

# ***Applications of Artificial Intelligence***

Sebastian Iwanowski  
FH Wedel

**Chapter 4:**  
Knowledge-Based Systems

4.4: Model-Based Reasoning

# Application from practice: Technical diagnosis

## Run time system:

(knowledge-based systems call this **problem solver / inference engine**)

### Input:

- Setting certain control inputs
- Observing values depending on this setting

### Output:

- A unique instruction how to repair which component

***This is where diagnostic systems do **not** differ !***

# Application from practice: Technical diagnosis

## Knowledge-based diagnosis:

### 1) Knowledge acquisition: Input into knowledge base

- rule-based (symptom-based)
  - case-based
  - model-based
- } as alternatives

### 2) Knowledge structure

- depends on knowledge acquisition

### 3) Knowledge processing by the problem solver

- depends on knowledge structure

***This is where diagnostic systems may differ !***

# 3. Model-Based Diagnosis

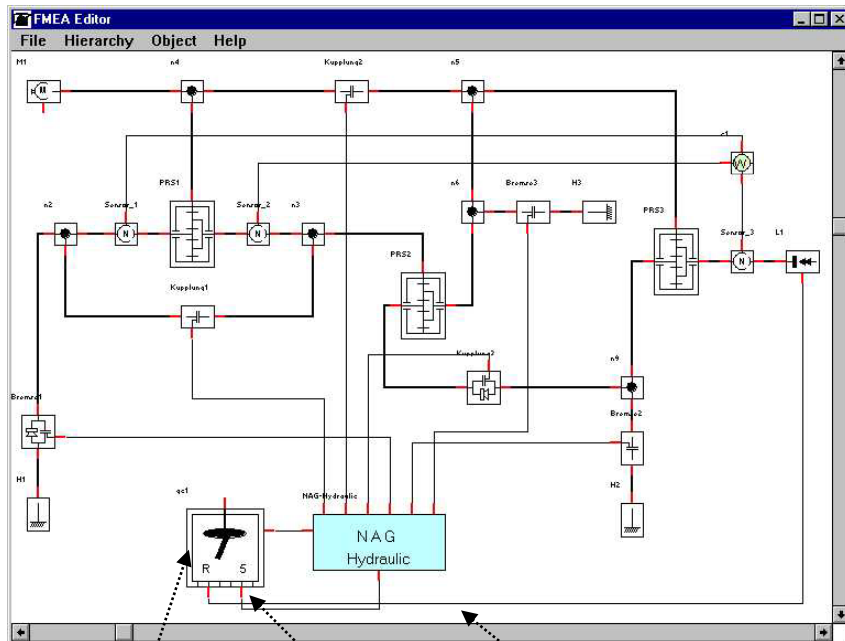
## Goal:

- fast knowledge acquisition
- exact and provable solution of problem solver

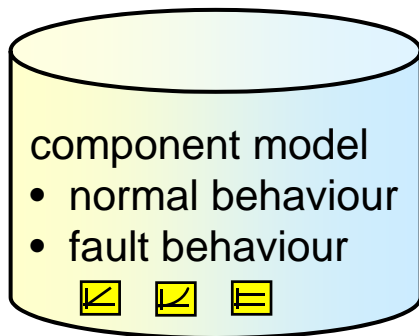
## Challenge:

- reasonable response time of problem solver at run time

# 3. Model-Based Diagnosis



component      port      link



## System model:

Which components of which type are connected in which way?

➔ *available from CAD data*

## Component models:

How do values depend on each other lying at ports of the component?

