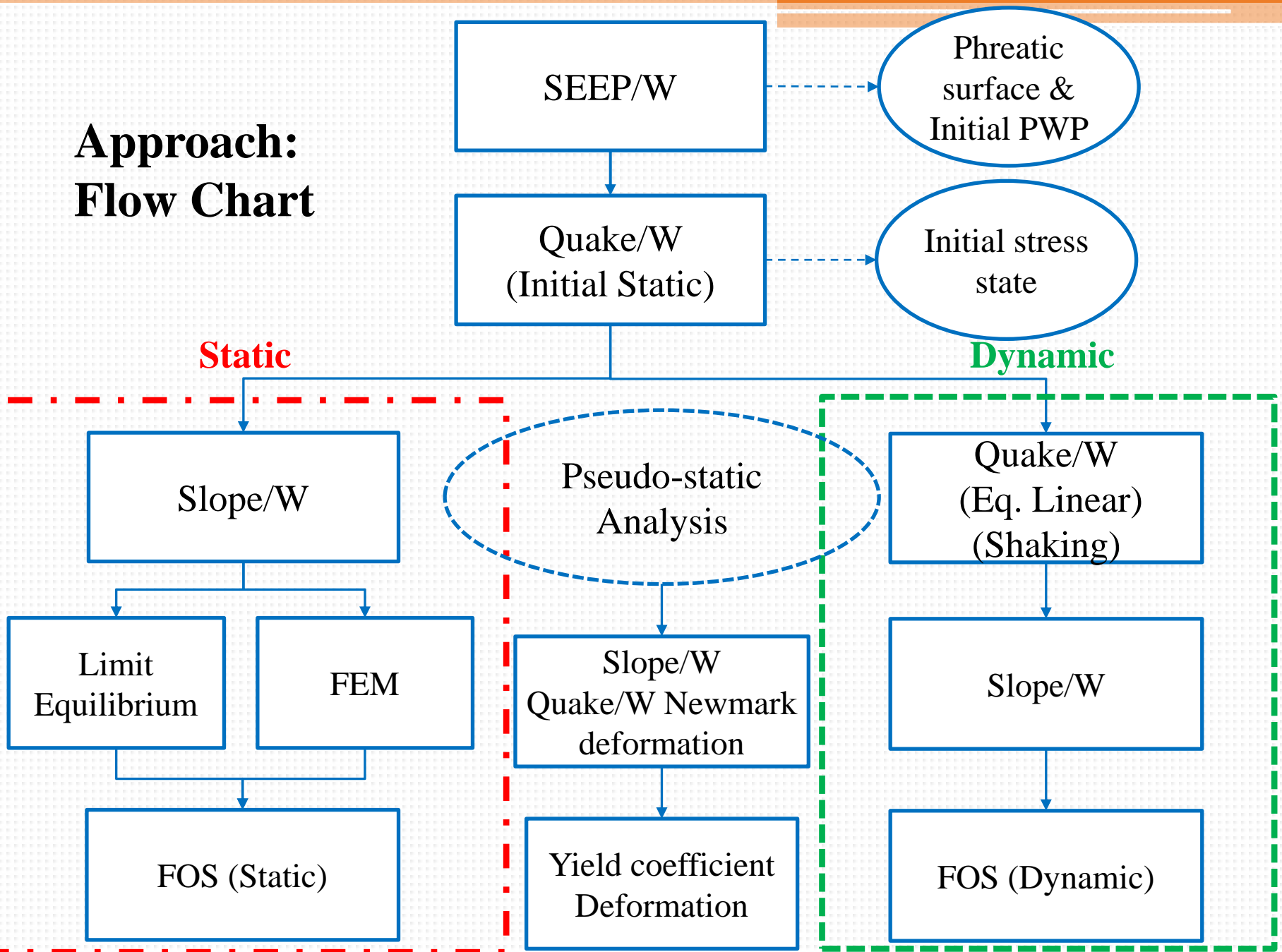
• At hi
(EL+

Based on SBT 3D visualization model, sands are observed in:

- 1) Zone 2 (El+668 to 657) and Zone 4 (El+668 to 645).
- 2) Top layers of levee (El+682 to 680).
- 3) Bottom layers of levee (El+630 to 590).

