




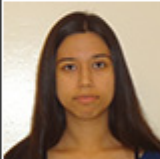




# Collapse Simulations of Buildings Under Earthquake Conditions

ASPIRES SUMMER RESEARCH INTERNSHIP 2018

CIVIL ENGINEERING GROUP 1

# Civil Engineering Group 1

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# Overview

- Introduction
- Background
  1. Earthquake Photo Collection
  2. Software
  3. Modified IMK Model
- OpenSees Simulation Structures
  1. Single Column Model
  2. 2-D Frame Model
- Optimization and Uncertainty Quantification
  1. Particle Swarm Optimization (PSO)
  2. Markov Chain Monte Carlo (MCMC)
- Analysis Results
- Summary & Conclusion



# Earthquake Photo Collection: Loma Prieta Earthquake

- **Date:** October 17, 1989 at 5:04 P.M.
- **Lasted :** 15 seconds
- **Location:** Loma Prieta Peak (Santa Cruz Mountains )
- **Magnitude:** 6.9
- **Affected Area:** The San Francisco Bay Area
- **Damage Cost:** 10 billion USD
- **Casualties:** 63 earthquake fatalities, 3,000 injured



Credit: Lloyd Cluff/ Getty Images



Photo, Lloyd S. Cluff





# Earthquake Photo Collection: Numerónimo 27F



Credit: El Mercurio Image



Credit: nachovalt Image

- **Date:** February 27, 2010 at 3:34 P.M.
- **Lasted:** approx. 4 Min
- **Location:** Ocean at about 150 km NE of Concepción, Chile, and 63km SW of Cauquenes, Chile
- **Magnitude:** 8.8
- **Affected Areas:** Valparaiso, Metropolitana de Santiago, Maule, Biobío y la Araucanía
- **Damage Cost:** 15-30 billion USD
- **Casualties:** more than 500 earthquake fatalities



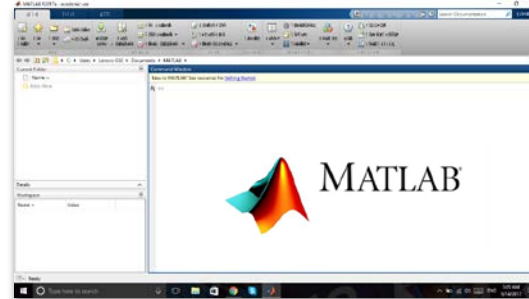
# Goal

- Be able to predict structural response to seismic activity to improve building safety.



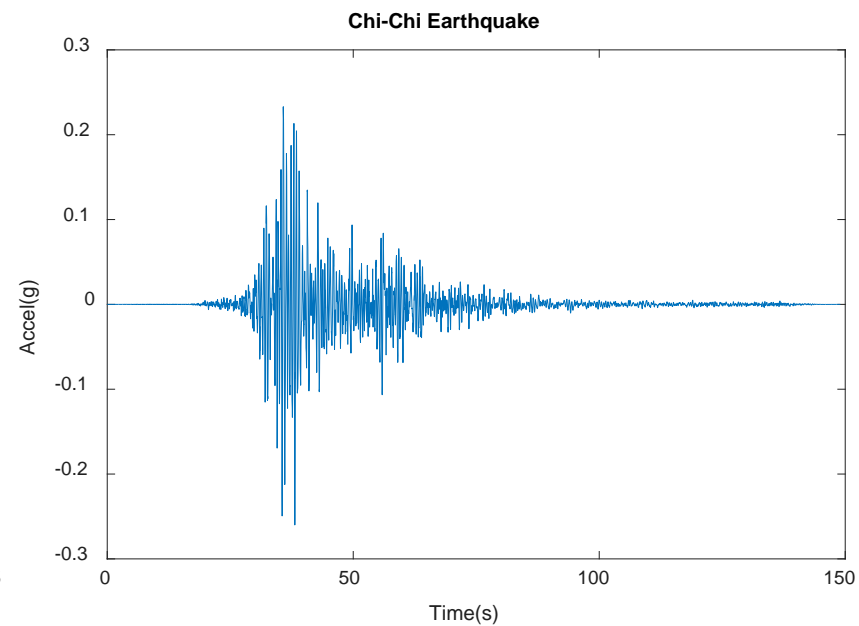
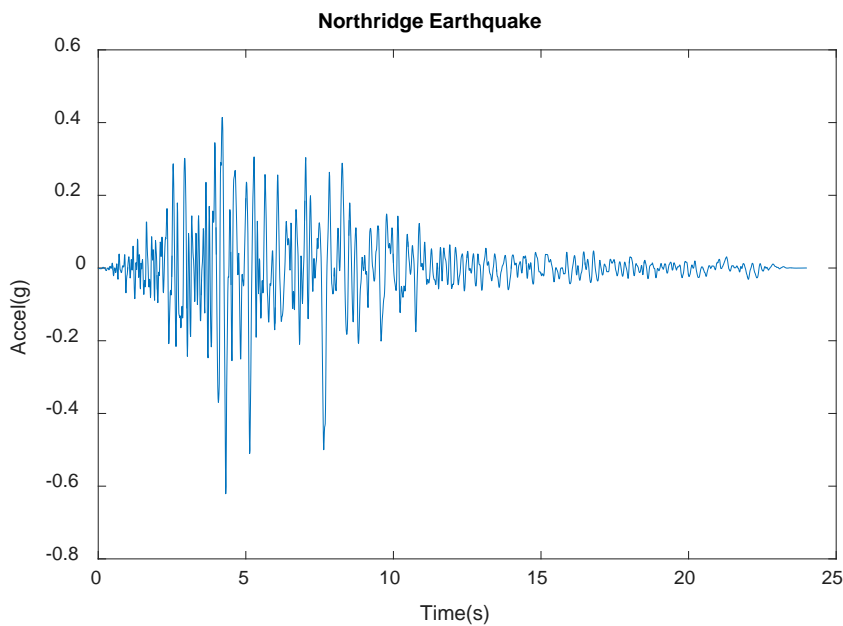
# Tools Used

