

# Maintaining Constraint-based Configuration Systems: Challenges ahead

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# Outline

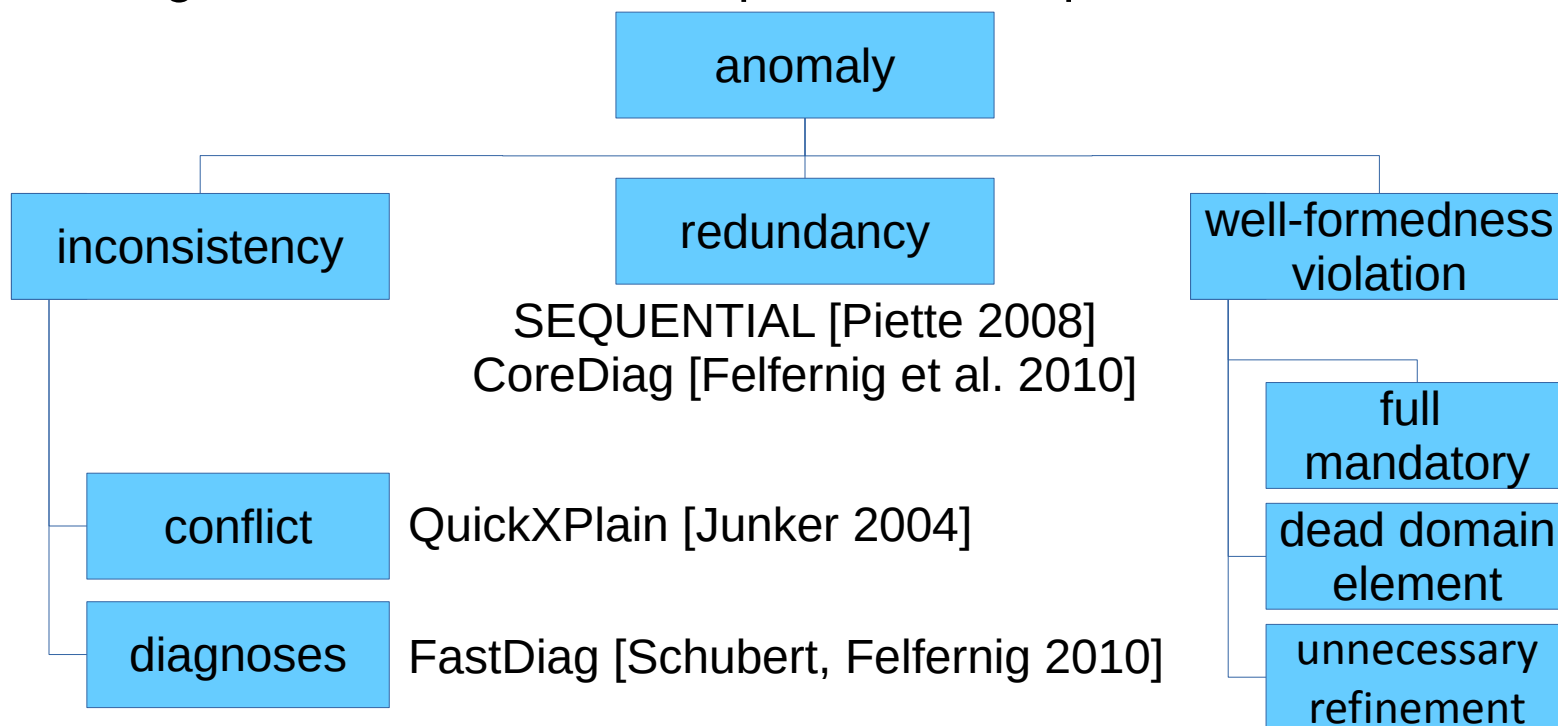
- Introduction
- Anomaly management
- Example
- Assignment-based anomaly management
- Summary

# Introduction

- Constraint-based configuration knowledge bases are changing over time
- Maintenance is time consuming and error prone
  - Detect anomalies
  - Understand anomalies
  - Repair anomalies
- Different techniques to reduce the maintenance effort
  - Recommendation
  - **Anomaly management**
  - Simulation
  - KB evaluation

