

'Why Should I Waste my Money on Monitoring?'

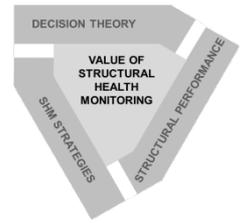
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Barcelona, Mar 14, 2016





Benefit of Monitoring?

monitoring of bridges is commonly presented as a powerful tool supporting decisions

in real-life bridge owners are very skeptical

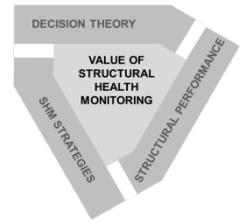
take decisions based on their experience or on common sense

a **reinforcement** intervention improves capacity

monitoring **does NOT** change capacity nor load

'why should I spend my money on monitoring?!'





Value of Information (Vol)

to appreciate the benefit monitoring, we must account for its **impact on decision**

Value of Information: money saved every time the manager interrogates the monitoring system

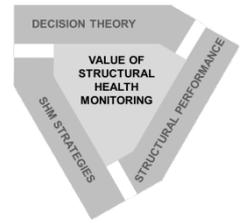
maximum **price** the rational agent is **willing to pay** for the information from the monitoring system

$$\text{Vol} = C - C^*$$

C=operational cost w/o monitoring

C*=operational cost with monitoring

implies the **manager can undertake actions** in reaction to monitoring response



Streicker Bridge at Princeton campus

- Pedestrian bridge being built at Princeton University campus
- over Washington Road
- Funded by Princeton alumnus **John Harrison Streicker (*64)**
- design by **Christian Menn**
- design details by Princeton alumni **Ryan Woodward (*02)** and **Theodor Zoli (*88)**

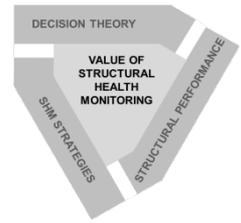


Streicker Bridge at Princeton campus

Main span: deck-stiffened arch,
deck=post-tensioned concrete,
arch=weathering steel

Approaching legs: curved post-tensioned
concrete continuous girders supported on
weathering steel columns



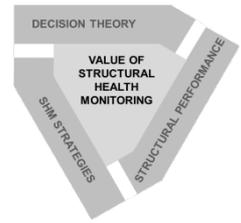


Introducing 'Tom'

- fictitious character
- responsible of the imaginary **Design and Construction office** in Princeton University
- behaves in a **rational** manner
- aims at minimizing the operational cost
- linear utility with cost
- no separation between direct cost to the owner and indirect cost to the user
- concerned that **a truck** driving on Washington Rd., could **collide with the steel arch**

"Tom"





Possible states of the bridge

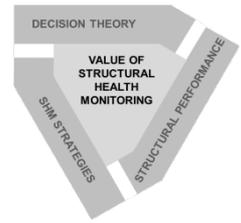
Severe Damage

- the bridge is still standing, but experienced severe damage at the steel arch structure; chance of collapse under design live load and under self-weight

No damage

- the structure has either no damage or mere cosmetic damage, with no or negligible loss in capacity





Tom's options

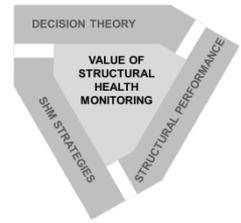
Do Nothing

- no special restriction is applied; bridge is open to pedestrian traffic; minimal repair or maintenance works can be carried out

Close bridge

- both Streicker bridge and Washington Rd. are closed to pedestrian and vehicular traffic; access to the nearby area is restricted



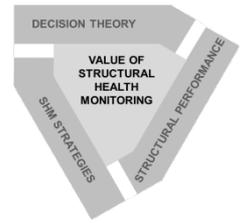


Tom's cost estimate

Close bridge

- **Daily Road User Cost** (DRUC) that considers the value of time per day as a monetary term (Kansas DOT 1991, Herbsman et al. 1995)
- estimated DRUC for Washington Road in \$4660/day
- estimated downtime: 1 month
- **total downtime cost**
 $C_{DT} = 4660 \times 30 = \$139,800$





Tom's cost estimate

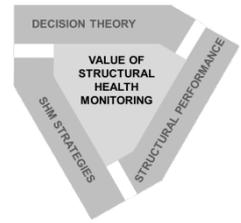
Do Nothing

AND

No damage

- Pay nothing!!





Tom's cost estimate

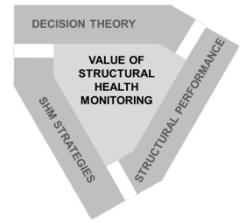
Do Nothing

AND

Severe
Damage

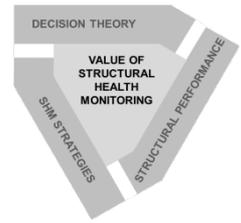
2 month DRUC	\$279,600
cost of fatality: k\$ 3840 chance of fatality: 15%	\$576,000
cost of injury: k\$ 52 chance of injury: 50%	\$26,000
total failure cost	$C_F = \$881,600$



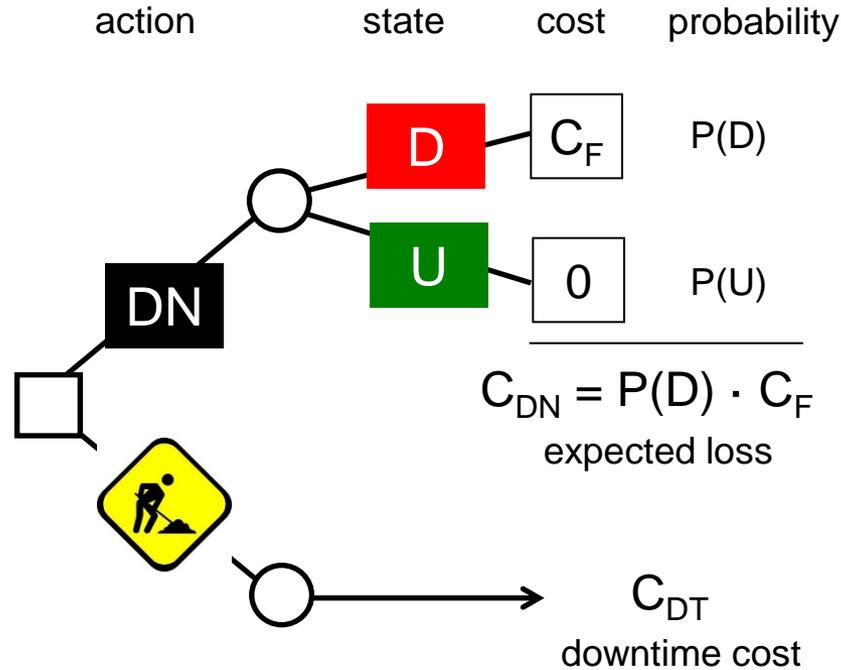


cost per state and action

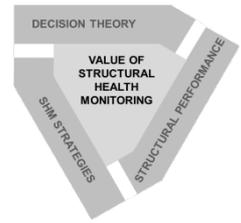
	Damage	No Damage
Do Nothing	C_F k\$ 881.6	0
Close bridge	C_{DT} k\$ 139.8	C_{DT} k\$ 139.8



