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# Risk Measures Beyond Expected Cost...

## *Unified Reliability and Design Optimization in Earthquake Engineering*

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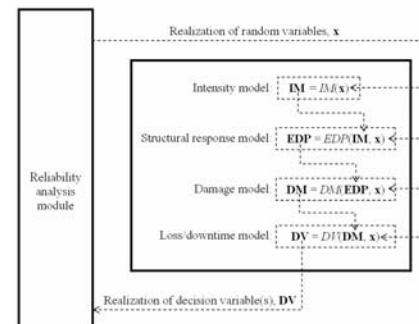
# Outline

- Trends

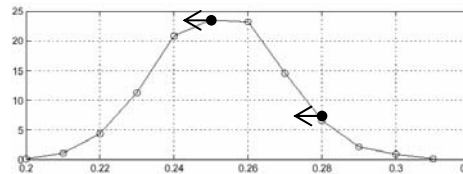


$$\lambda(dv) = \int_0^{\infty} \int_0^{\infty} \int_0^{\infty} G(dv | dm) |dG(dm | edp)| |dG(edp | im)| |d\lambda(im)$$

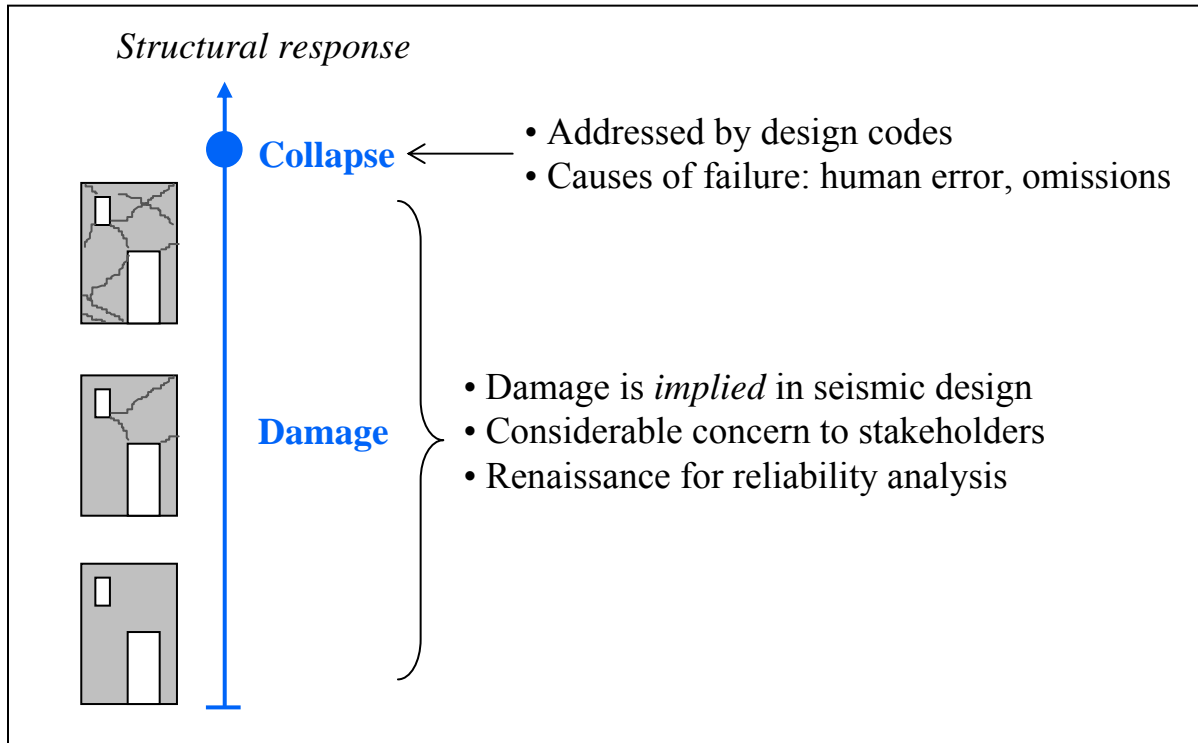
- “Unified” reliability analysis



- Design optimization



# Trends



Pacific Earthquake  
Engineering Research Center  
(PEER)