- **Matlab**: software for pre and post analysis processing
- **OpenSees**: platform for simulations
- **Notepad ++**: Text editor for coding process (saved as .tcl in OpenSees folder)



# Research - Database

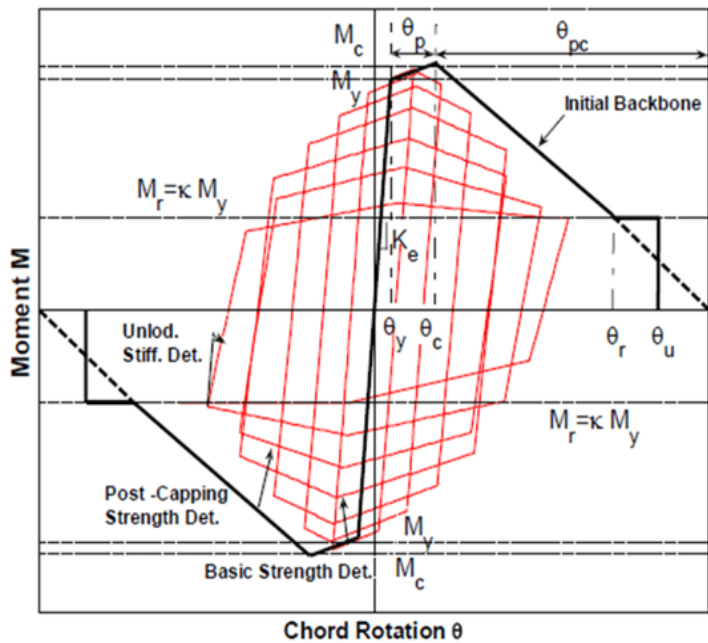
- Pacific Earthquake Engineering Research (PEER)
  - Northridge Earthquake - Mag: 6.7
  - Chi-Chi Earthquake - Mag: 7.6
- Dimitrios-Lignos Steel Database





# Ibarra-Medina-Krawinkler (IMK)

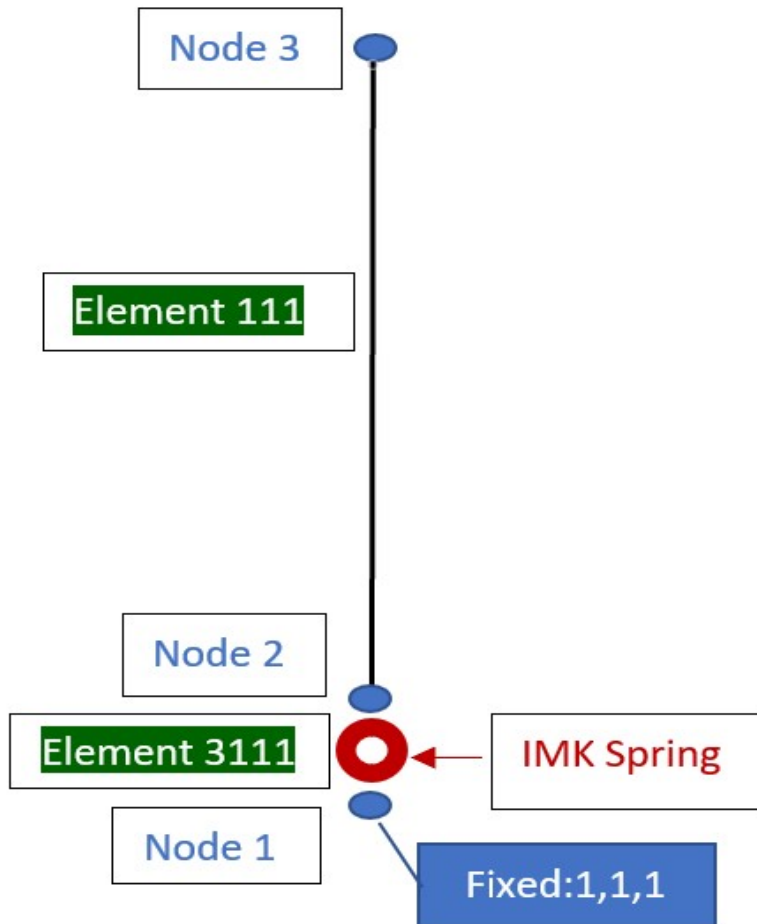
- Captures strength and stiffness deterioration
- Predicts structural response close to collapse



