



Ceci n'est pas une pipe.

This is not a pipe.

Magritte



observation

Ceci n'est pas une pipe.

This is not a pipe.

Magritte



observation

diagnosis

Ceci n'est pas une pipe.

This is not a pipe.

Magritte

Theory of Diagnosis

Foundations
Extensions
Application

1.4. Bill of material :

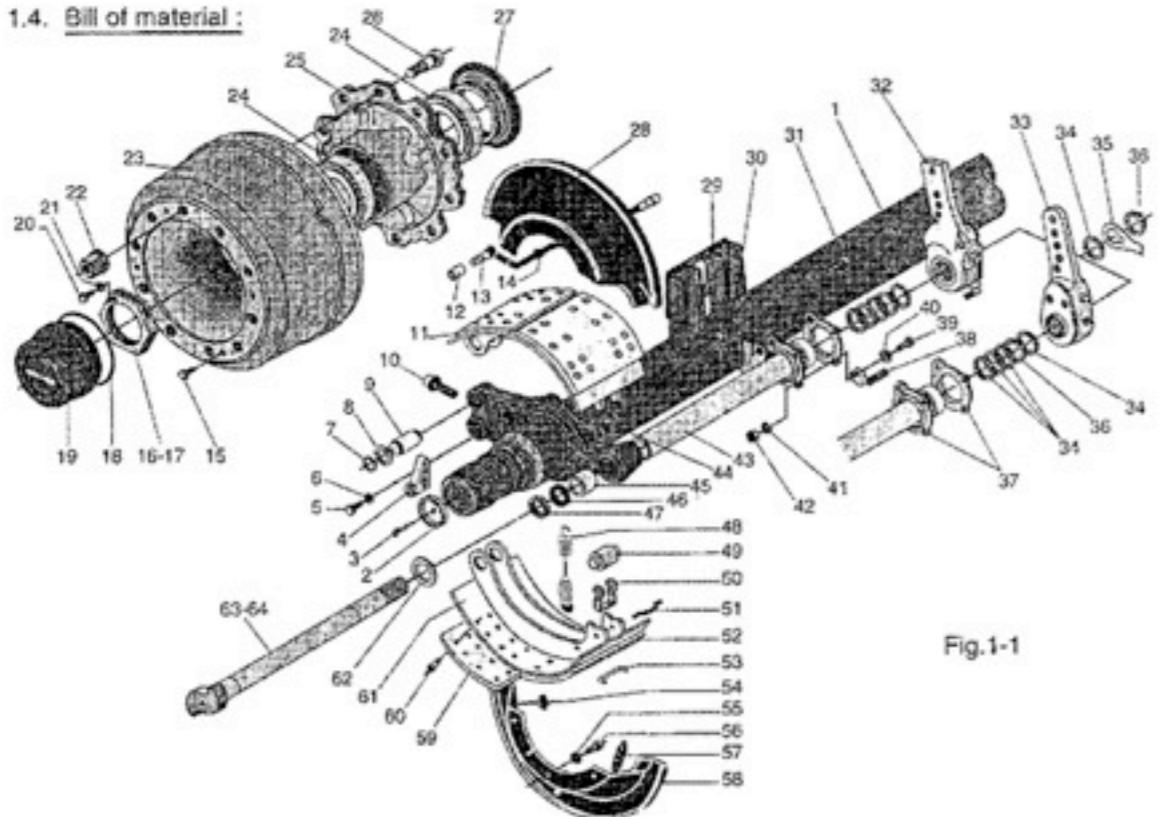


Fig.1-1

REP	NOMENCLATURE / BILL OF MATERIAL	REP	NOMENCLATURE / BILL OF MATERIAL
1	Corps d'essieu assemblé / Axle beam assembly	33	Levier à réglage manuel / Manual slack adjuster
2	Bouchon / Plug	34	Rondelle / Washer
3	Goupille fendue / Split pin	35	Indicateur d'usure / Wear indicator
4	Support de capteur / Sensor bracket	36	Circlip / Circlip
5	Vis / Bolt	37	Cage de palier / Camshaft bracket
6	Rondelle / Washer	38	Pette de point fixe / Fixed point assembly
7	Circlip / Circlip	39	Vis / Bolt
8	Rondelle / Washer	40	Rondelle / Washer
9	Axe de machoire / Anchor pin	41	Rondelle / Washer
10	Vis de sécurité / Bolt - security	42	Ecrou / Nut
11	Machoire garnie / Brake shoe assembly	43	Fourreau d'arbre à came / Camshaft bearing tube
12	Bague de capteur / Retaining ring	44	Graisseur / Nipple
13	Capteur ABS / ABS sensor	45	Bague roulée / Bushing
14	Passe-fil / Grommet	46	Joint torique / 'O' ring
15	Vis de tambour / Bolt	47	Rondelle plastique / Plastic washer
16	Ecrou de fusée (pas à gauche) / Ade nut (left hand thread)	48	Ressort de rappel / Return spring
17	Ecrou de fusée (pas à droite) / Ade nut (right hand thread)	49	Galet / Roller
18	Joint torique / 'O' ring	50	Support de galet / Retainer
19	Chapeau de moyeu / Hub cap	51	Axe de ressort / Pin
20	Vis frein / Locking bolt	52	Garniture coté came / Lining - cam
21	Rondelle / Washer	53	Fixation de galet / Pin roller retainer
22	Ecrou de roue / Wheel nut	54	Bouchon plastique / Plastic plug
23	Tambour / Drum	55	Rondelle / Washer
24	Roulement / Bearing	56	Vis / Bolt
25	Moyeu / Hub	57	Bouchon caoutchouc / Plug rubber
26	Goujon de fixation de roue / Wheel bolt	58	Cache-tambour / Dust cover
27	Joint de moyeu / Hub seal	59	Garniture coté axe / Lining - anchor
28	Cache-tambour / Dust cover	60	Rivet / Rivet
29	Ecrou / Bolt	61	Machoire nue / Brake shoe
30	Rondelle / Washer	62	Rondelle / Washer
31	Vis / Bolt	63	Arbre à came / Camshaft
32	Levier à réglage automatique / Automatic slack adjuster	64	Arbre à came / Camshaft

1.4. Bill of material :

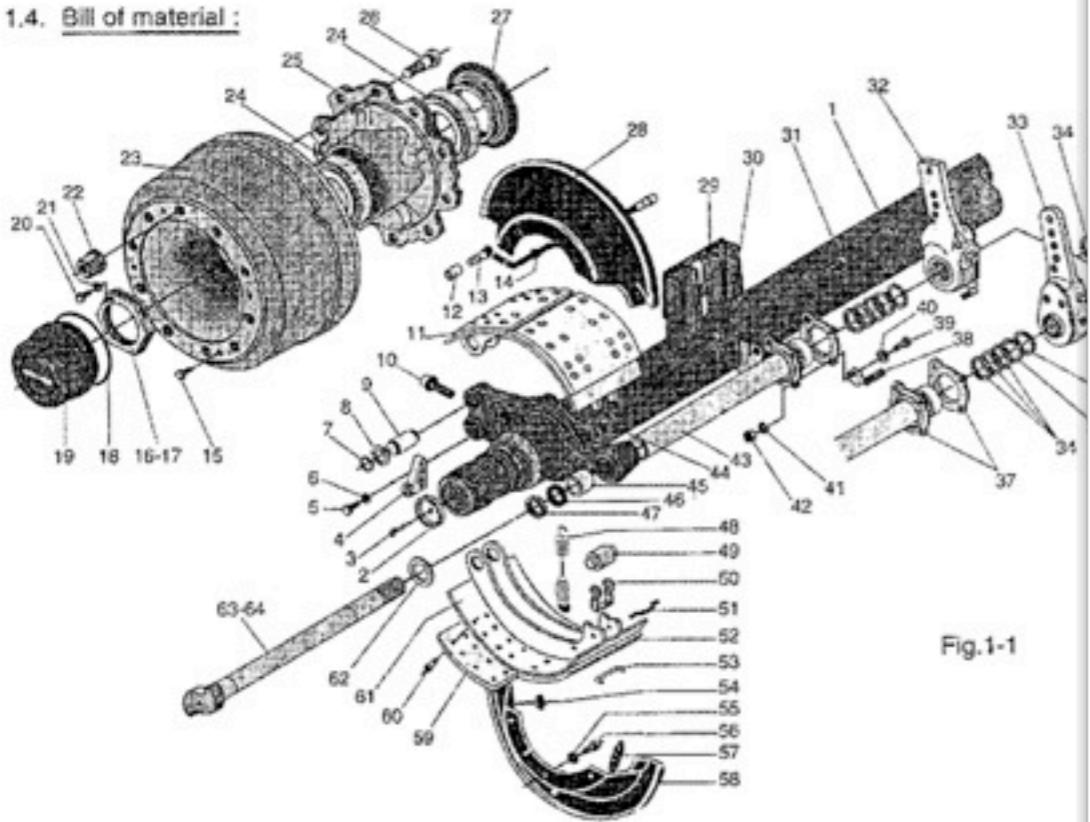


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23	Tambour / Drum	55	Rondelle / Washer
24	Roulement / Bearing	56	Vis / Bolt
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31	Vis / Bolt	63	Arbre à came / Camshaft
32	Levier à réglage automatique / Automatic slack adjuster	64	Arbre à came / Camshaft

Company Name

625 E Beale
Kingman, AZ 86401
Ph 928-753-6945 Fax 928-718-3238
craig@mesc.org

Quote Number 1001
Quote Date March 7, 2008
Project XYZ School District Wobulator

TO [Customer Representative]
[Customer Name]
[Street Address]
[City, ST ZIP Code]
[Phone]

NOTES: [Place notes about the project here, e.g., "customer is responsible for removal of old product"]

SALESPERSON	PAYMENT TERMS	EXPECTED DELIVERY	QUOTE VALID:
Craig McKee	As per MESC contract listed below	30 days ARO	30 Days from date above

Quotation prepared by: [Sales Representative]

MISCELLANEOUS

Quotation accepted by: [Member Representative]

SUBTOTAL \$ 1,035.00

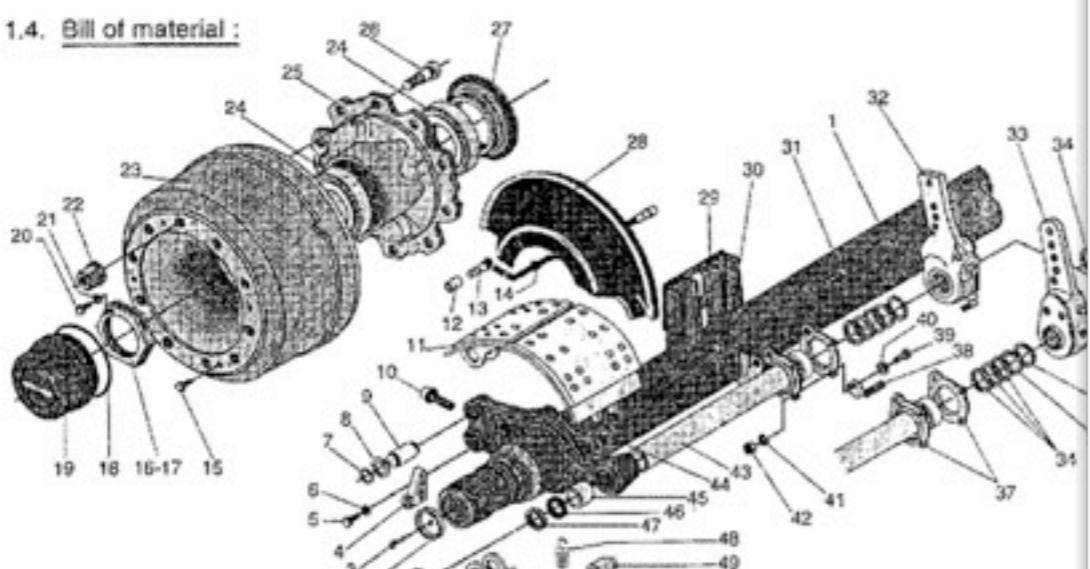
Quotation is subject to the conditions of MESC contract: 08X-XXX-1234

SALES TAX% 0.08

Pricing includes MESC Admin Fee

TOTAL \$ 1,117.80

THANK YOU FOR YOUR BUSINESS!



```
SELECT *
FROM Persons
WHERE LastName='Doe'
AND (FirstName='John' OR FirstName='Jane')
```

12	Bague de capteur / Resaining ring	44	Graisseur / Ripple
13	Capteur ABS / ABS sensor	45	Bague roulée / Bushing
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26	Goujon de fixation de roue / Wheel bolt	58	Cache-tambour / Dust cover
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28	Cache-tambour / Dust cover	60	Rivet / Rivet
29	Ecrou / Bolt	61	Marcheire nue / Brake shoe
30	Rondelle / Washer	62	Rondelle / Washer
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NOTES: [Place notes about the project here, e.g., "customer is responsible for removal of old product"]

QUOTE VALID:

30 Days from date above

	MESC PRICE	LINE TOTAL
%	\$90.00	\$900.00
%	\$135.00	\$135.00

Quotation prepared by: [Sales Representative]

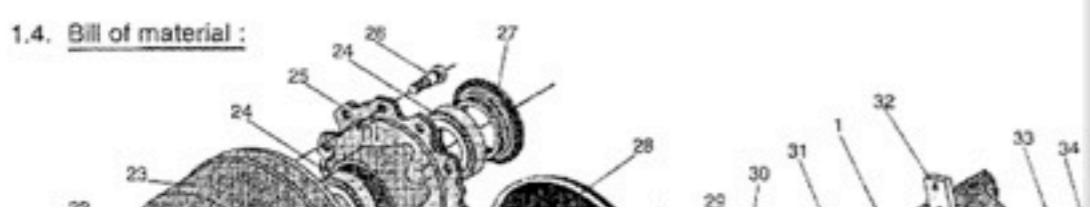
MISCELLANEOUS	
SUBTOTAL	\$ 1,035.00
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Quotation is subject to the conditions of MESC contract: 08X-XXX-1234

Pricing includes MESC Admin Fee

THANK YOU FOR YOUR BUSINESS!



Company Name

General Preferences

General Rulers Slideshow Presenter Display Remote Auto-Correction

For New Documents: Show Theme Chooser Use theme: [Choose...](#)

Editing: Show size and position when moving objects
 Reduce placed images to fit on slides

Saving: Back up previous version
 Include preview in document by default
 Save new documents as packages
 Copy audio and movies into document
 Copy theme images into document

Font Preview: Show font preview in Format Bar font menu
 Hold the Option key to toggle font preview on or off.

Animations: Include obsolete animations in choices

Outline View Font: Lucida Grande 12

30	Vis / Bolt	63	Arbre à came / Camshaft
31	Levier à réglage automatique / Automatic slack adjuster	64	Arbre à came / Camshaft

QUOTE

Quote Number 1001

Quote Date March 7, 2008

Project XYZ School District Wobulator

18-3238

sentative]

de]

NOTES: [Place notes about the project here, e.g., "customer is responsible for removal of old product"]

QUOTE VALID:

30 Days from date above

MESC PRICE	LINE TOTAL
% \$90.00	\$900.00
% \$135.00	\$135.00

Name= 'Jane')

as Representative]	MISCELLANEOUS
number Representative]	SUBTOTAL \$ 1,035.00
conditions of MESC contract: 08X-XXX-1234	SALES TAX% 0.08
ee	TOTAL \$ 1,117.80

THANK YOU FOR YOUR BUSINESS!

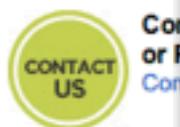


Home & Home Office

Laptop



Get performance on the Intel Help



CONTACT US

Narrow Your

Product Cat

- Inspiron Laptops
- Mini Netbooks
- Studio Laptops
- Adamo
- XPS Laptop
- Studio XPS
- Gaming Laptops

Need it Fast?

- Ships Out Next Day

Operating Syst

- Windows 7
- Windows Vista
- Windows XP
- Ubuntu Linux

How much do you need?

- 1TB: 18,500 hrs of video
- 500GB: 9,250 hrs of video
- 320GB: 5,900 hrs of music or 500 hrs of video

.config - Linux Kernel v2.6.31.12 Configuration

Processor type and features

Arrow keys navigate the menu. <Enter> selects submenus --->. Highlighted letters are hotkeys. Pressing <Y> includes, <N> excludes, <M> modularizes features. Press <Esc><Esc> to exit, <?> for Help, </> for Search. Legend: [*] built-in [] excluded <M> module < > module capable

^(-) [*] Single-depth WCHAN output
Processor family (Generic-x86-64) --->
[] Configure Maximum number of SMP Processors and NUMA Nodes
(64) Maximum number of CPUs
 Preemption Model (No Forced Preemption (Server)) --->
[*] Machine Check Exception
<M> Machine check injector support
<M> Dell laptop support
<M> /dev/cpu/microcode - microcode support
<M> /dev/cpu/*/msr - Model-specific register support
<M> /dev/cpu/*/cpuid - CPU information support
< > /sys/kernel/debug/x86/cpu/* - CPU Debug support (NEW)
 Memory model (Flat Memory) --->
(65536) Low address space to protect from user allocation
[*] MTRR (Memory Type Range Register) support
[*] x86 PAT support
[*] Enable seccomp to safely compute untrusted bytecode
[*] Enable -fstack-protector buffer overflow detection (EXPERIMENTAL)
 Timer frequency (100 HZ) --->
[*] kexec system call
(0x1000000) Physical address where the kernel is loaded
-- Support for hot-pluggable CPUs
[] Compat VDSO support
[*] Built-in kernel command line
(root=/dev/sdb8 ro console=tty0) Built-in kernel command string
[] **Built-in command line overrides boot loader arguments**

<Select> < Exit > < Help >

Repair

Explanation

Diagnosis

Conflict

**Concurrent
configuration
of Feature
Models**

Repair

Explanation

Diagnosis

Conflict

Reiter's Theory of Diagnosis

[Reiter'87]

Definition **System** [Reiter'87,Def 2.1]

A *system* is a pair $(SD, \text{COMPONENTS})$ where:

1. SD , the system description, is a set of first-order sentences;
2. COMPONENTS , the system components, is a finite set of constants.