Decision tree w/o monitoring



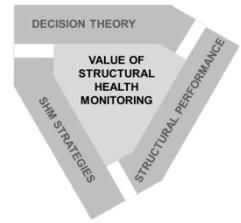
action:		state:	
DN	<i>Do Nothing</i>	D	<i>Damaged</i>
	<i>Close Bridge</i>	U	<i>Undamaged</i>



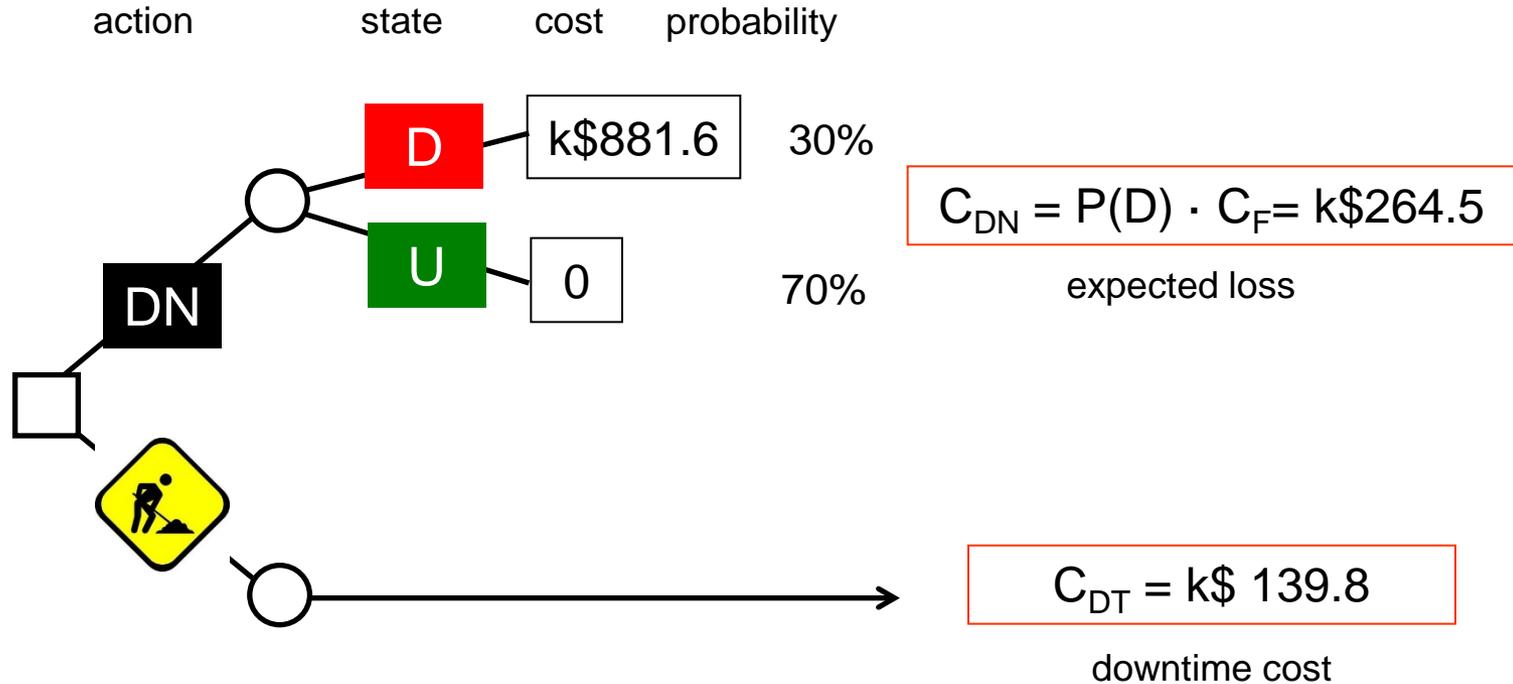
Tom's prior expectation

	Damage $P(D)=30\%$	No Damage $P(U)=70\%$
Do Nothing	C_F k\$ 881.6	0
Close bridge	C_{DT} k\$ 139.8	C_{DT} k\$ 139.8





Decision tree w/o monitoring

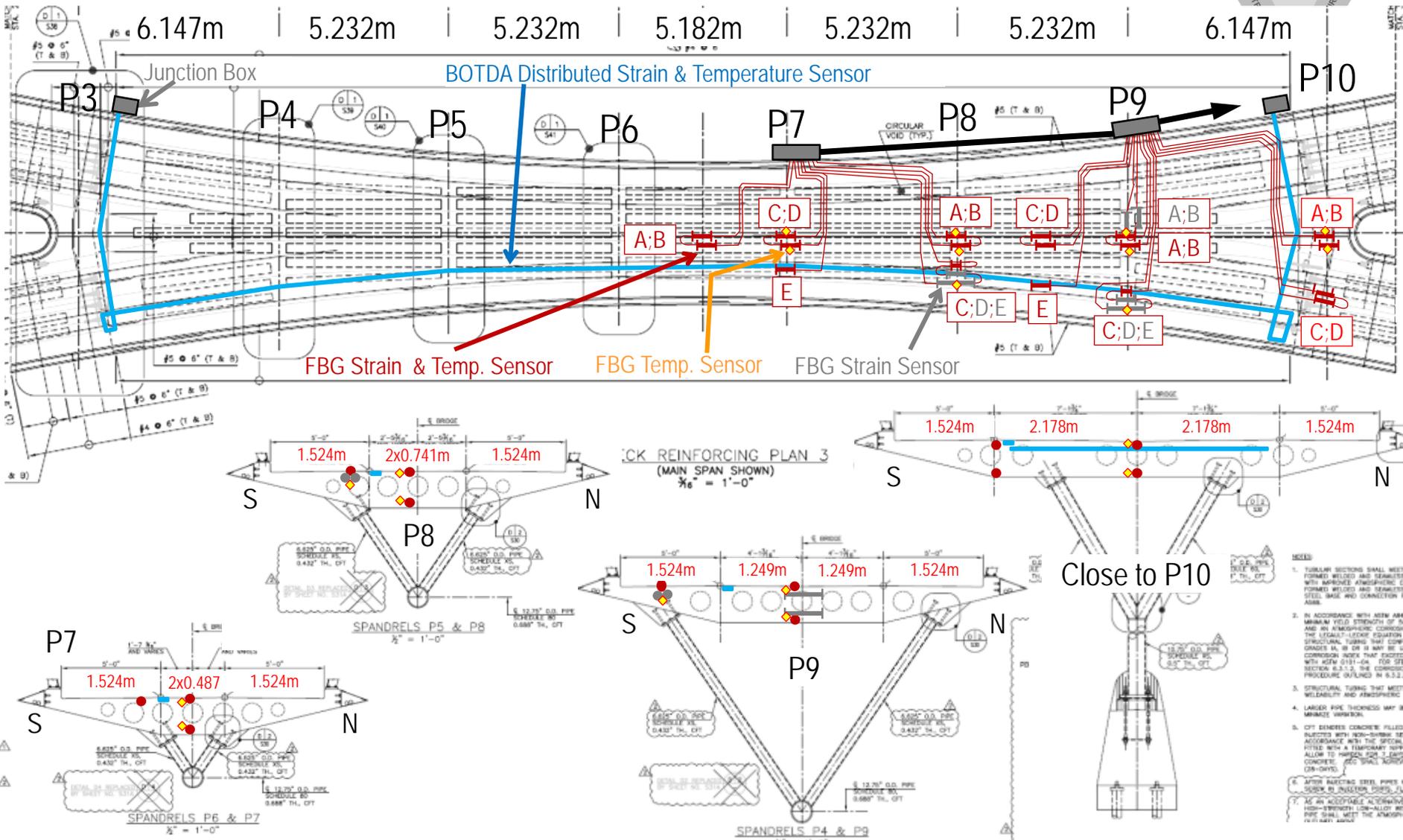
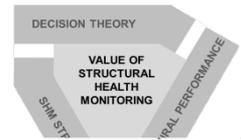


