

---

# Stochastic models & analyses for embedded systems evaluation

Sören Kemmann

---

# Content

- Reliability Block diagrams (RBD)
- Fault Trees (FT)
  - Component Fault Trees (CFT)
  - Dynamic Fault Trees (DFT)
- Stochastic Petri nets (SPN)
  - GSPN, DSPN
  - PN analysis
- A comparison of the expressive power of model types

---

# RBD

---

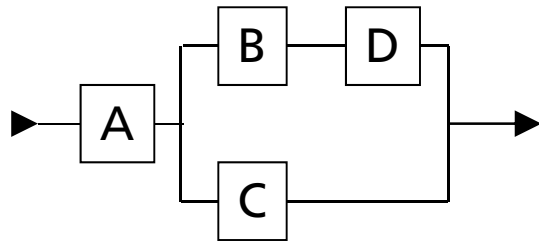
## ■ Reliability Block Diagrams

# Reliability Block Diagrams (RBD)

- “Which elements of the system may fail without causing system failure?”
- Models necessary components for system functions
- Compare Fault Trees:
  - Fault Tree: Which basic events are necessary for a given failure?
  - RBDs: Which components must be available for correct operation

# Reliability Block Diagrams (RBD)

- Example:



- Correct system operation is given when there is a path from one side to the other
- The system works if A, B and D are available or A and C are available.
- RBD allows easy identification of A as single point of failure.

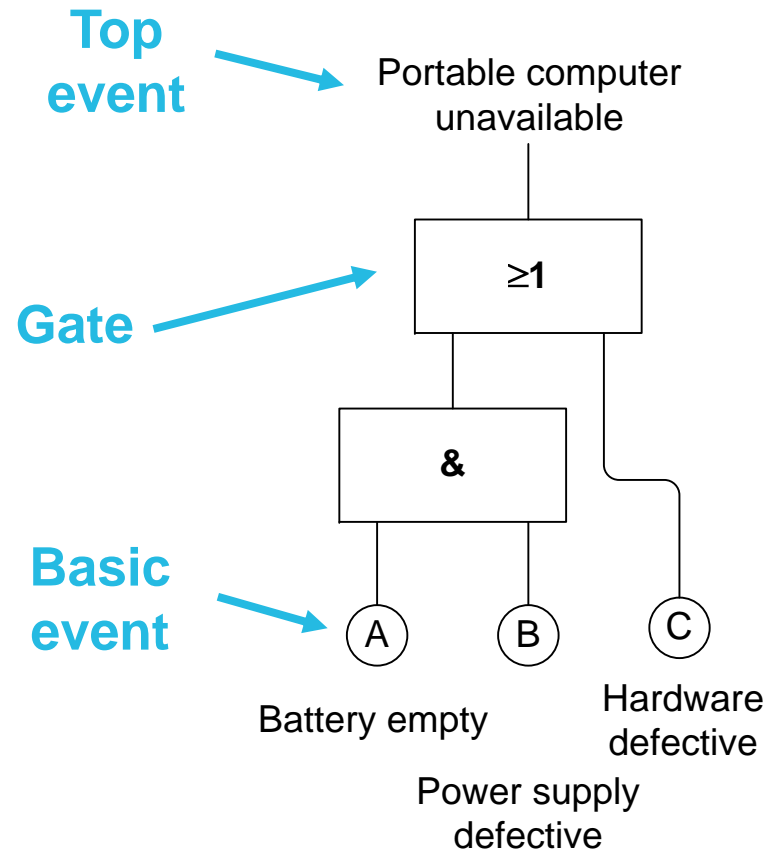
---

# FT

---

## ■ Fault Trees

# Fault trees



Analysis method for dependability properties

Recursive, deductive decomposition of causes for a given hazard or failure in the form of a DAG

- Root (top event) = hazard/failure
- Leaves (basic events) = elementary causes
- Logical gates (And, Or, ...) explain interaction of causes

# Fault tree analysis

## Use

- Search for all relevant causes for hazards and failures

## Qualitative analysis

- Listing all combinations of basic events that are necessary and sufficient to cause a top event
- Search for **single points of failure** (with minimal cut sets, MCS)

## Quantitative Analysis

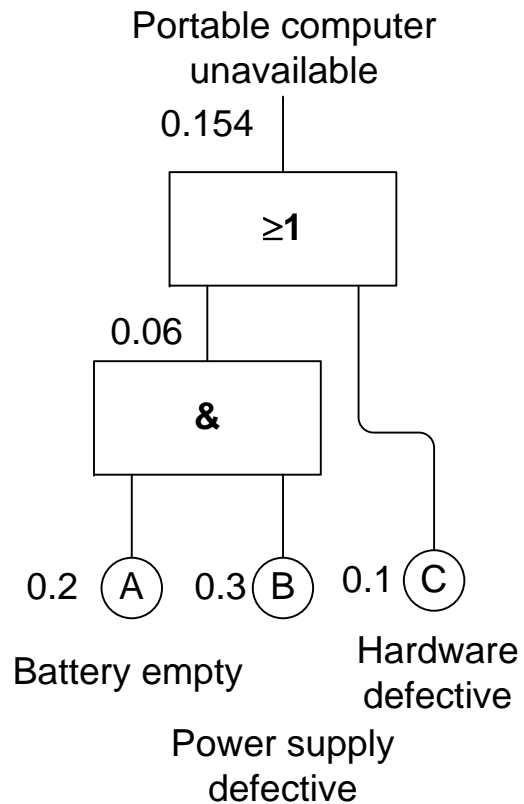
- Calculation of hazard or failure probabilities from given probabilities for elementary causes

## Other measures

- Mean time to failure (MTTF)
- Influence/importance measures

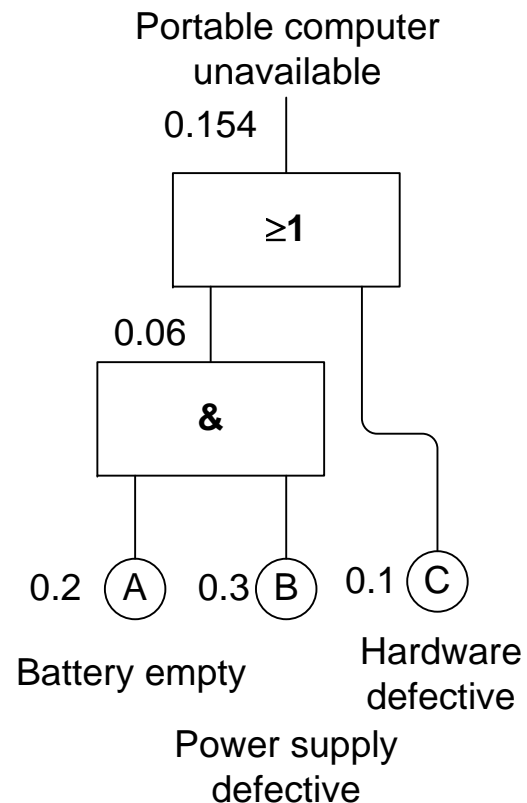


# Qualitative FTA



- Determine MCS
  - Find minterms/implicants
    - $ABC, AB\sim C, A\sim BC, \sim ABC, \sim A\sim BC$
  - Remove negated variables
    - $ABC, AB, AC, BC, C$
  - Minimise
    - **$\{A, B\}, \{C\}$**