Reiter's Theory of Diagnosis

[Reiter'87]

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Definition **Abnormality** [Reiter'87]

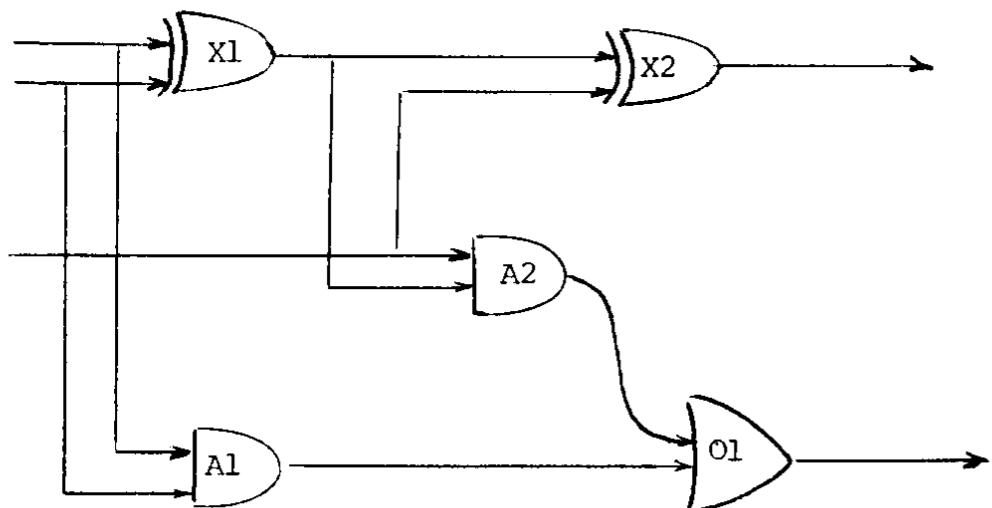
The unary predicate $AB(\cdot)$ denotes the abnormality of a component in a given system description.

Reiter's Theory of Diagnosis

[Reiter'87]

Example

Binary full adder [Reiter'87]



SD

$\text{ANDG}(x) \wedge \neg \text{AB}(x) \supset \text{out}(x) = \text{and}(\text{in1}(x), \text{in2}(x)) ,$
 $\text{XORG}(x) \wedge \neg \text{AB}(x) \supset \text{out}(x) = \text{xor}(\text{in1}(x), \text{in2}(x)) ,$
 $\text{ORG}(x) \wedge \neg \text{AB}(x) \supset \text{out}(x) = \text{or}(\text{in1}(x), \text{in2}(x)) ,$
 $\text{ANDG}(A_1), \quad \text{ANDG}(A_2) ,$
 $\text{XORG}(X_1) , \quad \text{XORG}(X_2) \quad \text{ORG}(O_1) ,$
 $\text{out}(X_1) = \text{in2}(A_2) ,$
 $\text{out}(X_1) = \text{in1}(X_2) ,$
 $\text{out}(A_2) = \text{in1}(O_1) ,$
 $\text{in1}(A_2) = \text{in2}(X_2) ,$
 $\text{in1}(X_1) = \text{in1}(A_1) ,$
 $\text{in2}(X_1) = \text{in2}(A_1) ,$
 $\text{out}(A_1) = \text{in2}(O_1) .$

COMPONENTS

→

$\{A_1, A_2, X_1, X_2, O_1\}$

Reiter's Theory of Diagnosis

[Reiter'87]

Definition

Observation [Reiter'87,Def 2.3]

An *observation* of a system is a finite set of first-order sentences. The triple $(SD, \text{COMPONENTS}, OBS)$ denotes the system $(SD, \text{COMPONENTS})$ with observation OBS .

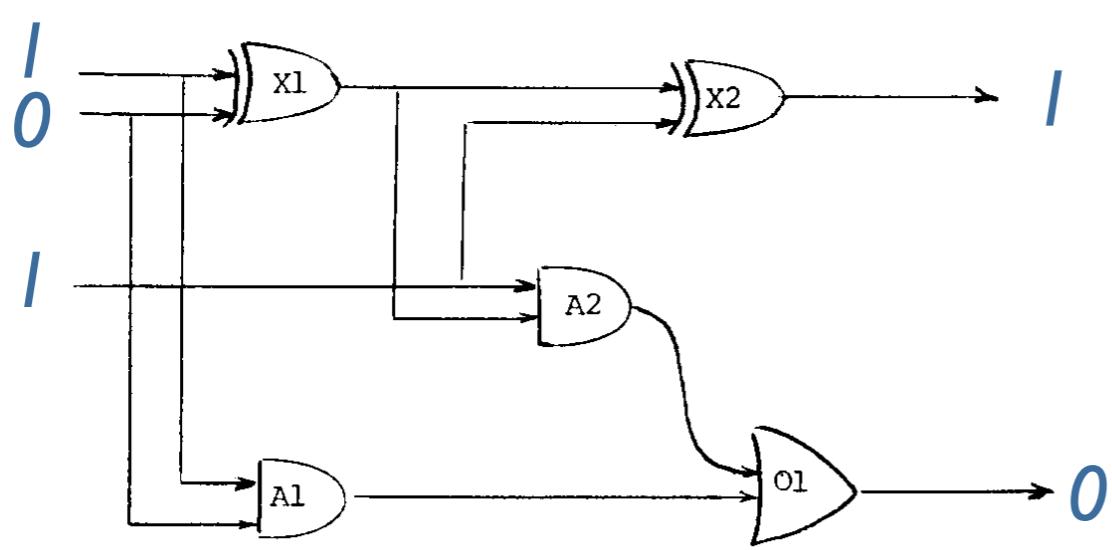
Reiter's Theory of Diagnosis

[Reiter'87]

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Example *Binary full adder* [Reiter'87]



OBS

$\text{in}_1(X_1) = 1 ,$
 $\text{in}_2(X_1) = 0 ,$
 $\text{in}_1(A_2) = 1 ,$
 $\text{out}(X_2) = 1 ,$
 $\text{out}(O_1) = 0 .$

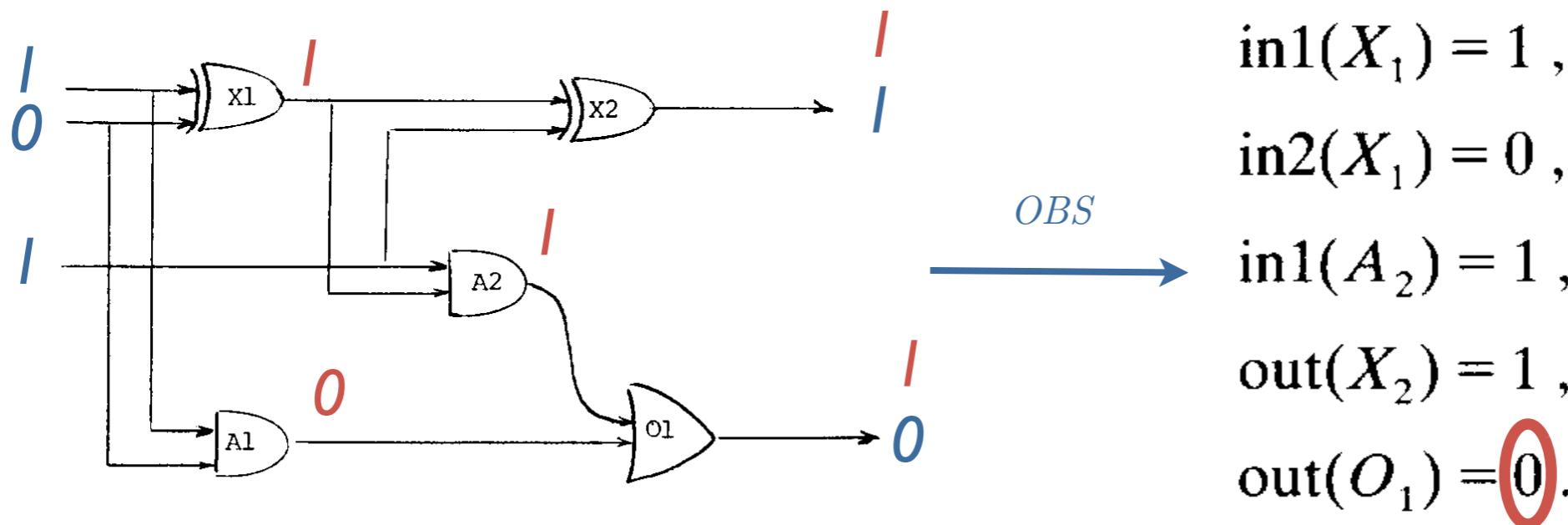
Reiter's Theory of Diagnosis

[Reiter'87]

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Example *Binary full adder* [Reiter'87]



Reiter's Theory of Diagnosis

[Reiter'87]

Definition *Diagnosis* [Reiter'87,Def 2.3]

A *diagnosis* for $(SD, \text{COMPONENTS}, OBS)$ is a minimal set $\Delta \subset \text{COMPONENTS}$ such that:

$SD \cup OBS \cup \{\text{AB}(c) \mid c \in \Delta\} \cup \{\neg \text{AB}(c) \mid c \in \text{COMPONENTS} - \Delta\}$
is consistent.

Reiter's Theory of Diagnosis

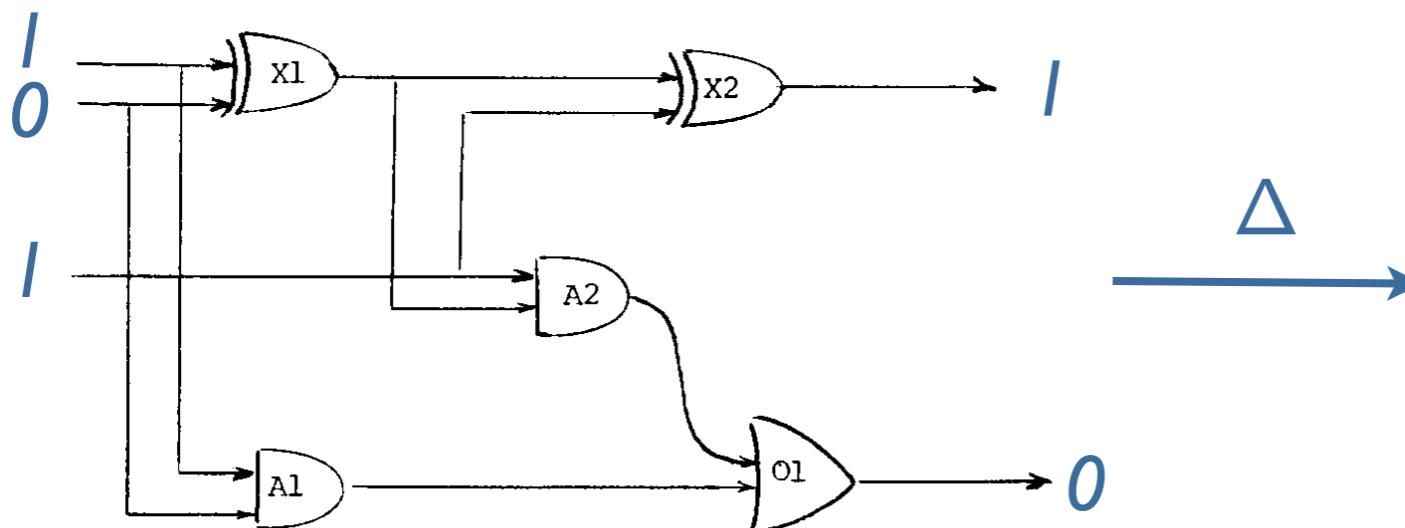
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Example *Binary full adder* [Reiter'87]



$\Delta \rightarrow$
 $\{X_1\},$
 $\{X_2, O_1\},$
 $\{X_2 A_2\},$

Reiter's Theory of Diagnosis

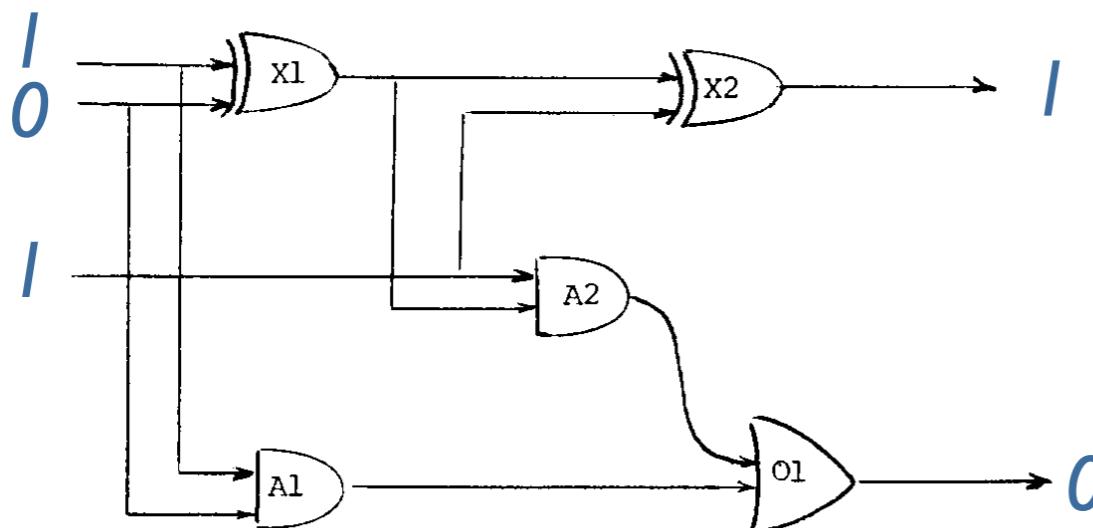
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is consistent.

Example *Binary full adder* [Reiter'87]



Δ

smallest sets

$\{X_1\}$,
 $\{X_2, O_1\}$,
 $\{X_2 A_2\}$,

Reiter's Theory of Diagnosis [Reiter'87]

Proposition *Diagnosis existence* [Reiter'87,Prop 3.1]

A diagnosis exists for $(SD, \text{COMPONENTS}, OBS)$ iff
 $SD \cup OBS$ is consistent.

Reiter's Theory of Diagnosis

[Reiter'87]

Definition *Conflict set* [Reiter'87,Def 4.1]

A *conflict set* for $(SD, \text{COMPONENTS}, OBS)$ is a set $\{c_1, \dots, c_k\} \subseteq \text{COMPONENTS}$ such that:

$$SD \cup OBS \cup \{\neg AB(c_1), \dots, \neg AB(c_k)\}$$

is **inconsistent**.

Reiter's Theory of Diagnosis

[Reiter'87]

Definition *Conflict set* [Reiter'87,Def 4.1]

A *conflict set* for $(SD, \text{COMPONENTS}, OBS)$ is a set $\{c_1, \dots, c_k\} \subseteq \text{COMPONENTS}$ such that:

$$SD \cup OBS \cup \{\neg AB(c_1), \dots, \neg AB(c_k)\}$$

is **inconsistent**.

Definition *Hitting set* [Reiter'87,Def 4.3]

Suppose C is a collection of sets. A *hitting set* for C is a set $H \subseteq \bigcup_{S \in C} S$ such that $H \cap S \neq \emptyset$ for each $S \in C$. A hitting set for C is *minimal* iff no proper subset of it is a hitting set for C .

Reiter's Theory of Diagnosis

[Reiter'87]

Theorem

Diagnosis [Reiter'87,Prop 4.4]

$\Delta \subseteq \text{COMPONENTS}$ is a diagnosis for
(SD, COMPONENTS, OBS) iff Δ is a minimal hitting
set for the collection of (minimal) conflict sets for
(SD, COMPONENTS, OBS).

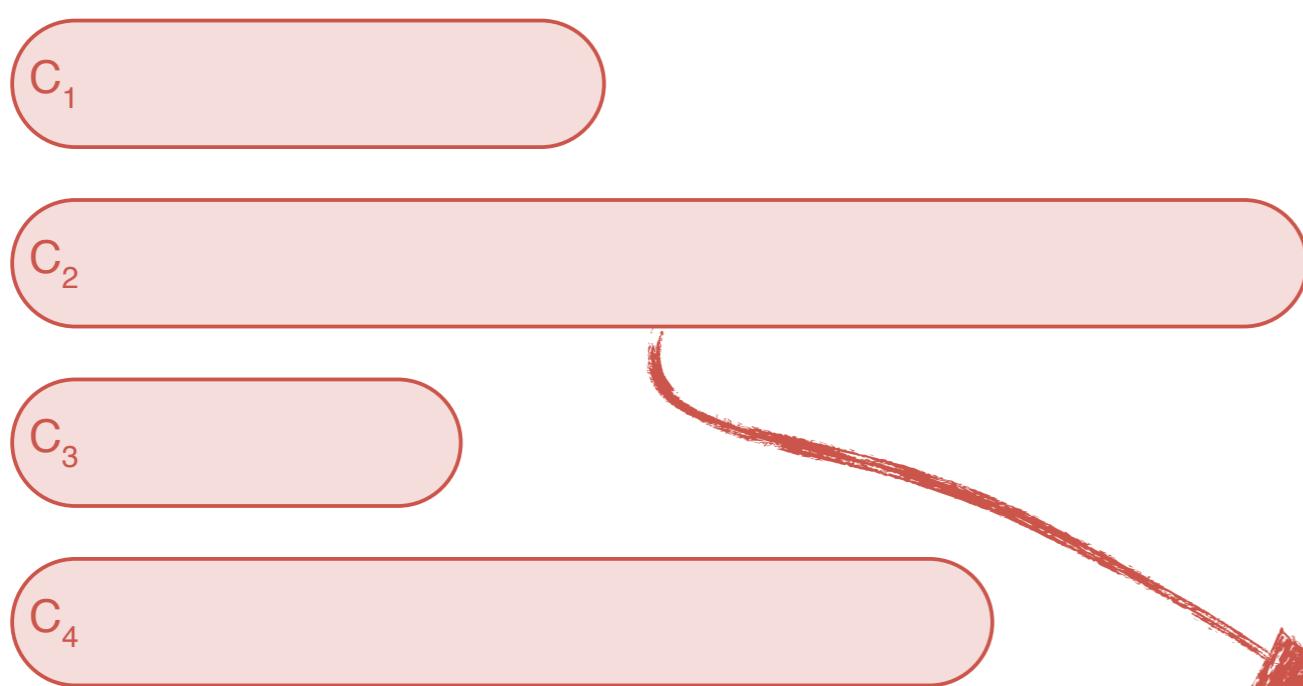
Reiter's Theory of Diagnosis

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why is a set of
constraints
inconsistent?