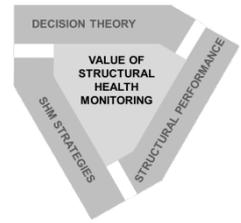
action:		state:	
DN	Do Nothing	D	Damaged
	Close Bridge	U	Undamaged

expected cost w/o monitoring

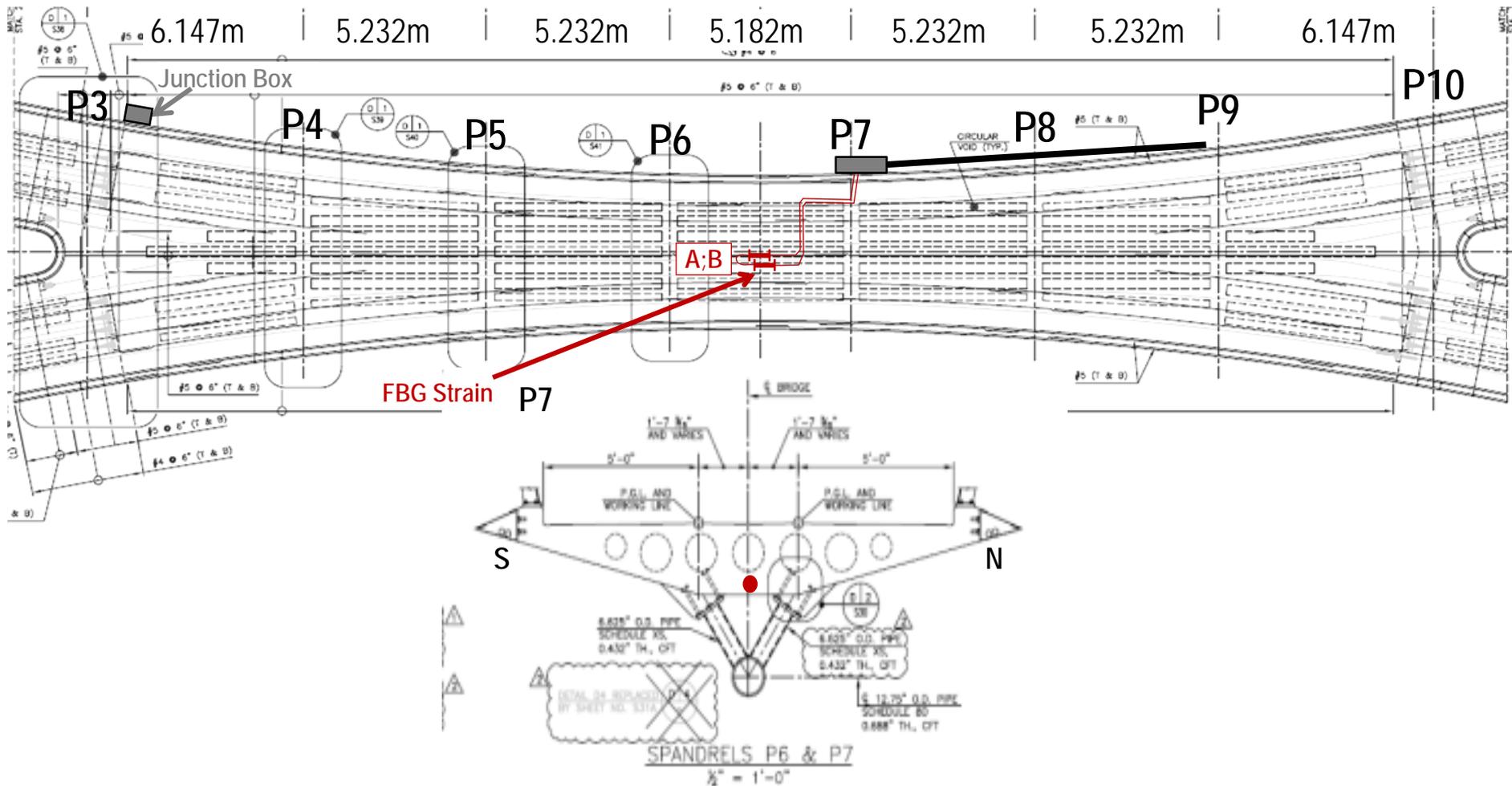
$$C = \min(C_F P(D), C_{DT}) = k\$ 139.8$$

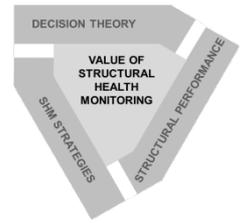
COST TU1402: Quantifying the Value of Structural Health Monitoring