# Quantitative FTA

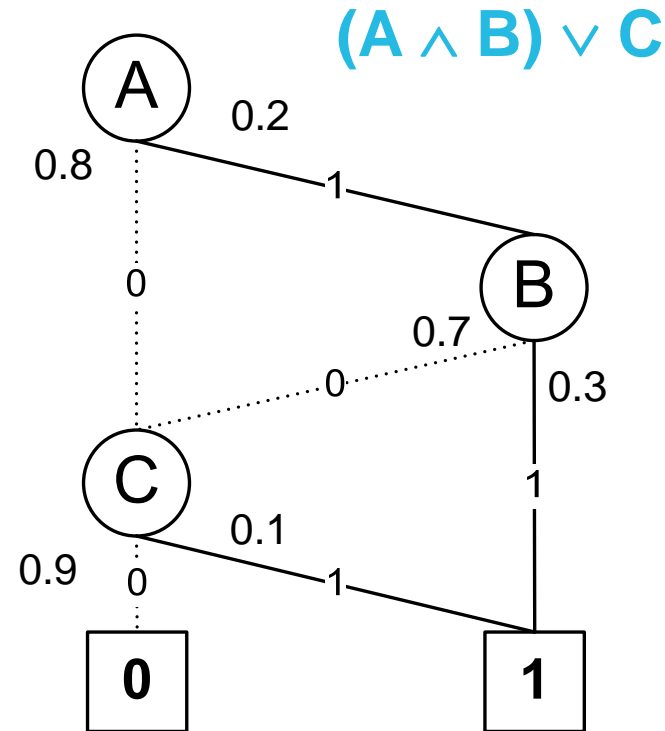
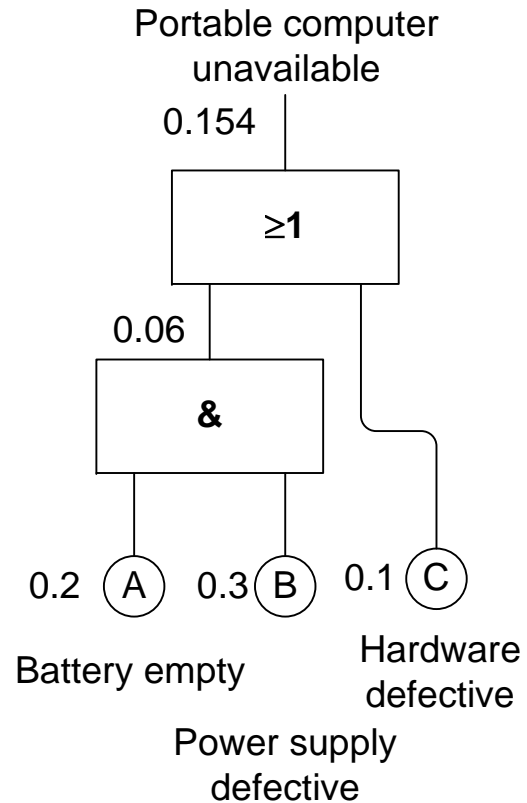


- Apply gate formulae bottom up
- Result when reaching the top event

Bottom-up calculation is inefficient for large FT.  
There are two main alternatives...

- Minimal cut set algorithm
- BDD-based algorithm  
(BDD = binary decision diagram)

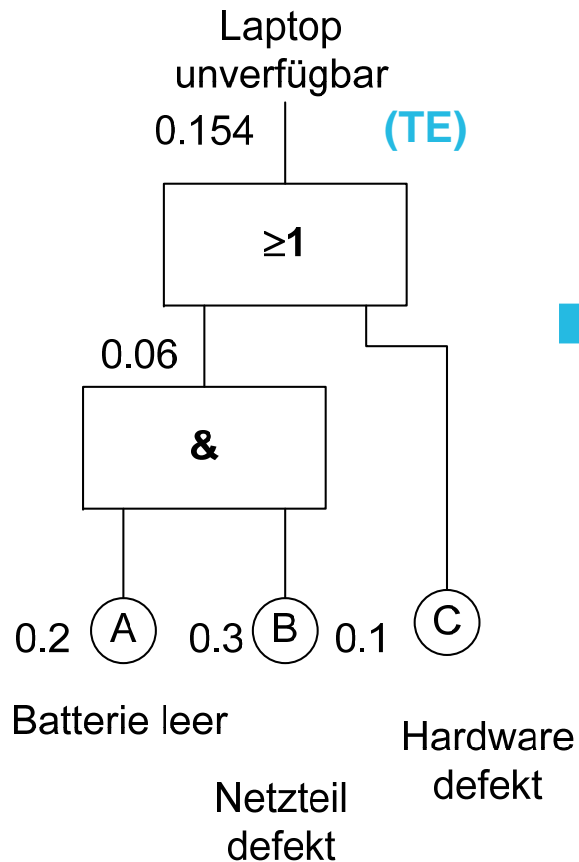
# Top event probability calculation – BDD method



$$P(TE) = AB + A\sim BC + \sim AC = 0.154$$

$$P(TE) = 0.06 + 0.014 + 0.08 = 0.154$$

# Top event probability calculation – MCS method



$$\text{MCS} = \{\{A, B\}, \{C\}\}$$

Calculation of top event probability as sum of MCS probabilities

$$P(A) \cdot P(B) = 0.06$$

$$P(C) = 0.1$$

$$\Sigma = 0.16 = P(\text{TE})$$

$$\text{BDD method: } P(\text{TE}) = 0.154$$

■ MCS method yields approximation

# Deficiencies of conventional fault trees

## No compositionality

- Technical and software(-controlled) systems are made of components.
- Software design models are often compositional → lack of integration.

No integration with other (aspects of) software/embedded systems (ES) design models, such as statecharts, Matlab/Simulink models etc.