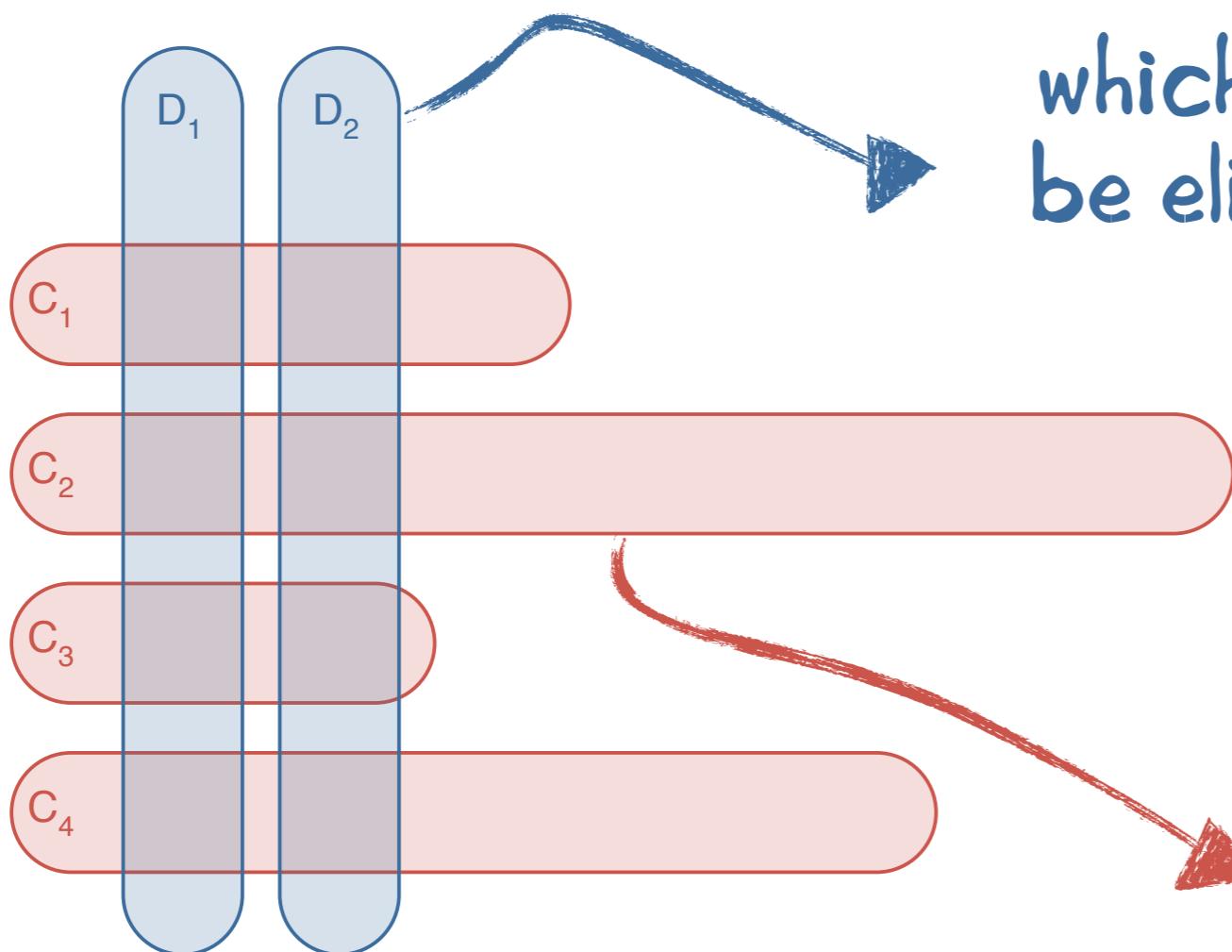
Reiter's Theory of Diagnosis

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(SD, COMPONENTS, OBS) iff Δ is a minimal hitting
set for the collection of (minimal) conflict sets for
(SD, COMPONENTS, OBS).



which constraints should
be eliminated to recover
consistency?

why is a set of
constraints
inconsistent?

Reiter's Theory of Diagnosis [Reiter'87]

Example

Binary full adder [Reiter'87]

The full adder has two minimal conflict sets $\{X_1, X_2\}$ and $\{X_1, A_2, O_1\}$ corresponding, respectively, to the inconsistency of:

$$SD \cup OBS \cup \{\neg AB(X_1), \neg AB(X_2)\}$$

$$SD \cup OBS \cup \{\neg AB(X_1), \neg AB(A_2), \neg AB(O_1)\}$$

There are three diagnoses: $\{X_1\}$, $\{X_2, A_2\}$, $\{X_2, O_1\}$

Reiter's Theory of Diagnosis

[Reiter'87]

Definition **HS-tree** [Reiter'87,Def 4.6]

Let C be a collection of sets. An HS-tree for C , call it T , is a smallest edge-labeled and node-labeled tree with the following properties:

1. The root is labeled by \checkmark if C is empty. Otherwise the root is labeled by an arbitrary set of C ;
2. For each node n of T , let $H(n)$ be the set of edge labels on the path in T from the root node to n . The label for n is any set $S \in C$ such that $S \cap H(n) = \{\}$, if such a set S exists. Otherwise, the label for n is \checkmark . If n is labeled by the set S , then for each $\sigma \in S$, n has a successor, n_σ , joined to n by an edge labeled by σ .

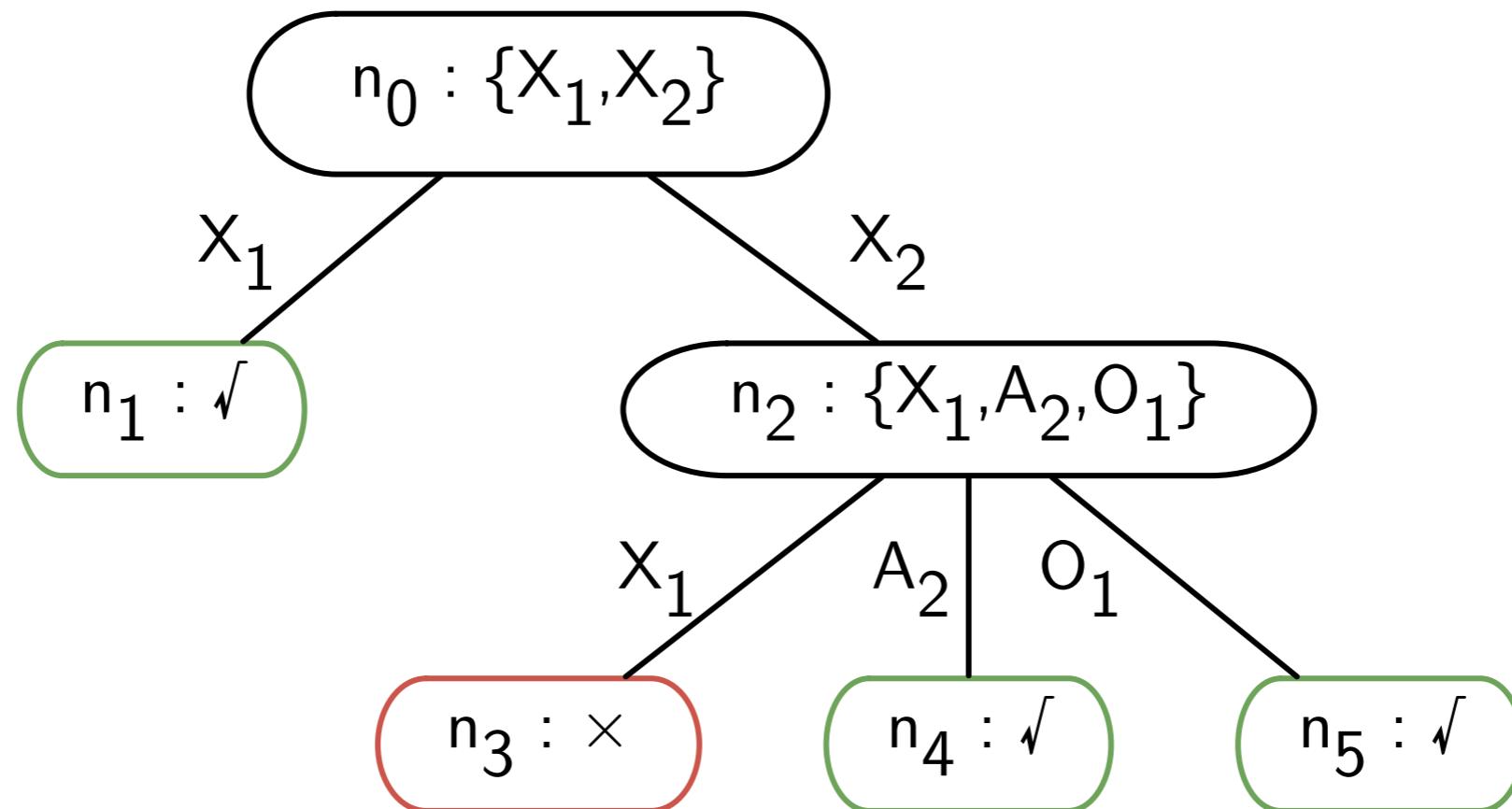
Reiter's Theory of Diagnosis

[Reiter'87]

Example

HS-Tree [Reiser'87]

T



$$C = \{\{X_1, X_2\}, \{X_1, A_2, O_1\}\}$$

$\text{label}(n_0) = \{X_1, X_2\}$, $\text{label}(n_1) = \checkmark$, $\text{label}(n_2) = \{X_1, A_2, O_1\}, \dots$

$H(n_1) = \{X_1\}$, $H(n_4) = \{X_2, A_2\}$, $H(n_5) = \{X_2, O_1\}, \dots$

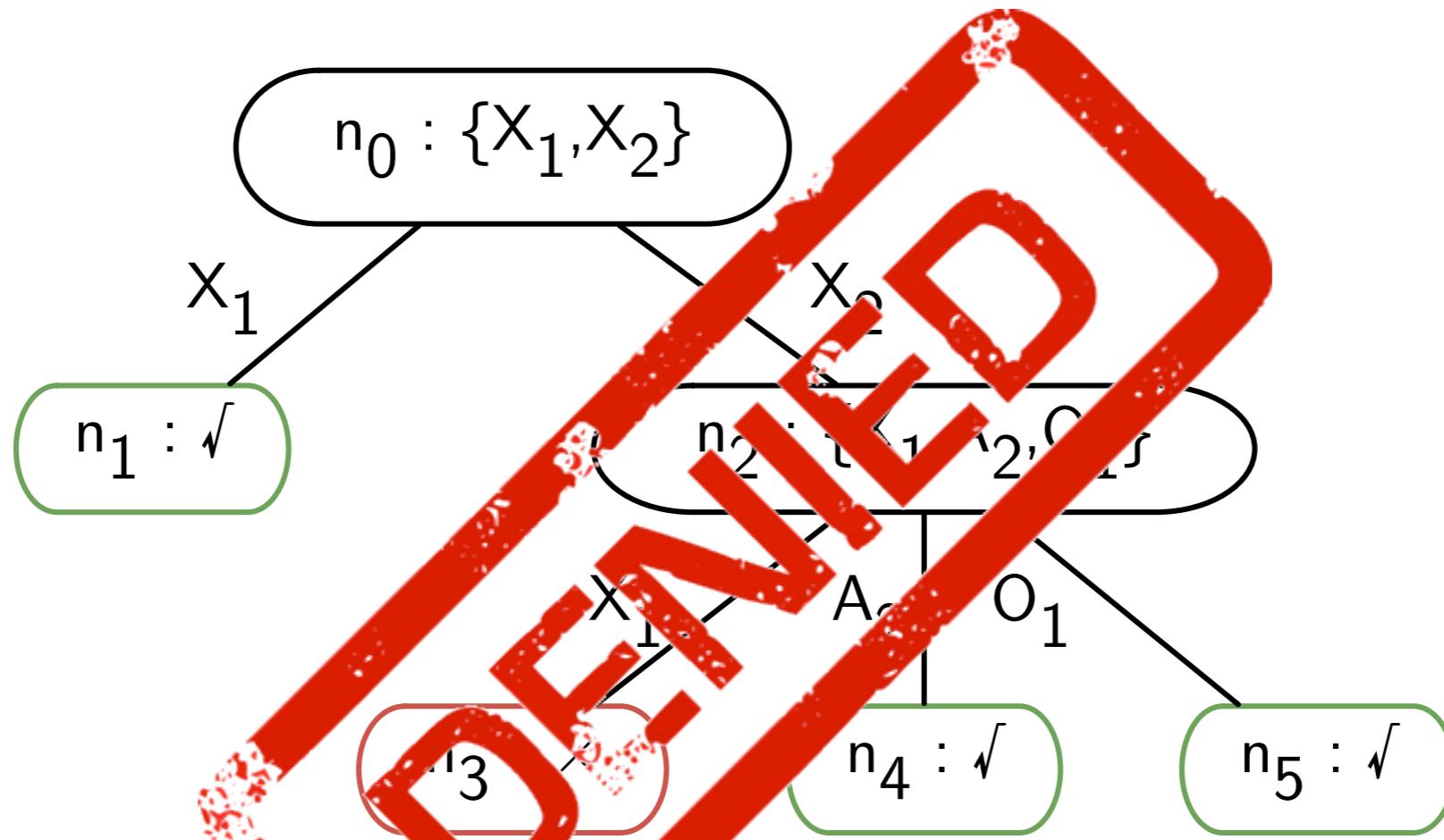
Reiter's Theory of Diagnosis

[Reiter'87]

Example

HS-Tree [Reiser'87]

T



$$C = \{\{X_1, X_2\}, \{X_1, A_2, O_1\}\}$$

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$H(n_1) = \{X_1\}$, $H(n_4) = \{X_2, A_2\}$, $H(n_5) = \{X_2, O_1\}, \dots$

Reiter's Theory of Diagnosis

[Reiter'87]

Algorithm

HS-DAG [Greiner'89]

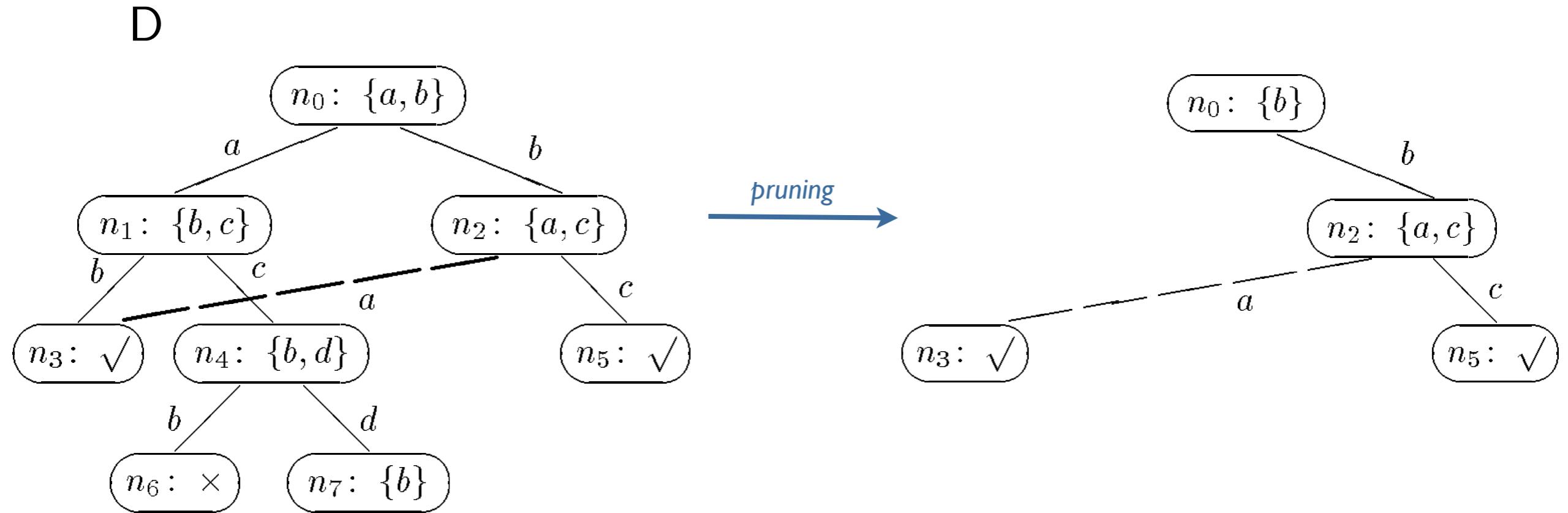
1. **let** D **be** the growing DAG.
generate the root of the DAG
2. Process the nodes in D in breadth first order:
 - A. **let** $H(n)$ **be** the set of edge labels on the path from the root to n
 - B. **if** $\forall x \in C, x \cap H(n) \neq \emptyset$ **then** label n by ✓
else label n by S **where** S is the first member of C for which $S \cap H(n) = \emptyset$
 - C. **if** n is labeled by a set $S \in C$
then $\forall s \in S$, **generate** a new downward arc labeled by s. This arc leads to a new node m with $H(m) = H(n) \cup \{s\}$.