- Effective yield Rotation ( $M_y$  and  $\theta_y$ )
- Effective Stiffness  $K_e = \frac{M_y}{\theta_y}$
- Capping Strength and associated rotation for monotonic loading ( $M_c$  and  $\theta_c$ )
- Pre-capping rotation capacity for monotonic loading  $\theta_p$
- Post-capping rotation capacity  $\theta_{pc}$
- Residual Strength  $M_r = kM_y$
- Ultimate Rotation Capacity  $\theta_u$



# Single Column Model



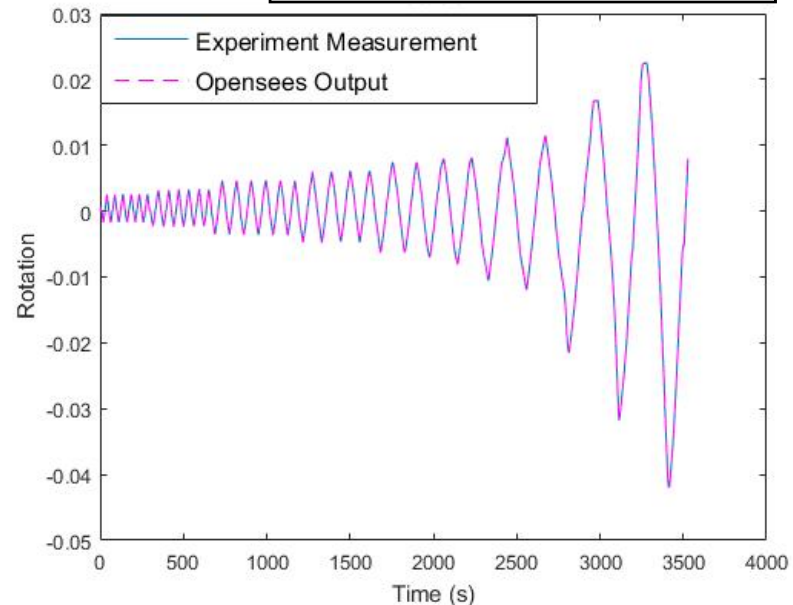
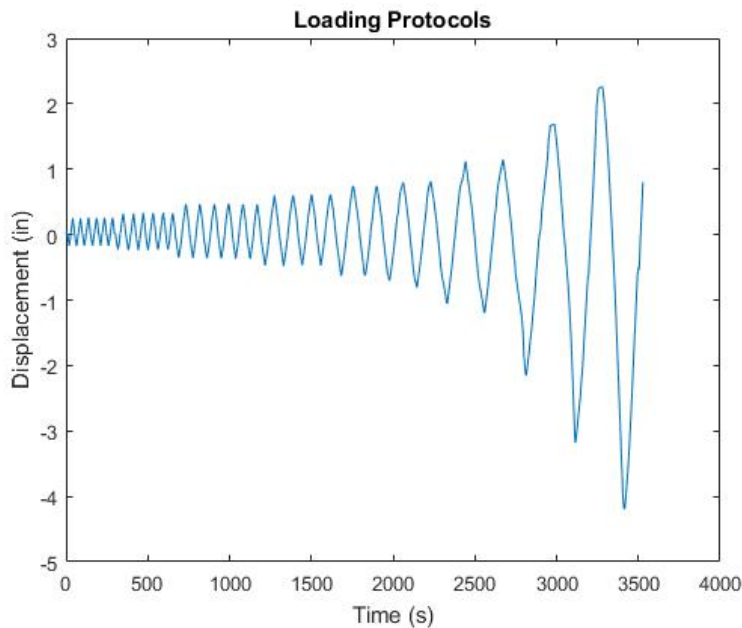
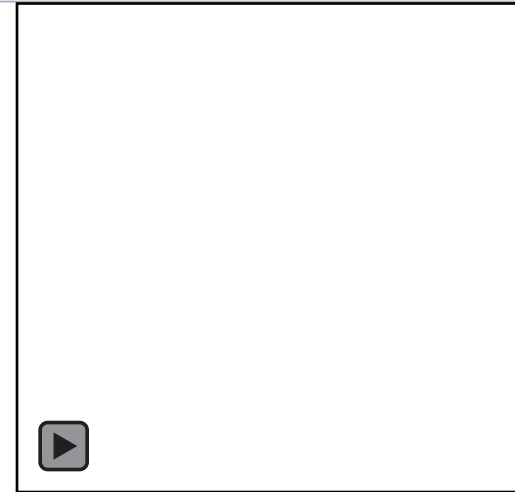
## Cyclic Analysis

- PSO: population based algorithm to determine the best position in the search space.
- MCMC: Method used for obtaining information about the distribution.