ATC-58



## Evaluation of the “PEER Equation”

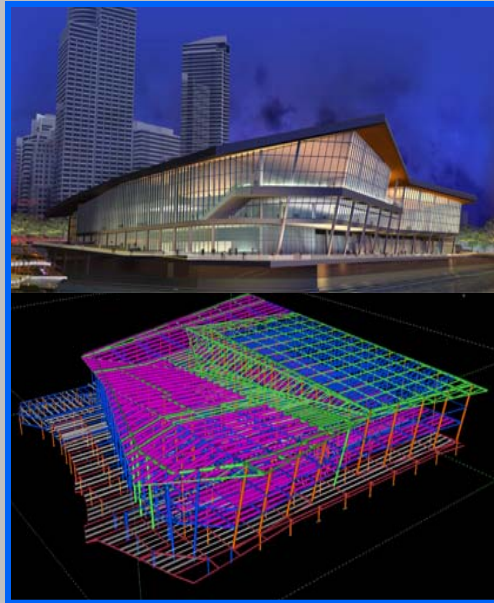
$$\lambda(dv) = \int_0^\infty \int_0^\infty \int_0^\infty G(dv | dm) |dG(dm | edp)| |dG(edp | im)| |d\lambda(im)$$

- Moehle, Stojadinovic, Der Kiureghian, Yang (2005)
- Tony Yang, Ph.D. thesis, UC Berkeley (2006)

- Hazard curve for intensity measure  $S_a$
- Suite of ground motions, scaled to match  $S_a$
- Nonlinear dynamic analysis
- Joint lognormal structural response vector
- Probability curves for damage states  $DS$ :  $P(DS \geq DS_i | x_j)$
- Associated repair costs from lookup tables



@ UBC



**Treatment of epistemic uncertainty**

*Koduru, Haukaas*

**Cost-benefit importance measures**

*Riederer, Haukaas*

**Finite element reliability analysis**

*Koduru, Haukaas*

**Reliability-based design optimization**

*Liang, Haukaas, Royset*

**Response sensitivities**

*Haukaas, Scott*

**Second-order response sensitivities**

*Bebamzadeh, Haukaas*

**Model errors**

*Bebamzadeh, Haukaas, Gardoni*

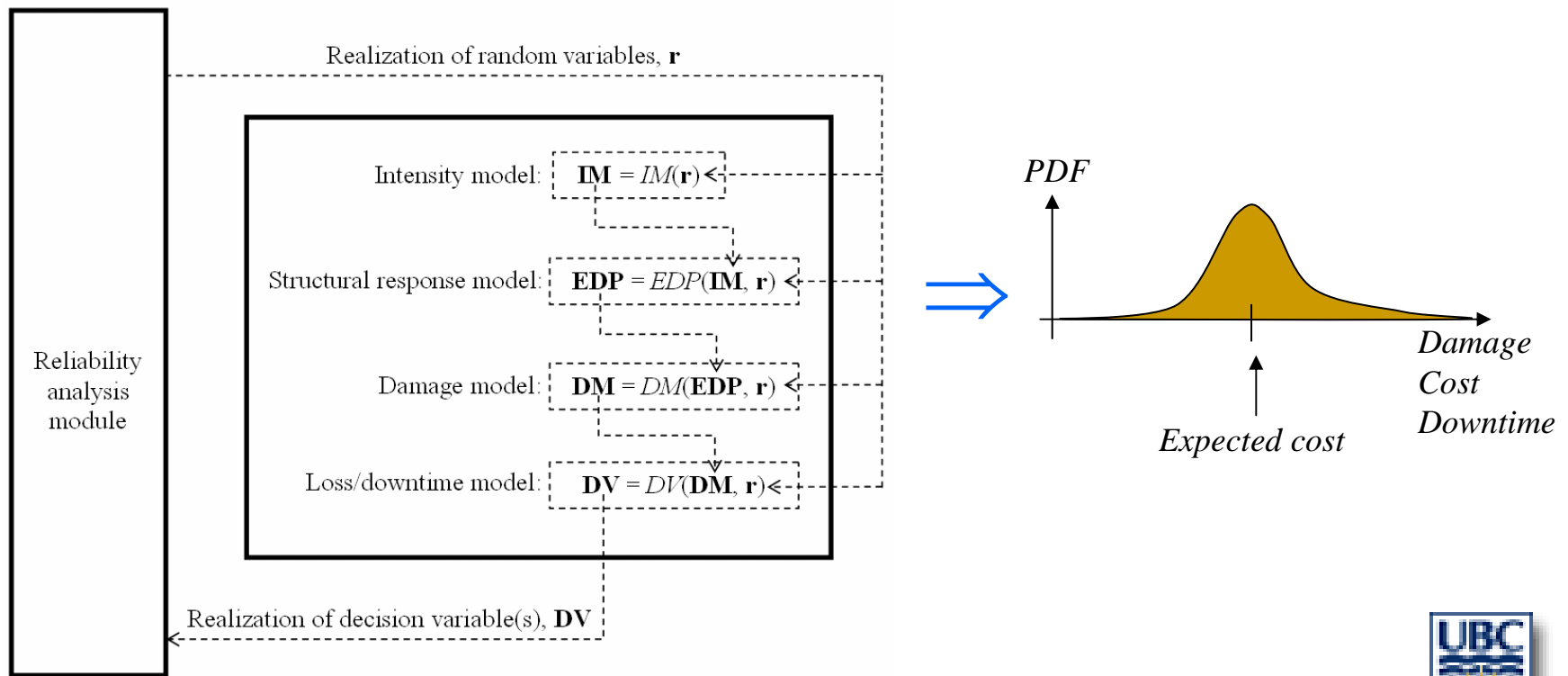
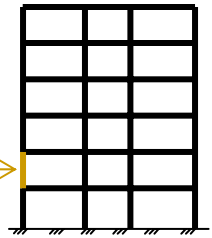
**Probabilistic models**