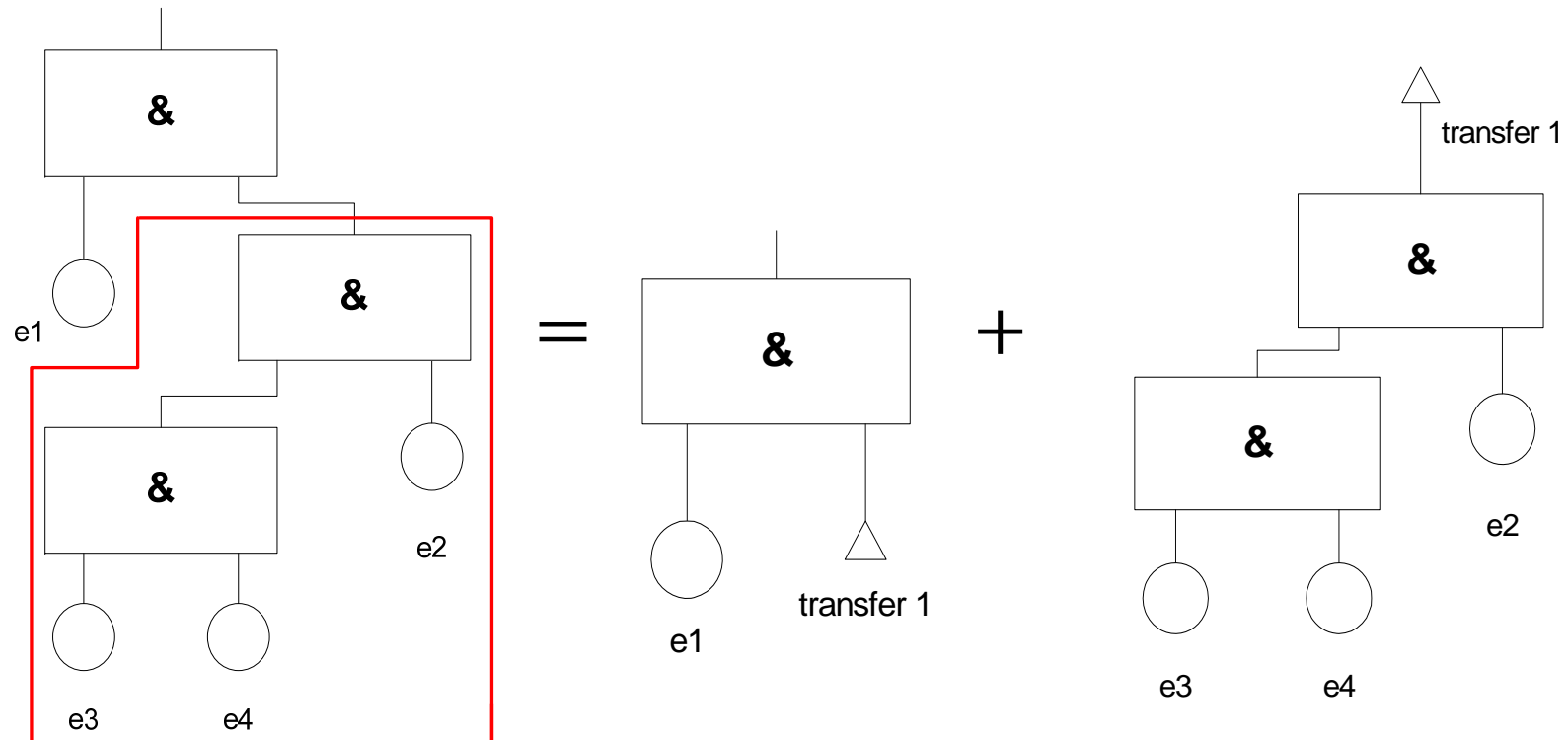
---

# CFT

---

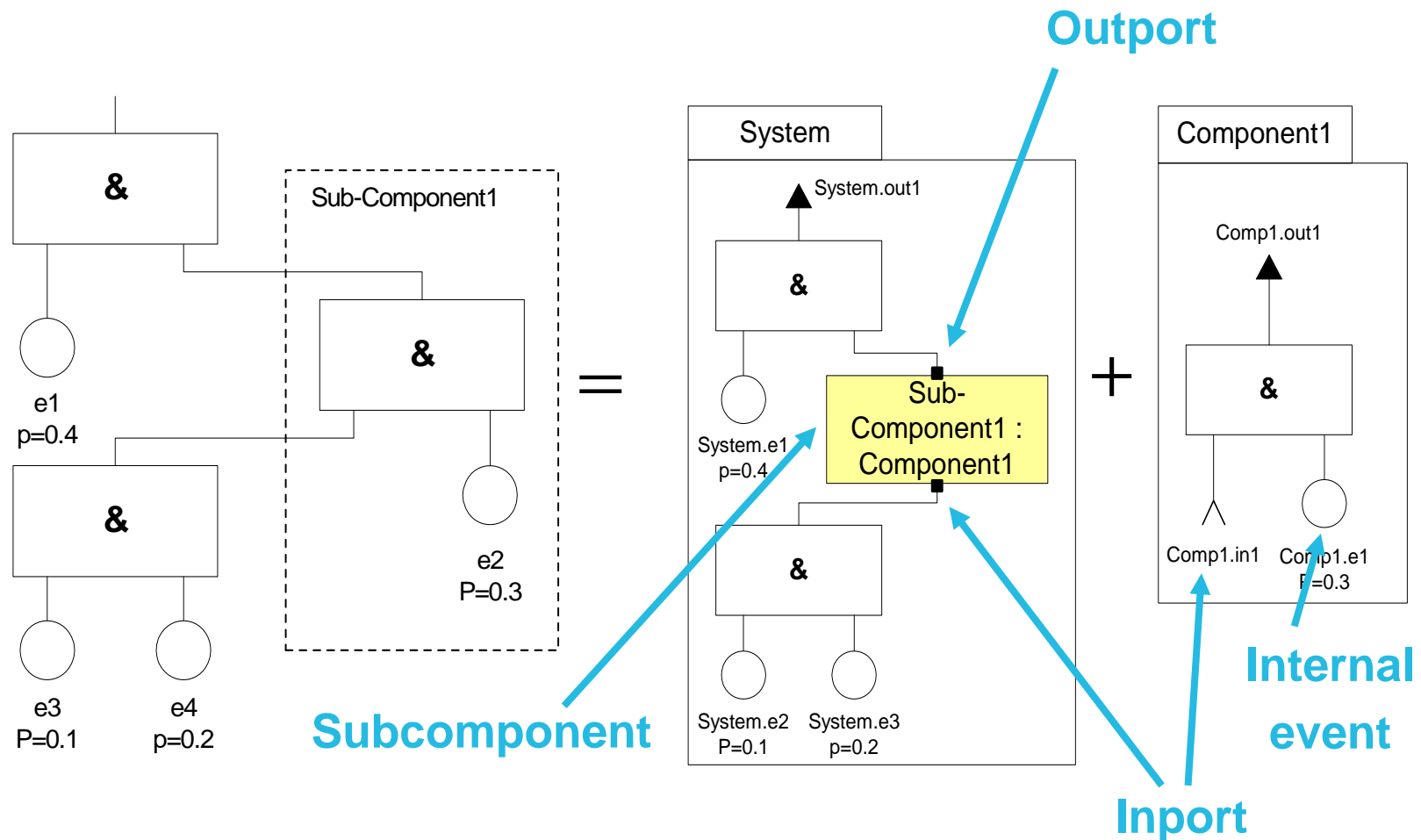
- Component fault trees

# Traditional FT decomposition by modules



Traditionally, “modules” are independent subtrees.

# Component fault trees



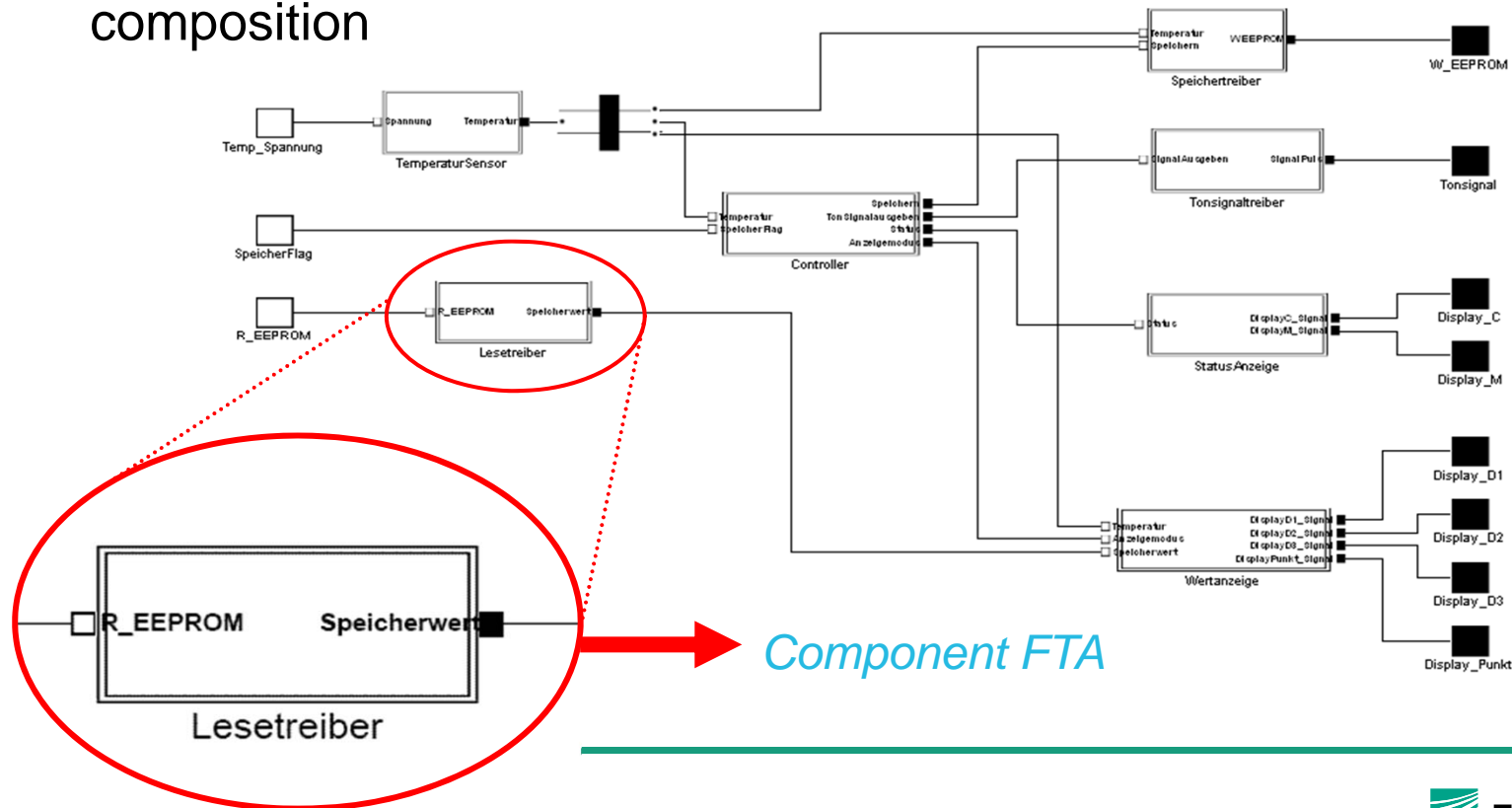
CFT component corresponds to technical component.  
Components have specification/realisation with in- and outports.