+ PRUNING

Reiter's Theory of Diagnosis

[Reiter'87]

Example **HS-DAG** [Greiner'89]



$$C = \{\{a,b\}, \{b,c\}, \{a,c\}, \{a,b\}, \{b,d\}, \{b\}\}$$

$$H(n_3) = \{a,b\}, H(n_5) = \{b,c\}$$

Reiter's Theory of Diagnosis

[Reiter'87]

Theorem

Correctness of HS-DAG algorithm [Greiner'89,Th 2]

Given the ordered collection C , the HS-DAG algorithm returns a particular labeled DAG such that;

1. For all nodes labeled by \checkmark , $H(n)$ is a minimal hitting set;
2. Every minimal hitting set for C is $H(n)$ for some node n whose label is \checkmark .

Reiter's Theory of Diagnosis

[Reiter'87]

Property

Diagnosis cardinality [Reiner'87]

The breadth-first generation of the DAG results in the computation of diagnosis in order of increasing cardinality. If diagnosis of cardinality lower than k are desired, then HS-DAG can stop growing the DAG at level k .

Reiter's Theory of Diagnosis

[Reiter'87]

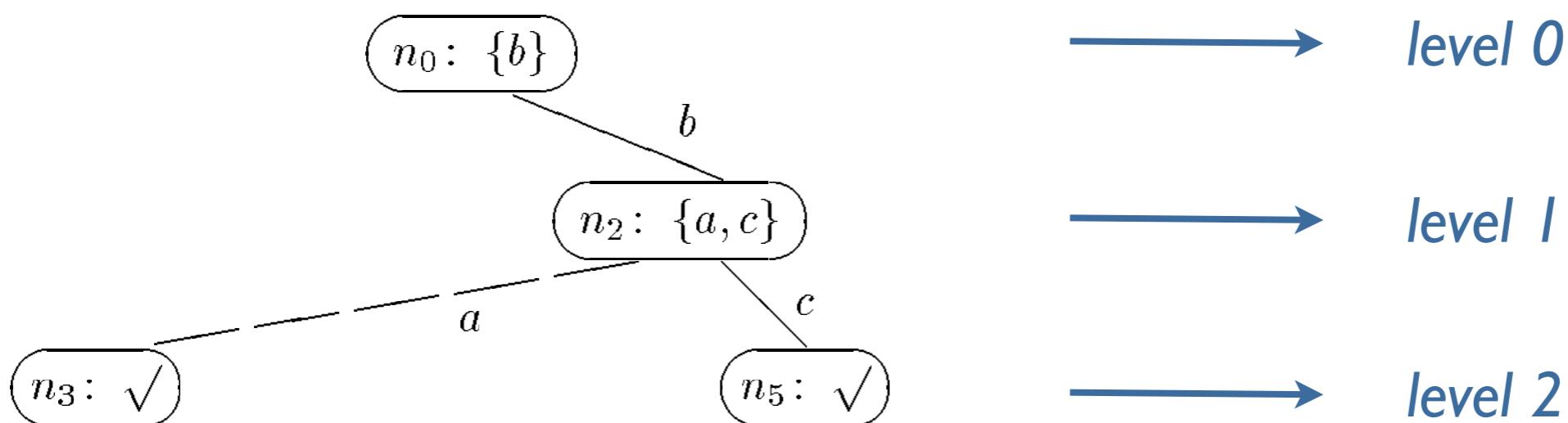
Property

Diagnosis cardinality [Reiner'87]

The breadth-first generation of the DAG results in the computation of diagnosis in order of increasing cardinality. If diagnosis of cardinality lower than k are desired, then HS-DAG can stop growing the DAG at level k .

Example

HS-DAG [Greiner'89]



Reiter's Theory of Diagnosis

[Reiter'87]

- and much more:
 - ▶ min # calls to solver
 - ▶ single fault diagnosis
 - ▶ predictors
 - ▶ relationship with default logic
 - ▶ ...

Repair

Explanation

Diagnosis

Conflict



**model-based
diagnosis**

Repair

Explanation

Diagnosis

Solver

QuickXplain

QuickXplain

[Junker'04]

- Complex problem:
 - ▶ exponential # conflicts: explain failure
 - ▶ exponential # relaxations: restore consistency
- Users of interactive applications want:
 - ▶ explanations for most important constraints
 - ▶ preference-based relaxation

QuickXplain

[Junker'04]

Example

Preferred explanation [Junker'04]

Example 1 A customer wants to buy a station-wagon with following options, but has a limited budget of 3000:

	Option	Requirement ρ_i	Costs
1.	roof racks	$x_1 = 1$	$k_1 = 500$
2.	CD-player	$x_2 = 1$	$k_2 = 500$
3.	one additional seat	$x_3 = 1$	$k_3 = 800$
4.	metal color	$x_4 = 1$	$k_4 = 500$
5.	special luxury version	$x_5 = 1$	$k_5 = 2600$

where the boolean variable $x_i \in \{0, 1\}$ indicates whether the i -th option is chosen and the costs $y = \sum_{i=1}^5 k_i \cdot x_i$ are smaller than the total budget of 3000.

QuickXplain

[Junker'04]

Example

Preferred explanation [Junker'04]

Requirement	Deduction	Argument/Conflict
$\rho_1 : x_1 = 1$	$y \geq 500$	$\{\rho_1\}$
$\rho_2 : x_2 = 1$	$y \geq 1000$	$\{\rho_1, \rho_2\}$
$\rho_3 : x_3 = 1$	$y \geq 1800$	$\{\rho_1, \rho_2, \rho_3\}$
$\rho_4 : x_4 = 1$	$y \geq 2300$	$\{\rho_1, \rho_2, \rho_3, \rho_4\}$
$\rho_5 : x_5 = 1$	$y \geq 4900$ <i>fail</i>	$\{\rho_1, \rho_2, \rho_3, \rho_4, \rho_5\}$

*complete set
of requirements*

Table 1: Computing a conflict during propagation.



*minimal
(irreducible)
conflicts*

QuickXplain

[Junker'04]

Example

Preferred explanation [Junker'04]

Requirement	Deduction	Argument/Conflict
$\rho_4 : x_4 = 1$	$y \geq 500$	$\{\rho_4\}$
$\rho_5 : x_5 = 1$	$y \geq 3100$	$\{\rho_4, \rho_5\}$
	<i>fail</i>	$\{\rho_4, \rho_5\}$

Table 2: Propagation for producing a minimal conflict.

QuickXplain

[Junker'04]

Example

Preferred explanation [Junker'04]

Requirement	Deduction	Argument/Conflict
$\rho_4 : x_4 = 1$	$y \geq 500$	$\{\rho_4\}$
$\rho_5 : x_5 = 1$	$y \geq 3100$	$\{\rho_4, \rho_5\}$
	<i>fail</i>	$\{\rho_4, \rho_5\}$

Table 2: Propagation for producing a minimal conflict.

Requirement	Deduction	Argument/Conflict
$\rho_3 : x_3 = 1$	$y \geq 800$	$\{\rho_3\}$
$\rho_5 : x_5 = 1$	$y \geq 3400$	$\{\rho_3, \rho_5\}$
	<i>fail</i>	$\{\rho_3, \rho_5\}$

Table 3: A preferred explanation for $\rho_3 \prec \rho_1 \prec \rho_2 \prec \rho_5 \prec \rho_4$.

QuickXplain

[Junker'04]

Definition *Problem* [Junker'04]

A problem P is defined as a pair (B,C) where:

1. B is the set of background constraints. Constraints in B cannot be relaxed;
2. C is the set of user requirements. Constraints in C can be relaxed.

QuickXplain

[Junker'04]

Definition *Problem* [Junker'04]

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1. B is the set of background constraints. Constraints in B cannot be relaxed;
2. C is the set of user requirements. Constraints in C can be relaxed.

Note

Relation with Reiter's (SD,COMPONENTS,OBS)

B \approx SD (system description)

C \approx OBS (observation)

variables \approx COMPONENTS

QuickXplain

[Junker'04]

Definition *Relaxation of a problem* [Junker'04, Def I]

A set $R \subseteq C$ is a *relaxation* of a problem $P = (B, C)$ iff $B \cup R$ has **a** solution.

Definition *Conflict of a problem* [Junker'04, Def I]

A set $F \subseteq C$ is a *conflict* of a problem $P = (B, C)$ iff $B \cup F$ has **no** solution.

QuickXplain

[Junker'04]

Example

Relaxation vs Conflict [Junker'04]

Example 1 A customer wants to buy a station-wagon with following options, but has a limited budget of 3000:

	<i>Option</i>	<i>Requirement</i> ρ_i	<i>Costs</i>
1.	<i>roof racks</i>	$x_1 = 1$	$k_1 = 500$
2.	<i>CD-player</i>	$x_2 = 1$	$k_2 = 500$
3.	<i>one additional seat</i>	$x_3 = 1$	$k_3 = 800$
4.	<i>metal color</i>	$x_4 = 1$	$k_4 = 500$
5.	<i>special luxury version</i>	$x_5 = 1$	$k_5 = 2600$

where the boolean variable $x_i \in \{0, 1\}$ indicates whether the i -th option is chosen and the costs $y = \sum_{i=1}^5 k_i \cdot x_i$ are smaller than the total budget of 3000.

B: $y \leq 3000$

C: $x_1=1, x_2=1, x_3=1, x_4=1, x_5=1$

QuickXplain

[Junker'04]

Example

Relaxation vs Conflict [Junker'04]

B: $y \leq 3000$

C: $x_1=1, x_2=1, x_3=1, x_4=1, x_5=1$

Requirement	Deduction	Argument/Conflict
$\rho_1 : x_1 = 1$	$y \geq 500$	$\{\rho_1\}$
$\rho_2 : x_2 = 1$	$y \geq 1000$	$\{\rho_1, \rho_2\}$
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	<i>fail</i>	$\{\rho_1, \rho_2, \rho_3, \rho_4, \rho_5\}$

Table 1: Computing a conflict during propagation.

F: $\{x_1=1, x_2=1, x_3=1, x_4=1, x_5=1\}$

R: {}

QuickXplain

[Junker'04]

Definition

Maximal relaxation of a problem [Junker'04]

A relaxation $R \subseteq C$ is *maximal* (non-extensible) iff there is no other relaxation $R' \supseteq R$ s.t. $B \cup R'$ has a solution.

Definition

Minimal conflict of a problem [Junker'04]

A conflict $F \subseteq C$ is *minimal* (irreducible) iff for every $F' \subseteq F$ $B \cup F'$ has a solution.

QuickXplain

[Junker'04]

Example

Maximal relaxation vs Minimal conflict [Junker'04]

B: $y \leq 3000$

C: $x_1=1, x_2=1, x_3=1, x_4=1, x_5=1$

Requirement	Deduction	Argument/Conflict
$\rho_4 : x_4 = 1$	$y \geq 500$	$\{\rho_4\}$
$\rho_5 : x_5 = 1$	$y \geq 3100$	$\{\rho_4, \rho_5\}$
	<i>fail</i>	$\{\rho_4, \rho_5\}$

Table 2: Propagation for producing a minimal conflict.

F: $\{x_4=1, x_5=1\}$

R: $\{x_1=1, x_2=1, x_3=1\}$

QuickXplain

[Junker'04]

Definition *Preference relation* [Junker'04]

The strict partial order between the constraints of C , denoted by $<$, defines a *preference relation* between constraints. We write $c_1 < c_2$ iff the selection of c_1 is preferred to the selection of c_2 .

QuickXplain

[Junker'04]

Definition *Preference relation* [Junker'04]

The strict partial order between the constraints of C, denoted by $<$, defines a *preference relation* between constraints. We write $c_1 < c_2$ iff the selection of c_1 is preferred to the selection of c_2 .

Definition *Linearization* [Junker'04]

A *linearization* \prec of $<$ is a strict total order that is a superset of $<$ and which describes a complete ranking.

QuickXplain

[Junker'04]

Definition *Preferred relaxation over a strict total order* [Junker'04, Def 4]

Let $P=(B,C,<)$ be a totally ordered problem. A relaxation R of P is a *preferred relaxation* of P iff there is no other relaxation R' of P s.t. $R' <_{\text{lex}} R$.



has more
preferred
constraints

QuickXplain

[Junker'04]

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Definition *Preferred relaxation over a strict partial order* [Junker'04, Def 5]

Let $P=(B,C,<)$ be a partially ordered problem. A relaxation R of P is a *preferred relaxation* of P iff there is a linearization $<$ of $<$ s.t. R is a preferred relaxation of $(B,C,<)$.

QuickXplain

[Junker'04]

Definition *Preferred conflict over a strict total order* [Junker'04, Def 7]

Let $P=(B,C,<)$ be a totally ordered problem. A conflict F of P is a *preferred conflict* of P iff there is no other relaxation F' of P s.t. $F' <_{\text{antilex}} F$.



has less
preferred
constraints

QuickXplain

[Junker'04]

Definition *Preferred conflict over a strict total order* [Junker'04, Def 7]

Let $P=(B,C,<)$ be a totally ordered problem. A conflict F of P is a *preferred conflict* of P iff there is no other relaxation F' of P s.t. $F' <_{\text{antilex}} F$.



Definition *Preferred conflict over a strict partial order* [Junker'04, Def 8]

Let $P=(B,C,<)$ be a partially ordered problem. A conflict F of P is a *preferred conflict* of P iff there is a linearization $<$ of $<$ s.t. F is a preferred conflict of $(B,C,<)$.

QuickXplain

[Junker'04]

Example

Maximal relaxation vs Minimal conflict [Junker'04]

B: $y \leq 3000$

C: $x_1=1, x_2=1, x_3=1, x_4=1, x_5=1$

Requirement	Deduction	Argument/Conflict
$\rho_3 : x_3 = 1$	$y \geq 800$	$\{\rho_3\}$
$\rho_5 : x_5 = 1$	$y \geq 3400$	$\{\rho_3, \rho_5\}$
	<i>fail</i>	$\{\rho_3, \rho_5\}$

Table 3: A preferred explanation for $\rho_3 \prec \rho_1 \prec \rho_2 \prec \rho_5 \prec \rho_4$.

F: $\{x_3=1, x_5=1\}$

R: $\{x_1=1, x_2=1, x_4=1\}$

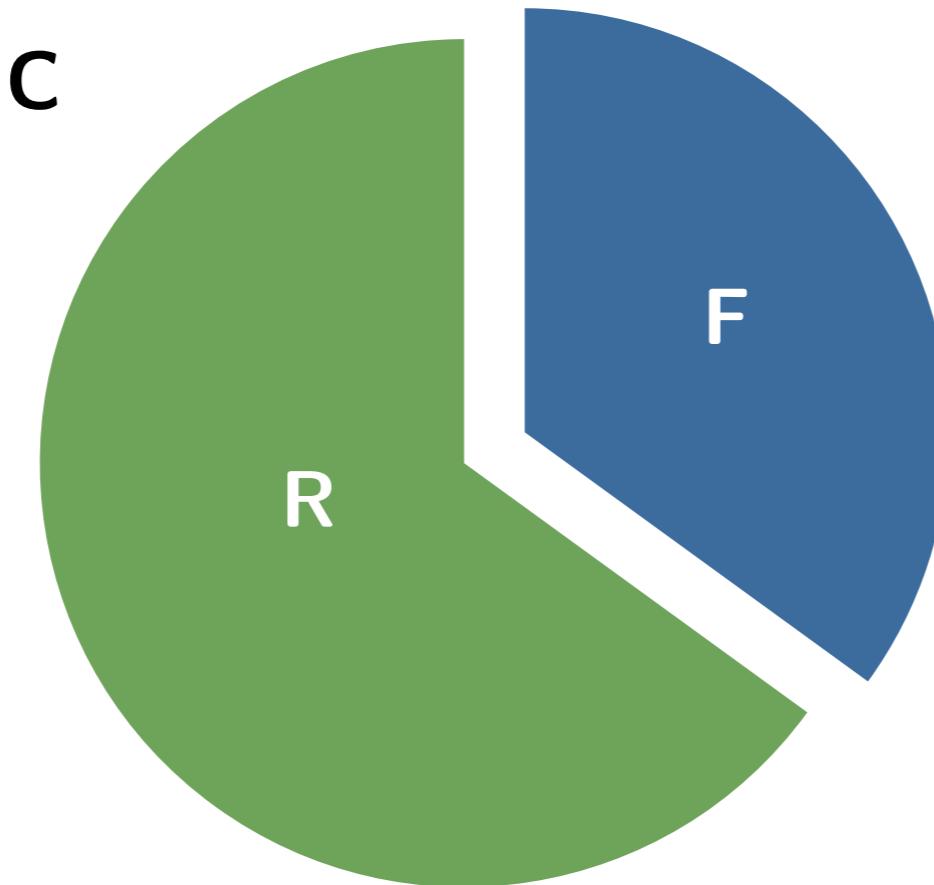
QuickXplain

[Junker'04]

Proposition

Preference duality [Junker'04, Prop 4]

If F is a preferred conflict of $P=(B,C,<)$ and R is a preferred relaxation of P , then the $<$ -minimal element of $C-R$ is equal to the $<$ -maximal elements of F .



QuickXplain

[Junker'04]

Algorithm

QuickXplain [Junker'04]

QuickXplain(B, C, \prec)

1. **if** $\text{isConsistent}(B \cup C)$ **return** “no conflict”
2. **else if** $C = \emptyset$ **then return** \emptyset
3. **else return** QuickXplain’(B, B, C, \prec)

QuickXplain’(B, Δ, C, \prec)

4. **if** $\Delta \neq \emptyset$ **and** $\neg \text{isConsistent}(B)$ **then return** \emptyset
5. **if** $C = \{c\}$ **then return** $\{c\}$
6. **let** c_1, \dots, c_n **be an enumeration of** C **that respects** \prec
7. **let** k **be** $\text{split}(n)$ **where** $1 \leq k \leq n$
8. $C_1 = \{c_1, \dots, c_k\}$ **and** $C_2 = \{c_{k+1}, \dots, c_n\}$
9. $\Delta_2 = \text{QuickXplain}'(B \cup C_1, C_1, C_2, \prec)$
10. $\Delta_1 = \text{QuickXplain}'(B \cup \Delta_2, \Delta_2, C_1, \prec)$
11. **return** $\Delta_1 \cup \Delta_2$

QuickXplain

[Junker'04]

Theorem

QuickXplain's termination [Junker'04, Th I]

The algorithm $\text{QuickXplain}(B, C, \prec)$ always terminates. If $B \cup C$ has a solution then it returns “no conflict”. Otherwise, it returns a preferred conflict of (B, C, \prec) .