➔ *to be modeled once per component type*

➔ *Model is reusable for all systems containing components of this type.*

# 3. Model-Based Diagnosis

## Input to knowledge base:

- system model: hierarchical structure of the system (+ how the components are connected)
- component models

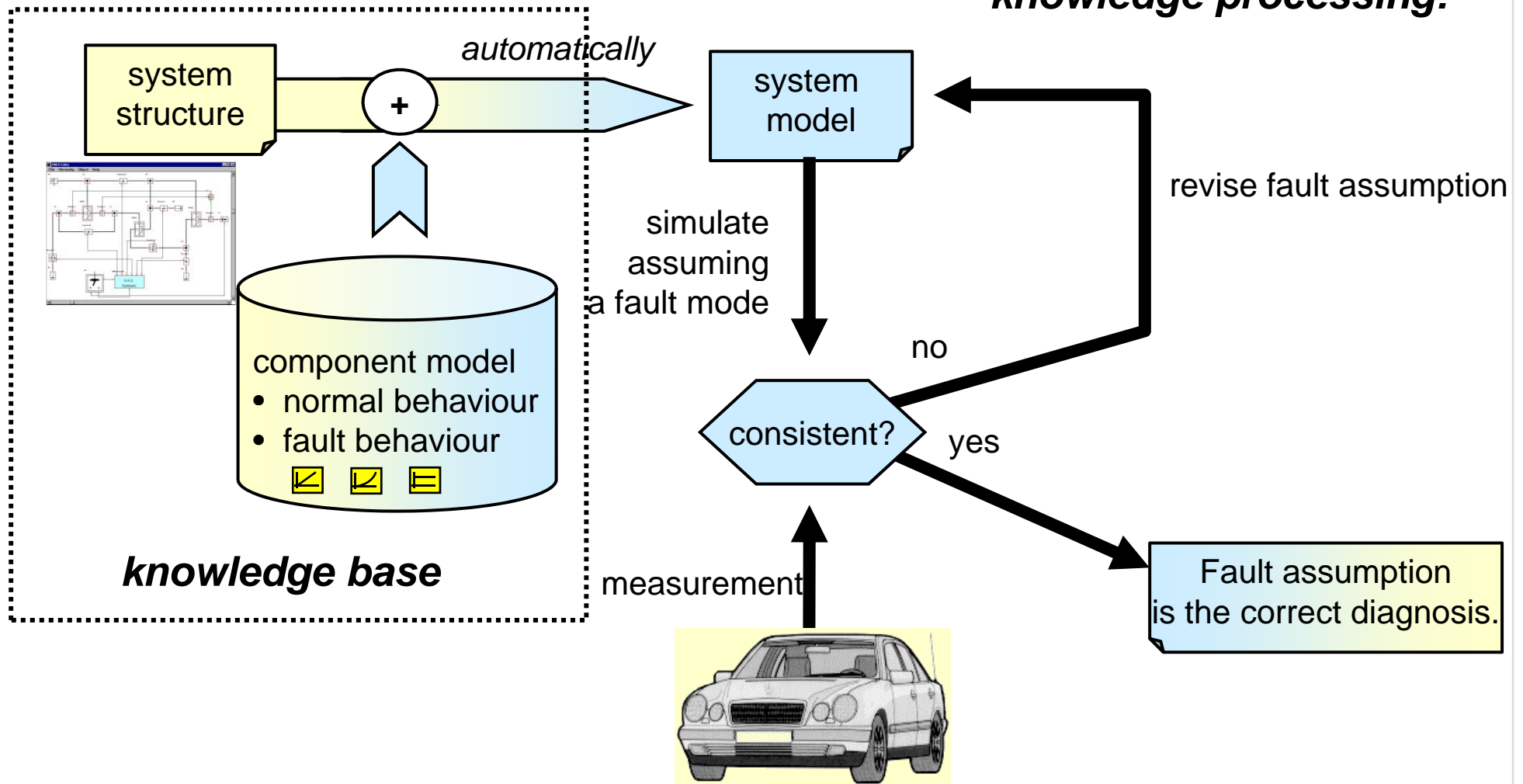
## Structure of knowledge base:

- constraint network (assembled automatically)
- structured by:
  - assigning constraints to components and ports
  - assigning variables to components and ports