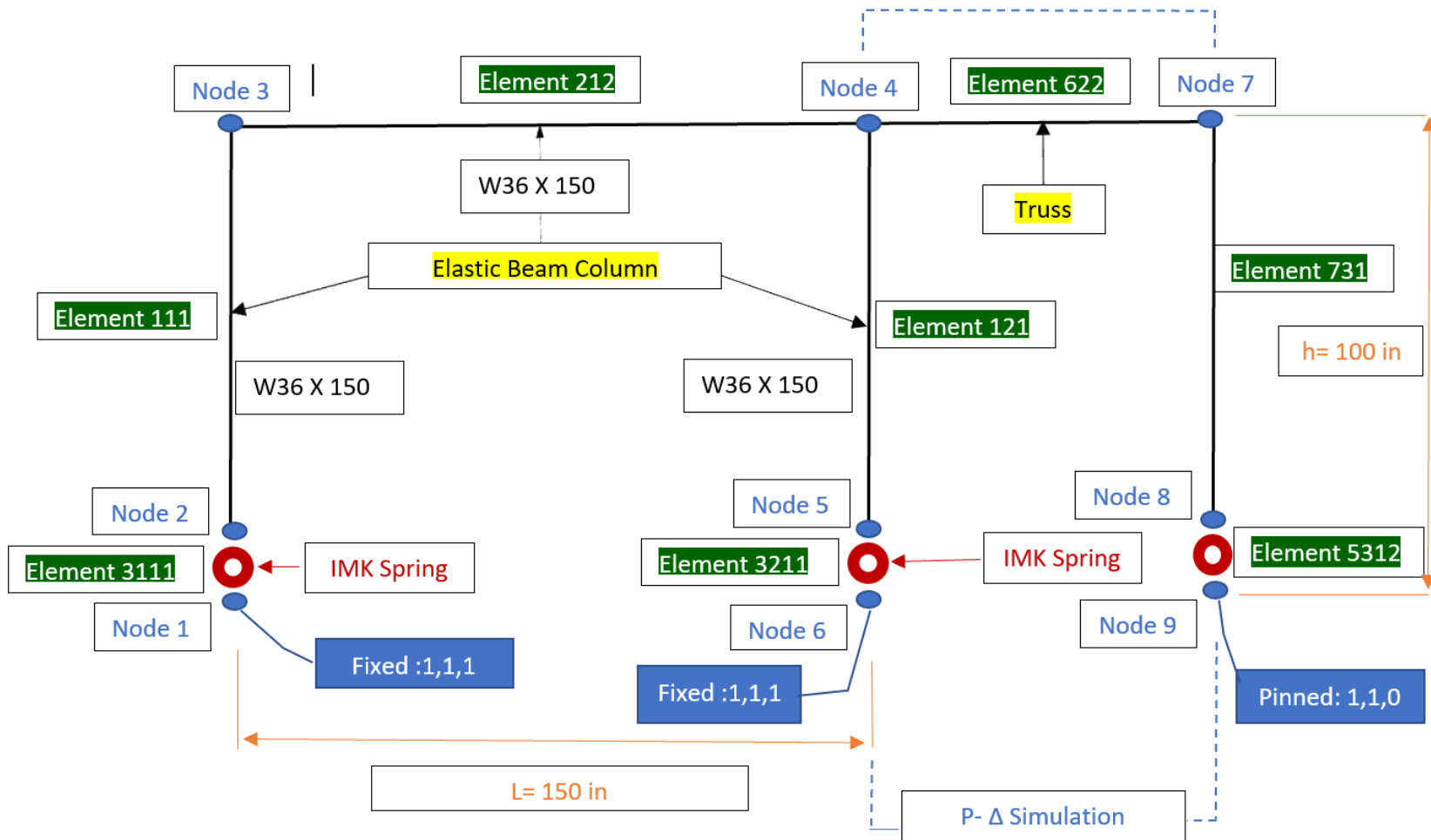


# Cyclic Analysis

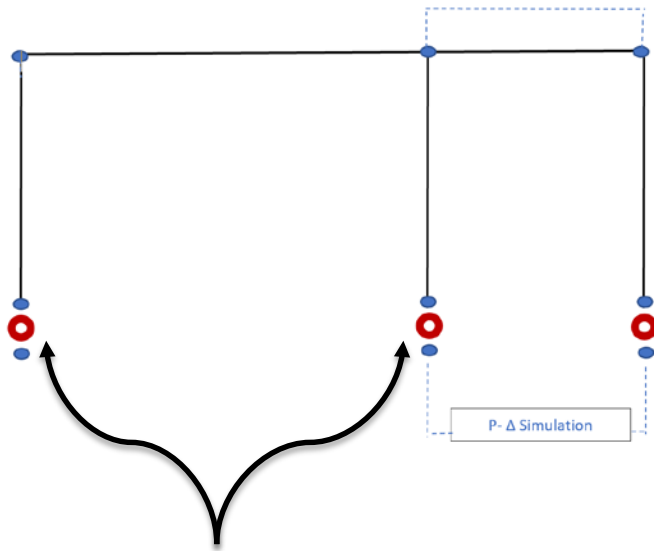
- Uses displacement control on point of interest of targeted structure.
- Allows for further optimization and uncertainty quantifications.