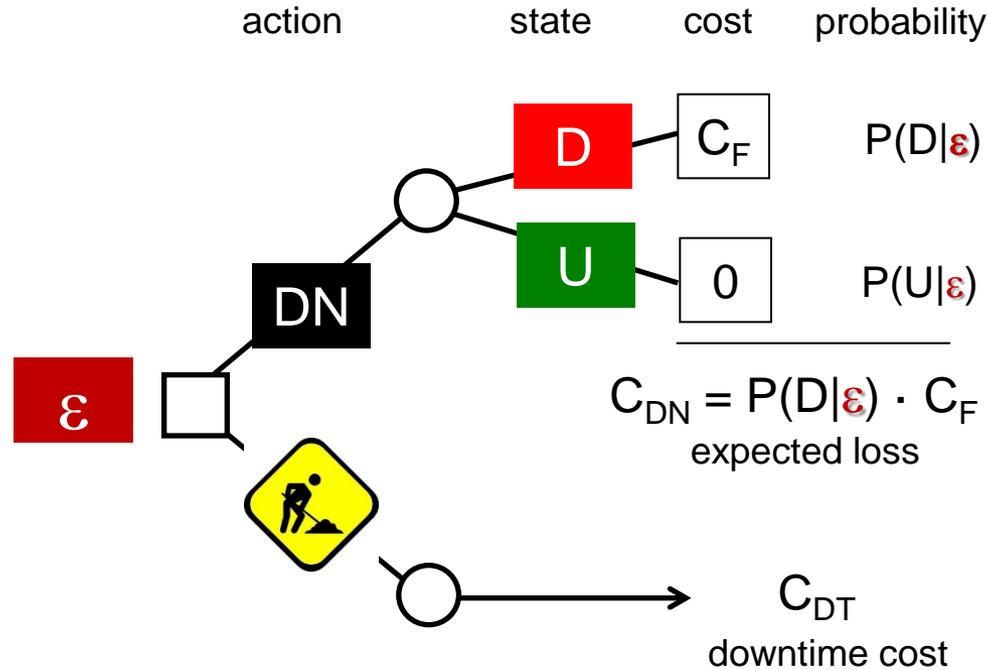


Sensor location in main span





Decision tree w/o monitoring

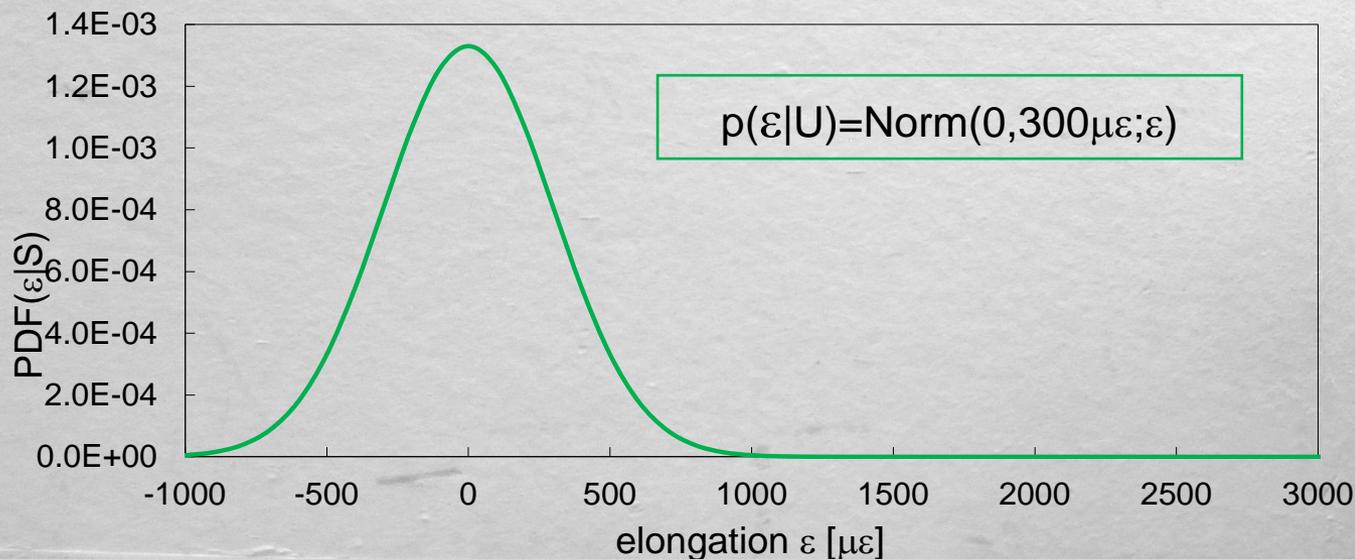


action:		state:	
DN	Do Nothing	D	Damaged
	Close Bridge	U	Undamaged

Likelihoods

No damage

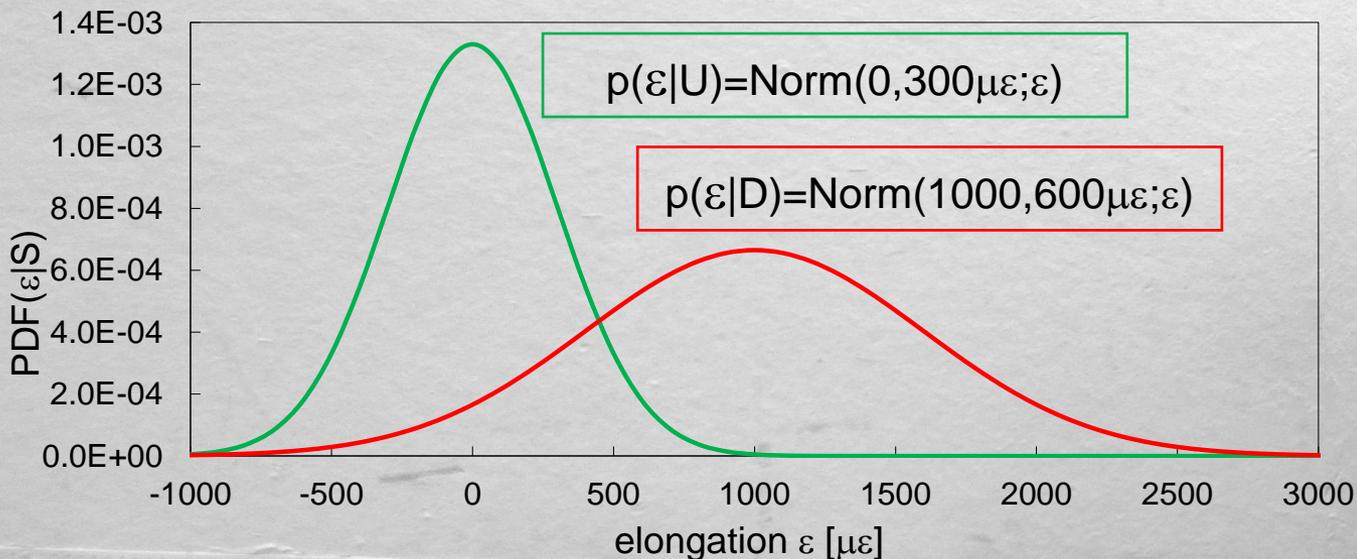
- if the bridge is virtually undamaged, the change in strain will be close to zero.
- There is natural fluctuation of the midspan curvature, mainly due to thermal effects;
- Tom's monitoring system provider told him that this fluctuation might be of the order of $\pm 300\mu\epsilon$.