3 & 4

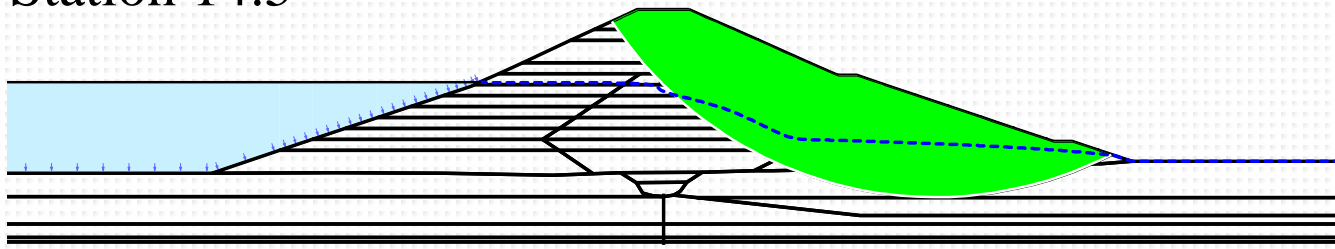
Approach: Flow Chart



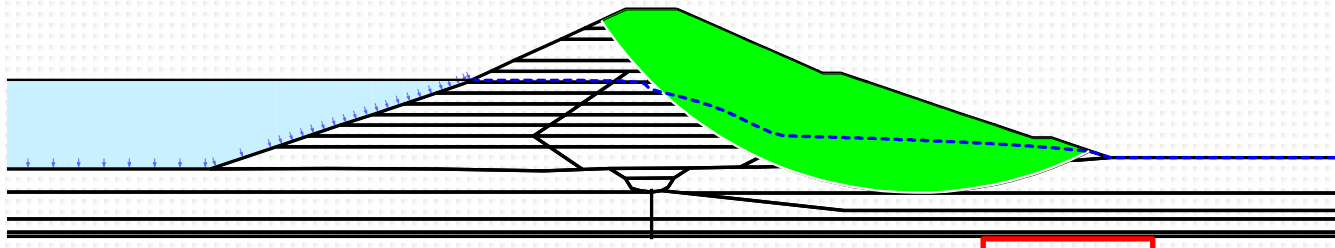
Static Slope Stability Analysis

- Required static FOS = **1.5**

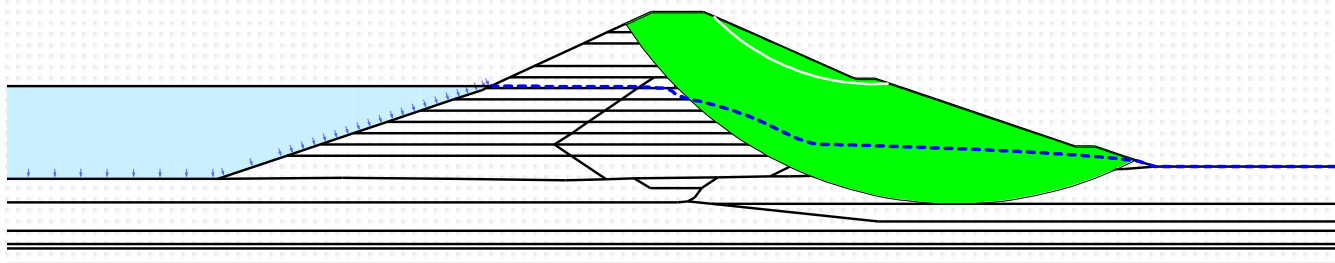
Station 14.5



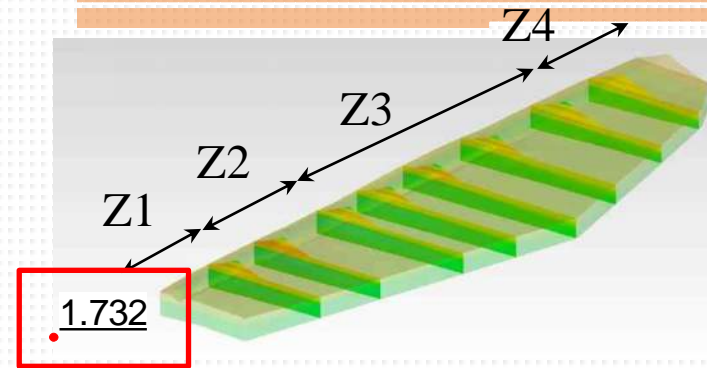
Case-1



Case-2

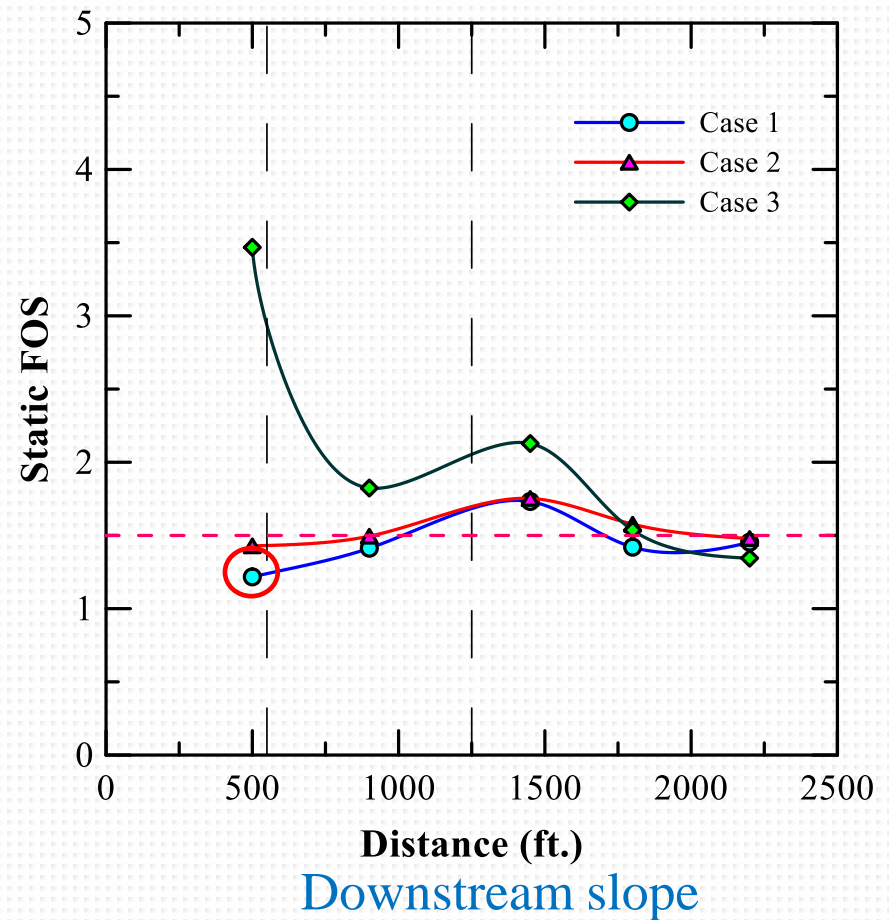
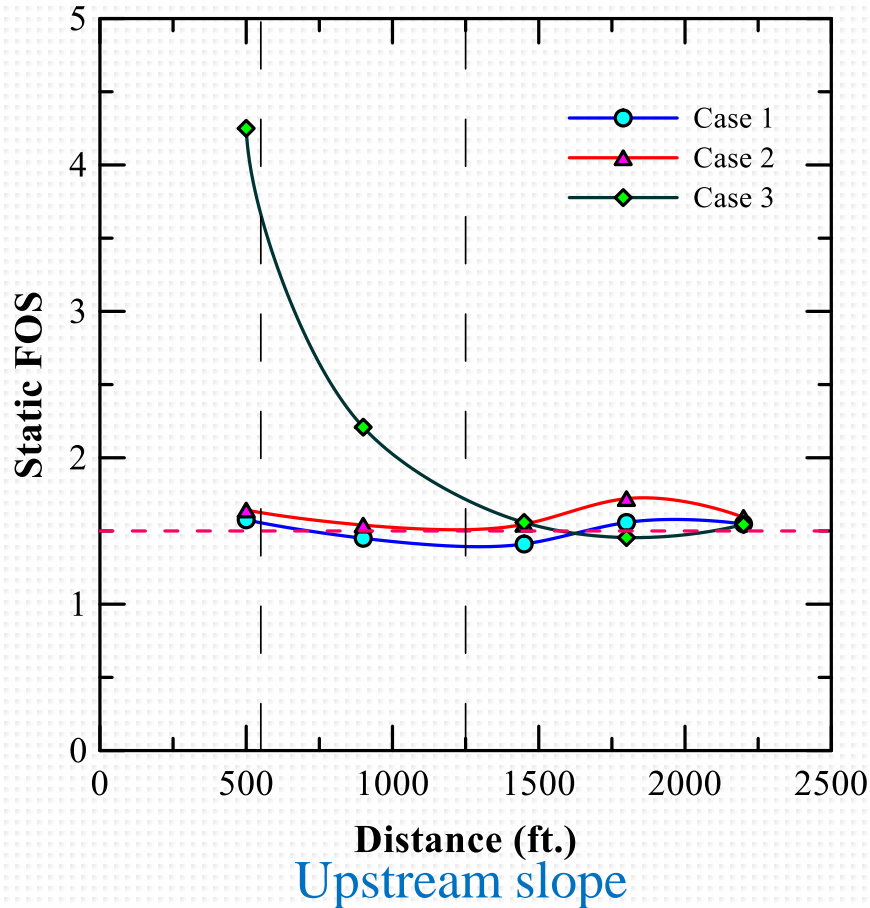
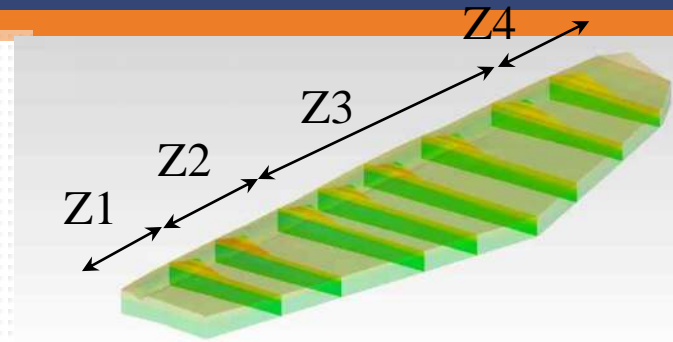


Case-3



Static Slope Stability Analysis

- Required static FOS = **1.5**



Conclusion: All sections, other than Stn.5 (Case-1) satisfy the static FOS requirement.

Identification of critical sections

U/S slope ($M < 6.5$)

1.8 Hz < Natural frequency < 3.22 Hz

Earthquakes	A	B	C	D	E	F	G	H
Predominant frequency (Hz)	1.14, 1.80	1.51, 2.24, 4.25	2.5, 5.03, 9.57	2.5, 3.37, 7.08	11.82, 11.87	1.95, 4.49, 6.64	5.86, 7.72, 11.38	2.98, 5.81
Peak acceleration (g)	0.001	0.035	0.038	0.04	0.05	0.097	0.146	0.402
Station 5	Green	Green	Green	Green	Green	Green	Green	Green
Station 9	Green	Green	Green	Green	Green	Green	Green	Yellow
Station 14.5	Green	Green	Green	Green	Green	Yellow	Yellow	Red
Station 18	Green	Yellow	Green	Yellow	Green	Red	Yellow	Red
Station 22	Green	Green	Green	Green	Green	Red	Yellow	Red
Station 27	Green	Green	Green	Green	Green	Yellow	Green	Green
Station 33	Green	Green	Green	Green	Green	Green	Green	Green
Station 39	Green	Green	Green	Green	Green	Green	Green	Green

U/S slope ($M = 7$)

Safe
 Just below 1
 Critical

Earthquakes	A	B	C	D	E	F	G	H
Predominant frequency (Hz)	1.14, 1.80	1.51, 2.24, 4.25	2.5, 5.03, 9.57	2.5, 3.37, 7.08	11.82, 11.87	1.95, 4.49, 6.64	5.86, 7.72, 11.38	2.98, 5.81
Peak acceleration (g)	0.001	0.035	0.038	0.04	0.05	0.097	0.146	0.402
Station 5	Green	Green	Green	Green	Green	Green	Green	Green
Station 9	Green	Green	Green	Green	Green	Green	Green	Yellow
Station 14.5	Green	Green	Green	Green	Green	Yellow	Yellow	Red
Station 18	Green	Yellow	Yellow	Yellow	Green	Red	Yellow	Red
Station 22	Green	Yellow	Green	Green	Green	Red	Yellow	Red
Station 27	Green	Green	Green	Green	Green	Yellow	Green	Green
Station 33	Green	Green	Green	Green	Green	Green	Green	Green
Station 39	Green	Green	Green	Green	Green	Green	Green	Green

Stations 14.5 to 27 may be critical (high PGA); same conclusion as pseudo-static analysis

Identification of critical sections

D/S slope ($M < 6.5$)

1.8 Hz < Natural frequency < 3.22 Hz

Earthquakes	A	B	C	D	E	F	G	H
Predominant frequency (Hz)	1.14, 1.80	1.51, 2.24, 4.25	2.5, 5.03, 9.57	2.5, 3.37, 7.08	11.82, 11.87	1.95, 4.49, 6.64	5.86, 7.72, 11.38	2.98, 5.81
Peak acceleration (g)	0.001	0.035	0.038	0.04	0.05	0.097	0.146	0.402
Station 5	Green	Green	Green	Green	Green	Green	Green	Green
Station 9	Green	Green	Green	Green	Green	Green	Green	Red
Station 14.5	Green	Green	Green	Green	Green	Green	Green	Green
Station 18	Green	Yellow	Yellow	Yellow	Green	Red	Red	Red
Station 22	Green	Yellow	Green	Yellow	Green	Yellow	Red	Red
Station 27	Green	Yellow	Green	Yellow	Green	Red	Red	Red
Station 33	Green	Green	Green	Green	Green	Green	Green	Green
Station 39	Green	Green	Green	Green	Green	Green	Green	Green

D/S slope ($M = 7$)