# 3. Model-Based Diagnosis

## Base functionality: Conflict driven search

*knowledge processing:*



## 3. Model-Based Diagnosis

**Base functionality: Conflict driven search**

**GDE 1987: *The prototype for model-based diagnosis***

**Problem:**

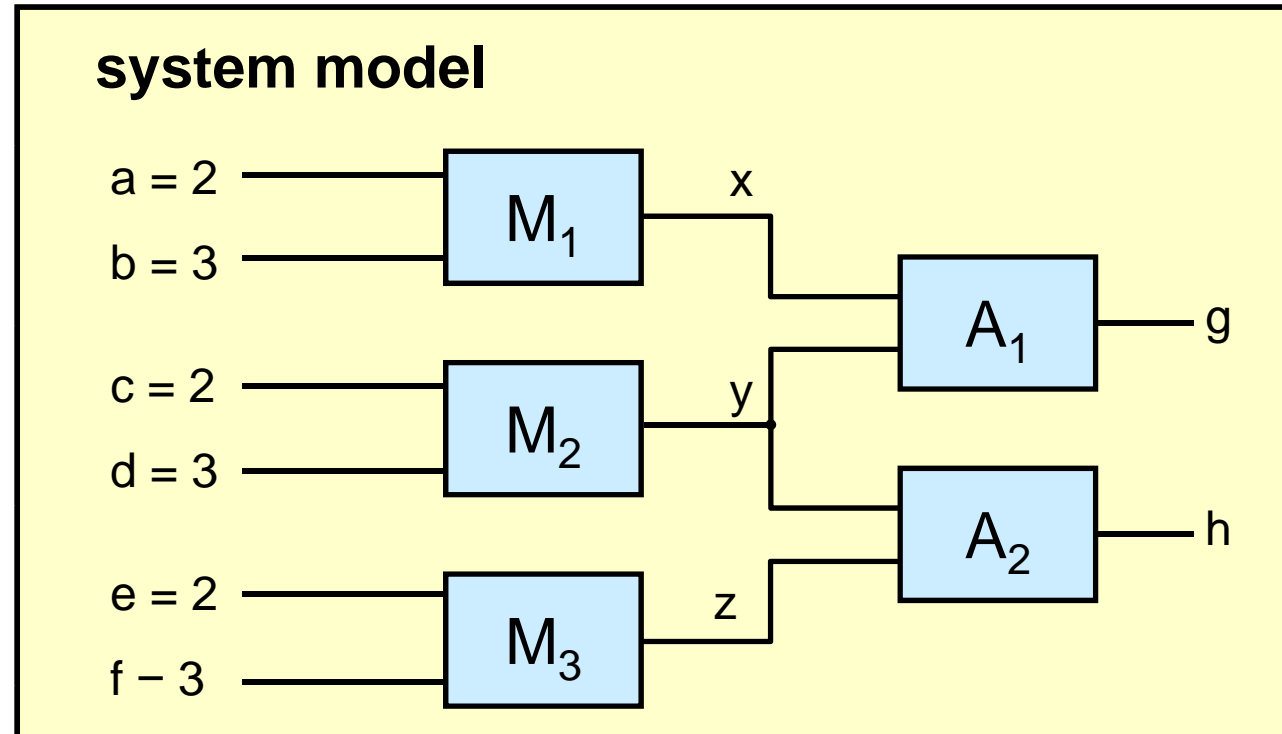
- ‚brute-force‘ Simulation of ***all*** fault assumptions combinatorically not feasible

**Idea:** General Diagnostic Engine GDE, deKleer & Williams 1987

- intelligent search in the space of all fault assumptions
- uses inconsistent assumptions for pruning the search space