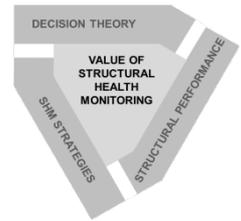


Likelihoods

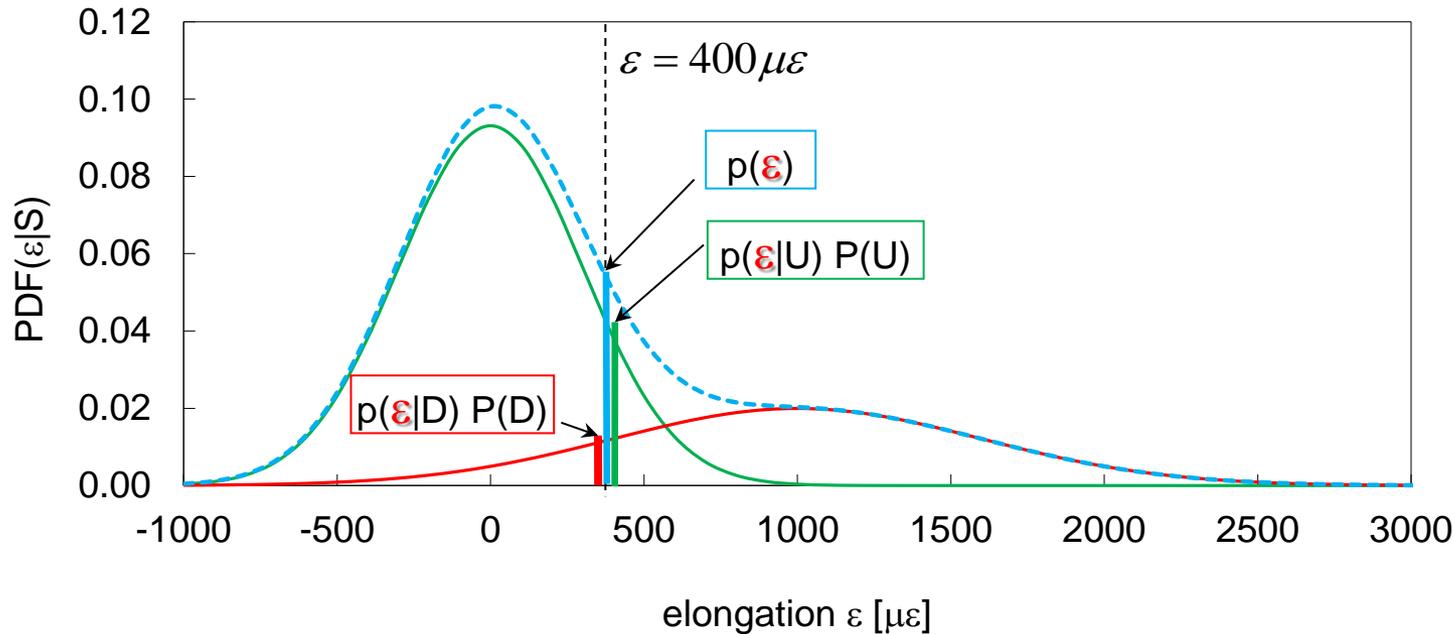
Severe Damage

- assume the bridge is heavily damaged but still standing
- Tom expects a significant change in strain in the order of 1000 $\mu\epsilon$





Joint probabilities and evidence



prior

$$P(U) = 70\%$$

$$P(D) = 30\%$$

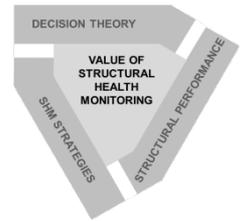
likelihoods

$$p(\epsilon|U)$$

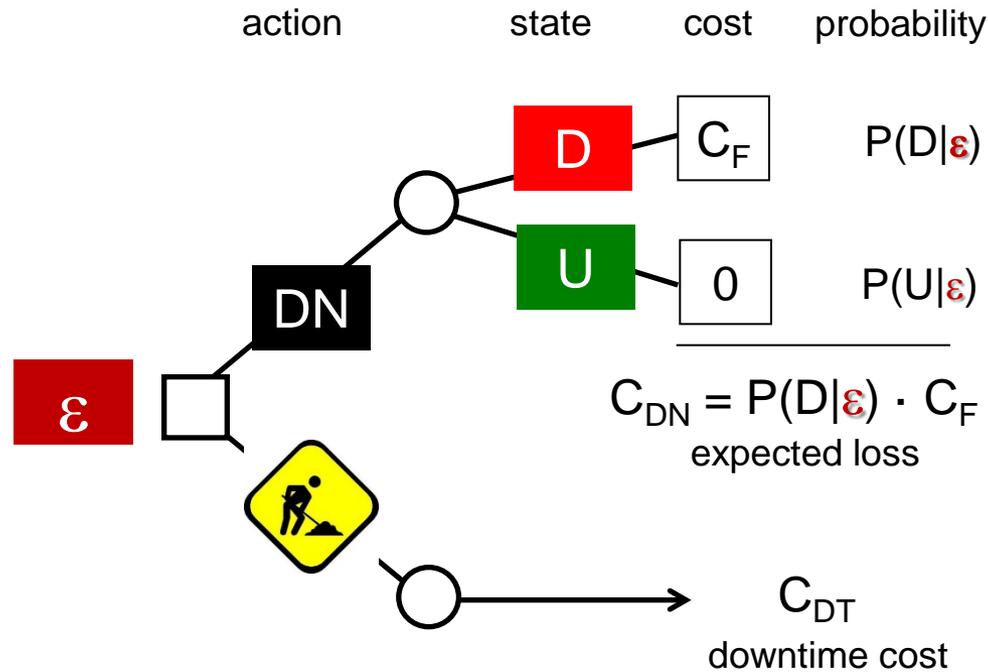
$$p(\epsilon|D)$$

posterior

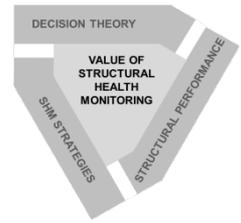
$$P(D|\epsilon) = \frac{p(\epsilon|D) P(D)}{p(\epsilon|U) P(U) + p(\epsilon|D) P(D)} = \frac{p(\epsilon|D) P(D)}{p(\epsilon)}$$



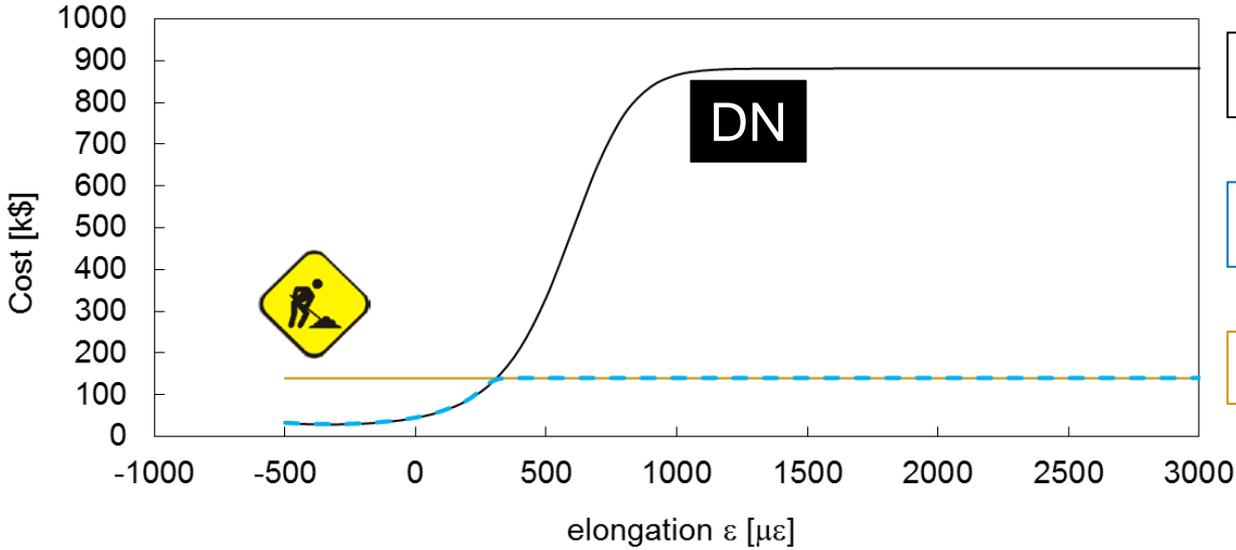
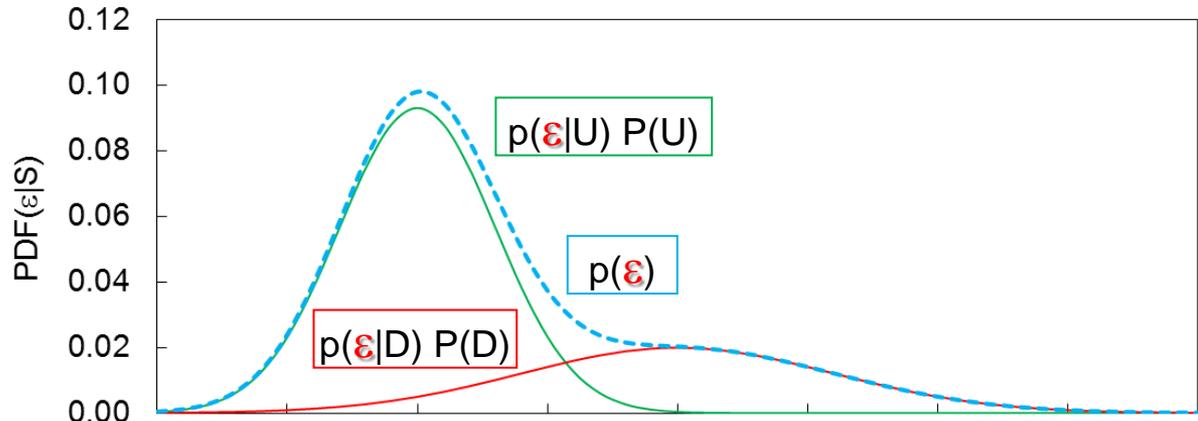
Decision tree w/o monitoring