*Zhu, Elwood, Haukaas, Gardoni*



# Unified Reliability Analysis

- Reliability formulation** -----  $p = \int_{g(\mathbf{r}) \leq 0} \dots \int f(\mathbf{r}) d\mathbf{r}$
- Explicit probabilistic models** -----  $\ln(\delta_s) = \ln\left(\theta_4 \rho^n + \theta_6 \frac{s}{d} + (0.0069 - 0.26\theta_6) \frac{a}{d} + \theta_9 \frac{P}{A_g f'_c}\right) + \sigma \varepsilon$
- Limit-state function** -----  $g(\mathbf{r}) = dv - DV = dv - DV(\mathbf{r}, DM(\mathbf{r}, EDP(\mathbf{r}, IM(\mathbf{r}))))$



# Full-scale Examples

- Koduru & Haukaas, ICASP10

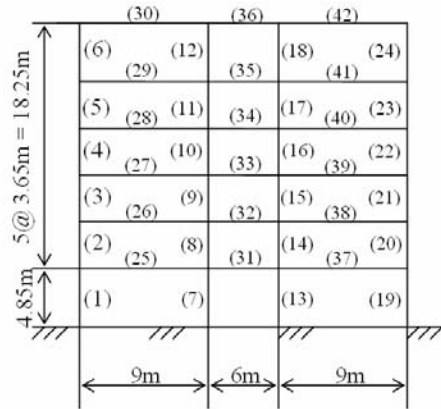


Figure 7. Finite element model of a six storey structure located in Vancouver, Canada. Element numbers are provided in parenthesis.

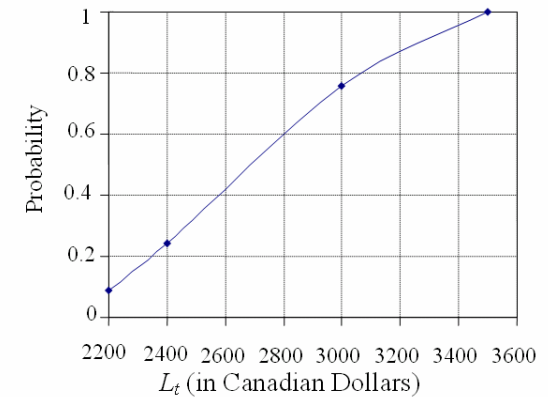


Figure 8. Probability distribution of total structural loss.

- Koduru & Haukaas, COMPDYN'07

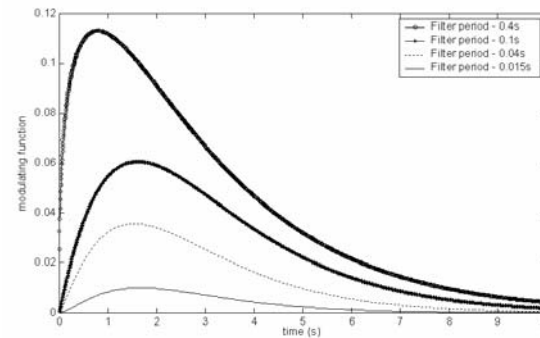


Figure 4: Modulating functions.