# Component fault trees

What is this good for?

- Composition enables integration of failure with design/architecture models.
- Example: signal flow graph can be used for automatic CFT composition



---

# DFT

---

- Dynamic fault trees

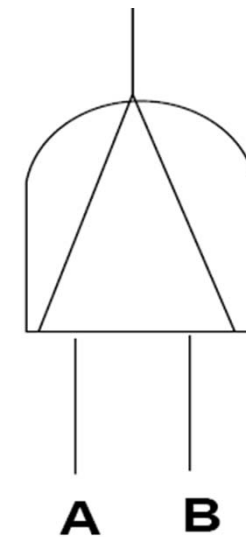
# Dynamic fault trees (DFT)

- Problem
  - FTA cannot model the order in which components fail
- Solution
  - Dynamic fault trees (DFT) extend FTA to allow analysis of computer-based systems characterised by
    - Spares (cold, warm, pooled)
    - Functional and sequence dependences
    - Imperfect coverage and other common-cause failures

# Dynamic fault trees (DFT)

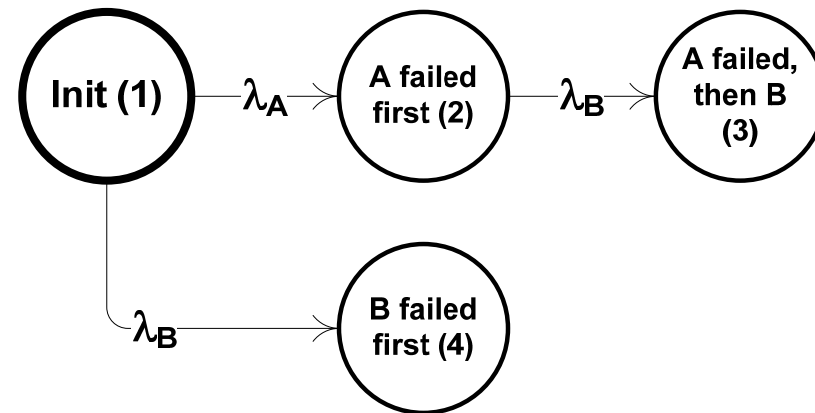
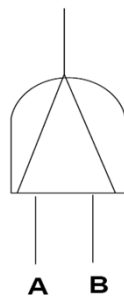
- DFT has constructs (gates) for modelling
  - Sequence dependences (priority-And)
  - Functional dependences
  - Spares (hot, warm, cold)
- DFT model is divided into independent modules that are solved separately
- Modules are classified as
  - static (containing only traditional gates) or
  - dynamic (containing at least one dynamic gate)

Priority-And  
(A before B)



# Dynamic fault trees (DFT)

- Separate modules are solved using most appropriate means
  - Markov chain for dynamic modules
  - BDD for static modules
  - Results are synthesised



- Pros and cons
  - + Easier to use than Markov model directly
  - - State space largeness (can be exponential in number of basic events)

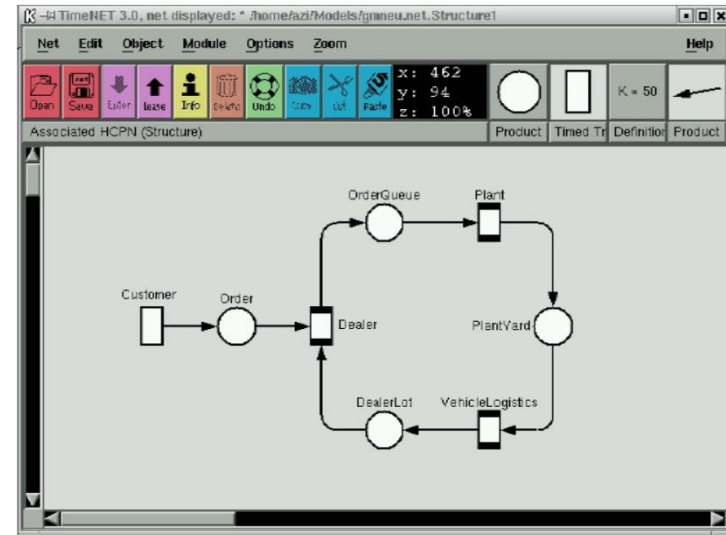
---

# Petri nets

---

# Petri nets

- Modelling of system behaviour
  - With focus on concurrency
- Large number of varieties
- Formal description and graphical representation
- Based on ideas of Carl Adam Petri (Dissertation 1962)