action:		state:	
DN	Do Nothing	D	Damaged
	Close Bridge	U	Undamaged



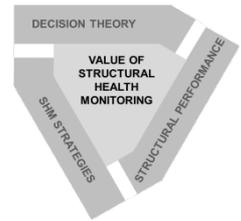
Likelihoods and evidence



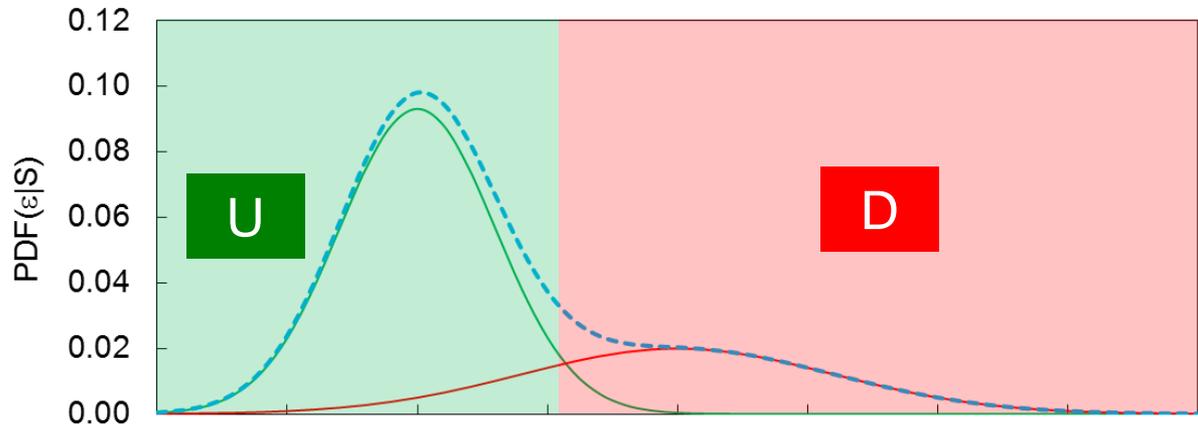
$$C_{DN} = P(D|\epsilon) \cdot C_F$$

$$c^*(\epsilon) = \min \{ P(D|\epsilon)C_F, C_{DT} \}$$

$$C_{DT} = k\$139.8$$

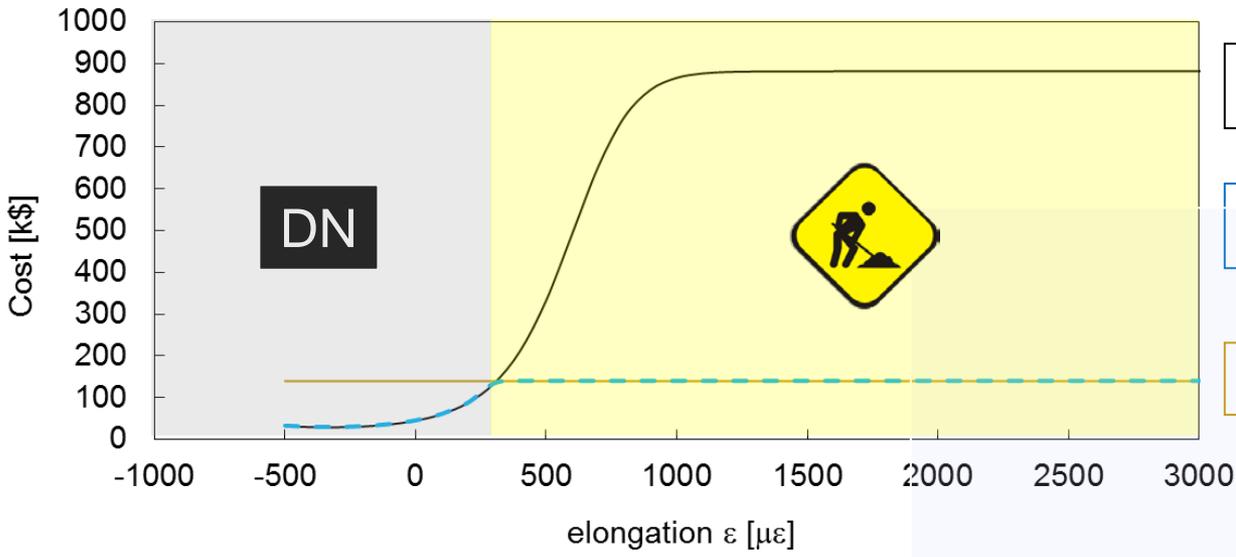


Likelihoods and evidence



$$p(\epsilon|U) P(U)$$

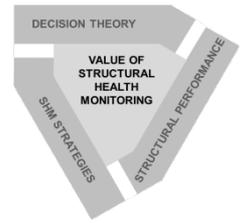
$$p(\epsilon|D) \cdot P(D)$$



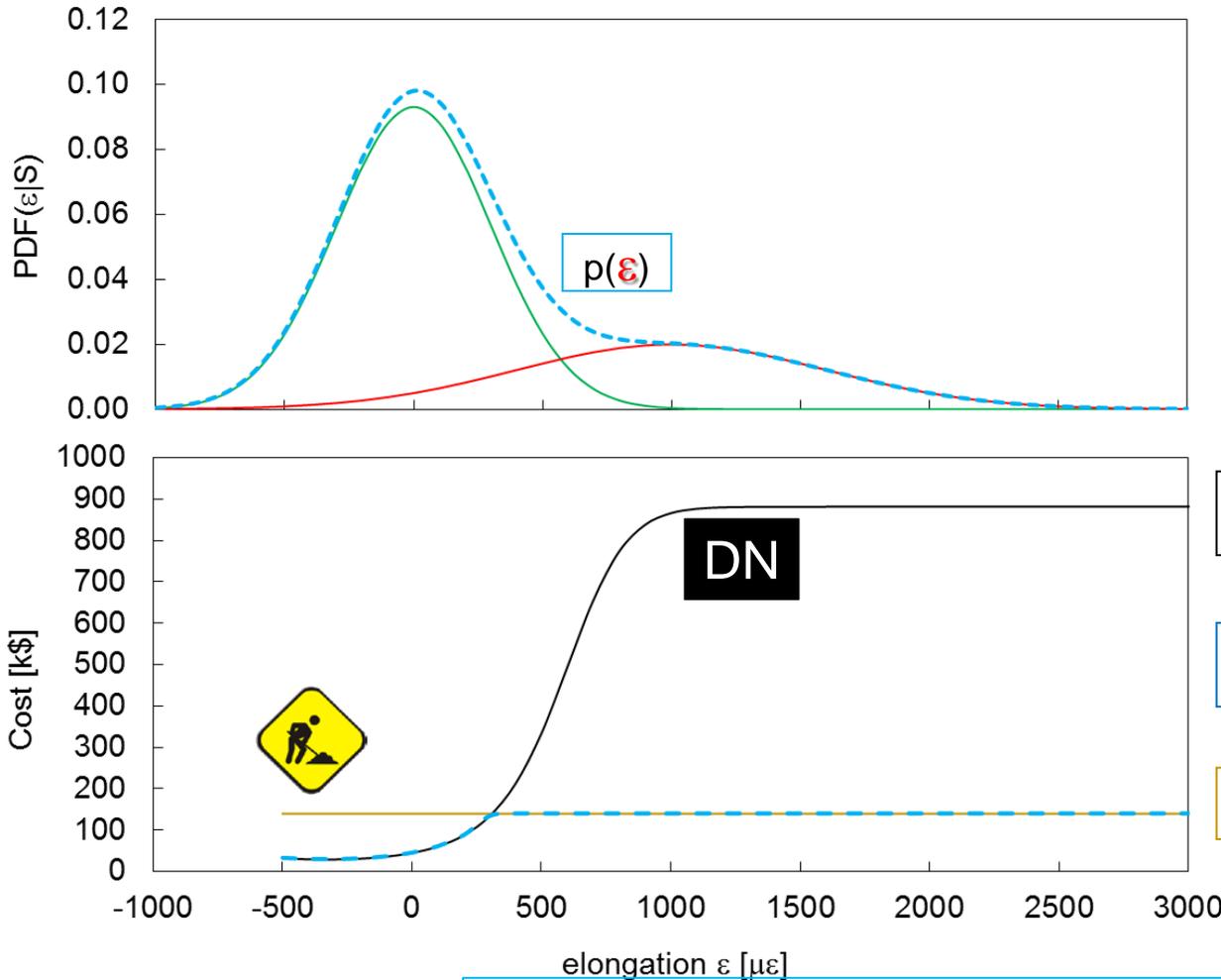
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Cost with monitoring



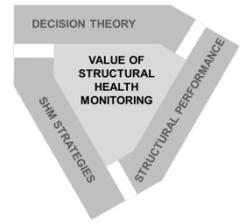
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cost with monitoring

$$C^* = \int_0^{\infty} c^*(\epsilon) p(\epsilon) d\epsilon = \int_0^{\infty} \min \{ C_F p(\epsilon|D) P(D), C_{DT} \} d\epsilon = k\$ 84.6$$



Summary

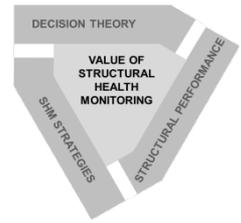
Vol: maximum **price Tom is willing to pay** for the information from the monitoring system

$$C = \min(C_F P(D), C_{DT}) \quad \text{k\$ } 139.8$$

$$C^* = \int_0^{\infty} \min(C_F p(\varepsilon|D)P(D), C_{DT}) d\varepsilon \quad \text{k\$ } 84.6$$