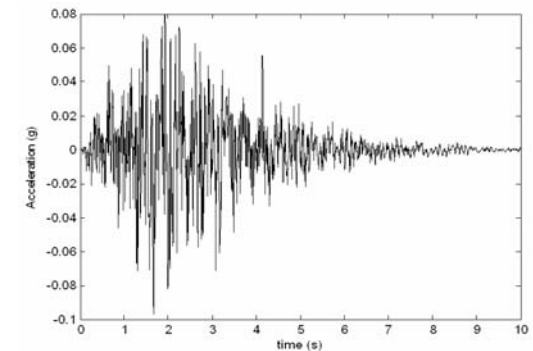
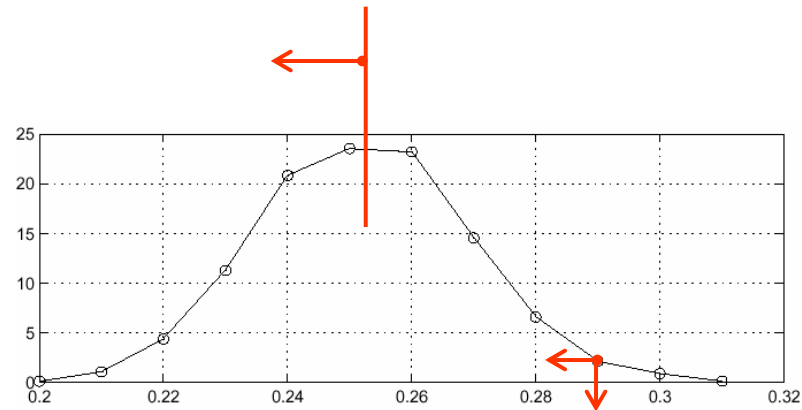


Figure 5: Sample realization of the ground motion.

# Design Optimization

- **Expected cost approach:** Criticized because it does not explicitly address the unlikely but potentially devastating costs in the tail of the cost distribution (Haimes 1998)
- **Proposal:** Perform the decision making in the tail of the distribution



- **Utilizing unified reliability analysis:**  $g(\mathbf{d}, \mathbf{r}) = c_o - c_c(\mathbf{d}, \mathbf{r}) - c_d(\mathbf{d}, \mathbf{r})$

*design variables*

*random variables*

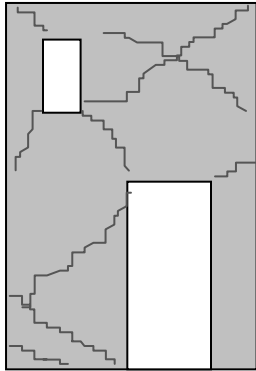
*losses in earthquake*

*cost of construction*

*cost threshold*



# Exceedingly Simple Example to Illustrate the Optimization Methodology



Equivalent stiffness,  $k$   
 Applied load,  $P$   
 Displacement response  $u=P/k$

← Design variable  
 ← Random variable  
 ← Response that causes damage

Cost of damage:

$$c_d(P,k)=m_u u$$

Cost of increasing the stiffness:

$$c_c(k)=m_k k$$

$$\mu_p=15,000kN$$

$$m_u = \$10,000 \text{ per cm}$$

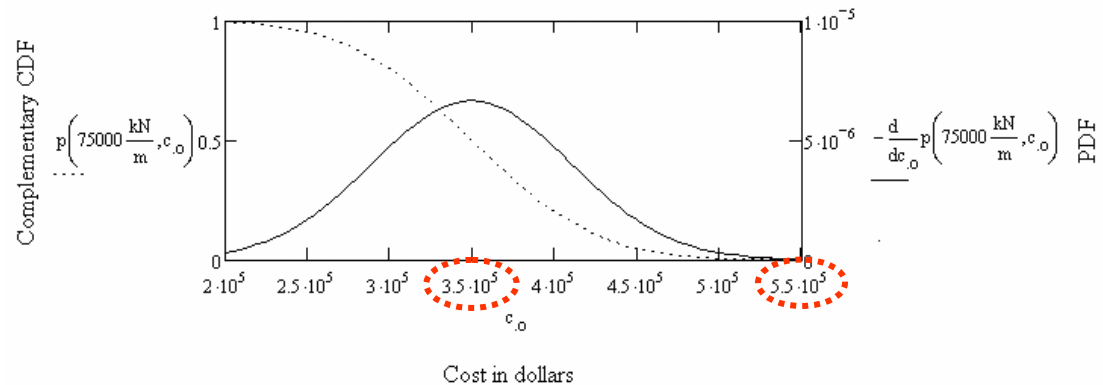
$$\sigma_p=4,500kN$$

$$m_k = \$2 \text{ per kN/m}$$

## ■ Unified reliability analysis

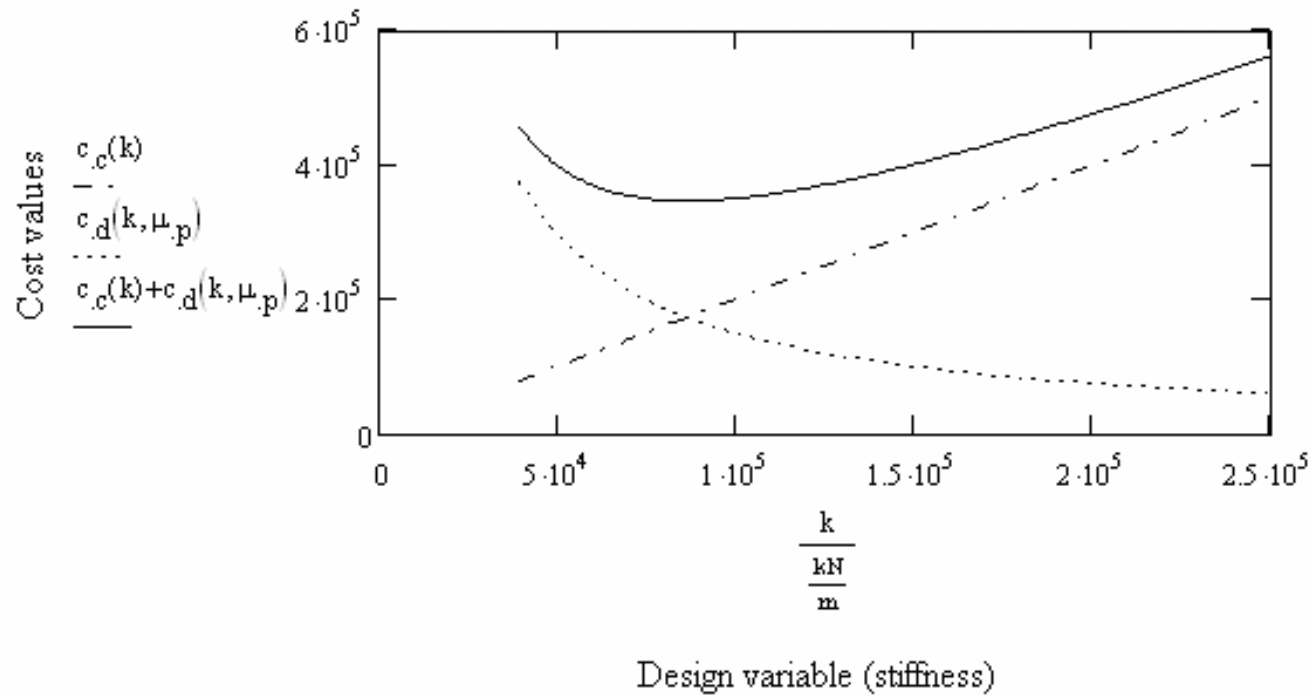
$$\beta(k, c_o) = \text{straightforward}$$