# GDE - Example

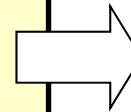
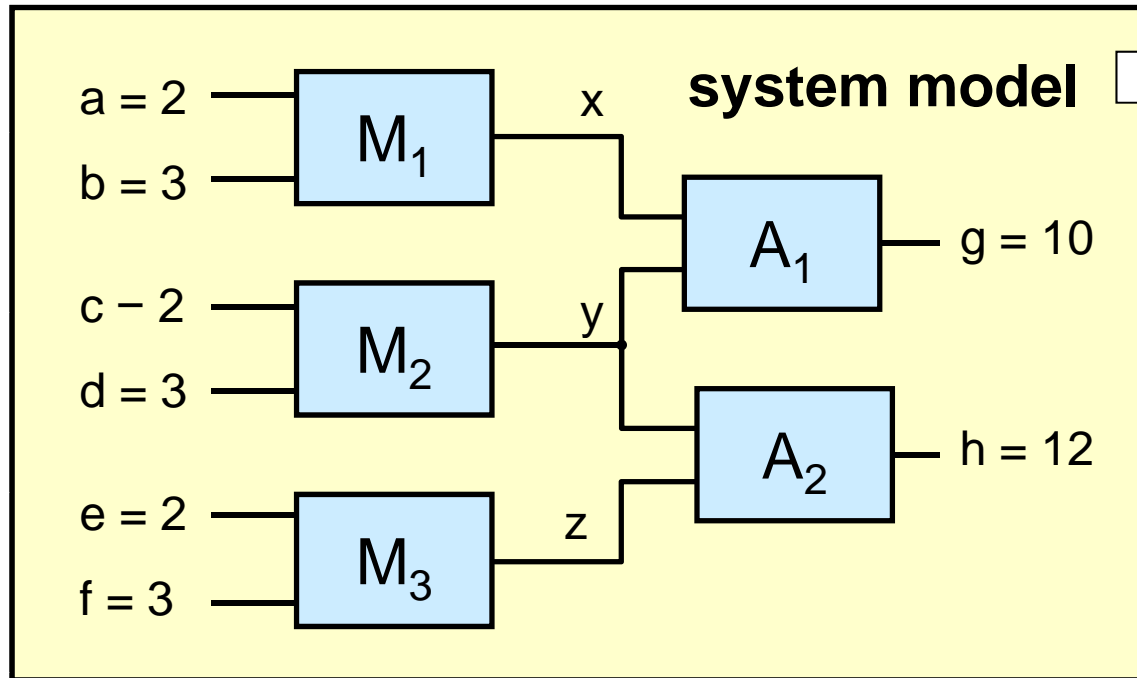


## component models

- multiplier:  $\text{mode=ok} \Rightarrow \text{out} = \text{in}_1 * \text{in}_2$
- adder:  $\text{mode=ok} \Rightarrow \text{out} = \text{in}_1 + \text{in}_2$

**measurements:**  $g = 10 \wedge h = 12$

# GDE - Example



**simulation**

$x = 6$  {M1}

$y = 6$  {M2}

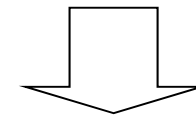
$z = 6$  {M3}

$g = 12$  {M1 M2 A1},  $g = 10$

$y = 4$  {M1 A1}

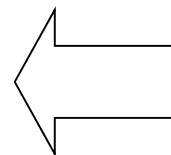
$h = 10$  {M1 A1 A2 M3},  $h = 12$

$y = 6$  {A2 M3}



**two conflicts**

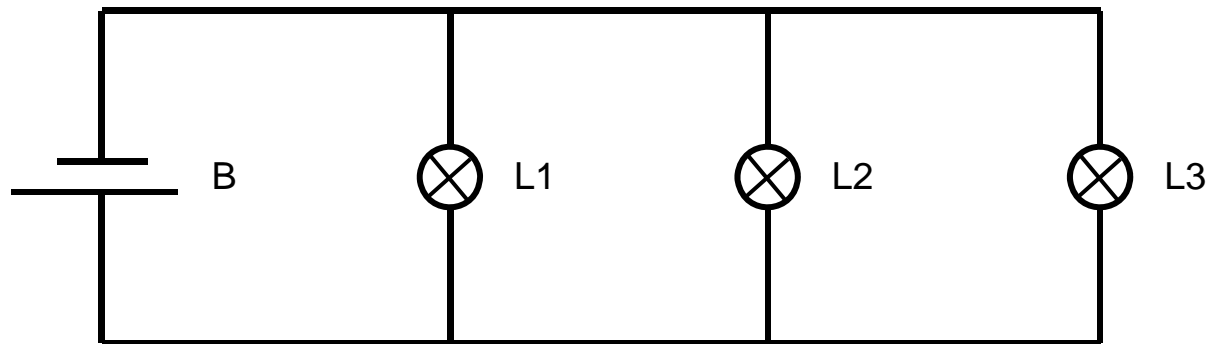
**diagnoses:**  
 single-fault **M1**  
 single-fault **A1**  
 double fault **M2 M3**  
 :