Safe



Just below 1



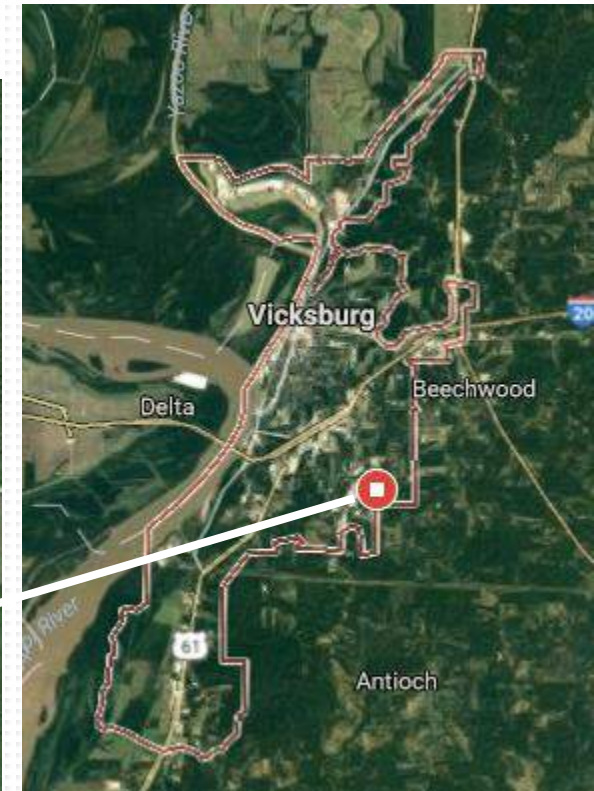
Critical

Earthquakes	A	B	C	D	E	F	G	H
Predominant frequency (Hz)	1.14, 1.80	1.51, 2.24, 4.25	2.5, 5.03, 9.57	2.5, 3.37, 7.08	11.82, 11.87	1.95, 4.49, 6.64	5.86, 7.72, 11.38	2.98, 5.81
Peak acceleration (g)	0.001	0.035	0.038	0.04	0.05	0.097	0.146	0.402
Station 5	Green	Green	Green	Green	Green	Green	Green	Green
Station 9	Green	Green	Green	Green	Green	Yellow	Green	Red
Station 14.5	Green	Green	Green	Green	Green	Green	Green	Green
Station 18	Green	Yellow	Yellow	Yellow	Green	Red	Red	Red
Station 22	Green	Yellow	Green	Yellow	Yellow	Red	Red	Red
Station 27	Green	Yellow	Green	Yellow	Green	Red	Red	Red
Station 33	Green	Green	Green	Green	Green	Green	Green	Green
Station 39	Green	Green	Green	Green	Green	Green	Green	Green

Stations 18 to 27 may be critical (high PGA); same conclusion as pseudo-static analysis

Development of 3D Model for Poor House Berm

Poor House Berm



Field Investigations

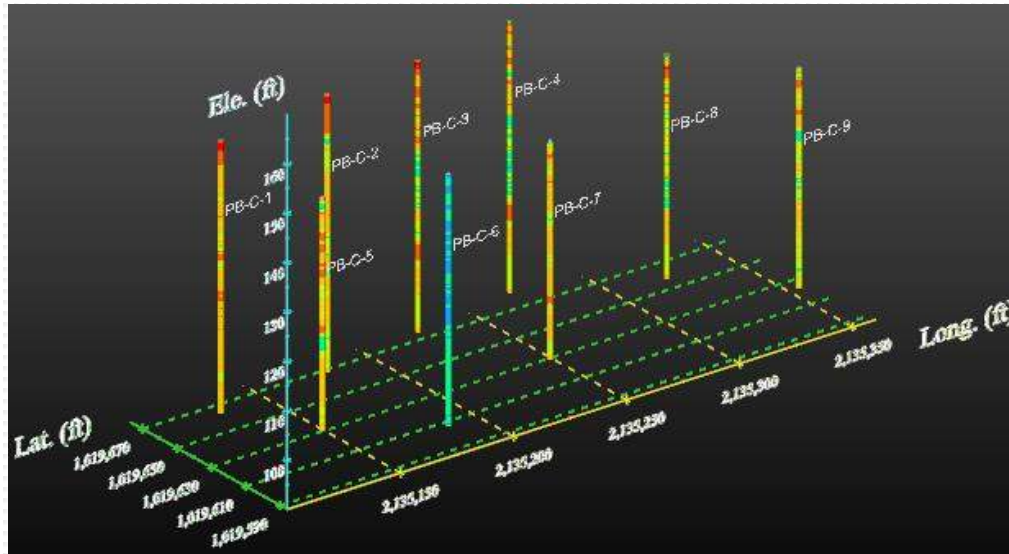
- Field Investigation – 9 CPTU soundings & 3 Soil borings



Generation of Volumetric Grid

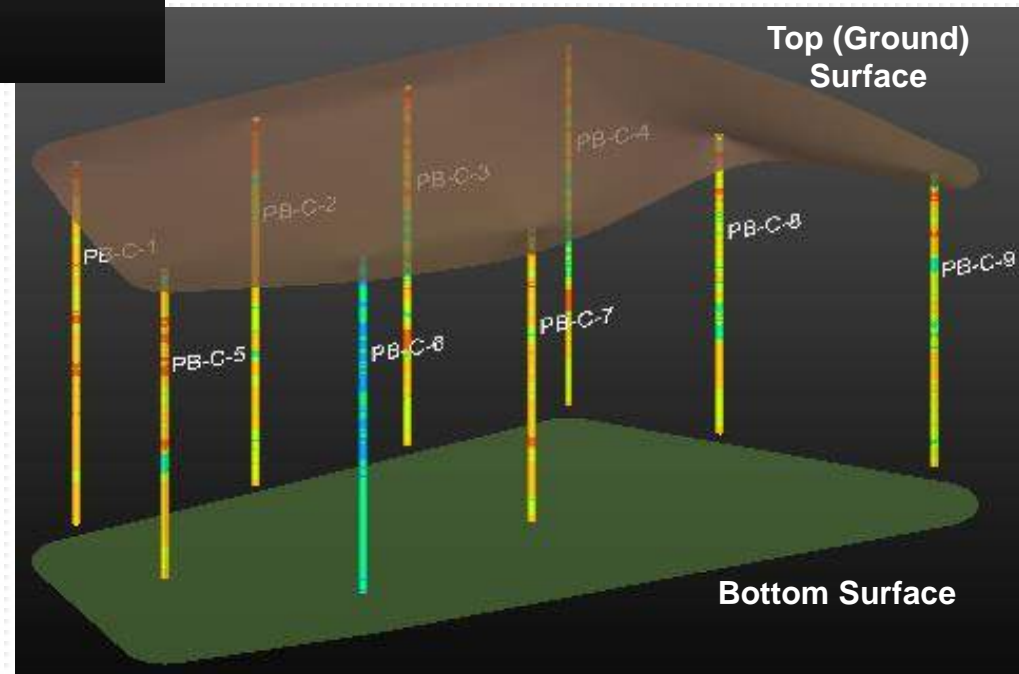
Boring Log Collection Data (Coordinates & Soil Properties)

- Nine (9) CPTs (Information Provided)
- Soil Properties are obtained based on CPT correlations
- CPTs are located in a 3D Dimensional Space

