

# Event Masking Latent Model

Christian M. Adriano (Chris) christian.adriano@hpi.de

# Definitions for the DTMC project



#### Hidden elements

- □ Events: infection, failures, rumor spread, toxic contamination, traffic accident, etc.
- □ Entities: components, people, infrastructure, that have **states** and are affected by **events**

#### Observable elements

- □ State (*S*):
  - operational (no failure/not infected): So
  - degraded (performance): Sd
  - unresponsive (disabled): Su
- $\square$  Transition (T): change from one state to another state (self-loops included)

#### State Traces

- A sequence of states that happened within a given time horizon:
  - $-ST_1 = So_1; So_2; So_3; Sd_3; So_3; So_1; Sd_1; Sd_2; Su_3; So_1; So_2; So_3$
- □ Obtained from system logs, contact tracing (GPS), sensors (traffic, water pipes), etc.

## Assumptions



### 1. Markov property

$$\square$$
 ( $S_{t+1} \perp S_{t-1}$ )|  $S_t$  or

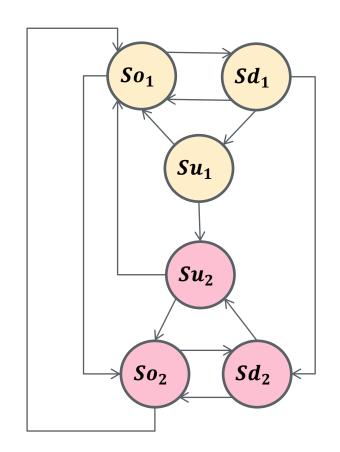
$$\square P(S_{t+1}, S_{t-1}) = P(S_{t+1}|S_t) P(S_{t-1})$$

- Memoryless, we do not keep the information from previous states, but the state is rich enough to estimate the transition probabilities.
- 2. Events might cause other events
- 3. Root-causes of events are unknown, but should be able to estimate
- 4. Transitions might have prior probabilities

## Example of Markov Chain



 $\overrightarrow{x_t}$ 



Intentionally not showing the self-loops

## **Markov matrix** *M*

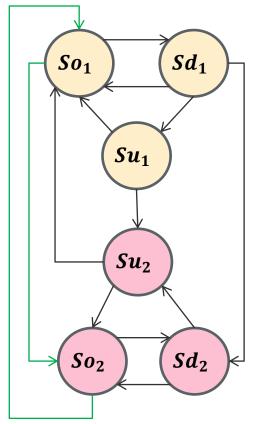
Also called stochastic matrix or transition matrix) M is a square matrix whose columns are probability vectors  $\overrightarrow{x_t}$ .

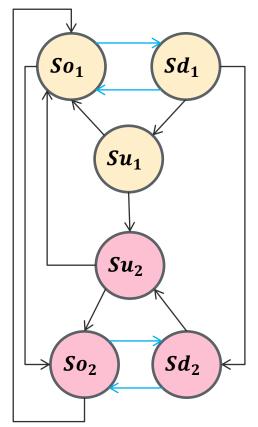
### **Source states**

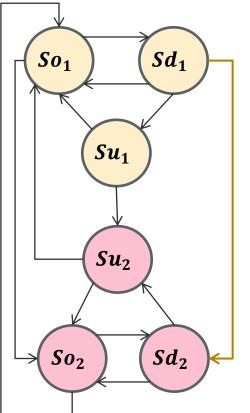
		$So_1$	$Sd_1$	$Su_1$	$So_2$	$Sd_2$	$Su_2$
•	$So_1$	0.15	0.50	0.25	0.80	0.0	0.25
	$Sd_1$	0.05	0.25	0.0	0.0	0.0	0.0
	$Su_1$	0.0	0.10	0.50	0.0	0.0	0.0
	$So_2$	0.80	0.0	0.0	0.15	0.50	0.25
	$Sd_2$	0.0	0.15	0.0	0.05	0.25	0.0
	$Su_2$	0.0	0.0	0.25	0.0	0.25	0.50
	Σ	1.0	1.0	1.0	1.0	1.0	1.0

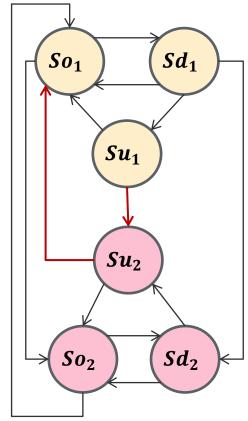
# Types of Traces

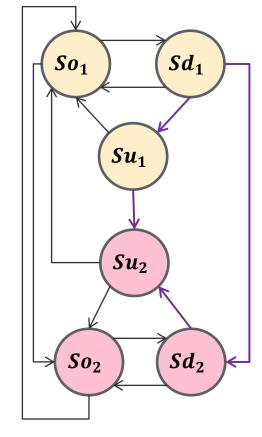












Normal operation  $(So_1; So_2; So_1)$ 



Intermittent failure

$$(So_2 \rightarrow Sd_2 \rightarrow So_2)$$

 $(So_1 \to Sd_1 \to So_1)$  $(So_2 \rightarrow Sd_2 \rightarrow So_2)$  Systemic degradation  $(Sd_1 \rightarrow Sd_2)$ 



Failure masking

$$(Su_1 \rightarrow Su_2 \rightarrow So_1)$$



Failure cascade

$$(Sd_1 \rightarrow Su_1 \rightarrow So_2)$$

$$(Sd_1 \rightarrow Sd_2 \rightarrow Su_2)$$





# End