M1	M2	M3	A1	A2
<b>X</b>	<b>X</b>		<b>X</b>	
<b>X</b>		<b>X</b>	<b>X</b>	<b>X</b>

# Model-Based Diagnosis: Base functionality

Example why adder/multiplier example does not reveal all difficulties for practice:



**Observation:**

L1, L2 are not lit, L3 is lit

**GDE diagnoses:**

1. (B ok, L1 faulty, L2 faulty, L3 ok)

2. (B faulty, L1 ok, L2 ok, L3 faulty)

???

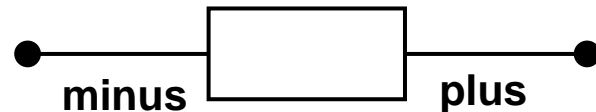
3. (B faulty, L1 ok, L2 ok, L3 ok)

???

# Model-Based Diagnosis: Base functionality

## Models of electric components:

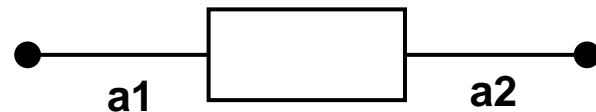
### Battery:



value ranges:  $\text{minus, plus} \in \{ \text{ground, supply voltage} \}$

rules:  
 $\text{ok} \Rightarrow (\text{minus} = \text{ground})$   
 $\text{ok} \Rightarrow (\text{plus} = \text{supply voltage})$

### Wire:



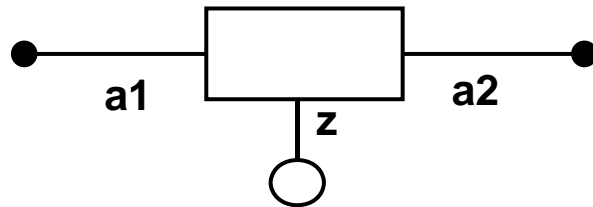
value ranges:  $\text{a1, a2} \in \{ \text{ground, supply voltage} \}$

rules:  
 $\text{ok} \wedge (\text{a1} = \text{ground}) \Rightarrow (\text{a2} = \text{ground})$   
 $\text{ok} \wedge (\text{a1} = \text{supply voltage}) \Rightarrow (\text{a2} = \text{supply voltage})$   
 $\text{ok} \wedge (\text{a2} = \text{ground}) \Rightarrow (\text{a1} = \text{ground})$   
 $\text{ok} \wedge (\text{a2} = \text{supply voltage}) \Rightarrow (\text{a1} = \text{supply voltage})$

# Model-Based Diagnosis: Base functionality

## Models of electric components:

Lamp:



value ranges:

$a1, a2 \in \{ \text{ground, supply voltage} \}$   
 $z \in \{ \text{lit, dark} \}$

rules:

$ok \wedge (a1 = \text{supply voltage}) \wedge (a2 = \text{ground}) \Rightarrow (z = \text{lit})$

$ok \wedge (a2 = \text{supply voltage}) \wedge (a1 = \text{ground}) \Rightarrow (z = \text{lit})$

$ok \wedge (a1 = \text{supply voltage}) \wedge (a2 = \text{supply voltage}) \Rightarrow (z = \text{dark})$

$ok \wedge (a1 = \text{ground}) \wedge (a2 = \text{ground}) \Rightarrow (z = \text{dark})$

$ok \wedge (a1 = \text{ground}) \wedge (z = \text{lit}) \Rightarrow (a2 = \text{supply voltage})$

$ok \wedge (a1 = \text{supply voltage}) \wedge (z = \text{lit}) \Rightarrow (a2 = \text{ground})$

$ok \wedge (a1 = \text{ground}) \wedge (z = \text{dark}) \Rightarrow (a2 = \text{ground})$

$ok \wedge (a1 = \text{supply voltage}) \wedge (z = \text{dark}) \Rightarrow (a2 = \text{supply voltage})$

$ok \wedge (a2 = \text{ground}) \wedge (z = \text{lit}) \Rightarrow (a1 = \text{supply voltage})$