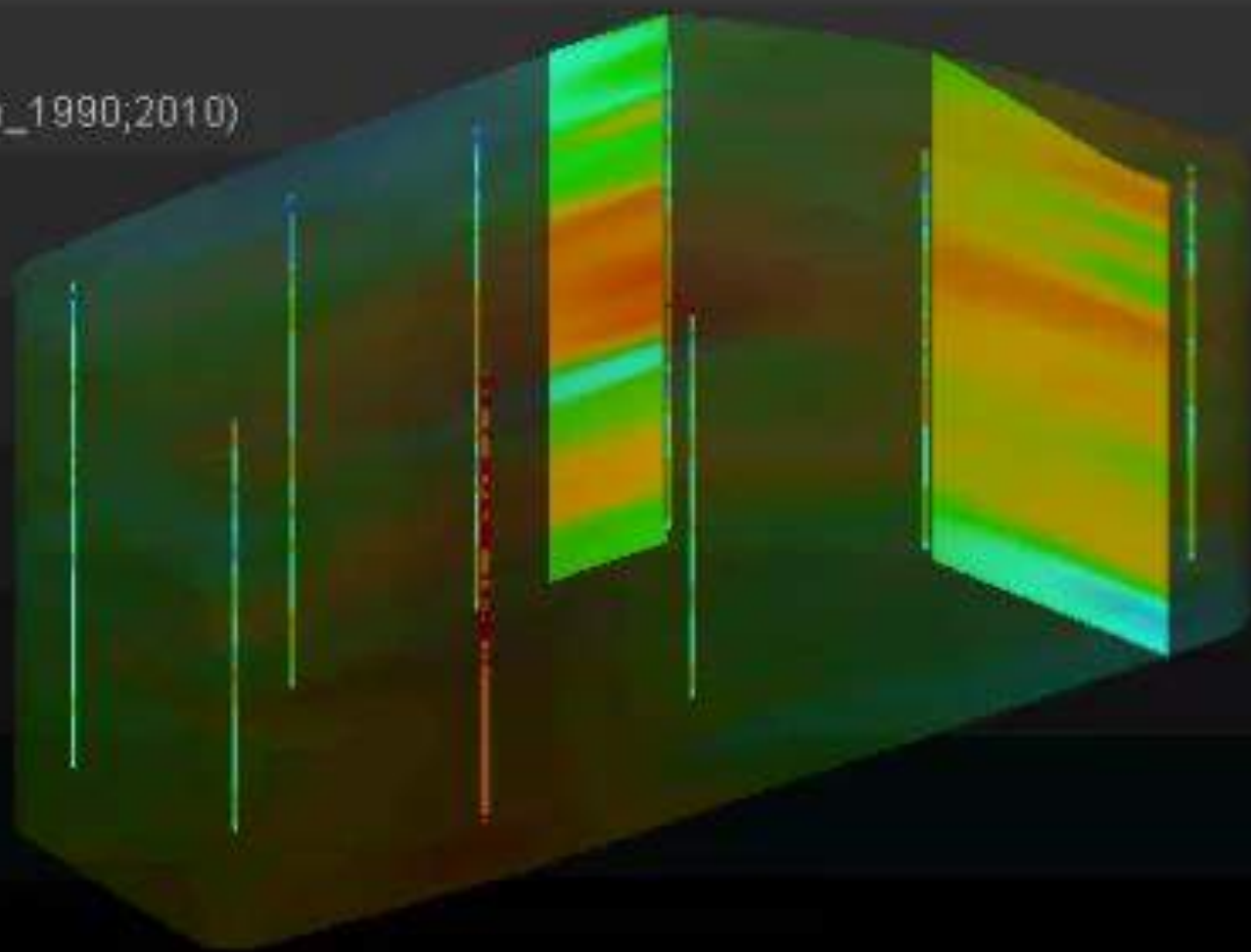


Ground and Bottom Surface

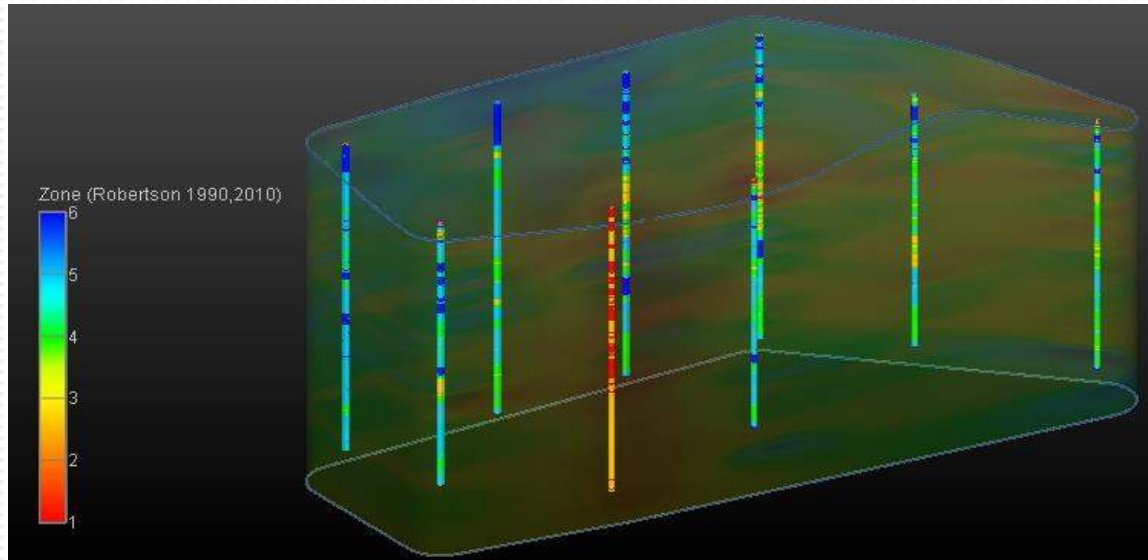
- Generation of Ground Surface (Elevation) and Bottom Surface (Depth of boring logs)
- Two surfaces generated to be interpolated (Kriging, natural neighbors, Spline)



ZONE (Robertson_1990;2010)

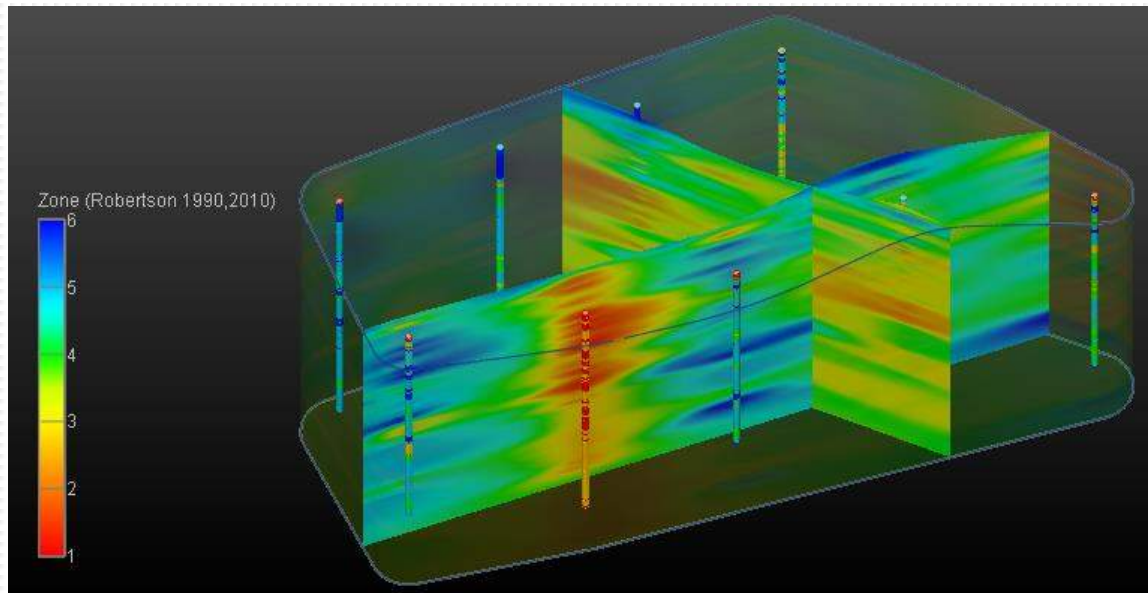


Soil Properties 3D Visualization (Geostatistics)



Kriging Interpolation

- Soil Behavior Type (SBT) data, Robertson, 1990; 2010, is interpolated within the volumetric grid.
- Interpolated data can be extracted from the model to validate with CPT data or sample data



Critical Sections

- Different Soil Properties can be interpolated (i.e. friction angle, cohesion, S_u) and critical section can be identified.
- Problematic soils (i.e. sensitive clays, loose sands or silts lenses susceptible for liquefaction) can also be identified.

Summary and Conclusions

- Geostatistical with proper care can quantify the uncertainties present in hydraulic fill structures and earthen dams
- Risk-based Resiliency framework - Performance and recreating of high-hazard dams:
 - Instrumentation, Field Monitoring, Computational Visualization and Modeling
 - Develop Quantifiable Metric Systems for Resilient Solutions – High-Quality Research Data and incorporates Variabilities and Uncertainties with Geotechnical Engineering

Relevant Publications

1. Bheemasetti, T. V., Puppala, A.J., Verreault, L., Pedarla, A., Weatherton Y.P. (2017). Optimizing Geotechnical Data for Levee Resilience. *Proceedings of the Institution of Civil Engineers- Engineering Sustainability*. Thomas Telford Ltd. pp. 1-12.
2. Chakraborty, S., Bheemasetti, T. V., Puppala, A. J., Das, J. T., Caballero S. (2021). Geomaterial Characterization and Stability Assessment of Hydraulic Fill Dam. *ASCE Journal of Materials in Civil Engineering*. [https://doi.org/10.1061/\(ASCE\)MT.1943-5533.0003553](https://doi.org/10.1061/(ASCE)MT.1943-5533.0003553)
3. Chakraborty, S., Puppala, A. J., Bheemasetti, T. V., Das, J. T. (2021). Seismic Slope Stability Analysis of a hydraulic fill dam. *ASCE International Journal of Geomechanics*. [https://doi.org/10.1061/\(ASCE\)GM.1943-5622.0001892](https://doi.org/10.1061/(ASCE)GM.1943-5622.0001892)
4. Puppala, A., Congress, S.S.C., Bheemasetti, T.V., Caballero, S. R. (2018). Visualization of Civil Infrastructure Emphasizing Geomaterial Characterization and Performance, *ASCE Journal of Materials in Civil Engineering*.
5. Caballero, S. R., Bheemasetti, T. V., Puppala, A. J., & Chakraborty, S. (2022). Geotechnical Visualization and Three-Dimensional Geostatistics Modeling of Highly Variable Soils of a Hydraulic Fill Dam. *Journal of Geotechnical and Geoenvironmental Engineering*, 148(11), 05022006.
6. Chakraborty, S., Bheemasetti, T. V., Puppala, A. J., & Verreault, L. (2018). Use of constant energy source in SASW test and its influence on seismic response analysis. *Geotechnical Testing Journal*, 41(6), 1102-1116.

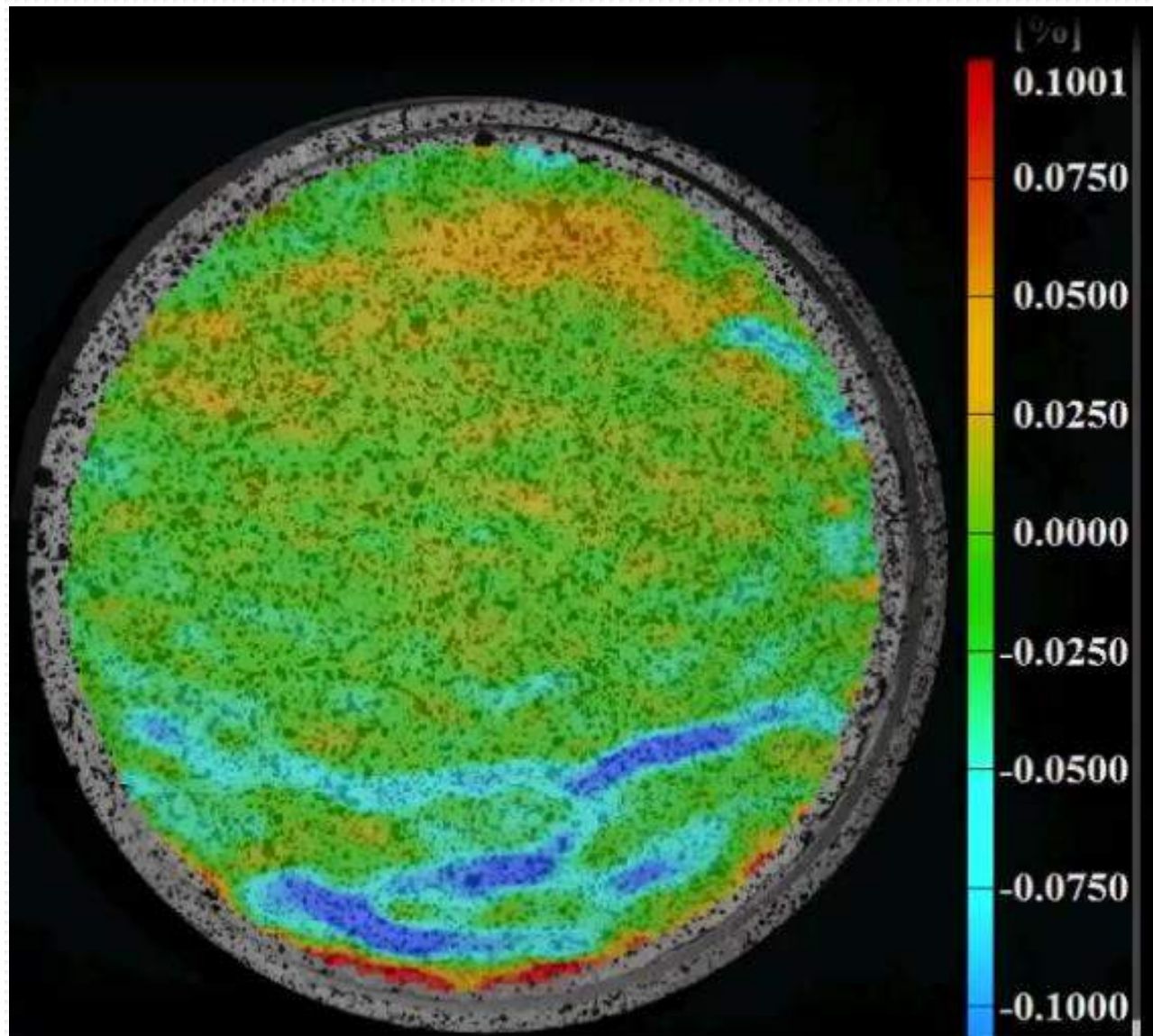
There are known knowns. These are things we know that we know. There are known unknowns. That is to say, there are things that we know we don't know. But there are also unknown unknowns. There are things we don't know we don't know.