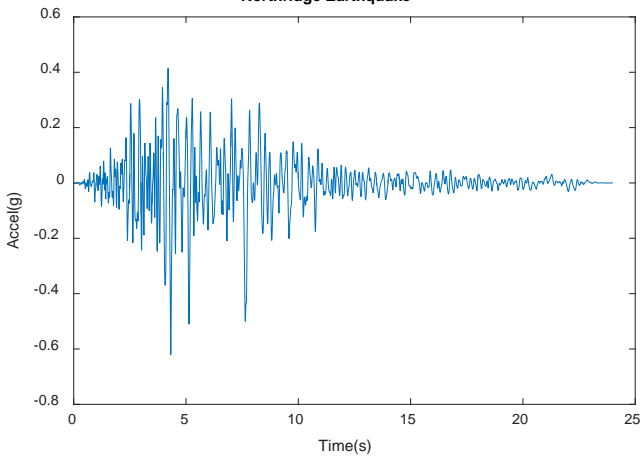
# Steel Frame Model



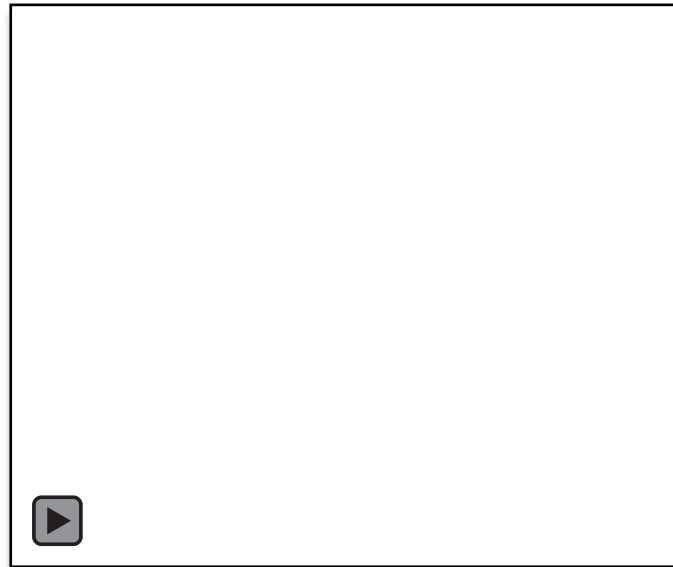
# Dynamic Analysis



Northridge Earthquake



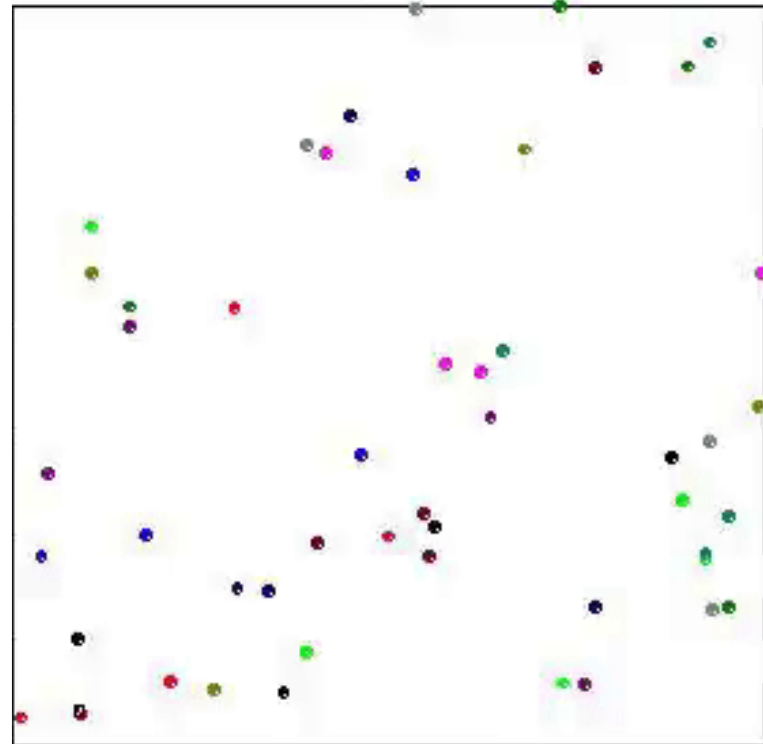
- Further information about the structural response.