QuickXplain

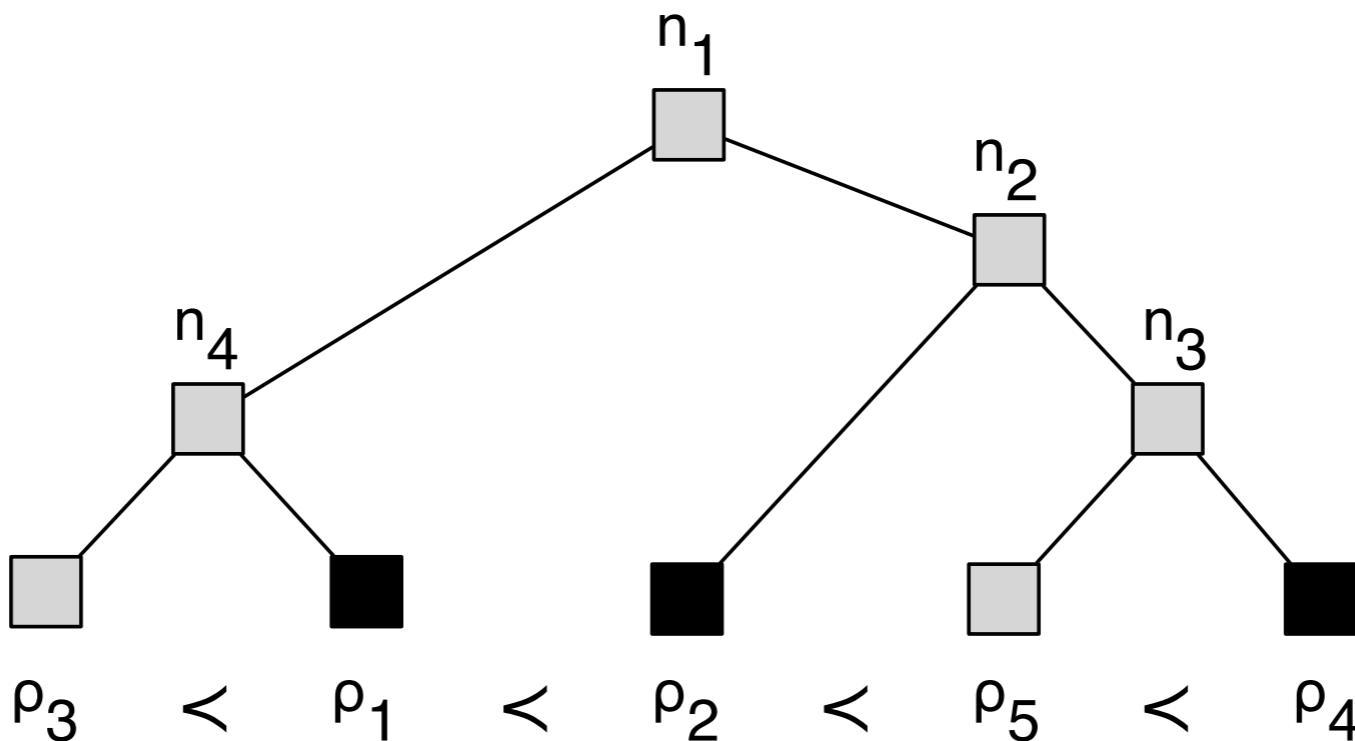
[Junker'04]

Example

Call graph of QuickXplain algorithm [Junker'04]

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	<i>fail</i>	$\{\rho_3, \rho_5\}$

Table 3: A preferred explanation for $\rho_3 \prec \rho_1 \prec \rho_2 \prec \rho_5 \prec \rho_4$.



QuickXplain in Reiter's theory

Diagnosis



Property

Minimal conflict set [Reiter'87]

If the solver returns only minimal conflict sets, no edge will ever be marked redundant, which simplifies the generation algorithm.



Solver

QuickXplain

Repair

Explanation

Diagnosis

Solver



QuickXplain

Optimal relaxation

[Jannach'06]

- Research question:
 - ▶ How to efficiently find customer-optimal relaxations for a given recommendation problem?
- Approach:
 - ▶ model-based diagnosis
 - ▶ best-effort search algorithm

Optimal relaxation

[Jannach'06]

Example

Camera recommender system [Jannach'06]

P = product database

ID	USB	Firewire	Price	Resolution	Make
p1	true	false	400	5	Canon
p2	false	true	500	5	Canon
p3	true	false	200	4	Fuji
p4	false	true	400	5	HP

FRS = filter rules

- f1: IF *the customer requires high-quality printouts of the pictures* THEN
recommend cameras with a resolution of 5 mega-pixels.
- f2: IF *the customer wants to have a cheap camera* THEN
recommend cameras with a price smaller than 300.
- f3: IF *customer needs a USB port* THEN
recommend cameras with a USB port.
- f4: IF *customer wants extended connectivity* THEN
recommend cameras supporting Firewire.
- f5: IN ANY CASE
recommend cameras with a resolution higher than 3 mega-pixels.

Optimal relaxation

[Jannach'06]

Example

Camera recommender system [Jannach'06]

FRS = filter rules

- f1: IF *the customer requires high-quality printouts of the pictures* THEN
recommend cameras with a resolution of 5 mega-pixels.
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- f3: IF *customer needs a USB port* THEN
recommend cameras with a USB port.
- f4: IF *customer wants extended connectivity* THEN
recommend cameras supporting Firewire.
- f5: IN ANY CASE
recommend cameras with a resolution higher than 3 mega-pixels.

CRS = customer requirements

USB-support, extended-connectivity, only cheap cameras, high-quality printouts.

Optimal relaxation

[Jannach'06]

Definition

Optimal relaxation [Jannach'06]

Let:

- RC be a function describing the costs of retracting a single filter $f \in FRS$;
- $COSTS$ be a function describing the costs of a relaxation.

A relaxation R for a recommendation problem $RP = (P, FRS, CRS)$ is optimal iff there does not exist R' such that:

$$COSTS(R', CRS, RC) < COSTS(R, CRS, RC)$$

Representative explanation [O'Sullivan]

- Research question:
 - ▶ How to define and compute representative explanations?
- Approach:
 - ▶ model-based diagnosis
 - ▶ definition of representativeness

Representative explanation [O'Sullivan'07]

Example

Car configuration problem [O'Sullivan'07]

	<i>Option</i>	<i>Selector</i>	<i>Cost</i>
c_1	<i>Budget</i>	$x_1 = 1$	$\sum_{i \in \{2, \dots, 5\}} (k_i \cdot x_i) \leq 3000$
c_2	<i>Roof Rack</i>	$x_2 = 1$	$k_2 = 500$
c_3	<i>Convertible</i>	$x_3 = 1$	$k_3 = 500$
c_4	<i>CD Player</i>	$x_4 = 1$	$k_4 = 500$
c_5	<i>Leather Seats</i>	$x_5 = 1$	$k_5 = 2600$

Assume that the technical constraints of the configuration problem forbid convertible cars having roof racks, therefore, constraints c_2 and c_3 form a conflict. Note that, given the budget constraint, if the user selects option c_5 , it is not possible to have any of the options c_2, c_3, c_4 . \blacktriangle

Minimal conflicts = $\{\{c_2, c_3\}, \{c_1, c_2, c_5\}, \{c_1, c_3, c_5\}, \{c_1, c_4, c_5\}\}$

Representative explanation [O'Sullivan'07]

Example *Car configuration problem* [O'Sullivan'07]

Table 1: The set of relaxations and exclusion sets for the over-constrained problem presented in Example 1. We show both the subset of the constraints in the relaxation (marked with a ✓) and those that are in the exclusion set, i.e. those that must be removed (marked with a ×).

Exp.	Constraints					Relaxation	Exclusion Set
	c_1	c_2	c_3	c_4	c_5		
I	×	×	✓	✓	✓	$\{c_3, c_4, c_5\}$	$\{c_1, c_2\}$
II	×	✓	×	✓	✓	$\{c_2, c_4, c_5\}$	$\{c_1, c_3\}$
III	✓	×	✓	✓	×	$\{c_1, c_3, c_4\}$	$\{c_2, c_5\}$
IV	✓	✓	×	✓	×	$\{c_1, c_2, c_4\}$	$\{c_3, c_5\}$
V	✓	×	×	×	✓	$\{c_1, c_5\}$	$\{c_2, c_3, c_4\}$

Exponential number of relaxation/exclusion sets!

Representative explanation [O'Sullivan'07]

Example

Car configuration problem [O'Sullivan'07]

Option I: every constraint that appears in a relaxation appears at least once in a relaxation in our chosen subset.

Table 2: A set of representative relaxations.

Explanation	Constraints				
	c_1	c_2	c_3	c_4	c_5
I	✗	✗	✓	✓	✓
II	✗	✓	✗	✓	✓
III	✓	✗	✓	✓	✗

Representative explanation [O'Sullivan'07]

Example

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I	✗	✗	✓	✓	✓
II	✗	✓	✗	✓	✓
III	✓	✗	✓	✓	✗



never
excluded?

Representative explanation [O'Sullivan'07]

Example

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I	✗	✗	✓	✓	✓
II	✗	✓	✗	✓	✓
III	✓	✗	✓	✓	✗

never
 c_1 and c_5 ?



never
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Representative explanation [O'Sullivan'07]

Example

Car configuration problem [O'Sullivan'07]

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II	✗	✓	✗	✓	✓
III	✓	✗	✓	✓	✗

never
 c_1 and c_5 ?



never
excluded?



Explanation V



Representative explanation [O'Sullivan'07]

Example

Car configuration problem [O'Sullivan'07]

Option 2: every constraint that must be relaxed once, appears in at least one exclusion set.

Table 3: A set of representative exclusion sets.

Explanation	Constraints				
	c_1	c_2	c_3	c_4	c_5
I	✗	✗	✓	✓	✓
III	✓	✗	✓	✓	✗
V	✓	✗	✗	✗	✓

Representative explanation [O'Sullivan'07]

Example

Car configuration problem [O'Sullivan'07]

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Table 3: A set of representative exclusion sets.

Explanation	Constraints				
	c_1	c_2	c_3	c_4	c_5
I	✗	✗	✓	✓	✓
III	✓	✗	✓	✓	✗
V	✓	✗	✗	✗	✓



always
excluded?

Representative explanation [O'Sullivan'07]

Example *Car configuration problem* [O'Sullivan'07]

Option 2: every constraint that must be relaxed once, appears in at least one exclusion set.

Table 3: A set of representative exclusion sets.

Explanation	Constraints				
	c_1	c_2	c_3	c_4	c_5
I	✗	✗	✓	✓	✓
III	✓	✗	✓	✓	✗
V	✓	✗	✗	✗	✓

↑
always
excluded? → Explanations II, IV

Representative explanation [O'Sullivan'07]

Example

Car configuration problem [O'Sullivan'07]

Option 3: set of explanations should contain at least:

1. one maximal relaxation containing each satisfiable constraint
2. one minimal exclusion containing each excludable constraint

Table 4: A set of representative explanations.

Explanation	Constraints				
	c_1	c_2	c_3	c_4	c_5
I	✗	✗	✓	✓	✓
IV	✓	✓	✗	✓	✗
V	✓	✗	✗	✗	✓

Representative explanation [O'Sullivan'07]

Definition *Maximal relaxation set* [O'Sullivan'07]

Let ρ be the set of all *maximal relaxations* of a problem $P=(B,C)$. Every pair of maximal relaxations are set-wise incomparable:

$$\forall R_i, R_j \in \rho : i \neq j \wedge R_i \not\subseteq R_j \wedge R_i \not\supseteq R_j$$

Representative explanation [O'Sullivan'07]

Definition *Maximal relaxation set* [O'Sullivan'07]

Let ρ be the set of all *maximal relaxations* of a problem $P=(B,C)$. Every pair of maximal relaxations are set-wise incomparable:

$$\forall R_i, R_j \in \rho : i \neq j \wedge R_i \not\subseteq R_j \wedge R_i \not\supseteq R_j$$

Definition *Minimal exclusion (conflict) set* [O'Sullivan'07]

Let Φ be the set of all *minimal exclusions* (conflicts) of a problem $P=(B,C)$. Every pair of minimal exclusions are set-wise incomparable:

$$\forall C_i, C_j \in \Phi : i \neq j \wedge C_i \not\subseteq C_j \wedge C_i \not\supseteq C_j$$

Representative explanation [O'Sullivan'07]

Definition

Representative set of explanations [O'Sullivan'07]

Given a problem $P=(B,C)$ that is inconsistent, $\rho' \subseteq \rho$ a set of maximal relaxations of P , and $\Phi' = \{C - R \mid R \in \rho'\}$ the corresponding set of minimal exclusion sets. The set:

$$X = \{(R, C - R) \mid R \in \rho'\}$$

is a *representative set of explanations* iff:

1. $\forall c \in \bigcup_{R \in \rho} : \exists R \in \rho' : c \in R$
2. $\forall c \in \bigcup_{C \in \Phi'} : \exists C \in \Phi' : c \in C$

Representative explanation [O'Sullivan'07]

Definition *Minimal representative set of explanations* [O'Sullivan'07]

Given a problem $P=(B,C)$ that is inconsistent, a set of representative set of explanations is minimal if any strict subset of it is not representative.

Representative explanation [O'Sullivan'07]

Definition *Minimal representative set of explanations* [O'Sullivan'07]

Given a problem $P=(B,C)$ that is inconsistent, a set of representative set of explanations is minimal if any strict subset of it is not representative.

Theorem *Number of explanations* [O'Sullivan'07]

The size of any minimal representative set of explanations is at most $|C|$, and this bound is tight.

Repair

Explanation

Diagnosis

Solver



QuickXplain

Personalized repairs [Felfernig'09]

- Research question:
 - ▶ How to present a personalized repair approach that integrates the calculation of explanations with collaborative problem solving techniques?
- Approach:
 - ▶ model-based diagnosis
 - ▶ collaborative problem solving (k-nearest neighbour algorithms)

Personalized repairs

[Felfernig'09]

Example

Financial services [Felfernig'09]

Assumption: available knowledge-base of products

id	return-rate (p.a.)	run-time	risk level	shares percentage	accessibility	plow back earnings	blue chip
i ₁	4.2	3.0	A	0	no	yes	yes
i ₂	4.7	3.5	B	10	yes	no	yes
i ₃	4.8	3.5	A	10	yes	yes	yes
i ₄	5.2	4.0	B	20	no	no	no
i ₅	4.3	3.5	A	0	yes	yes	yes
i ₆	5.6	5.0	C	30	no	yes	no
i ₇	6.7	6.0	C	50	yes	no	no
i ₈	7.9	7.0	C	50	no	no	no

$$C = \{\text{return-rate} \geq 5.5(r_1), \text{runtime}=3(r_2), \text{accessibility}=y(r_3), \text{bluechip}=y(r_4)\}$$

Minimal diagnosis: $\{\{r_1, r_2\}, \{r_1, r_3\}, \{r_2, r_4\}\}$

Personalized repairs [Felfernig'09]

Example *Financial services* [Felfernig'09]

Minimal diagnosis: $\{\{r_1, r_2\}, \{r_1, r_3\}, \{r_2, r_4\}\}$

$R = \{\text{accessibility}=y(r_3), \text{bluechip}=y(r_4)\} \rightarrow \mathbf{rep}_1, \mathbf{rep}_2, \mathbf{rep}_3$

$R = \{\text{runtime}=3(r_2), \text{bluechip}=y(r_4)\} \rightarrow \mathbf{rep}_4$

$R = \{\text{return-rate} \geq 5.5(r_1), \text{accessibility}=y(r_3)\} \rightarrow \mathbf{rep}_5$

repair	return-rate	runtime	accessibility	bluechip
\mathbf{rep}_1	4.7	3.5	✓	✓
\mathbf{rep}_2	4.8	3.5	✓	✓
\mathbf{rep}_3	4.3	3.5	✓	✓
\mathbf{rep}_4	4.2	✓	no	✓
\mathbf{rep}_5	✓	6.0	✓	no

} repair alternatives

Personalized repairs [Felfernig'09]

Definition *Similarity function* [Felfernig'09]

Given a problem $P=(B,C)$, the similarity function returns for every item (product) i_j the degree of similarity with the user requirements C .

Personalized repairs [Felfernig'09]

Definition *Similarity function* [Felfernig'09]

Given a problem $P=(B,C)$, the similarity function returns for every item (product) i_j the degree of similarity with the user requirements C .