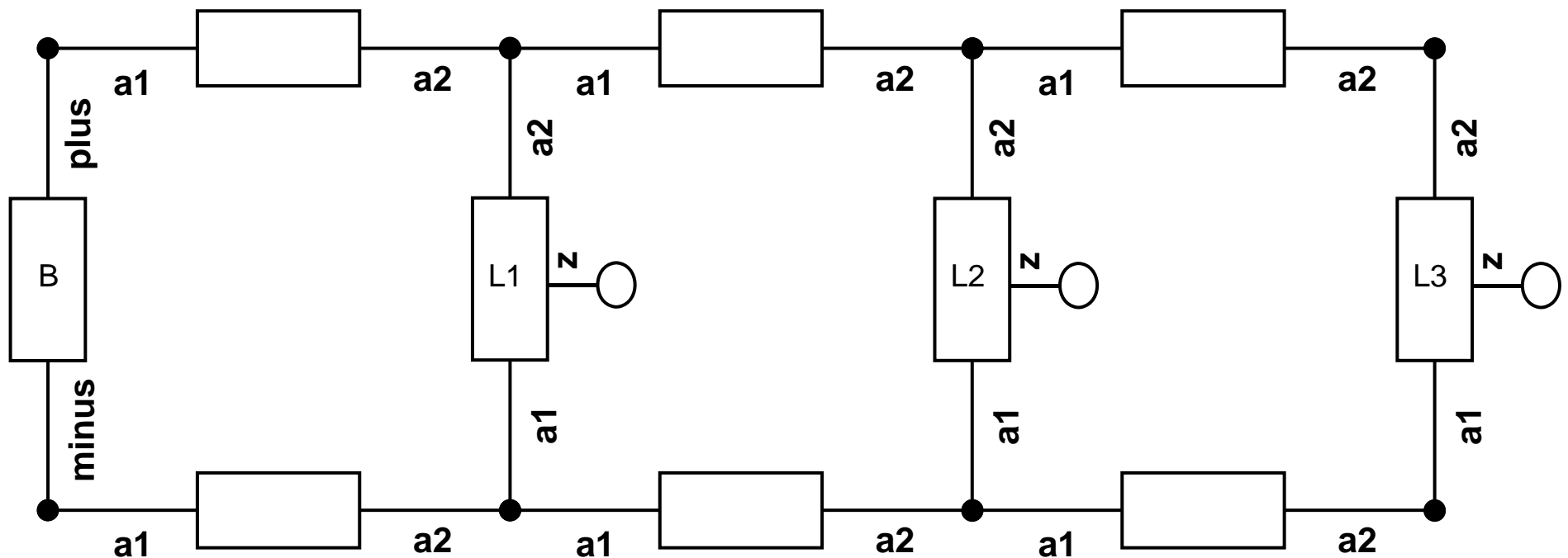
$ok \wedge (a2 = \text{supply voltage}) \wedge (z = \text{lit}) \Rightarrow (a1 = \text{ground})$

$ok \wedge (a2 = \text{ground}) \wedge (z = \text{dark}) \Rightarrow (a1 = \text{ground})$

$ok \wedge (a2 = \text{supply voltage}) \wedge (z = \text{dark}) \Rightarrow (a1 = \text{supply voltage})$

# Model-Based Diagnosis: Base functionality

Composing the system model from the component models:



Values at connecting ports must be the same from both sides.

In case of contradiction: Conflict between the behavioural modes predicting the resp. values

Diagnoses are sets of behavioural modes not containing any conflict.

# Model-Based Diagnosis: Base functionality

## Conclusion from this modeling:

There is no logic contradiction to the following diagnosis:

2. (B faulty, L1 ok, L2 ok, L3 faulty)

### Reason:

L3 may be lit in fault mode even if there is no voltage difference.

***Incomplete knowledge base !***

### Even worse:

If a behavioural rule is only evaluated when its antecedents assume actual values, then no contradiction can be found to the following diagnosis:

3. (B faulty, L1 ok, L2 ok, L3 ok)

### Reason:

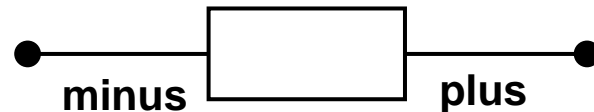
There is no voltage value computed anywhere in the system.