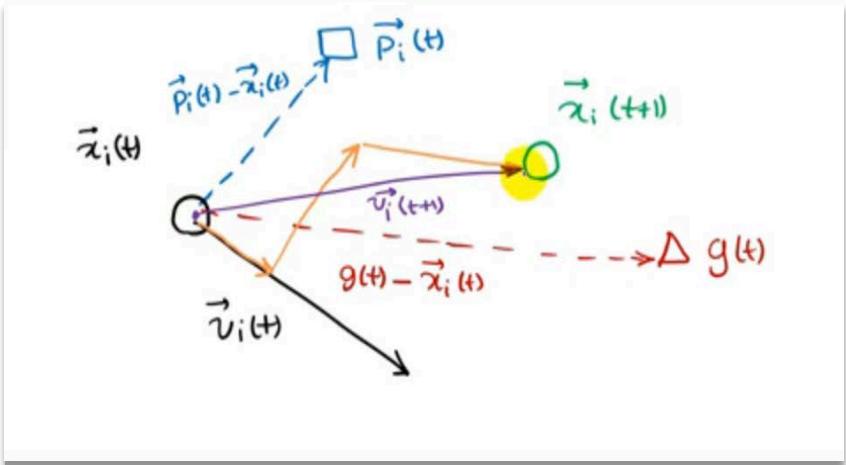
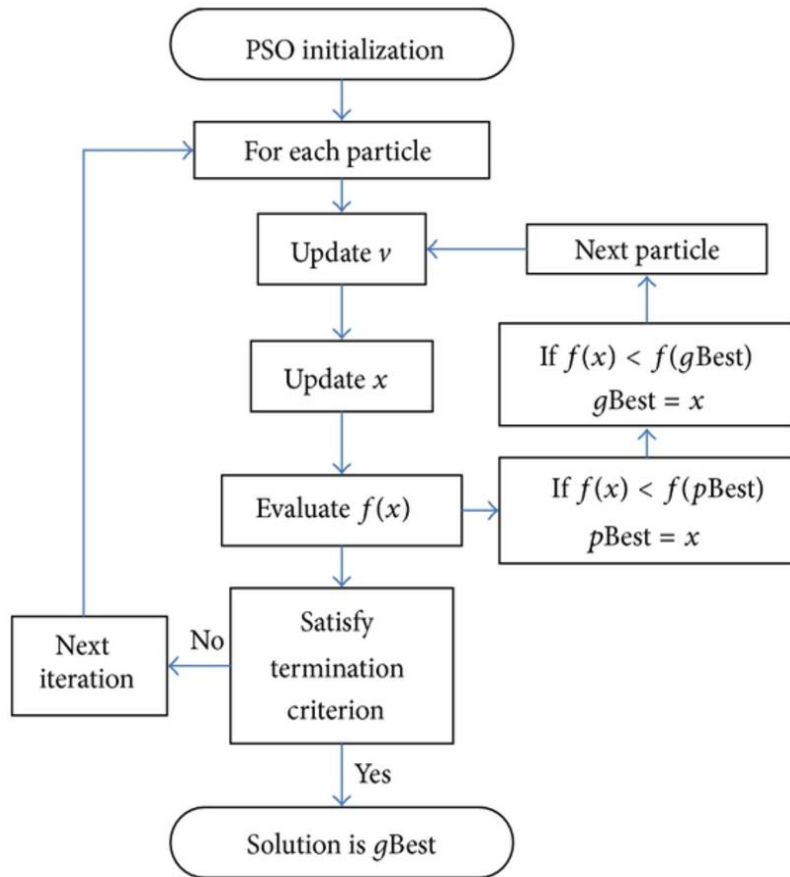


# Particle Swarm Optimization (PSO)

- By James Kennedy & Russell Eberhart
- Iterative process in which particles move to obtain the global optimum
- Animation shows how PSO progresses in 2D scenario