Donald Rumsfeld



Thank You!





Soils with Seasonal Climatic Variability

Understand the thermal-mechanical behavior of control soils and develop mix-designs for treating **problematic soils**



Fig. Climate Change Effects in Black Hills region – (a) desiccation cracks & salt precipitation; (b) soil erosion; (c) slope failures; (d) progressive landslide along US16

PSHA TASKS

TASK 1: CHARACTERIZATION OF SOURCES: SPATIAL AND SIZE UNCERTAINTY

40 MILES RADIUS APPROACH-SAMPLE

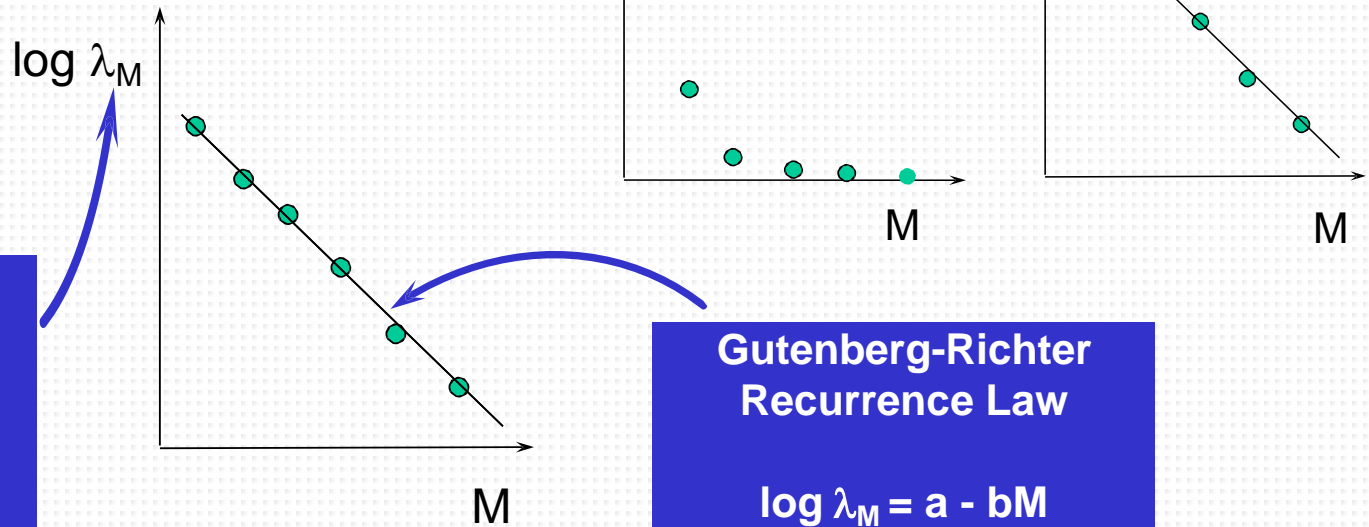
b. SIZE UNCERTAINTY:

Distribution of earthquake magnitudes

Given source can produce different earthquakes

Low magnitude - often

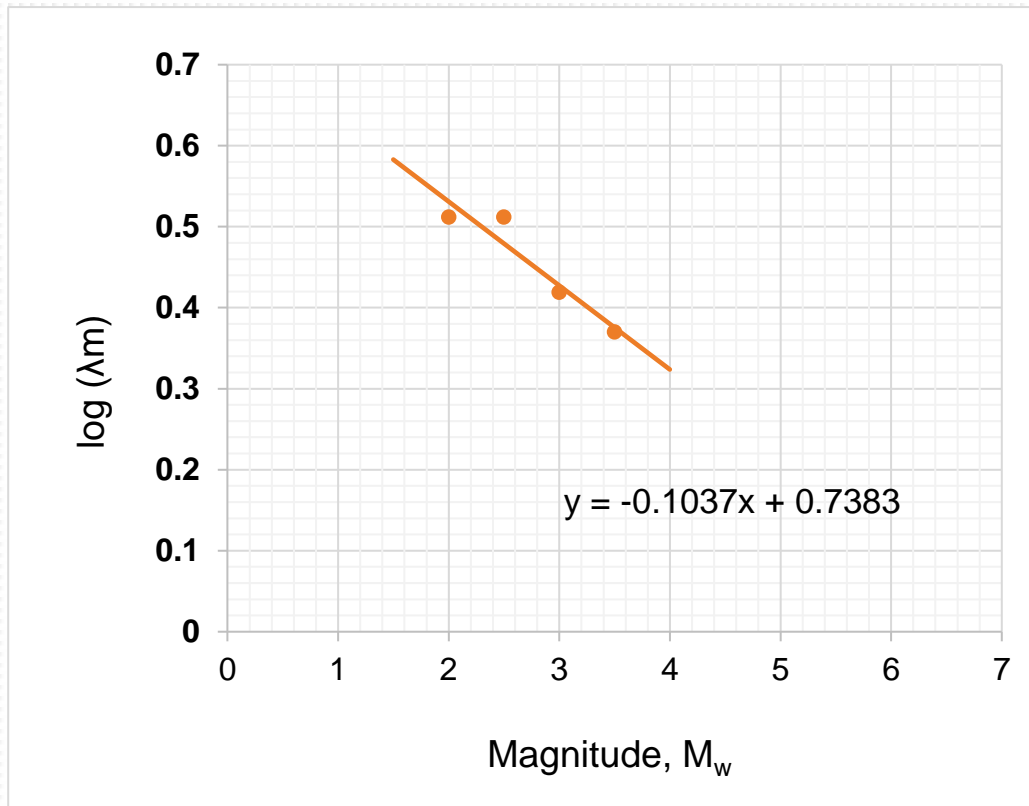
Large magnitude - rare



PSHA TASKS

TASK 1: CHARACTERIZATION OF SOURCES: SPATIAL AND SIZE UNCERTAINTY 40 MILES RADIUS APPROACH-SAMPLE

b. SIZE UNCERTAINTY (Source 1-AZLE, TX) Cont.:



$$\log \lambda_M = a - bM$$

Where:

$$a = 0.7383$$

$$b = 0.1037$$

Return period
(recurrence interval)

$$T_R = 1 / \lambda_M$$

Source 1

$$M_{\max} = 3.6$$

$$\lambda_M = 0.365$$

$$T_R = 1/0.365 = 2.7 \text{ years}$$

PSHA TASKS

TASK 1: CHARACTERIZATION OF SOURCES: SPATIAL AND SIZE UNCERTAINTY

40 MILES RADIUS APPROACH-SAMPLE

SIZE UNCERTAINTY (Source 1-AZLE, TX) CONT.:

Recurrence for Source 1

$$\log \lambda_M = a - bM$$

Where:

$$a = 0.7383$$

$$b = 0.1037$$

Therefore, temporal distribution of earthquake recurrence:

$$v = 10^{a - bM_0}$$

For $m_0 = 2$,

$$v = 10^{0.7383 - 0.1037(2.0)}$$

$$v = 3.40$$

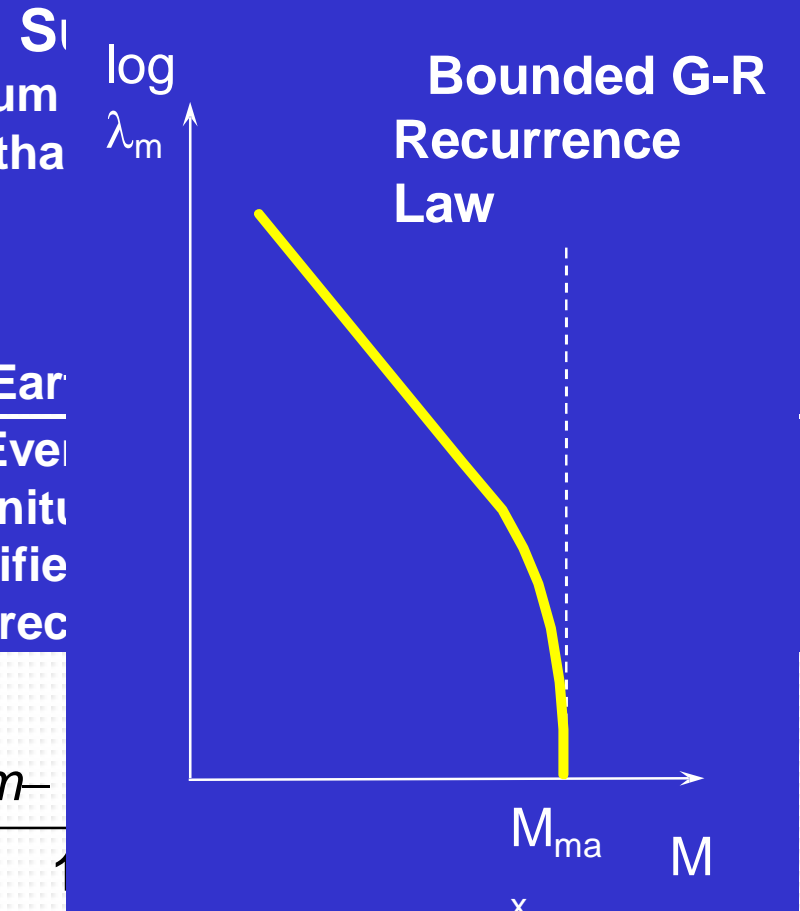
1.1 Assume a minimum seismic events less than the seismic hazard:

1.2 Select a range of Earthquake Magnitude

M	# Eqs
2-2.5	5
2.5-3	14
3-3.5	5
3.5-4	2

1.3 Evaluate magnitude modified G-R recurrence law

$$\lambda_m = v \frac{\exp[-\beta(m - m_{ma})]}{m - m_{ma}}$$



PSHA TASKS

TASK 1: CHARACTERIZATION OF SOURCES: SPATIAL AND SIZE UNCERTAINTY 40 MILES RADIUS APPROACH-SAMPLE

SIZE UNCERTAINTY (Source 1-AZLE, TX):

Source 1						
M	Range of Distances, R (km)					
	8	10	12.5	15	17	19
2-2.5	0.07113	0.123	0.16598	0.25	0.023	0.0999
2.5-3	0.02912	0.12334	0.15788	0.0945	0.01942	0.01942
3-3.5	0.00921	0.02455	0.02148	0.0754	0.00614	0.00614
3.5-4	0.00231	0.00776	0.00679	0.00388	0.00194	0.00194
4-4.5	0.00092	0.00245	0.00215	0.00123	0.00061	0.00061
4.5-5	0.00029	0.00078	0.00068	0.00039	0.00019	0.00019
5-5.5	9.2E-05	0.00025	0.00021	0.00012	6.1E-05	6.1E-05
5.5-6	2.9E-05	7.8E-05	6.8E-05	3.9E-05	1.9E-05	1.9E-05
6-6.5	9.2E-06	2.5E-05	2.1E-05	1.2E-05	6.1E-06	6.1E-06
6.5-7	2.9E-06	7.8E-06	6.8E-06	3.9E-06	1.9E-06	1.9E-06
7-7.5	9.2E-07	2.5E-06	2.1E-06	1.2E-06	6.1E-07	6.1E-07
7.5-8	2.9E-07	7.8E-07	6.8E-07	3.9E-07	1.9E-07	1.9E-07
Σ						1.35591

Subtasks:

1.1 Probability of M_{avg} (BGRRL)

U_{T2}

1.2 Probability of occurrence M_{avg} at each distance range – U_{T1}

1.3 Ground Motion for each combination of M_{avg} and distance using GMPEs

1.4 Calculate the probability of exceedance a specific PGA for each combination

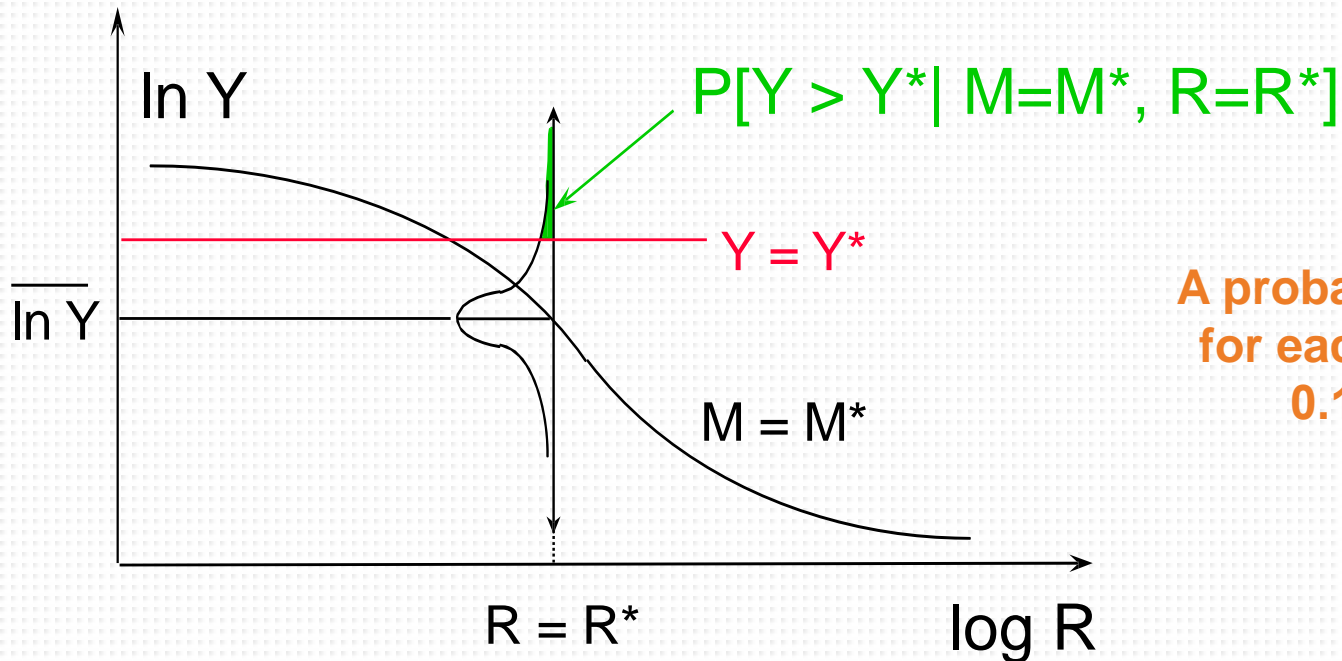
$$\lambda_m = \nu \frac{\exp[-\beta(m - m_o)] - \exp[-\beta(m_{max} - m_o)]}{1 - \exp[-\beta(m_{max} - m_o)]}$$

PSHA TASKS

TASK 2: GROUND MOTION PREDICTION USING GMPEs 40 MILES RADIUS APPROACH-SAMPLE

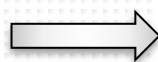
Predictive Relationships: (Source 1-AZLE, TX):

Standard error - use to evaluate conditional probability



A probability is calculated for each PGA (i.e. 0.01g, 0.1g, 0.2g.... 1g)

U_{T3} = Effect of Earthquakes



Each combination of M_{avg} and distance range

PSHA TASKS

TASK 3: SUMMATION OF UNCERTAINTIES FOR EACH SOURCE

PGA=0.1g

Source 1						
M	Range of Distances, R (km)					
	8	10	12.5	15	17	19
2-2.5	0.07113	0.123	0.16598	0.25	0.023	0.0999
2.5-3	0.02912	0.12334	0.15788	0.0945	0.01942	0.01942
3-3.5	0.00921	0.02455	0.02148	0.0754	0.00614	0.00614
3.5-4	0.00231	0.00776	0.00679	0.00388	0.00194	0.00194
4-4.5	0.00092	0.00245	0.00215	0.00123	0.00061	0.00061
4.5-5	0.00029	0.00078	0.00068	0.00039	0.00019	0.00019
5-5.5	9.2E-05	0.00025	0.00021	0.00012	6.1E-05	6.1E-05
5.5-6	2.9E-05	7.8E-05	6.8E-05	3.9E-05	1.9E-05	1.9E-05
6-6.5	9.2E-06	2.5E-05	2.1E-05	1.2E-05	6.1E-06	6.1E-06
6.5-7	2.9E-06	7.8E-06	6.8E-06	3.9E-06	1.9E-06	1.9E-06
7-7.5	9.2E-07	2.5E-06	2.1E-06	1.2E-06	6.1E-07	6.1E-07
7.5-8	2.9E-07	7.8E-07	6.8E-07	3.9E-07	1.9E-07	1.9E-07
Σ						1.35591

Summation of Uncertainties
for Source 1

Same approach for Source 2
(40 miles radius), therefore;

For a PGA = 0.1g, 0.2.....1.0

$$\%P_{EXCS1} = v \times U_{t1} \times U_{t2} \times U_{t3}$$

**SEISMIC HAZARD CURVES
ARE DEVELOPED FOR
DIFFERENT VALUES OF PGA**

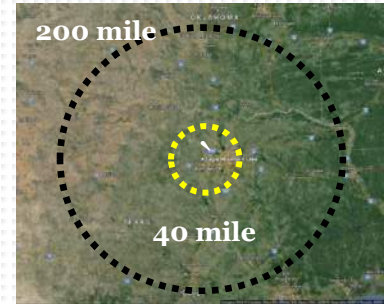
$$\%P_{TOTAL} = \%P_{EXCS1} + \%P_{EXCS2}$$

$$\%P_{TOTAL} = 1.3559 + 0.3322$$

%P_{TOTAL} = 1.688
For PGA=0.1g

Seismic parameters (DSHA)

Identification of sources
(40 miles & 200 miles)



Characterization of Sources
(Magnitude, Depth, Distance to site)

Geometry of sources
(polygons)