$$Vol = C - C^* \quad \text{k\$ } 55.2$$





Summary

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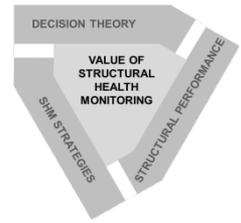
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Vol depends on:

(i) expected financial impact of actions C_F and C_{DT}





Summary

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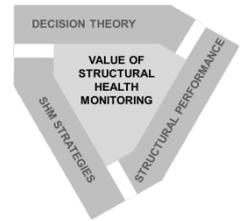
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Vol depends on:

- (i) expected financial impact of actions C_F and C_{DT}
- (ii) prior knowledge of structure state $P(D)$





Summary

Vol: maximum **price Tom is willing to pay** for the information from the monitoring system

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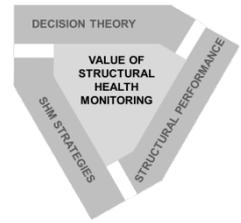
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Vol depends on:

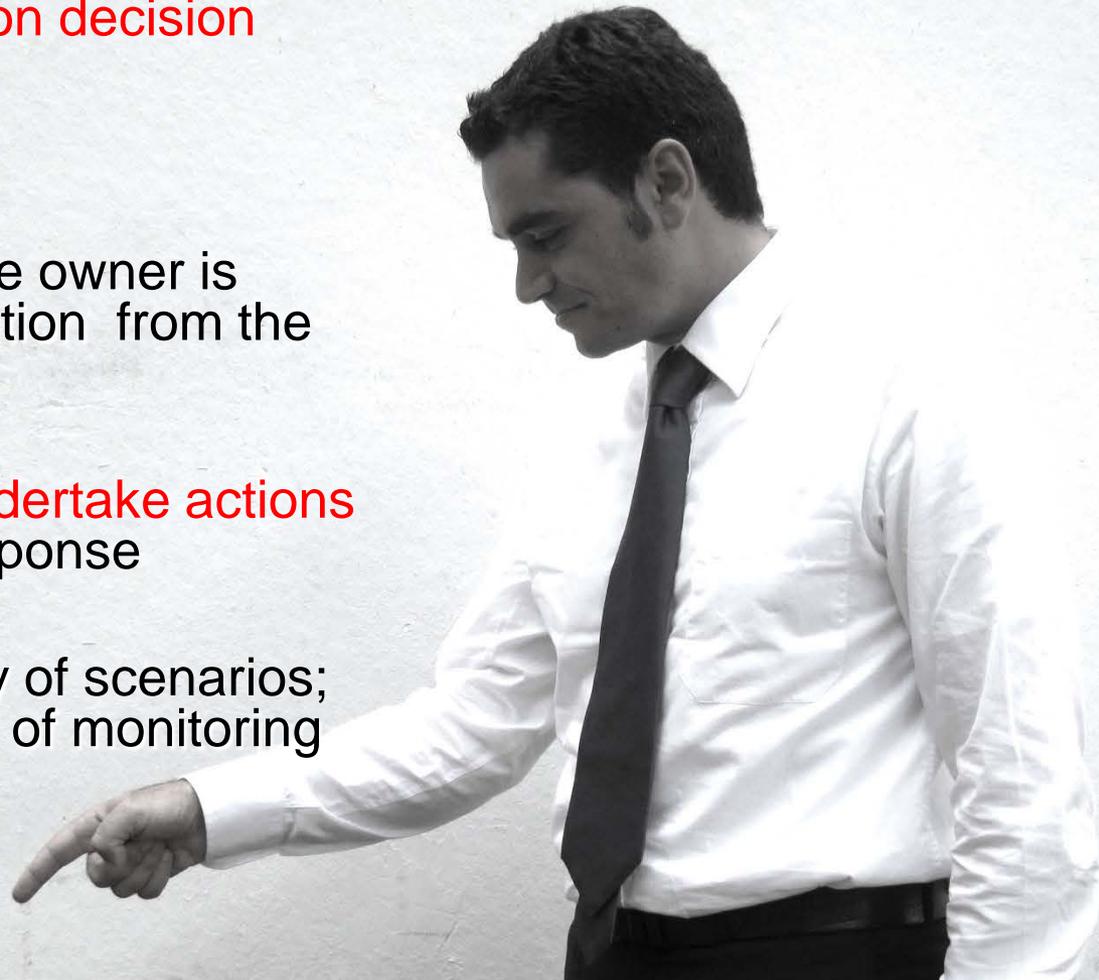
- (i) expected financial impact of actions C_F and C_{DT}
- (ii) prior knowledge of structure state $P(D)$
- (iii) sensor sensitivity to damage: $\text{pdf}(\varepsilon|D)$