# Petri nets

- Tokens

  - Entities

- Places

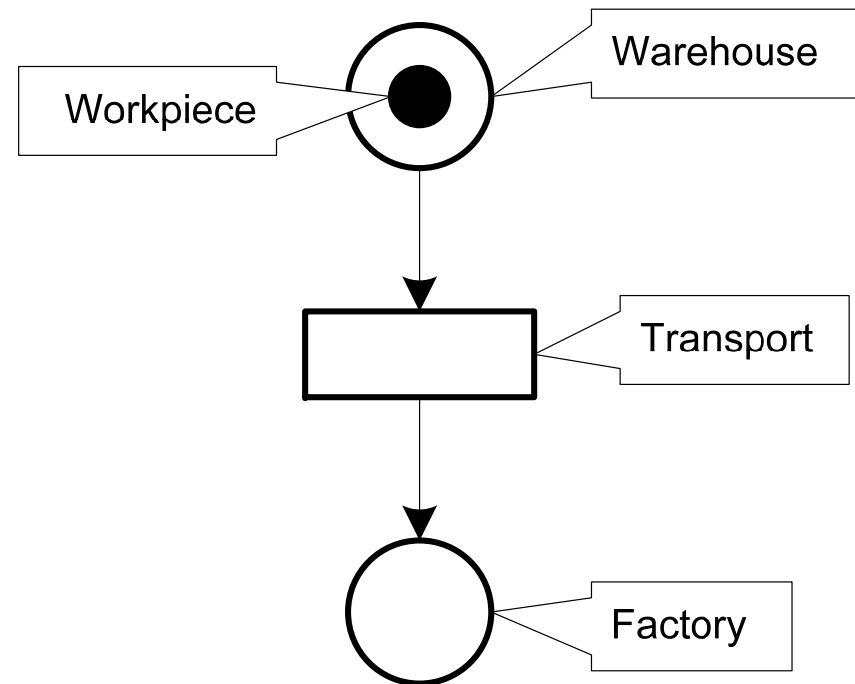
  - Location/state of entities

- Transitions

  - Activities

- Marking

  - System state





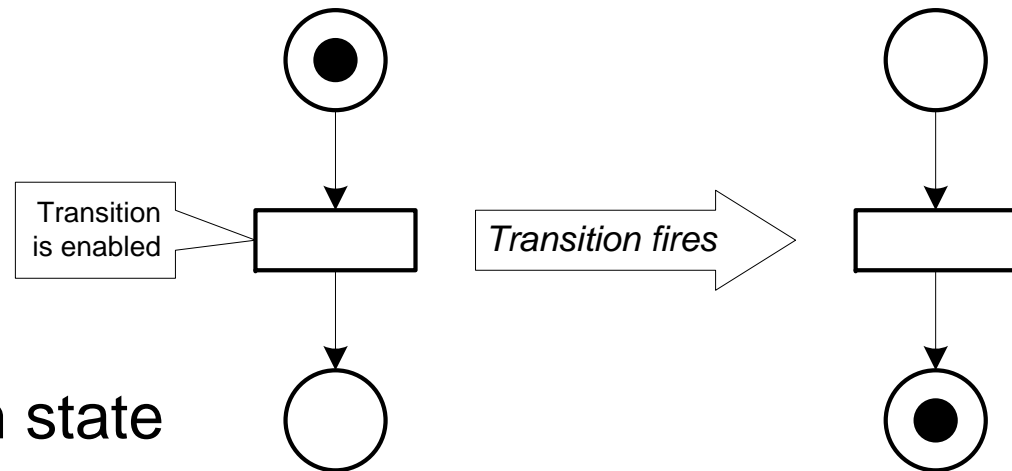
# Petri nets

## ■ Ongoing activity

- Transition is enabled
- All preconditions of transition have to be fulfilled

## ■ Activity is finished

- Transition fires
- Firing is atomic
- New marking/system state



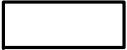

# Petri nets

## ■ Transition types

### ■ Immediate

- Takes no time between enabling and firing
- Can be prioritised for case of conflict

### ■ Timed

- Takes time between enabling and firing
  - Exponentially timed 
  - Deterministically timed 

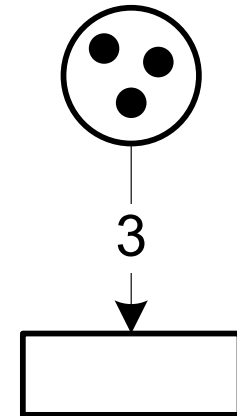
# Petri nets

## ■ Arc weights

### ■ For flow arcs

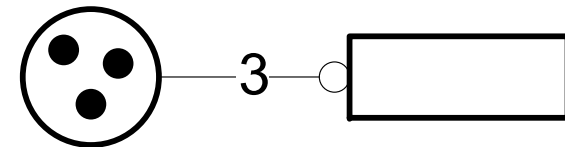
- Minimum number of tokens on place to enable transition

- Number of tokens consumed/produced



### ■ For inhibitor arcs

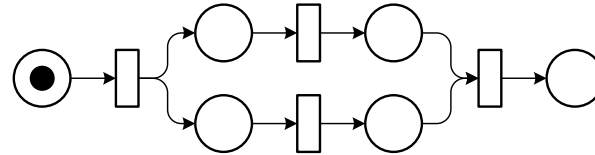
- Min. number of tokens needed on place to disable transition



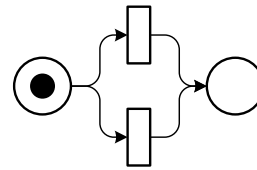
## ■ Arc weights or priorities make PN Turing complete!

# Petri nets – typical structures

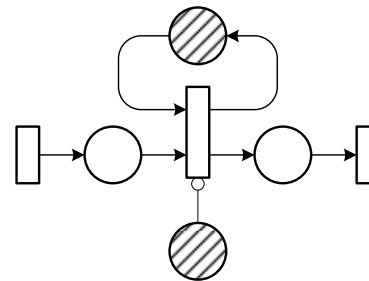
## ■ Concurrency



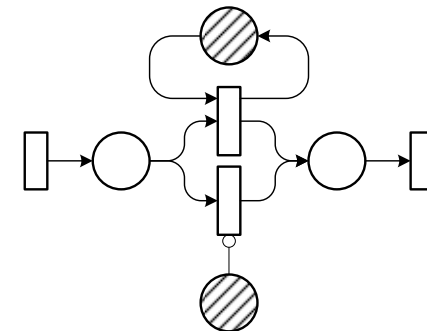
## ■ Conflict



## ■ Firing constraints



Conjunction



Disjunction

# Petri Nets: Formal Definition

A marked Petri net is formally defined by the following tuple

$$PN = (P, T, F, W, M_0)$$

where

$$P = (p_1, p_2, \dots, p_P)$$

is the set of places

$$T = (t_1, t_2, \dots, t_T)$$

is the set of transitions

$$F \subseteq (P \times T) \cup (T \times P)$$

is the set of arcs

$$W: F \rightarrow (1, 2, \dots)$$

is a weight function

$$M_0 = (m_{01}, m_{02}, \dots, m_{0P})$$

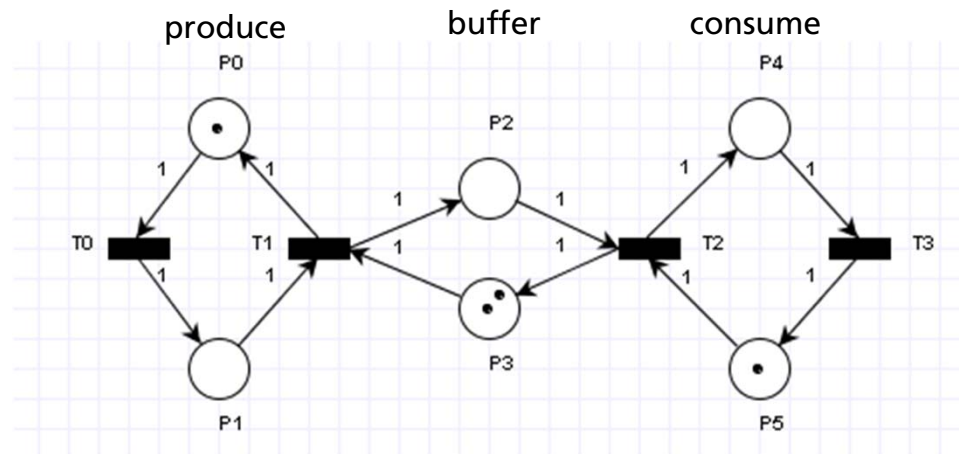
is the initial marking

Combining the information provided by the flow relations and by the weight function, we obtain the *Incidence Matrix*

$$C = \begin{pmatrix} C_{11} & \cdots & C_{1T} \\ \vdots & \ddots & \vdots \\ C_{P1} & \cdots & C_{PT} \end{pmatrix}$$

# Petri Nets: Simple example – Producer/Consumer

Petri net model:



Set of places:

Set of transitions:

( )

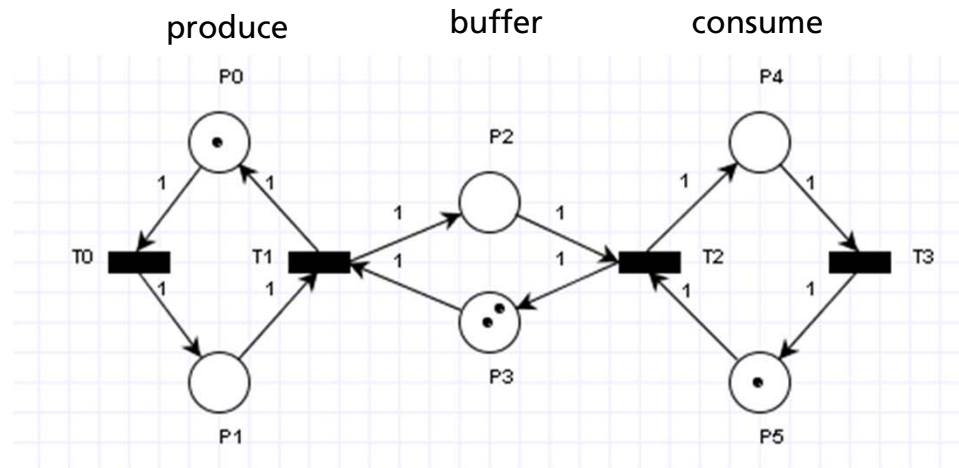
Initial marking:

Incidence matrix:

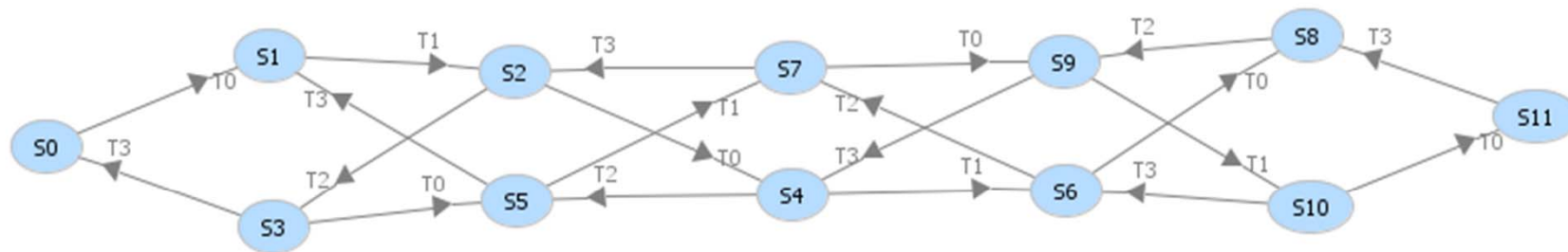
$$\begin{pmatrix} & T0 & T1 & T2 & T3 \\ P0 & & & & \\ P1 & & & & \\ P2 & & & & \\ P3 & & & & \\ P4 & & & & \\ P5 & & & & \end{pmatrix}$$

# Petri Nets: Simple example – Producer/Consumer

Petri net model:



Reachability Graph:



<b>S4 [Vanishing State]</b>
<b>Marking:</b> {0, 1, 1, 1, 0, 1}
<b>Edges From:</b> S2 (T0); S9 (T3)
<b>Edges To:</b> S5 (T2); S6 (T1)

# Petri net types (untimed)

- Condition-event nets
  - At most one token per place
- Place-transition nets
  - Arbitrary number of tokens on places
- State machines
  - Transitions have exactly one input and output place
  - Can model finite state automata
- Marked graphs
  - Places have exactly one input and output transition
  - No conflicts possible
- Stochastic PN
- High-level PN
  - For example, coloured PN



# Petri net analysis (untimed)

## ■ PN properties

- Behavioural properties (marking dependent)
  - Reachability → reachability graph (one node for every PN marking)
  - Liveness (deadlock free)
- Structural properties (marking independent)
  - Concurrency
  - Synchronisation points

## ■ Analysis

- Incidence matrix
- Graph-based methods → reachability graph

# Time and Petri Nets

# Petri net types (timed)

- Stochastic Petri nets (SPN)

- All transition firing times are exponentially distributed

- Generalised stochastic Petri nets (GSPN)

- Firing times are immediate or exponentially distributed

- Deterministic stochastic Petri nets (DSPN)

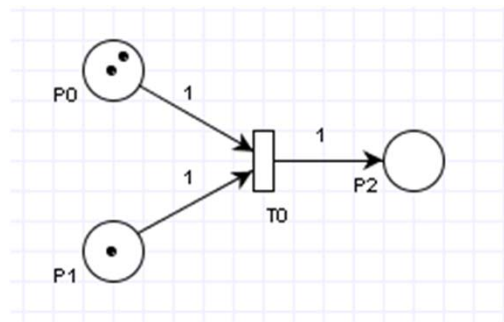
- Immediate, exponentially distributed or deterministic

# Timing Specifications

- Time is associated to places
- Time is associated to tokens
- Time is associated to arcs
- **Time is associated to transitions**

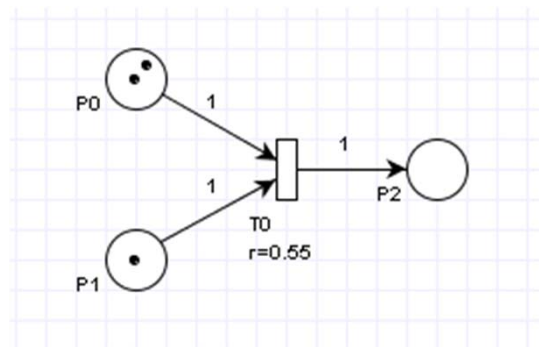
# Timed transitions

- Time is associated to transitions, that represent „activities“
  - Activity start corresponds to enabling
  - Activity end corresponds to firing
- Delay is associated with transitions



# Stochastic (Exponential) Petri Nets

- The delay of a transition is a random variable
- Timed Transition PN with atomic firing and race policy in which transition delays are random variables *exponentially* distributed are called Stochastic Petri Nets (SPN)
- SPN is the name chosen by Molloy in 1982, but more adequate one could be Exponential Petri Nets

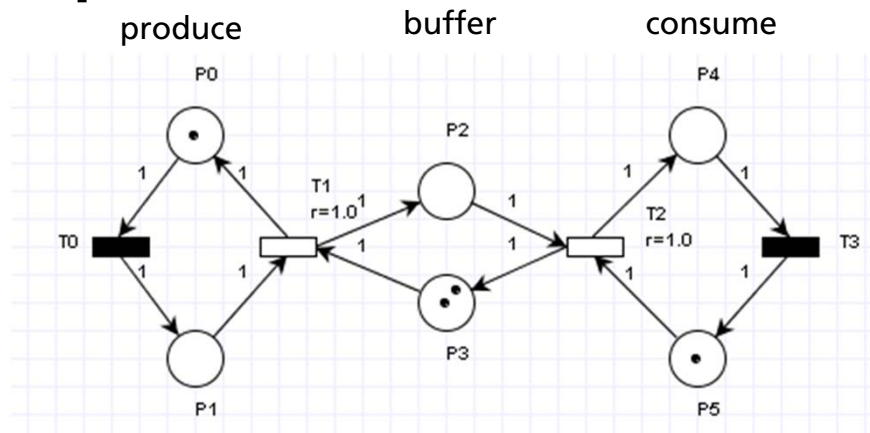


# Generalized Stochastic Petri Nets

- Two types of transitions
  - Timed with an exponentially distributed delay
  - Immediate, with constant zero delay
  
- Why immediate transitions:
  - To account for instantaneous actions (typically choices)
  - To implement logical actions (e.g. emptying a place)

# GSPN: Simple example – Producer/Consumer

GSPN model:



Set of places:

Set of transitions:

( )

Initial marking:

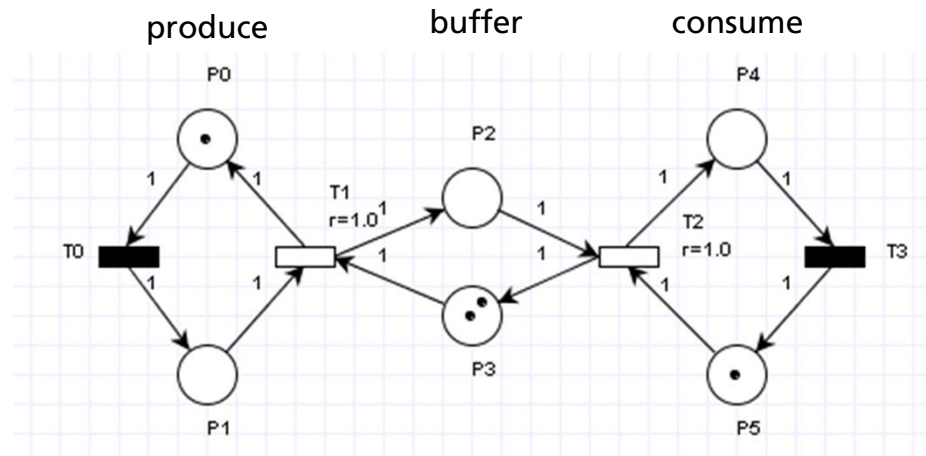
Incidence matrix:

$$\begin{pmatrix} & T0 & T1 & T2 & T3 \\ P0 & & & & \\ P1 & & & & \\ P2 & & & & \\ P3 & & & & \\ P4 & & & & \\ P5 & & & & \end{pmatrix}$$