Example *Similarity function* [Felfernig'09]

$$sim(C, i_j) = \sum_{k=1}^m \left(1 - \frac{|c_k - i_j[k]|}{\max(k) - \min(k)} \right) * w(k)$$

Personalized repairs [Felfernig'09]

Example

Financial services [Felfernig'09]

id	return-rate (p.a.)	run-time	risk level	shares percen- tage	accessi- bility	plow back earnings	blue chip
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i ₈	7.9	7.0	C	50	no	no	no

C: return-rate \geq 5.5(r₁), runtime=3(r₂), accessibility=y(r₃), bluechip=y(r₄)



id	i ₁	i ₂	i ₃	i ₄	i ₅	i ₆	i ₇	i ₈
sim(C,p_i)	.66	.91	.92	.41	.88	.36	.48	.08

Table 4: Calculated $sim(C, i_j)$ for $\{i_1, \dots, i_8\}$

Personalized repairs

[Felfernig'09]

Example

Financial services [Felfernig'09]

id	i_1	i_2	i_3	i_4	i_5	i_6	i_7	i_8
$\text{sim}(C, p_i)$.66	.91	.92	.41	.88	.36	.48	.08

Table 4: Calculated $\text{sim}(C, i_j)$ for $\{i_1, \dots, i_8\}$



nearest neighbours

id	return-rate (p.a.)	run-time	risk level	shares percen- tage	accessi- bility	plow back earnings	blue chip
i_1	4.2	3.0	A	0	no	yes	yes
i_2	4.7	3.5	B	10	yes	no	yes
i_3	4.8	3.5	A	10	yes	yes	yes
i_5	4.3	3.5	A	0	yes	yes	yes
i_7	6.7	6.0	C	50	yes	no	no

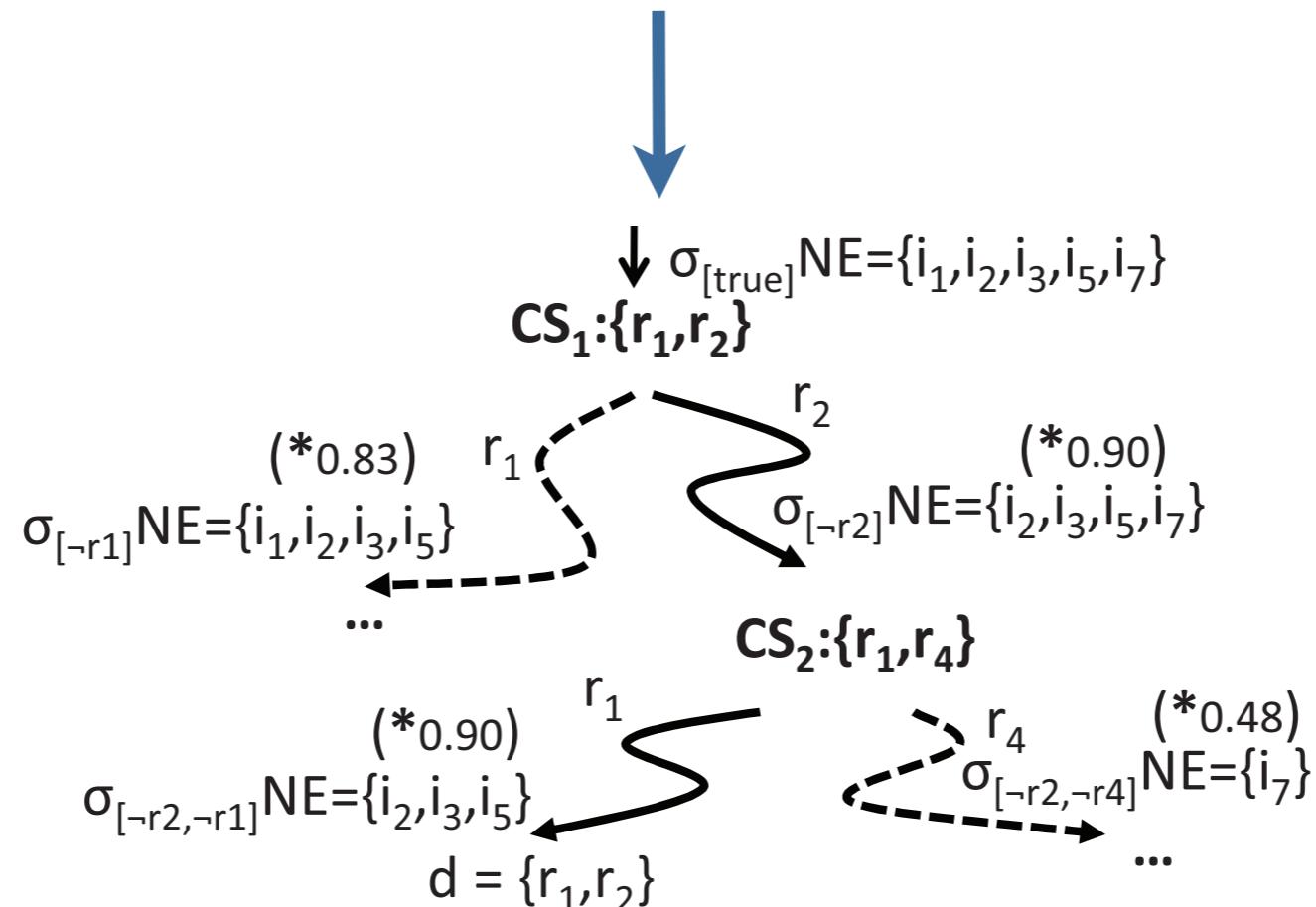
Table 3: Calculated nearest neighbors $\{i_1, i_2, i_3, i_5, i_7\}$

Personalized repairs [Felfernig'09]

Example *Financial services* [Felfernig'09]

id	return-rate (p.a.)	run-time	risk level	shares percen- tage	accessi- bility	plow back earnings	blue chip
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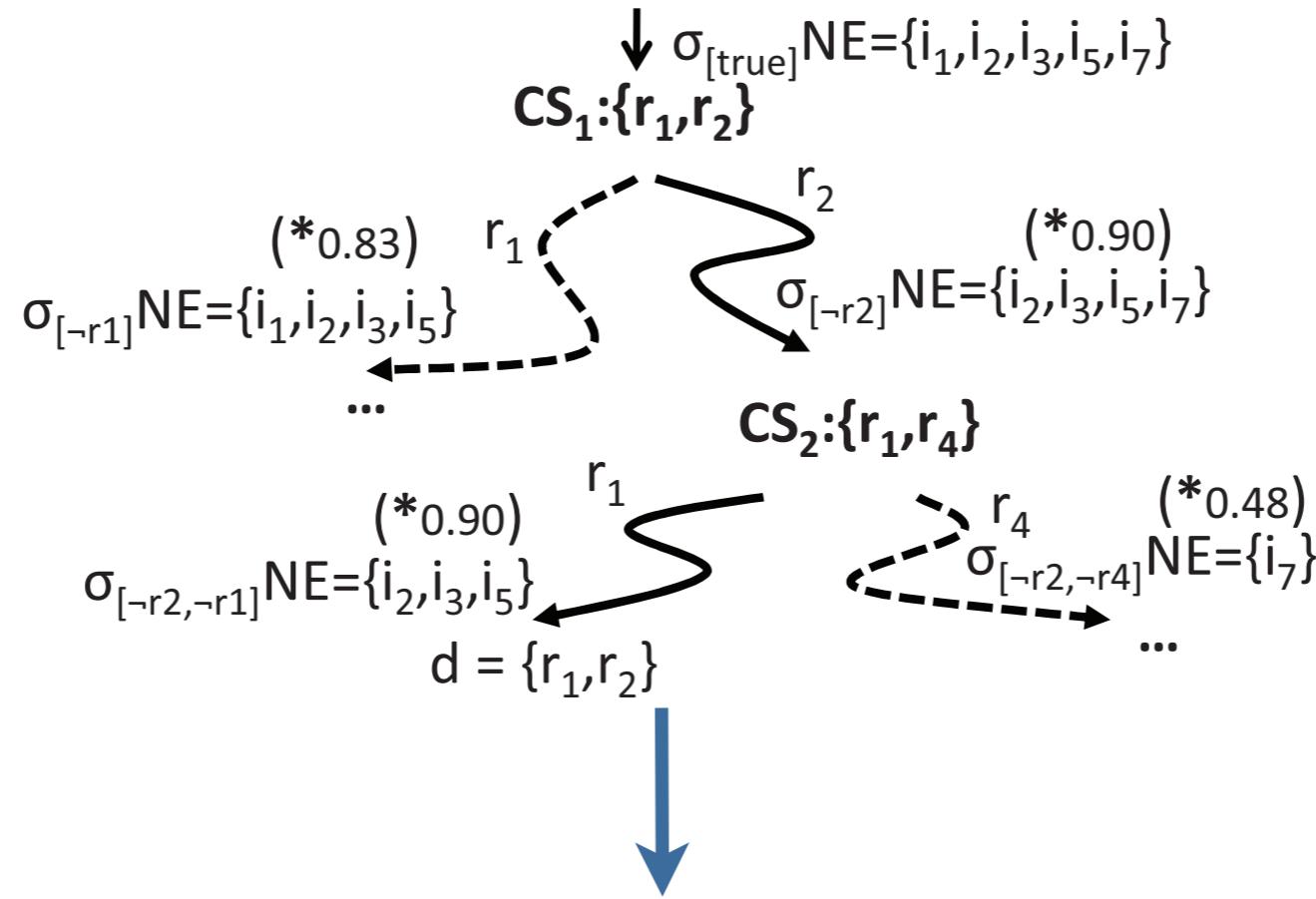
Table 3: Calculated nearest neighbors $\{i_1, i_2, i_3, i_5, i_7\}$



Personalized repairs [Felfernig'09]

Example

Financial services [Felfernig'09]



$F = \{\text{return-rate} \geq 5.5(r_1), \text{runtime}=3(r_2)\}$

Repairs = $\{\{\text{return-rate}=4.7, \text{runtime}=3.5\}, \{\text{return-rate}=4.8, \text{runtime}=3.5\}, \{\text{return-rate}=4.3, \text{runtime}=3.5\}\}$