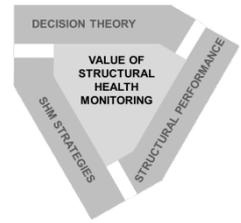




Conclusions

- to appreciate the **benefit monitoring**, we must account for its **impact on decision**
- quantified using Vol
- Vol is the **maximum price** the owner is willing to pay for the information from the monitoring system
- implies the manager **can undertake actions** in reaction to monitoring response
- depends on: prior probability of scenarios; impact of actions; sensitivity of monitoring system to damage
- **depends on the owner!**

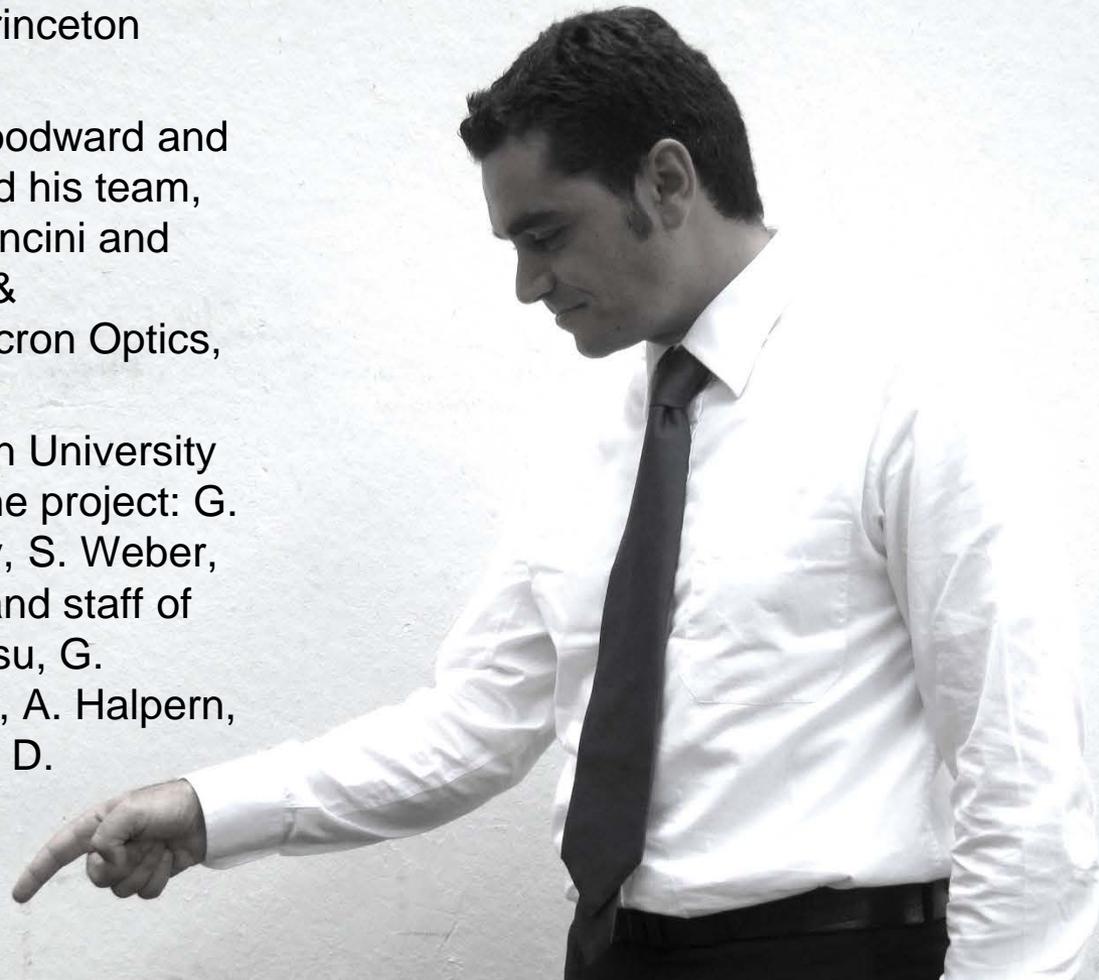


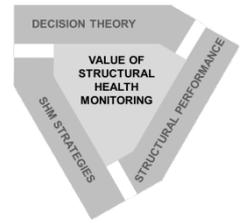


Thank you for your attention!

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- Matteo Pozzi, CMU
- Ivan Bartoli, 'Tom', Drexel University





Perfect information

- assume that the monitoring system provides **perfect information**
- means that Tom can always **determine univocally the state of the bridge** based on the sensor measurements
- this happens when the two likelihood distributions $\text{pdf}(\varepsilon | U)$ and $\text{pdf}(\varepsilon | D)$ do not overlap, thus only one possible state is associated to any one value of strain

$$C^* = C_{DT} P(D)$$

$$VoI = C - C^* = C_{DT} - C_{DT} P(D) = C_{DT} P(U)$$

- cost Tom will incur for taking the wrong decision due to his lack in knowledge
- represents the **upper bound value of VoI**



Strong prior: Cocky Tom

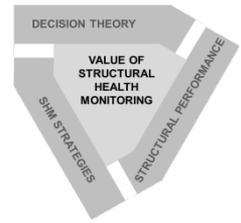
Trust me, no need to close the bridge, nothing will happen!!

- "projected **Superman syndrome**"
- Tom believe the bridge is invulnerable

$$P(D) = 0$$

$$VoI = 0$$





Strong prior 2: chicken-hearted Tom

Too dangerous, I'd better close the bridge anyway!!!

- over-concerned Tom
- believes that the bridge is highly vulnerable to truck collision

$$P(D) = 1 \quad C = C^* = C_{DT}$$

$$VoI = C - C^* = 0$$



No consequence to the manager

I'll close it – it costs me nothing!!

- an action has no direct consequence to the manager
- say, for example, that to Tom the indirect cost to users is irrelevant

$$C_{DT} = 0$$

- he will always close the bridge

$$C = C^* = 0$$

$$VoI = 0$$