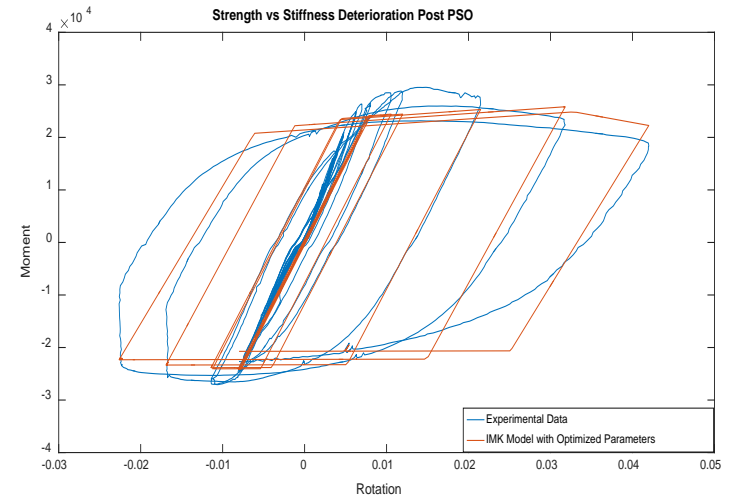
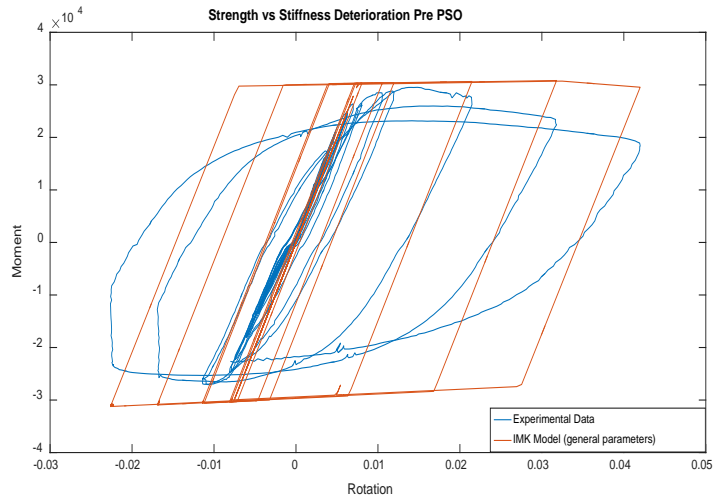
# Particle Swarm Optimization (PSO)



- $x_{ij}(t + 1) = x_{ij}(t) + v_{ij}(t + 1) * 1$
- $v_{ij}(t + 1) = wv_{ij}(t) + c_1r_1[P_{ij}(t) -$



# Particle Swarm Optimization (PSO)



Error Pre PSO:  $n \times 10^7$

Error Post PSO:  $n \times 10^6$

	General Parameters	Optimized Parameters
McMyP	1.15	1.73
McMyN	1.05	1.28
MyP	30350	23378
MyN	-30350	-23378
K	4E+06	3E+06
th_p	0.025	0.022
th_pc	0.25	0.28
LS	10	1
ResP	0.4	0.6
th_u	0.4	0.4



# Markov Chain Monte Carlo (MCMC)

- MCMC-statistical simulation using many algorithms that takes random samples from a probability distribution to produce uncertainty quantification

## The Bayes Formula

$$P(\theta|y) = \frac{P(y|\theta)P(\theta)}{P(y)}$$

- $P(\theta|y)$ -Posterior distribution
- $P(y|\theta)$ -Likelihood Function
- $P(y)$ -Single number
- $P(\theta)$ -*Non-informative*
- $y$ -IMK Parameters
- $\theta$ -Experimental Observation

## Our Likelihood Function

$$P(y|\theta, \sigma^2) = (2\pi)^{\frac{-n}{2}} \sigma^{-n} \cdot e^{\left\{\frac{-1}{2\sigma^2} \cdot (\sum_{i=1}^n (y_i - f(x_i; \theta))^2)\right\}}$$

- $\sigma^2$ -unknown variance
- $n$ -number of individual observations
- $\pi$ -target distribution