***Incomplete proving ability of the problem solver !***

# Model-Based Diagnosis: Base functionality

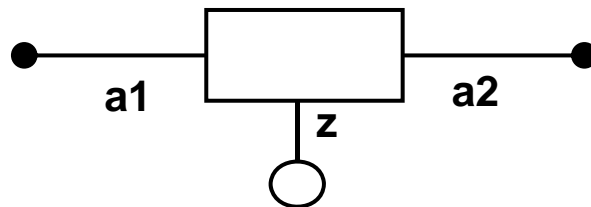
Additional rules for the exclusion of diagnoses 2 / 3:

Battery:



faulty  $\Rightarrow$  (minus = ground)

Lamp:



faulty  $\wedge$  (a1 = supply voltage)  $\wedge$  (a2 = supply voltage)  $\Rightarrow$  (z = dark)

faulty  $\wedge$  (a1 = ground)  $\wedge$  (a2 = ground)  $\Rightarrow$  (z = dark)

***There must be models for faulty behaviour, too, in order to exclude diagnoses that are physically impossible.***



# Model-Based Diagnosis: Extended functionality

## Base functionality:

### Input:

- Setting certain control inputs
- Observing values depending on this setting

### Output:

- Several diagnoses of the following kind:
  - Each diagnosis assigns a behavioural mode to each component: ok or a defined fault mode
  - The rules of all behavioural modes assigned agree with all set and observed values.

## What does the user need ?

**Input:** see above

**Output:** • A unique instruction how to repair which component

# Model-Based Diagnosis: Extended functionality

## Extended functionality:

### 1) Suggestion of setting certain control inputs

- Setting certain values at certain places in the system  
(such that the observations to be expected differ such that the diagnoses valid so far may be distinguished best)

### 2) Suggestion of observation points

- Selecting observation points  
(such that the observations to be expected differ such that the diagnoses valid so far may be distinguished best)

**Test**

## Requirement for the modeling:

- Definition of test points
- Definition of test values to be set at the test points
- Definition of observation points to be measured

**Control actions**

**Observations**

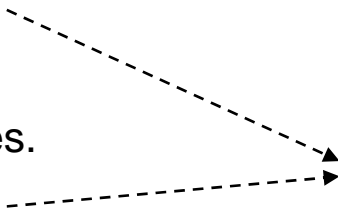
# Modeling the components

## Behavioural modes

- modes of the component to be searched for in the diagnostic process
- Domain of definition must be finite (normal less than 10 values)

## Variables

- containing values
- The variable values are used in the constraints.
- The constraints compute new values for other variables.



*Distinguish  
internal variables  
from port variables !*

## Ports

- containing variables to be identified at the connections to adjacent components

## Constraints

- set of behavioural rules connecting the variables of the same component
- Normally, a constraint is only valid under the assumption of a certain behavioural mode.