Source:
 $F (M_{max}, R_{min})$

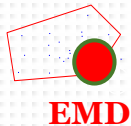
Ground Motion
Predicting Equations

Selection of
Threshold values

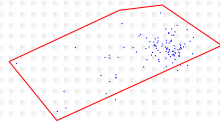
List all Sources >
Threshold

Maximum
PGA/PGV/PSA

Zone 1



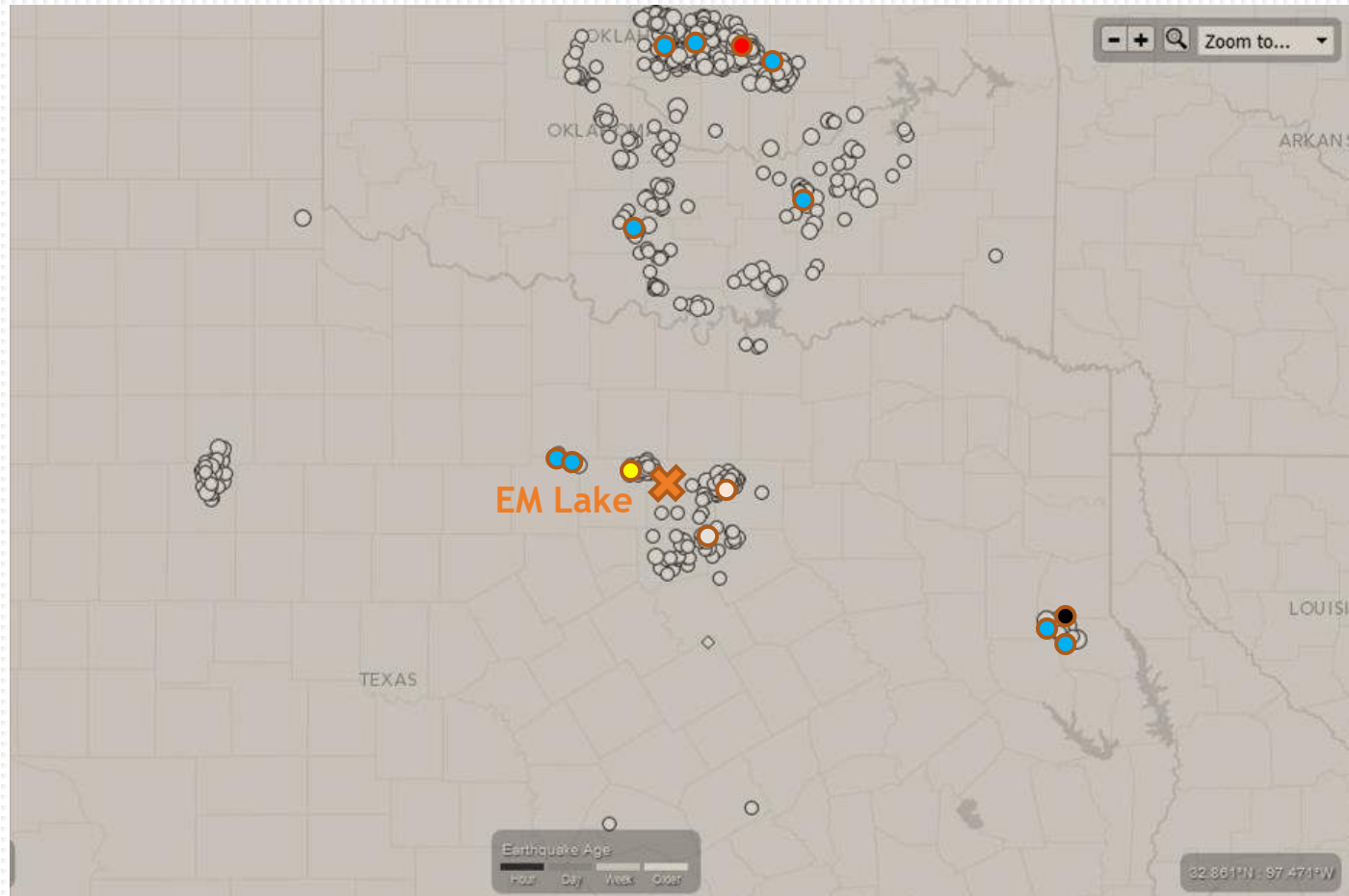
Zone



PGA ~ Peak Ground Acceleration
PGV ~ Peak Ground Velocity
PSA ~ Peak Spectral Acceleration

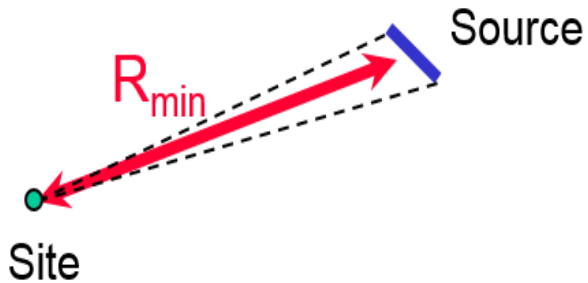
Identification of Sources

- Prague, OK
(2011) M5.6
- Eastern Texas
(2012) M4.8
- Azle, TX
(2013) M~3.6
- Venus, TX
(2015) M4.0
- Irving, TX
(2015) M3.6
- Others, M~3.0

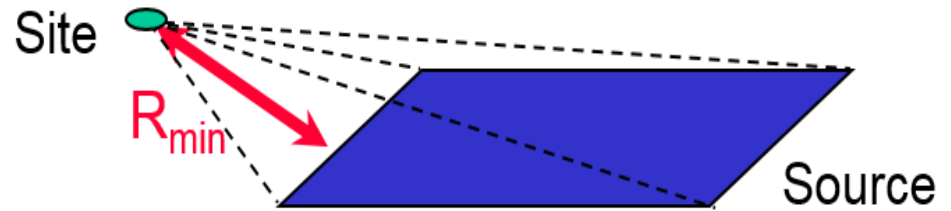


Source: USGS Archives

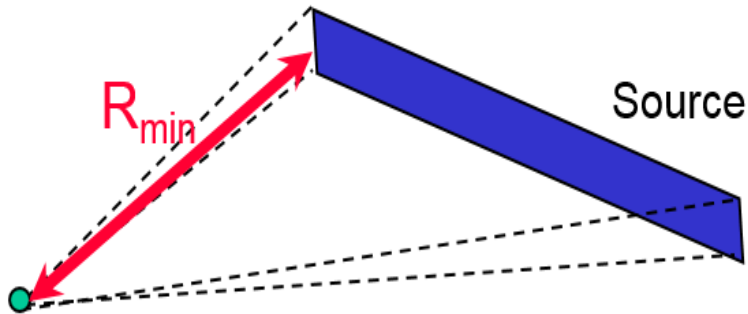
Characterization of Sources



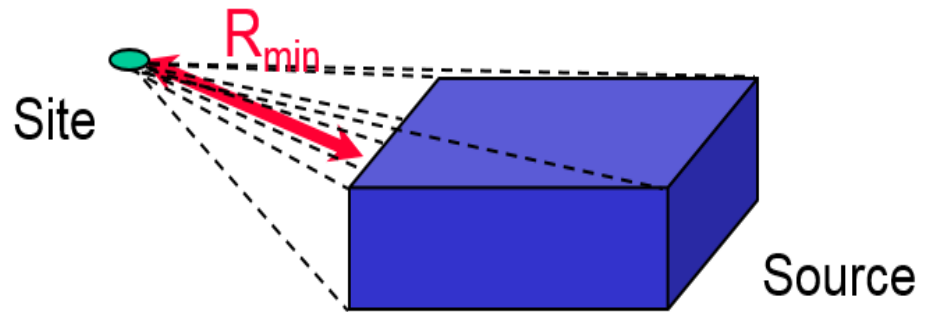
Short distances: Volcanos



Areal Source: Constant depth
crustal source



Linear Source: Shallow distant
faults

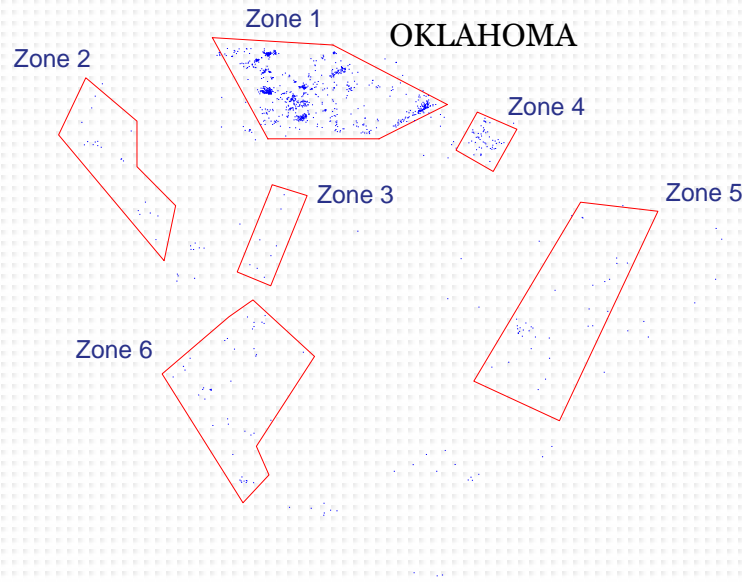


Volumetric Source:
Uncertainty about the origin.
Variation in depths

Deterministic Seismic Hazard Analysis

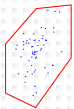
CHARACTERIZATION OF THE GEOMETRY OF THE SOURCES

Source	M_{max}
1	5.6
2	3.4
3	4.4
4	3.6
5	3.3
6	3.2
7	4.3
8	3.6
9	3.6
10	4.0
11	4.8