Repair

Explanation

Diagnosis

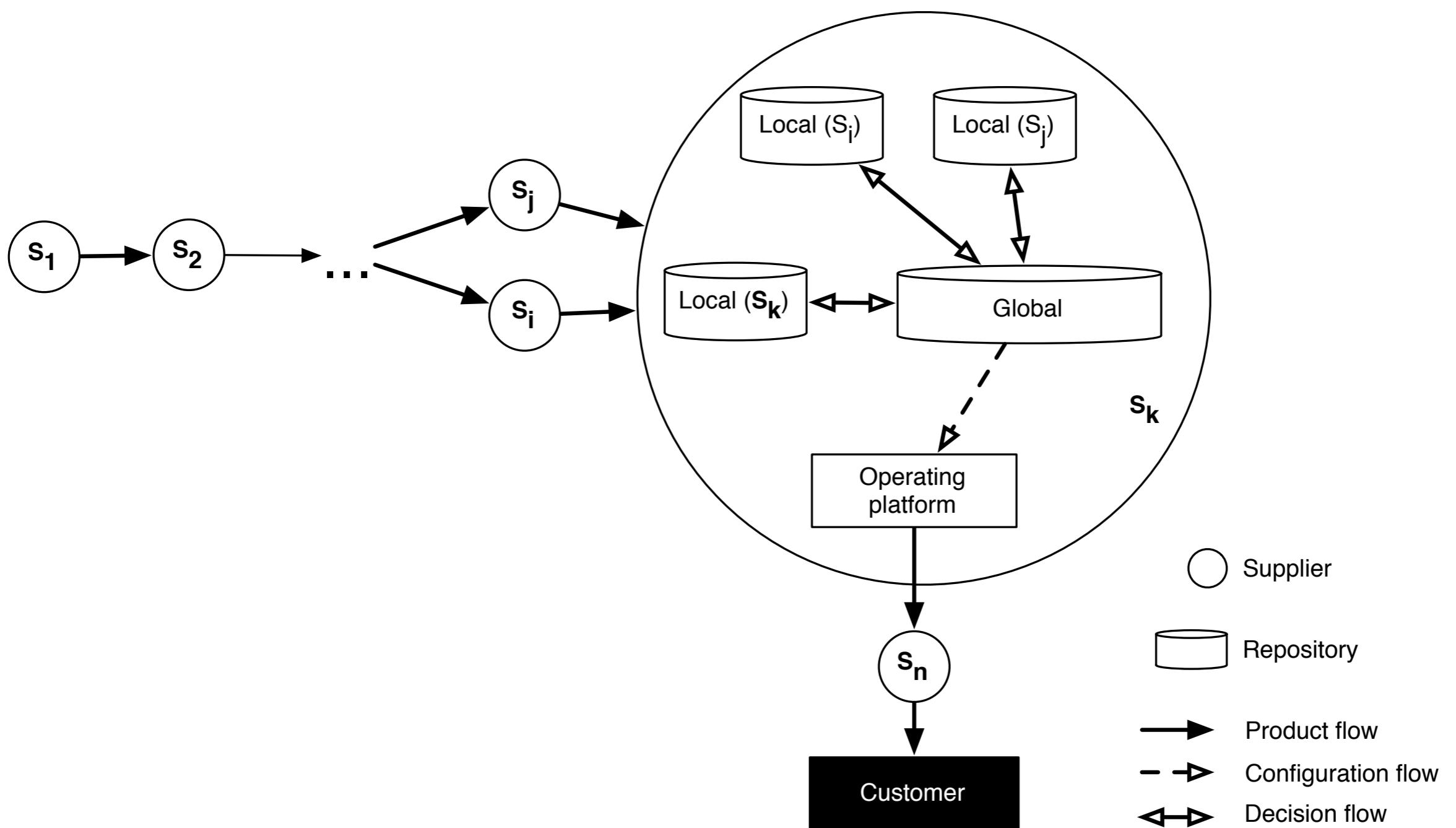
Solver



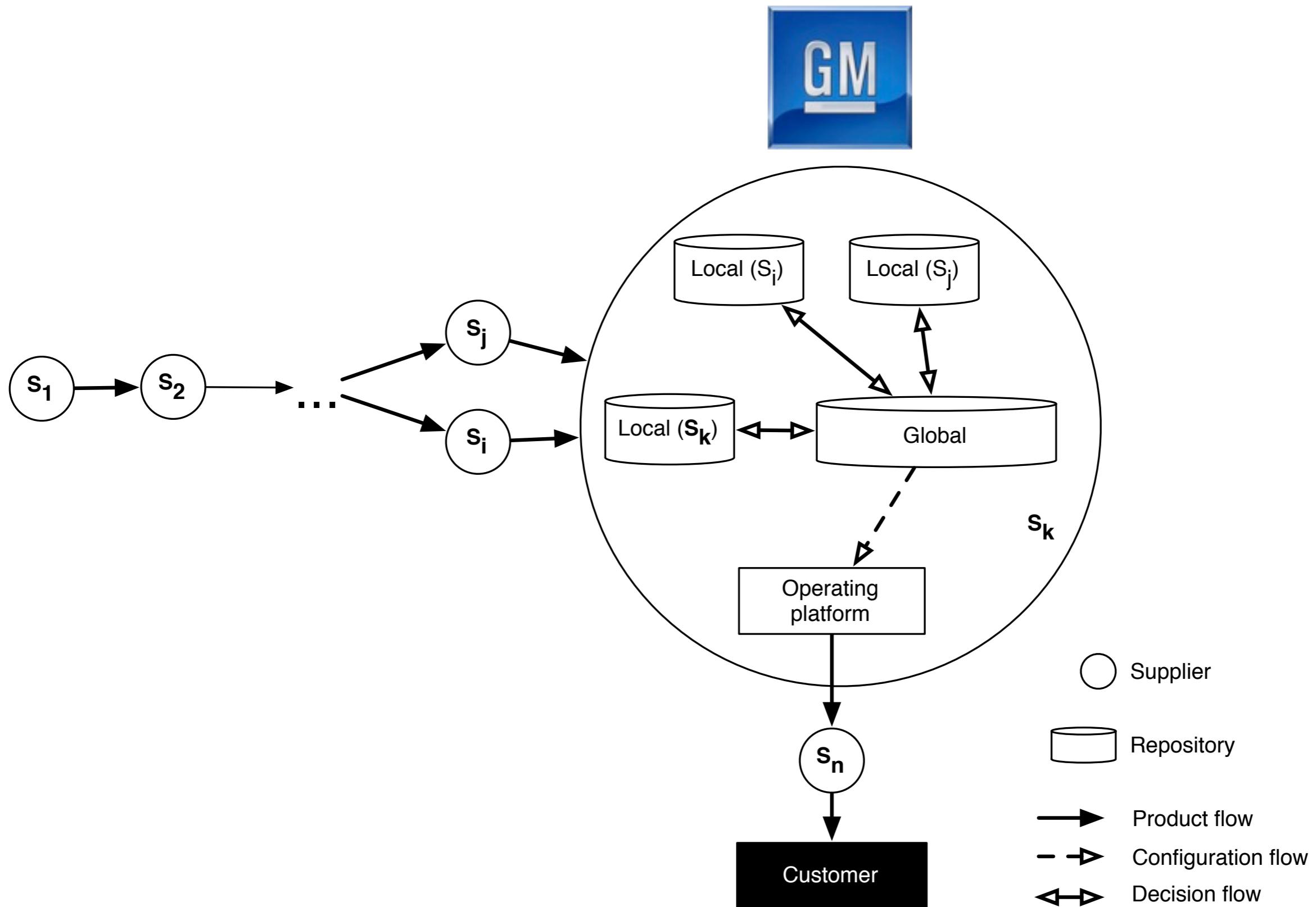
QuickXplain

**Concurrent
configuration
of Feature
Models**

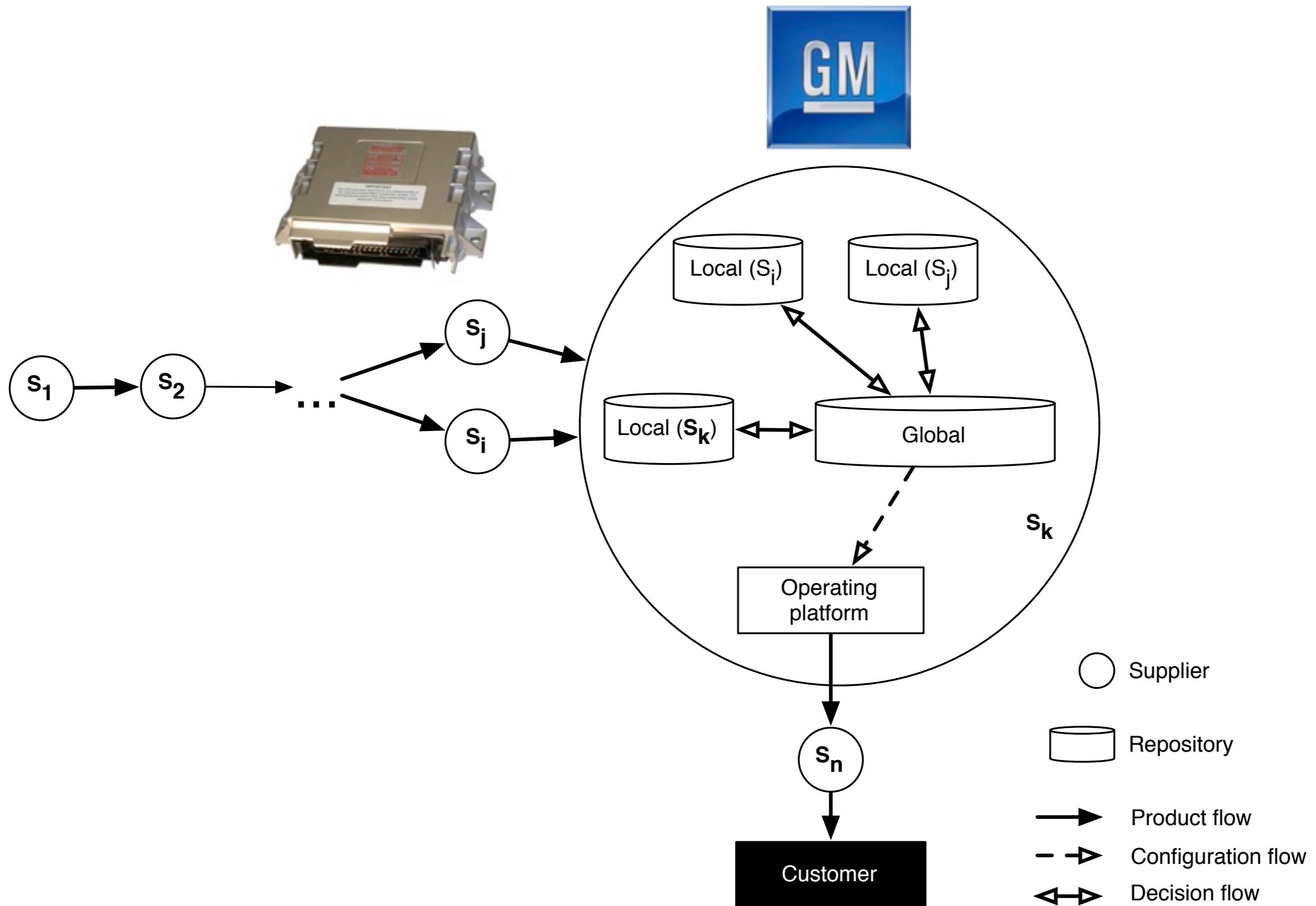
Concurrent configuration



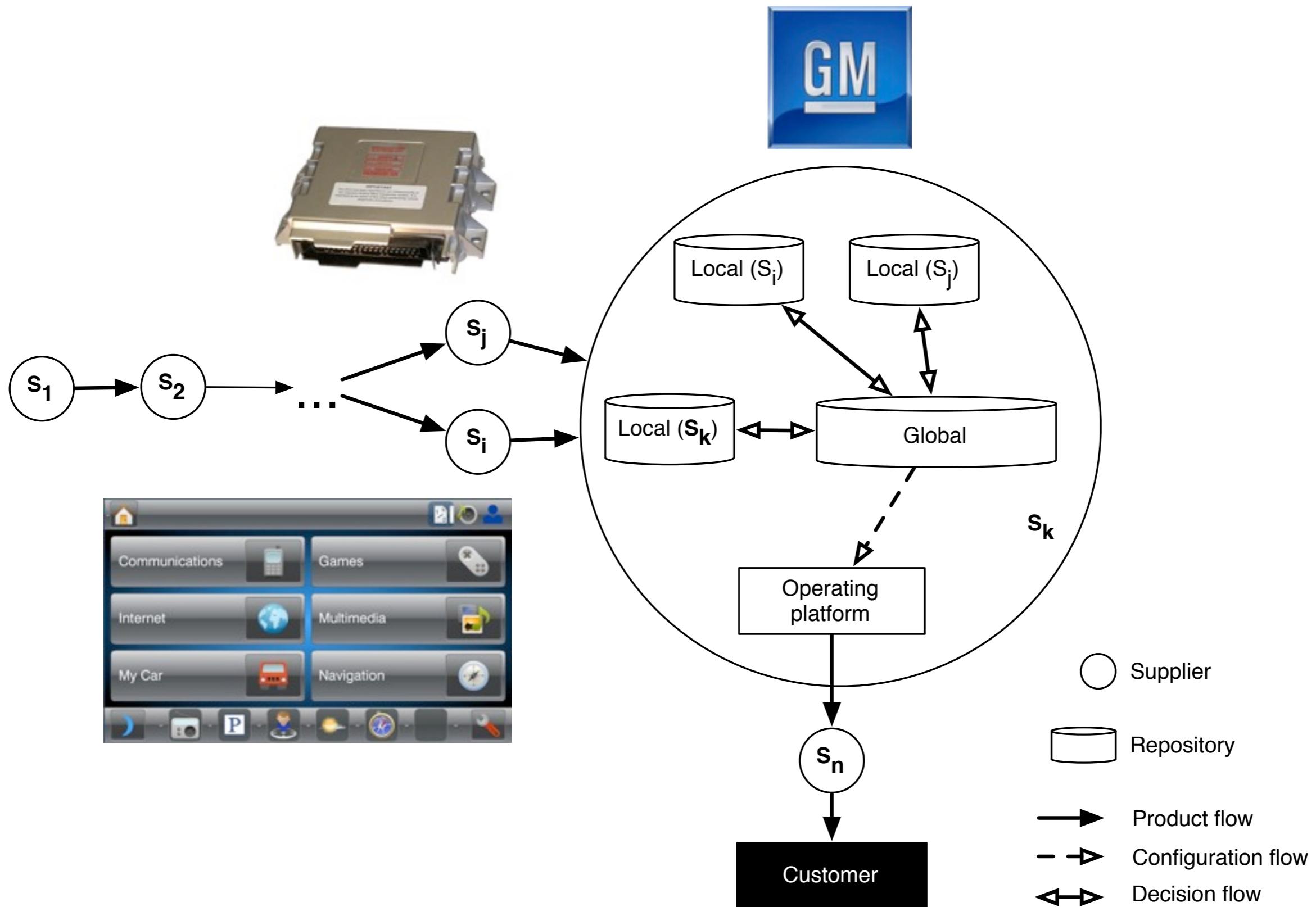
Concurrent configuration



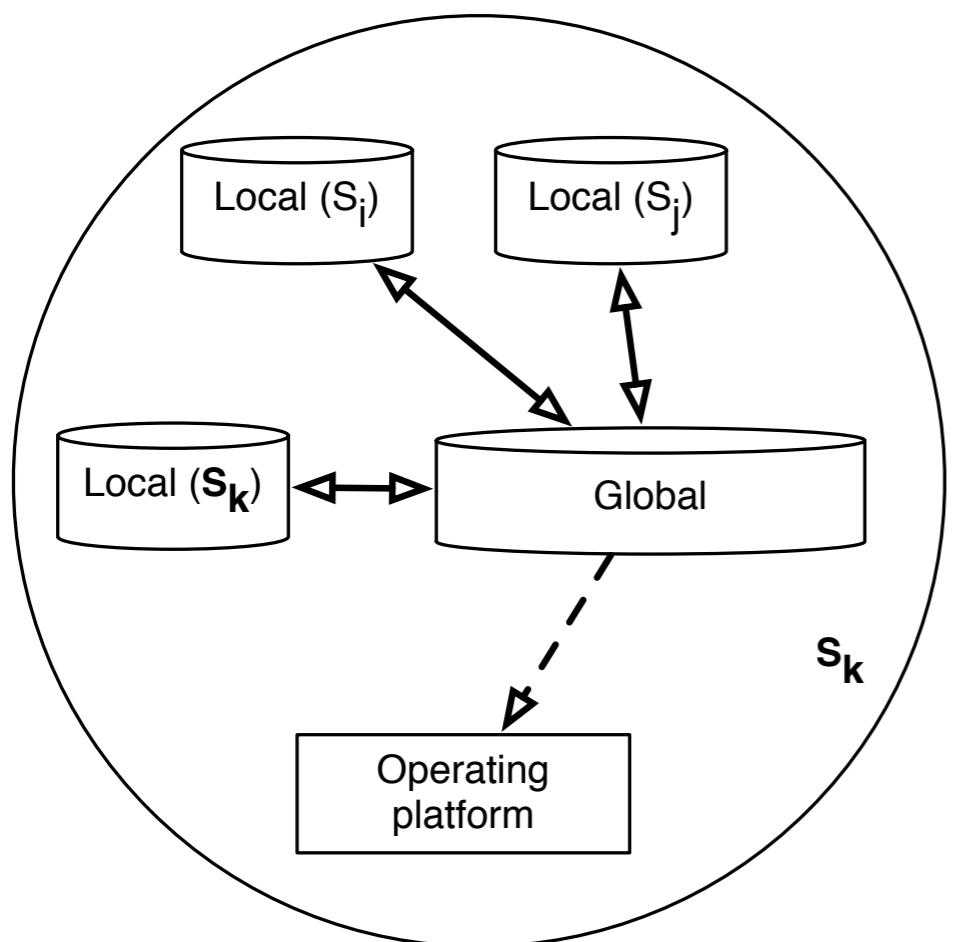
Concurrent configuration



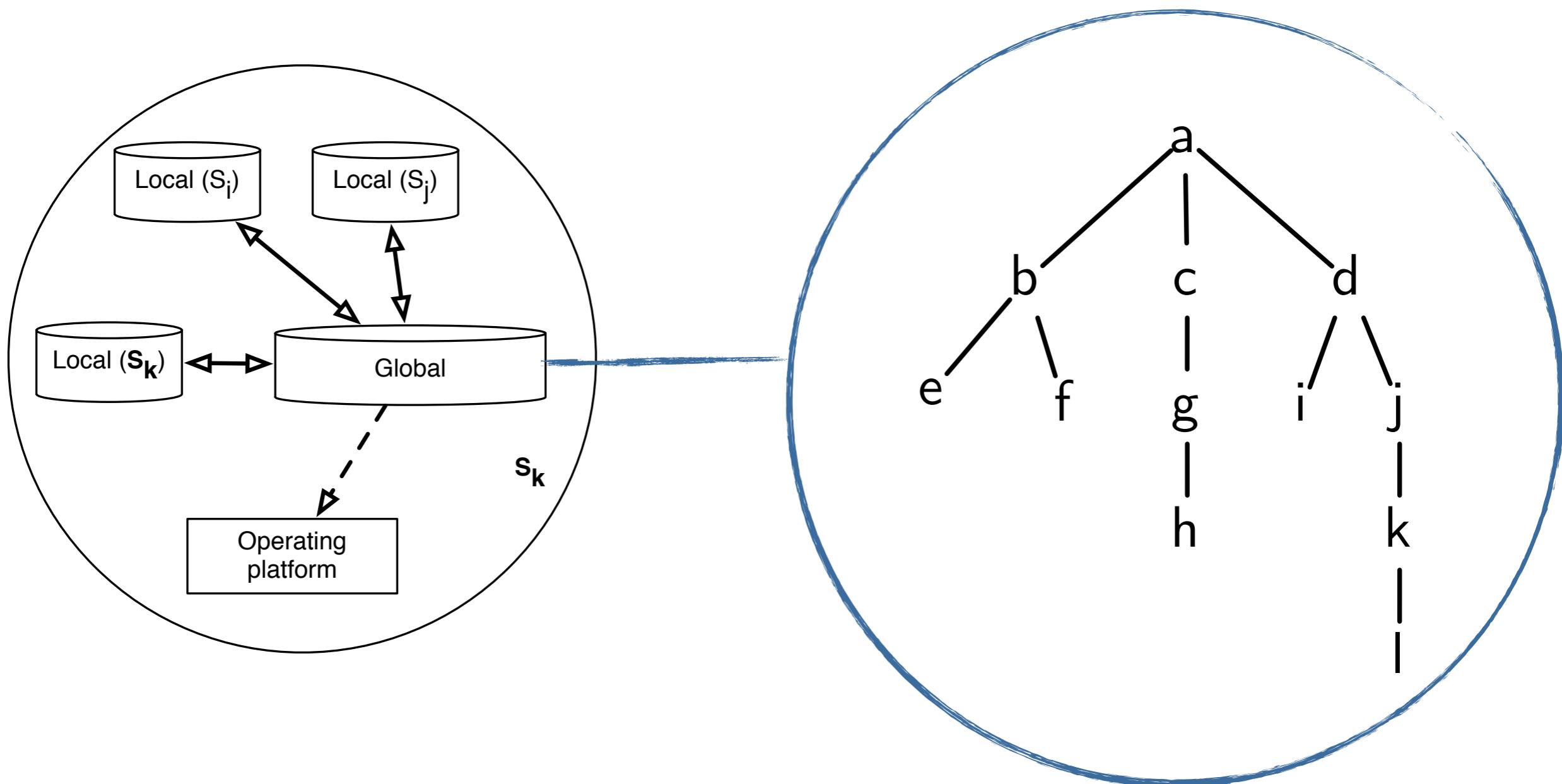
Concurrent configuration



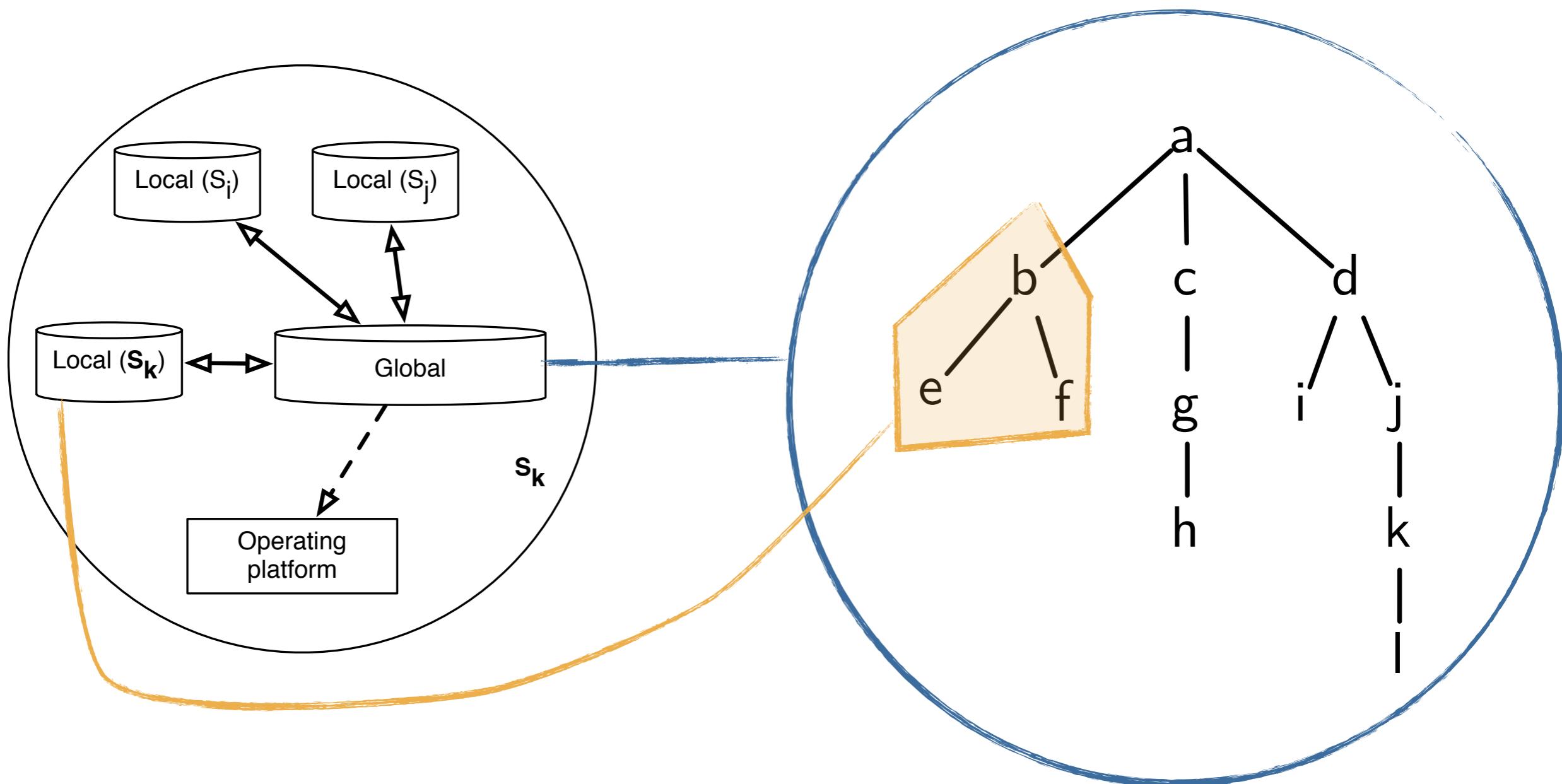
Concurrent configuration of FM



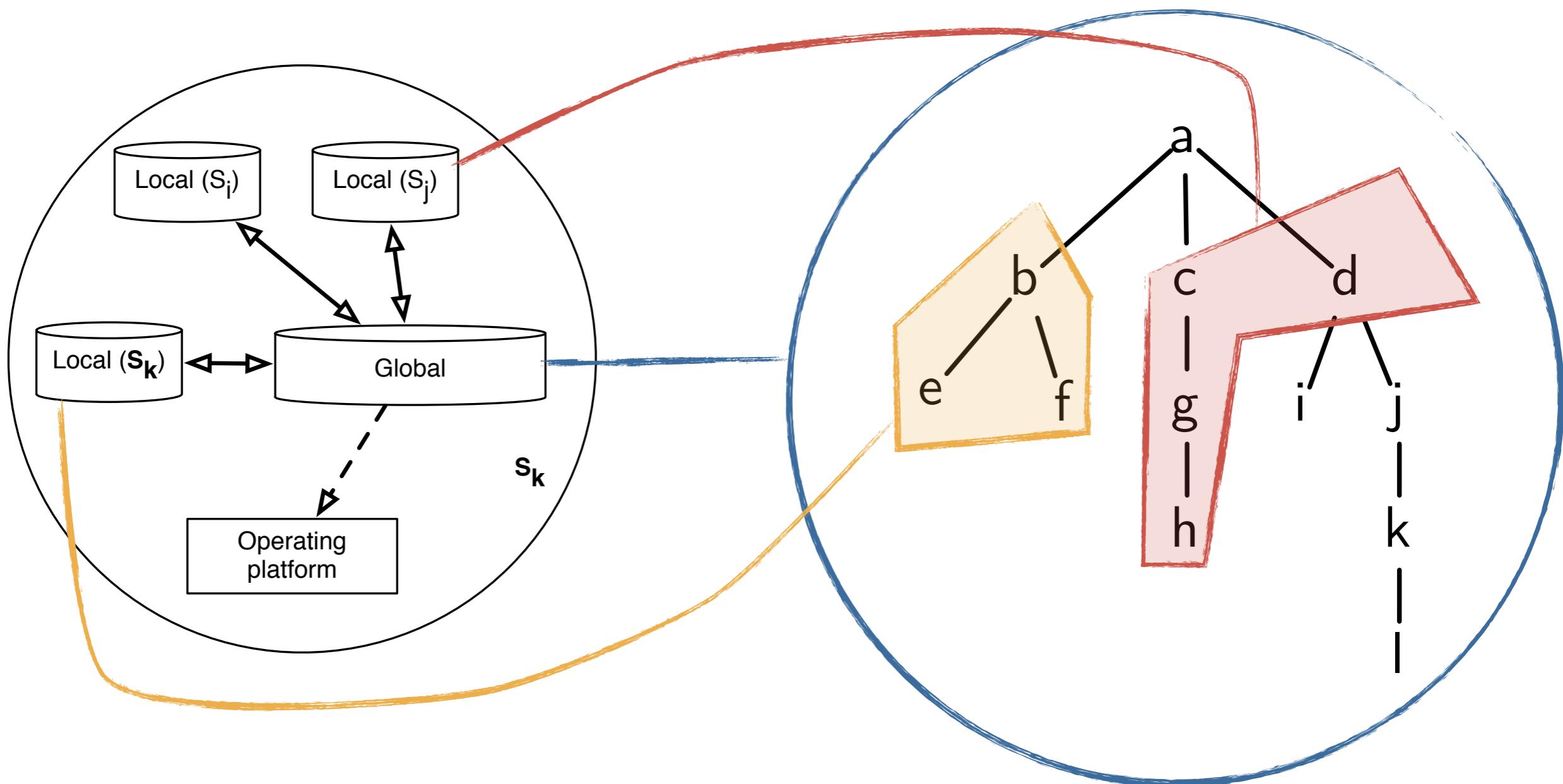
Concurrent configuration of FM



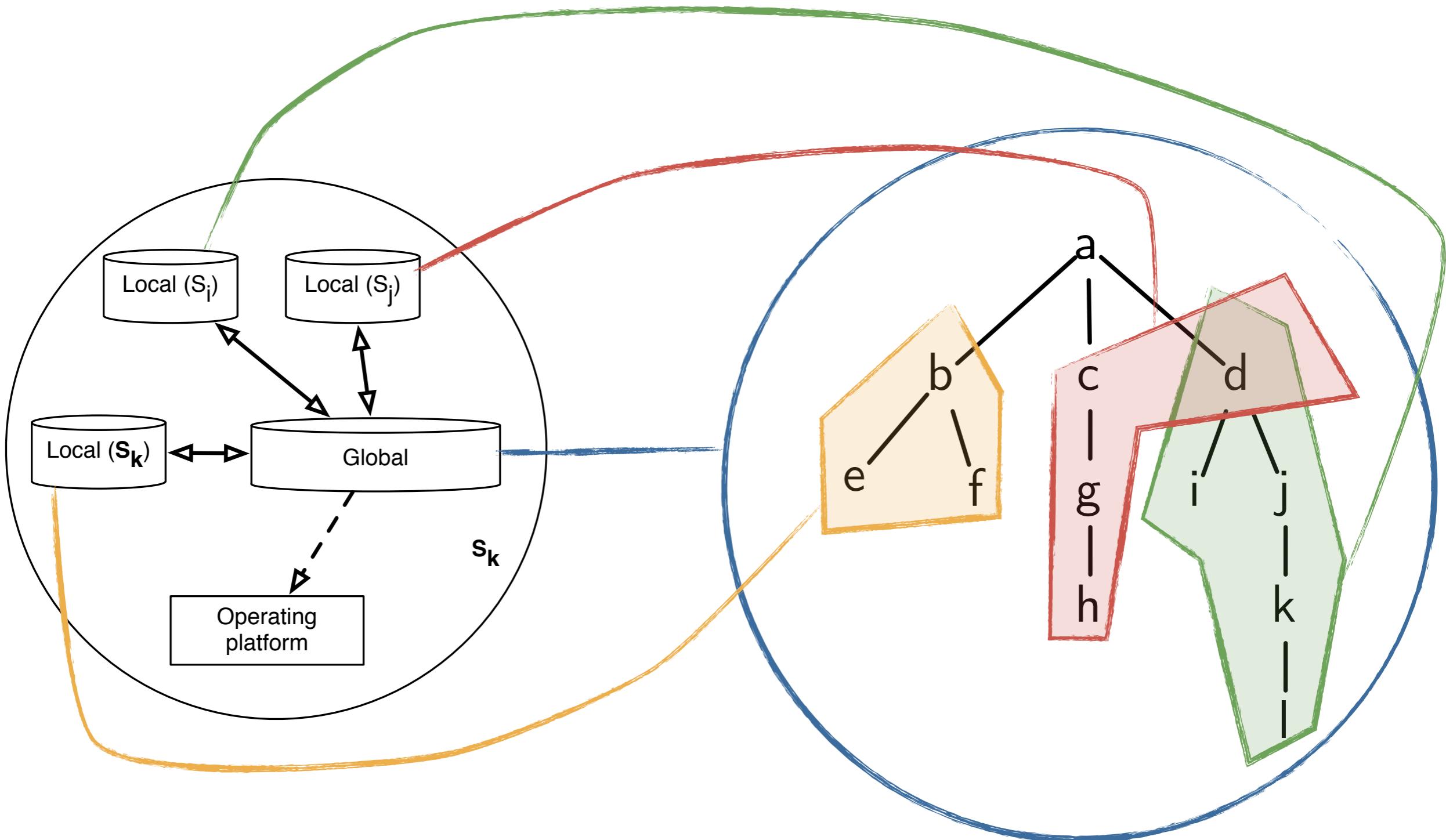
Concurrent configuration of FM



Concurrent configuration of FM

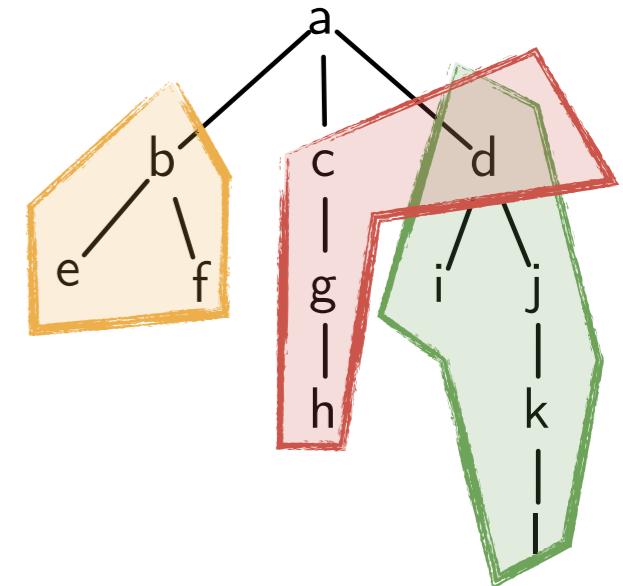


Concurrent configuration of FM



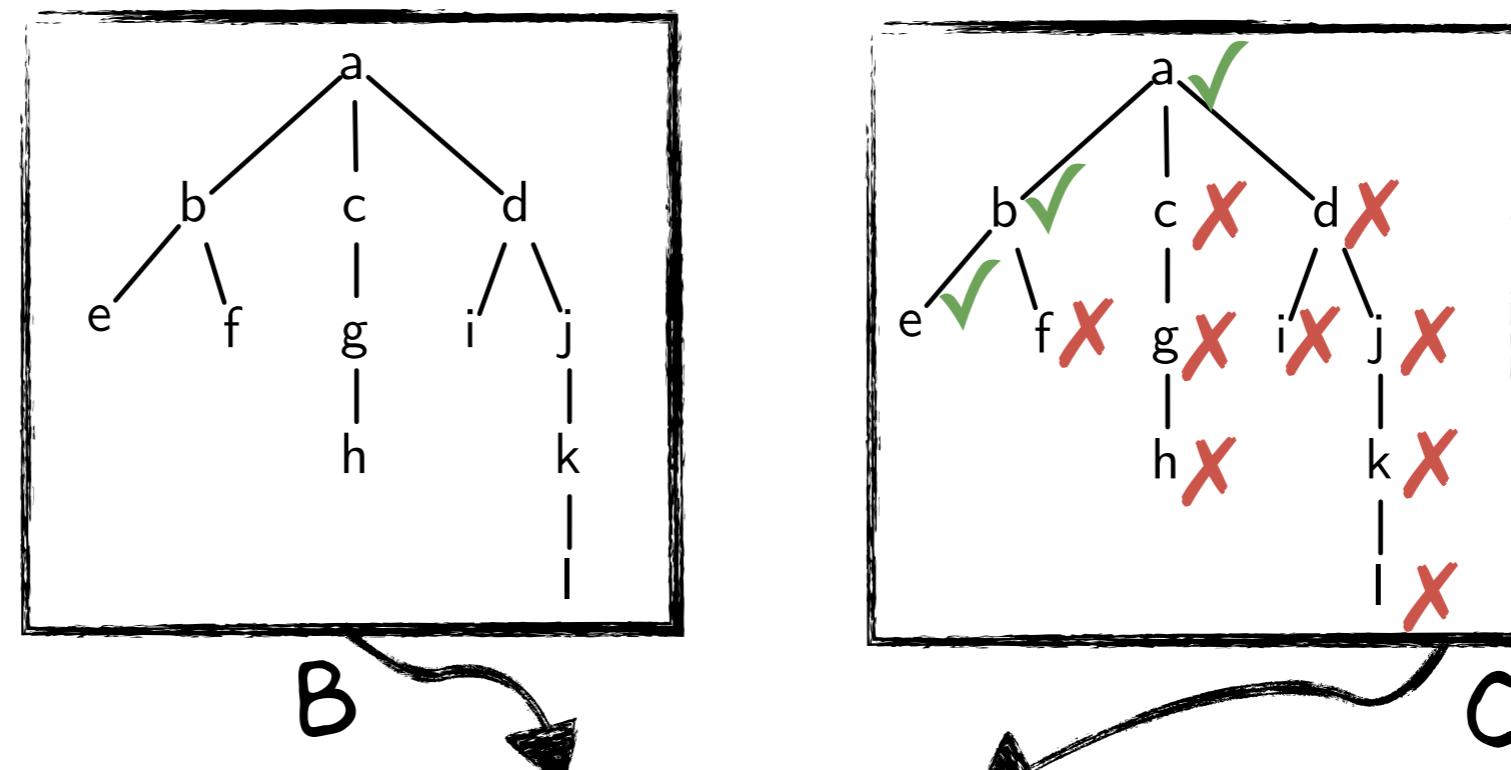
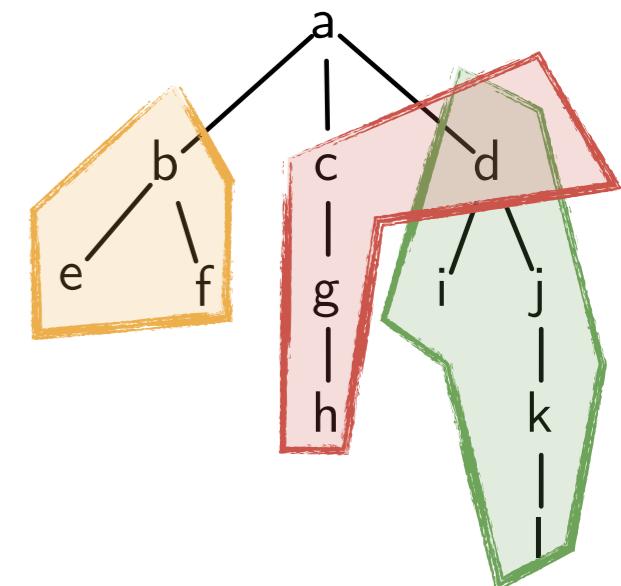
Concurrent configuration of FM

- Research questions:
 - ▶ How to detect constraint violations?
 - ▶ How to explain the cause of a conflict?



Concurrent configuration of FM

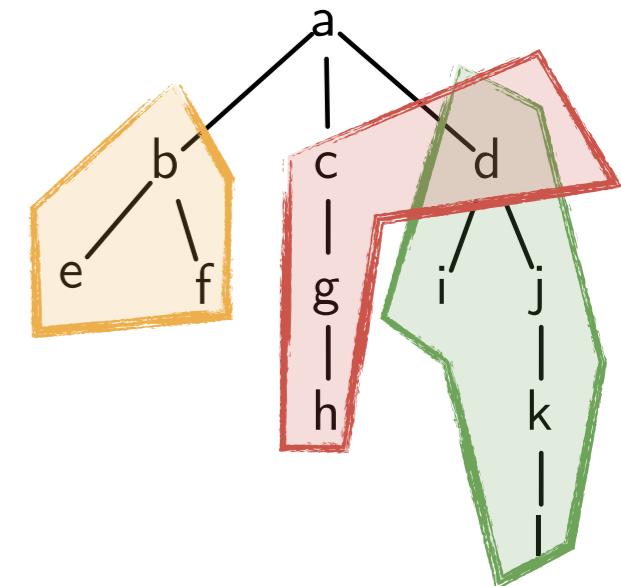
- Research questions:
 - ▶ How to detect constraint violations?