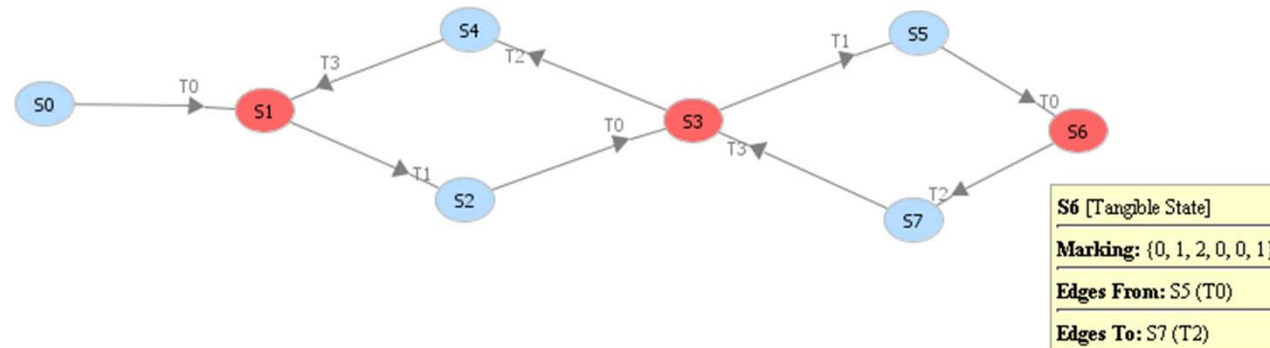


# GSPN: Simple example – Producer/Consumer

Petri net model:

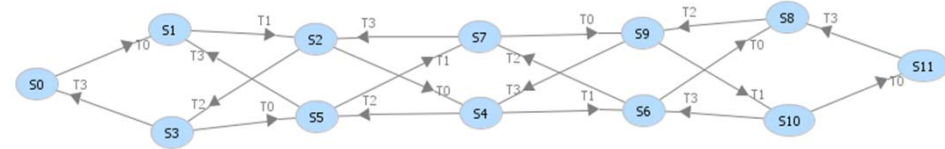
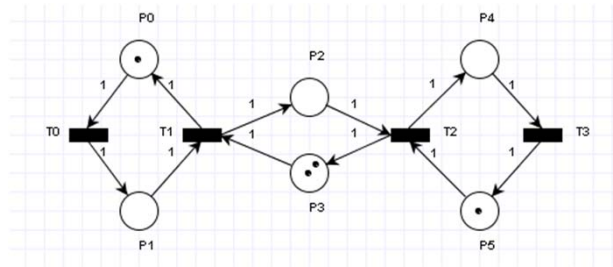


Reachability Graph:

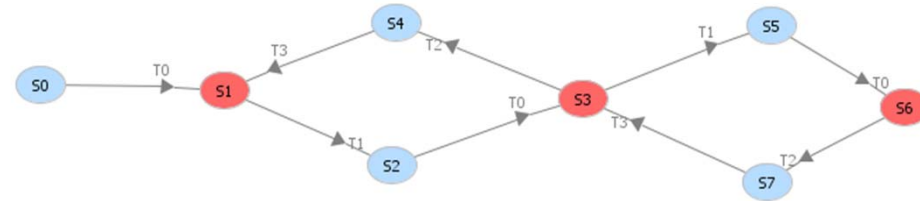
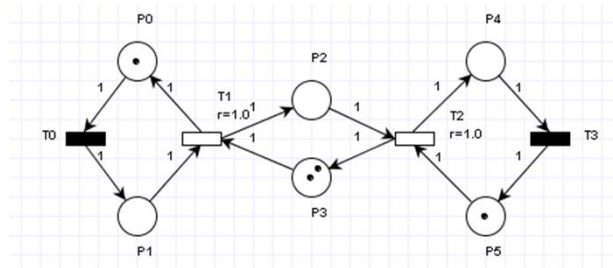