$$p(k, c_o) = \Phi(-\beta(k, c_o))$$

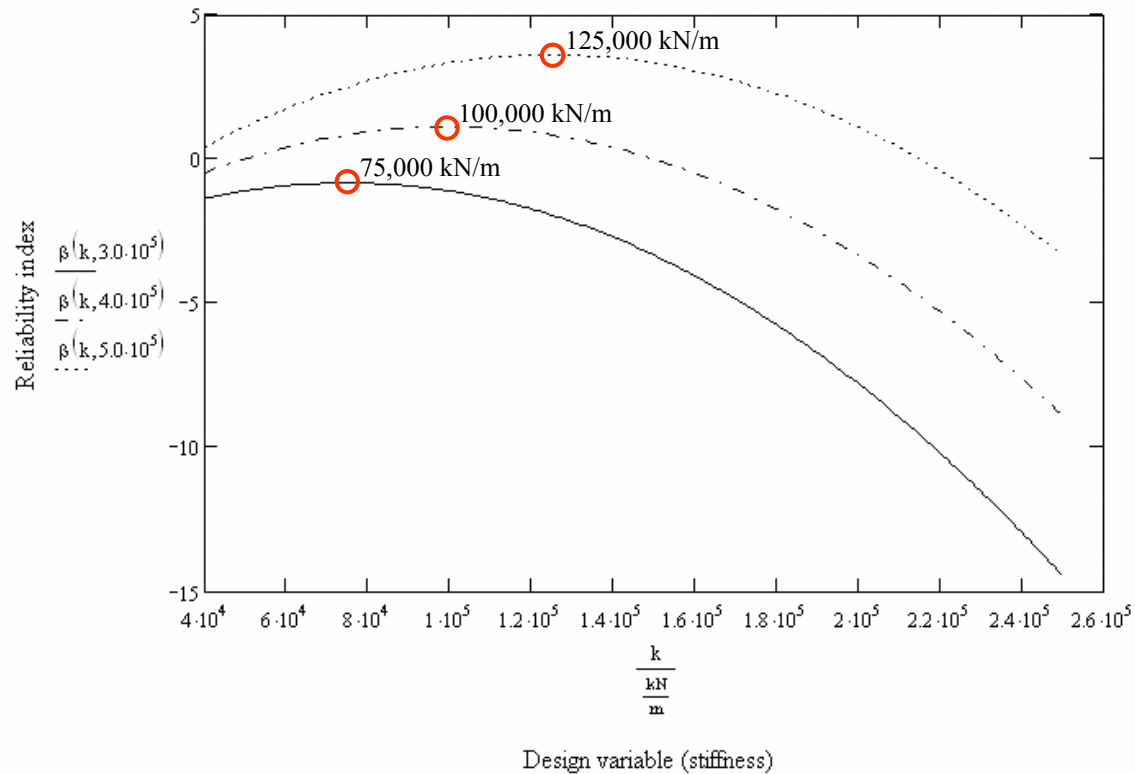




Construction cost and damage cost at the mean value of the random load, as function of the design variable:



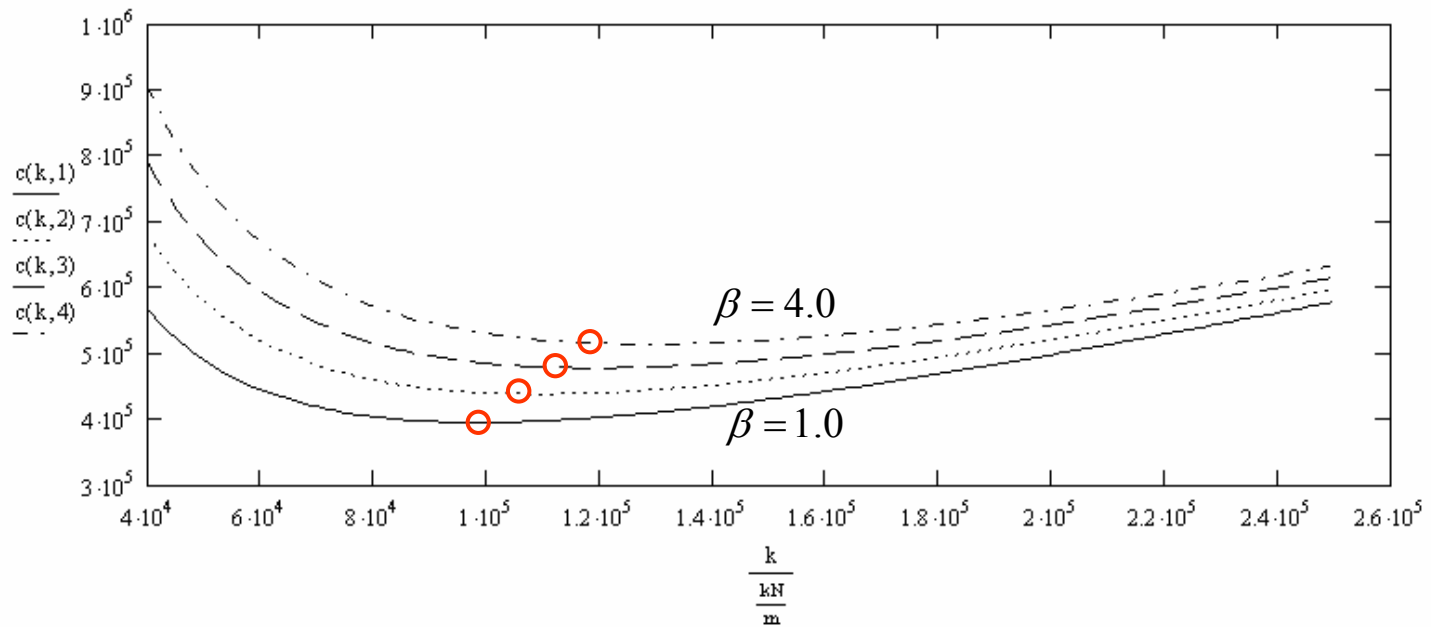
Reliability index associated with three different cost thresholds, plotted as function of the design variable:



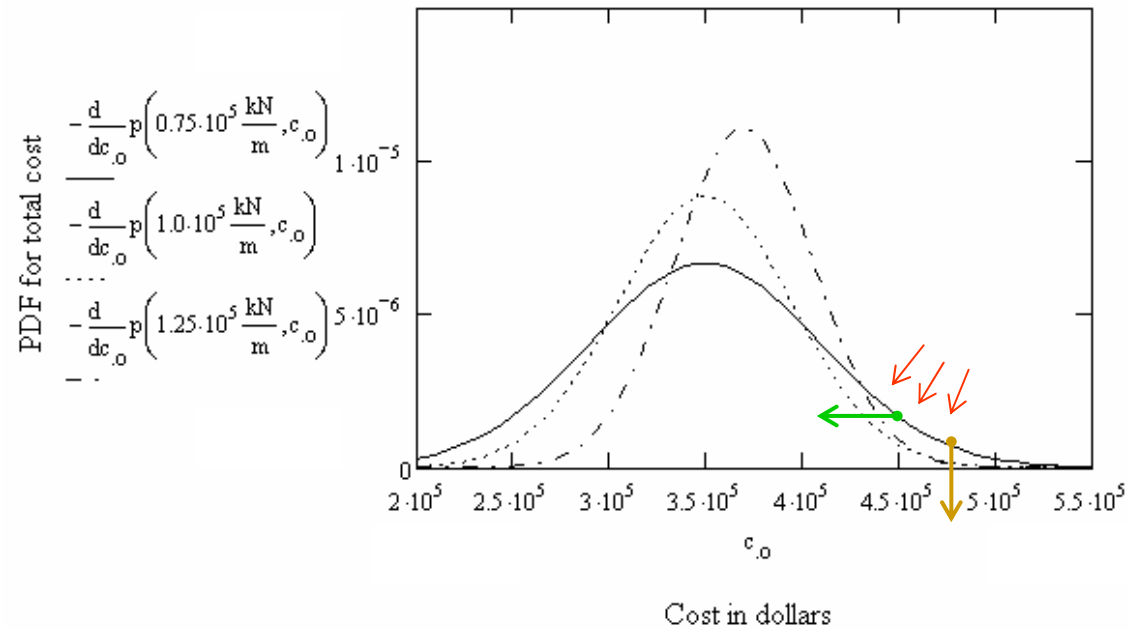
- Observations:** The optimal value of the design variable increases with increasing cost threshold  
 → Risk averseness on the part of the decision maker becomes part of the design  
 Akin to a utility function with built-in risk averseness



Total cost threshold associated with four different reliability indices, plotted as function of the design variable:



PDF for total cost, associated with different optima:



- Possible problem formulations:

Minimize exceedance probability at a cost threshold:

Minimize cost threshold at a probability:

$$\min\{p(\mathbf{d}) | c_o\}$$

$$\min\{c_o(\mathbf{d}) | p\}$$



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Thank You for Your Attention