# Metropolis-Hastings (MH) Algorithm

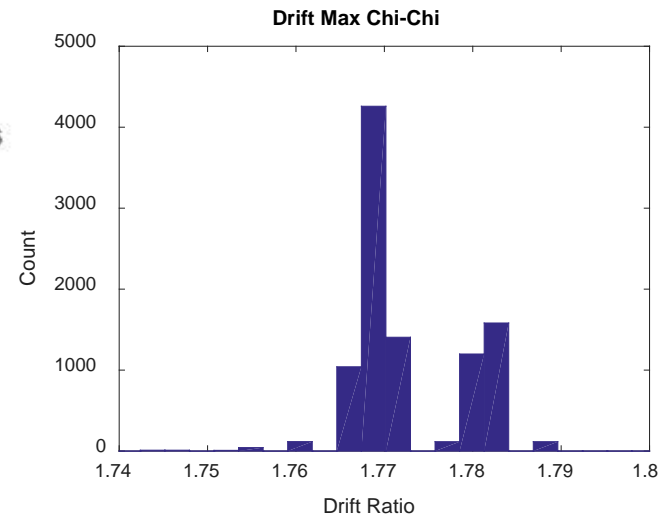
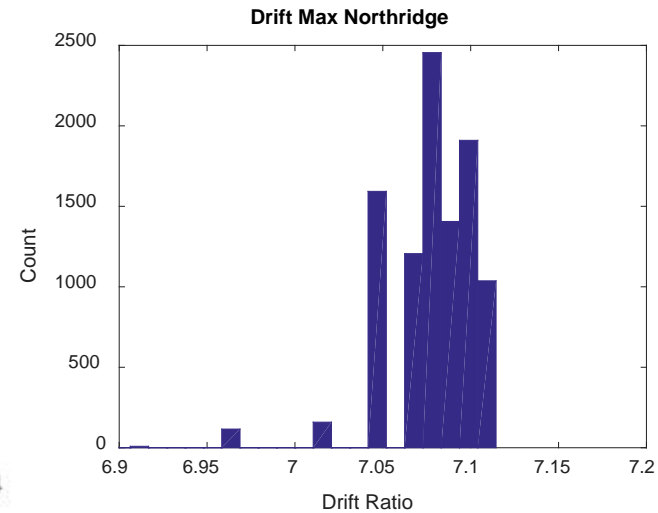
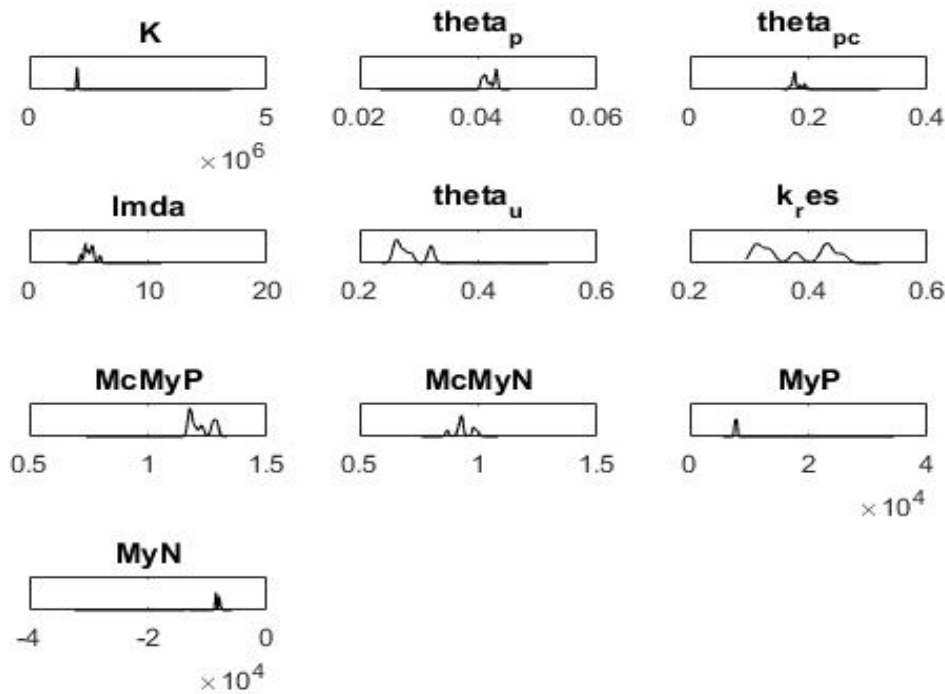
- 1) Start from the initial value  $\theta^0$ , and select a proposal distribution.
- 2) At each step where the value is  $\theta^{i-1}$ , it is correct to offer a candidate for a new distribution.
- 3) If the proposed value  $n$  is closer than the previous value  $\theta^{i-1}$ , then it is accepted unconditionally.
- 4) If the new value is not closer than the previous value,  $\theta^*$  is accepted as a new value with a probability function AKA the "delayed rejection" procedure.
- 5) If  $\theta^*$  is not accepted, the chain remains as the current value  $\theta^i = \theta^{i-1}$ .
- 6) Repeat steps 2-6 until enough values are generated.





# Analysis Results

- Small Graphs: PDF of model IMK Parameters
- Larger Graphs: distribution of story drift ratio from analysis





# Summary

- Created a Photo Collection of structural damage due to earthquake conditions
- Conducted Literature Reviews
- Designed models in OpenSees for earthquake analysis
- Applied Particle Swarm Optimization to optimize IMK parameters
- Utilized Markov Chain Monte Carlo simulations to produce uncertainty quantifications for structural collapse



# Conclusion

- Conduct simulations to reliably predict building responses to earthquake conditions
- Gain a greater appreciation for the multidiscipline research in Civil Engineering
- Teamwork
- Time management by meeting deadlines



Questions?



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