# PN vs. GSPN

## PN



## GSPN

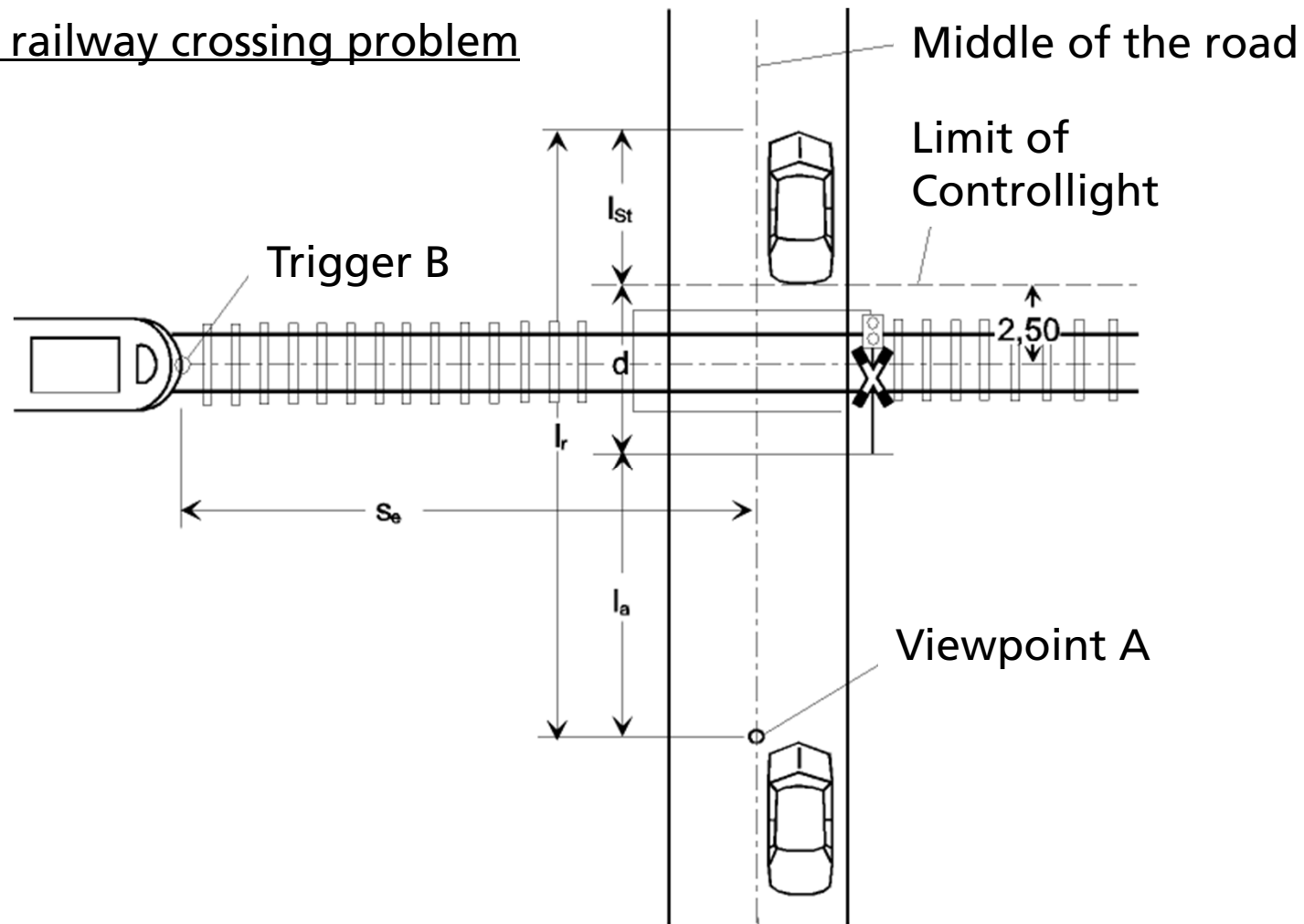


# Petri net analysis (timed)

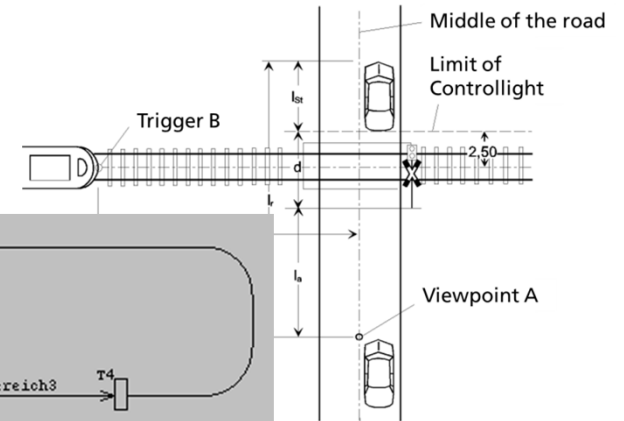
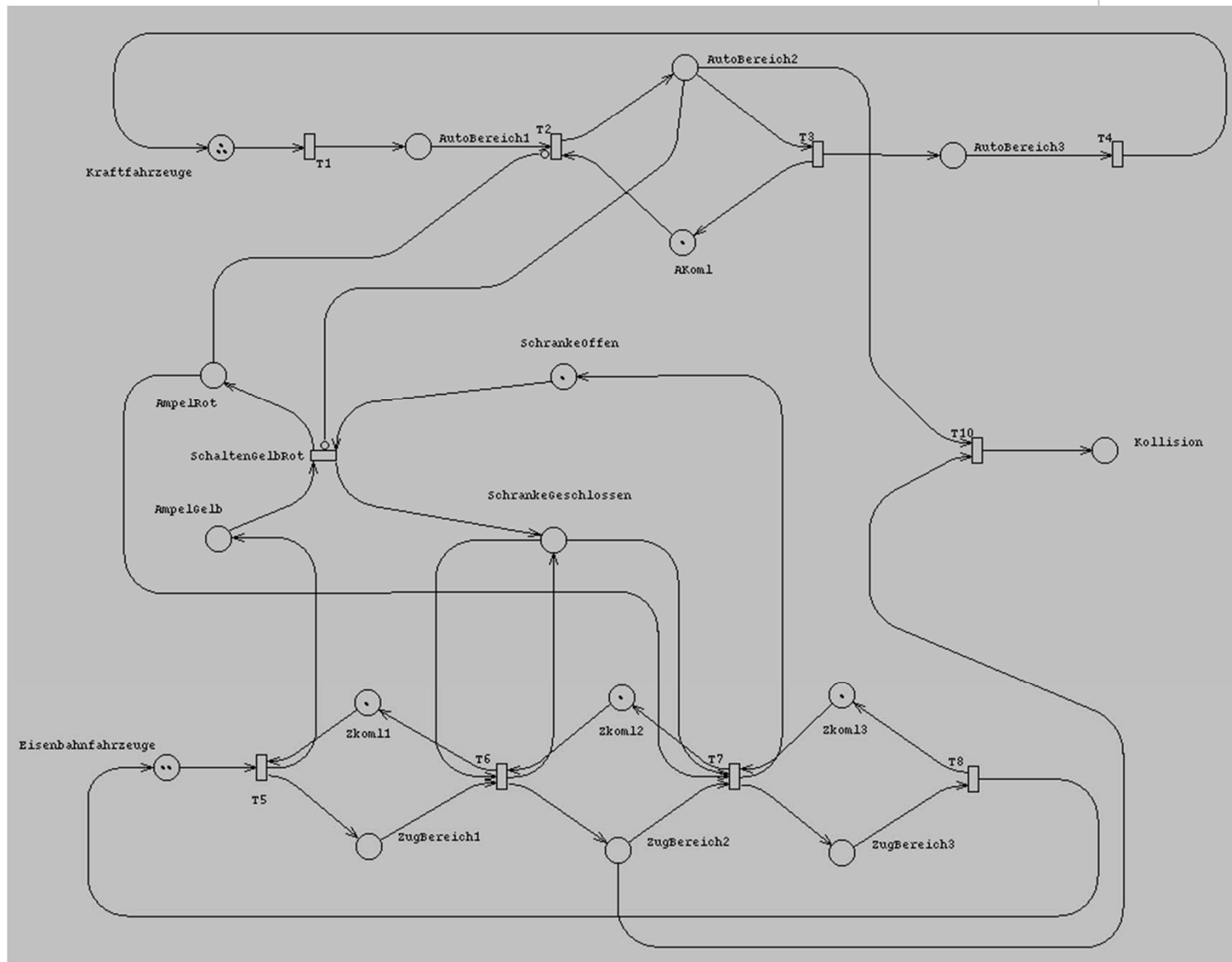
- Mapping to underlying stochastic process
- Reward measures derived from state probabilities of stochastic process
  - Determine reachability graph of SPN and GSPN
  - Convert reachability graph to Markov chain
  - May experience state space largeness problems
  - DSPN are mapped to *embedded* Markov chain
- Simulation
  - Statistical measures
  - No problems with state space size (except precision)

# Petri nets – a practical view

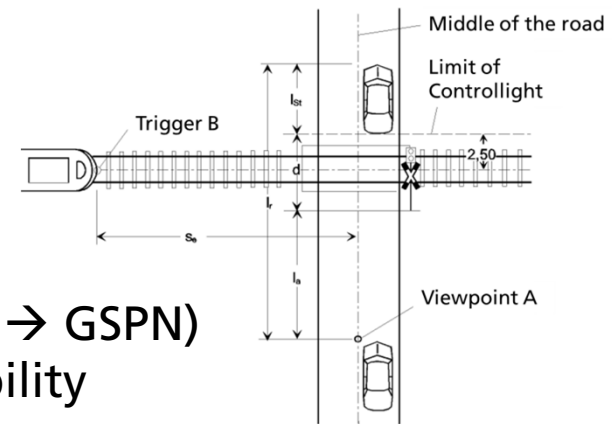
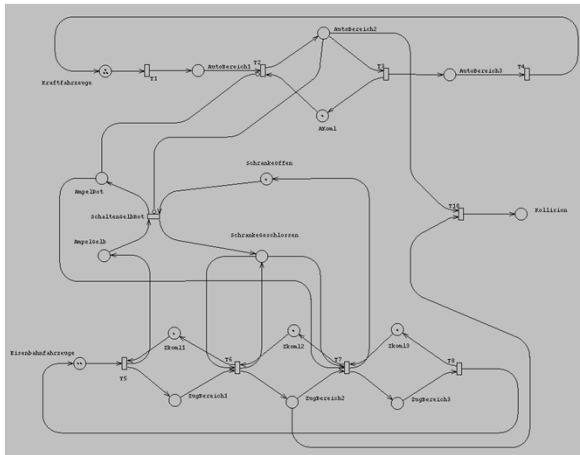
## General railway crossing problem



# Petri nets – a practical view



# Petri nets – a practical view



- Mapping ( $F \leftrightarrow \text{GSPN}$ )
- Understandability
- Scalability
- \*ilities

# Expressive power of model types

	FME(C/A)	FTA	ETA	RBD	Markov chain	Petri net
<b>Property</b>						
Direction of search	Inductive	Deductive	Inductive	Deductive	Inductive	Inductive/deductive
Sequence-dependent behaviour	No	FT extensions (DFT, SEFT)	No*	No	Yes	Yes
Deterministic dependences	No	FT extensions (SEFT)	No	No	No	Yes
Components	Yes	FT extensions (CFT, SEFT)	No	Yes	No**	No**
Semi-quantitative analysis (ordinal scale)	Yes	No***	No	No	No	No
Quantitative analysis	No	Yes	Yes	Yes	Yes	Yes

\*\* → There are approaches to tackle components

\*\*\* → There are approaches for semi-quantitative Analysis