 - ▶ How to explain the cause of a conflict?



Configuration = $\phi \wedge \{a, b, \neg c, \neg d, e, \dots\}$

Concurrent configuration of FM

- Research questions:
 - ▶ How to detect constraint violations?
 - ▶ How to explain the cause of a conflict?



Representative explanation [O'Sullivan]

HS-DAG

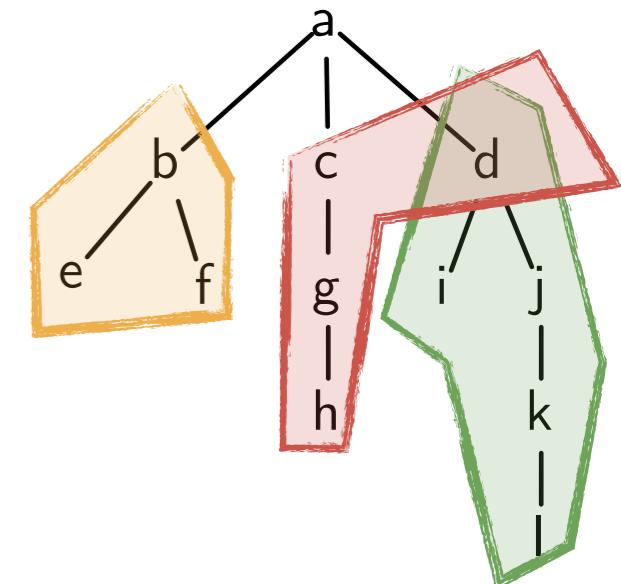
SAT4j(XPlain)

QuickXplain

} boolean FM

Concurrent configuration of FM

- Research questions:
 - ▶ How to detect constraint violations?
 - ▶ How to explain the cause of a conflict?



Representative explanation [O'Sullivan]

HS-DAG

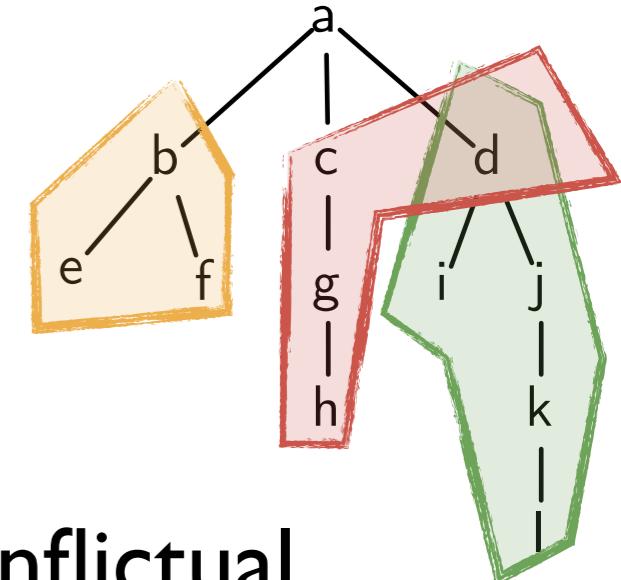
SMT

QuickXplain

} numeric FM

Concurrent configuration of FM

- Research questions:
 - ▶ How to differentiate manually and automatically resolvable decisions?
 - ▶ How to automate the resolution of conflictual decisions?



Personalized repairs: complete product set?

- ▶ How to perform n-way conflict resolution?
- ▶ How to control the impact of conflict resolution?

Personalized repairs

Representative explanation
Optimal relaxation

HS-DAG

Solver

QuickXplain

Concurrent
configuration
of Feature
Models