WEST TEXAS

Zone 7



AZLE, TX

Zone 8



EMD

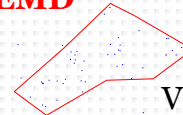
IRVING, TX

Zone 9



VENUS, TX

Zone 10



EASTERN TEXAS

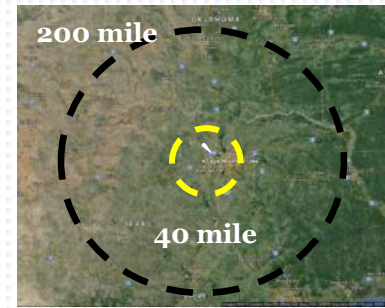
Zone 11



Seismic Sources (200 miles radius)

Seismic parameters (DSHA)

Identification of sources
(40 miles & 200 miles)



Characterization of Sources
(Magnitude, Depth, Distance to site)

Geometry of sources
(polygons)

Source:
 $F(M_{max}, R_{min})$

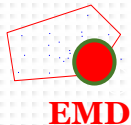
Ground Motion
Predicting Equations

Selection of
Threshold values

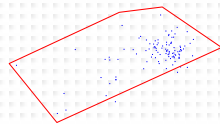
List all Sources >
Threshold

Maximum
PGA/PGV/PSA

Zone 1



Zone



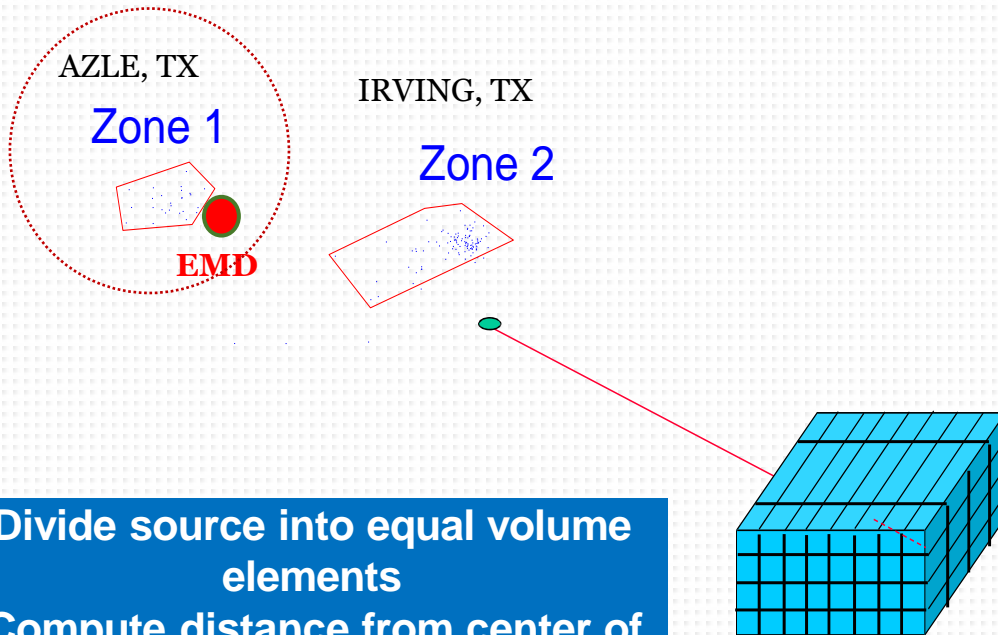
PGA ~ Peak Ground Acceleration
PGV ~ Peak Ground Velocity
PSA ~ Peak Spectral Acceleration

PSHA TASKS

TASK 1: CHARACTERIZATION OF SOURCES: SPATIAL AND SIZE UNCERTAINTY

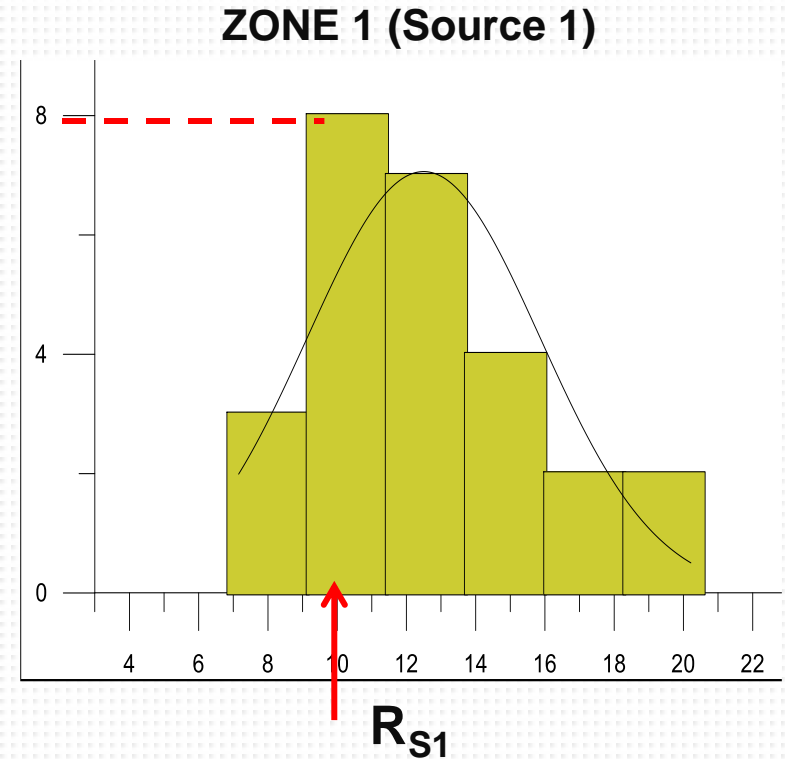
40 MILES RADIUS APPROACH-SAMPLE

a. SPATIAL UNCERTAINTY:



Divide source into equal volume elements
 Compute distance from center of each element
 Create histogram of source-site distance

Range of Distances (***)



$$R_{S1} = 10.2 \text{ Km}$$

$$U_{T1} = \#R_{S1} / \#\text{Obs}$$

$$U_{T1} = (8/26) = 0.307$$

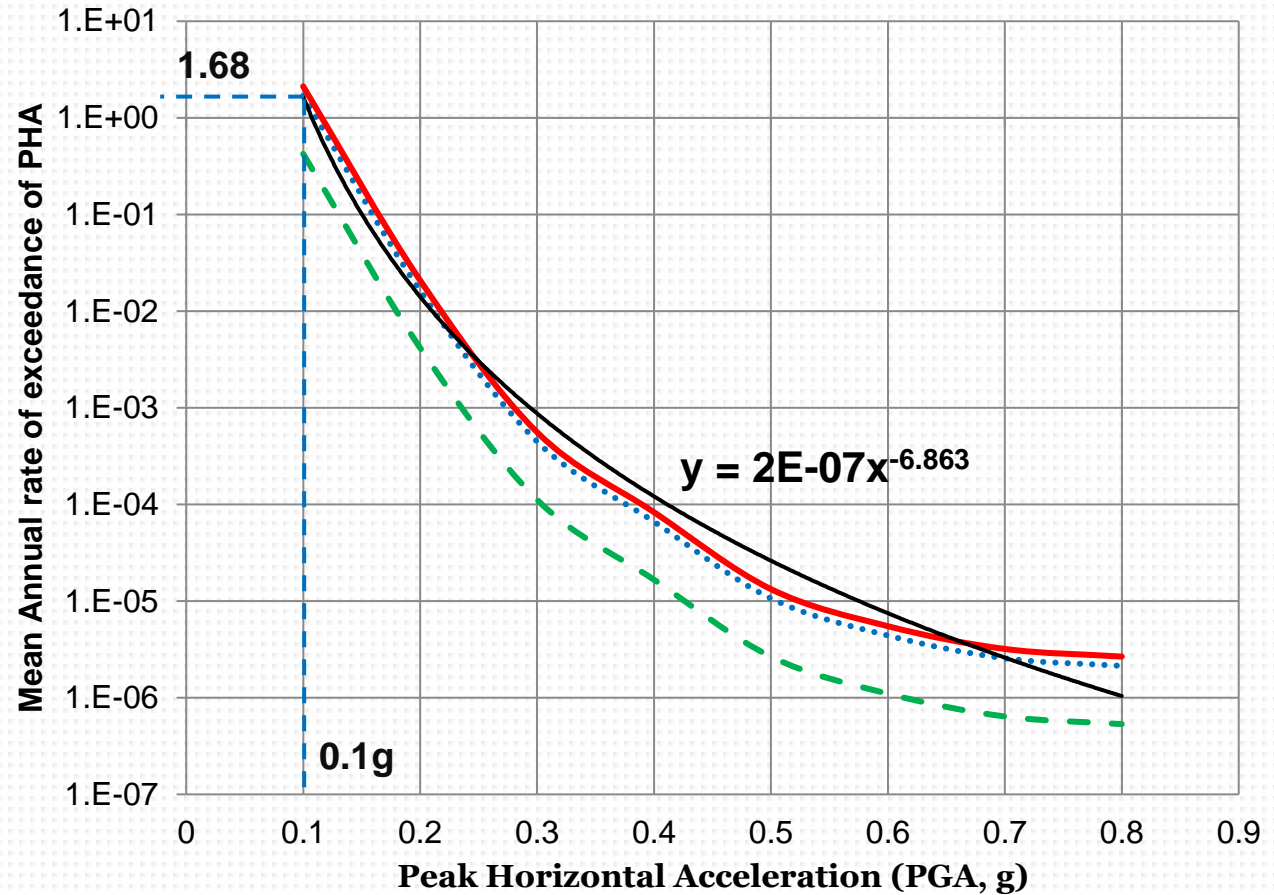
PSHA TASKS

TASK 4: SEISMIC HAZARD CURVES (40 MILES RADIUS)

RESULTS (PSHA)

Y	0.01253318	<i>From Graph</i>
Time	5	Years
PGA	Time Period	%Prob.
0.2	1	1.25
	5	6.07
	10	11.78
	20	22.17
	30	31.34
	50	46.56
	100	71.44

Seismic Hazard Curves



..... Source 1 - - - Source 2 - - - TOTAL - - - Power (TOTAL)