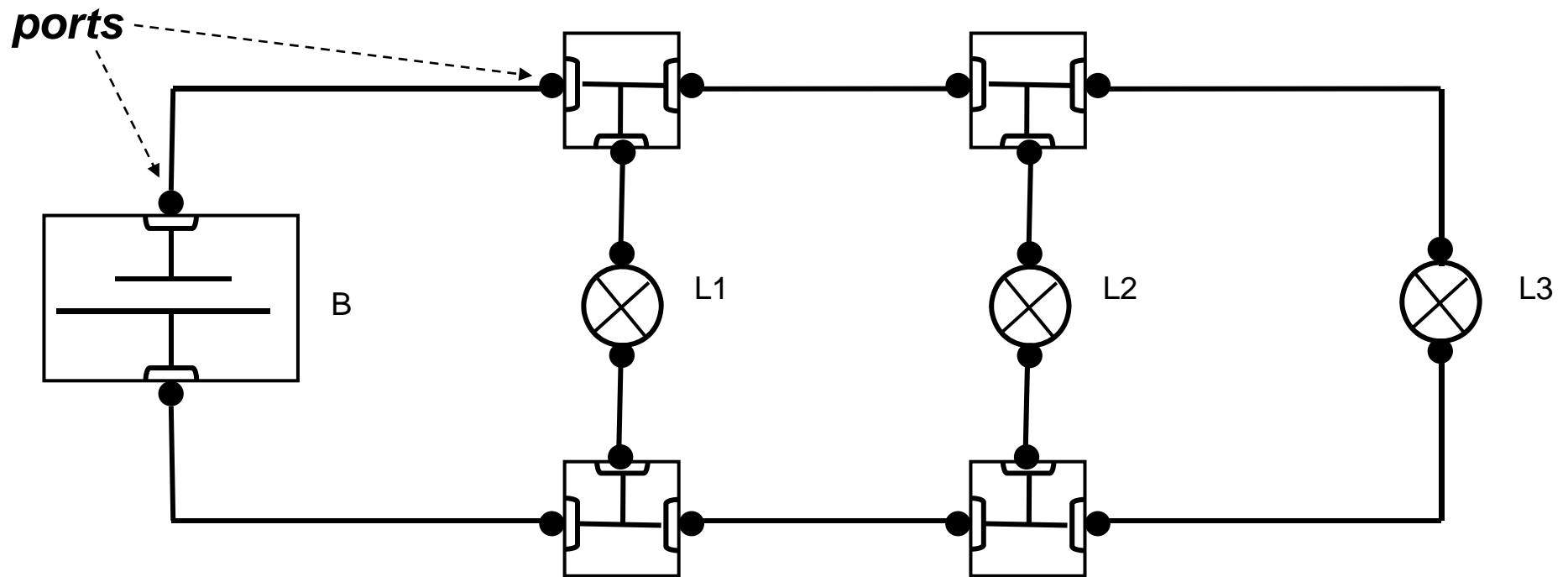
## Control actions

- variables and values to be set
- measure of accessibility and the difficulty to set certain values.

## Observations

- variables
- measure for accessibility

# Modeling a simple electric circuit



**component types:**

**Battery**

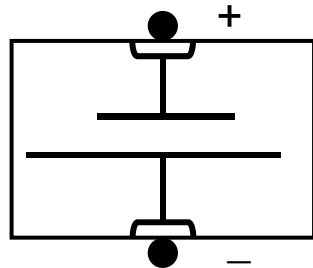
**Lamp**

**Wire**

**Junction (3)**

# Modeling a simple electric circuit

## Battery



### **fault modes:**

discharged

contact gap at +

contact gap at -

loose contact at +

loose contact at -

corroded

### **control actions:**

open connector at +

open connector at -

close connector at +

close connector at -

### **observations:**

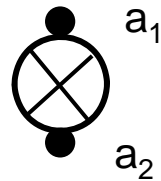
inspect connectors

measure voltage at +

measure voltage at -

# Modeling a simple electric circuit

## Lamp



**fault modes:**

blown

lamp is not inserted

loose contact

corroded

**control actions:**

remove lamp

insert lamp

**observations:**

inspect lamp

## Wire



**fault modes:**

broken

shorted to ground

shorted to voltage

corroded

**control actions:**

**observations:**

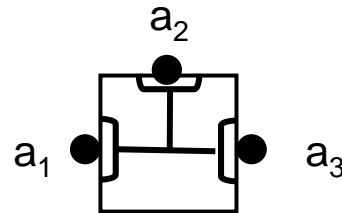
measure voltage at  $a_1$

measure voltage at  $a_2$

inspect wire

# Modeling a simple electric circuit

## Junction (3)



### **fault modes:**

contact gap at  $a_1$   
contact gap at  $a_2$   
contact gap at  $a_3$   
loose contact at  $a_1$   
loose contact at  $a_2$   
loose contact at  $a_3$

### **control actions:**

close contact at  $a_1$   
close contact at  $a_2$   
close contact at  $a_3$   
open contact at  $a_1$   
open contact at  $a_2$   
open contact at  $a_3$

### **observations:**

inspect contacts