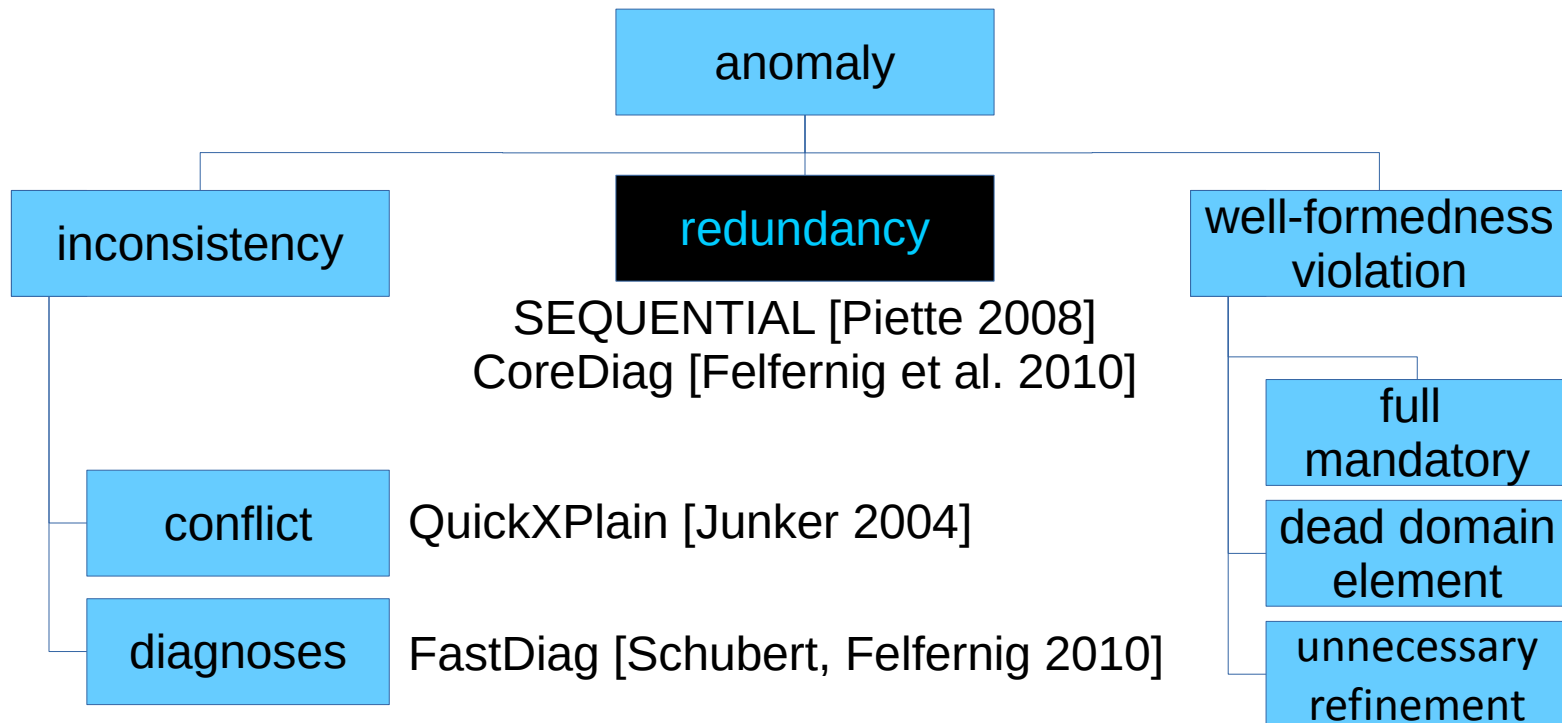
# Anomaly management

- Anomalies are patterns in data that do not conform to a well defined notion of normal behaviour [Chandola et al. 2009]
- Management = detection + explanation + repair



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# Anomaly management: redundancy

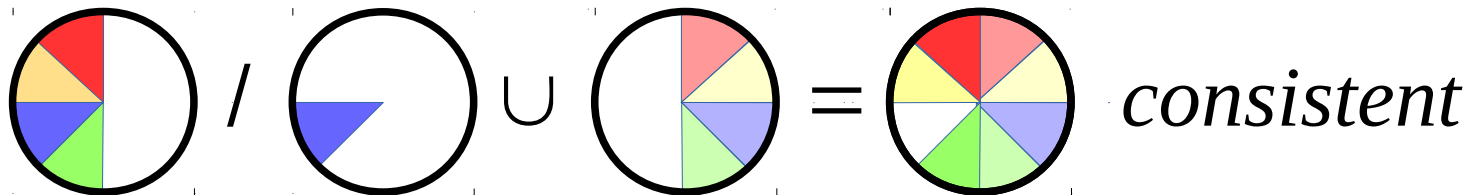
- A constraint  $c$  is redundant, iff the removal of a constraint  $c$  from  $KB$  leads to the same semantic, s.t.  
 $KB/\{c\} \models c$

$KB/\{c\} \cup \bar{K}B = inconsistent$  means that  $c$  is redundant  
 $\bar{K}B = \{\neg c_0 \vee \neg c_1 \vee \dots \vee \neg c_n\}$

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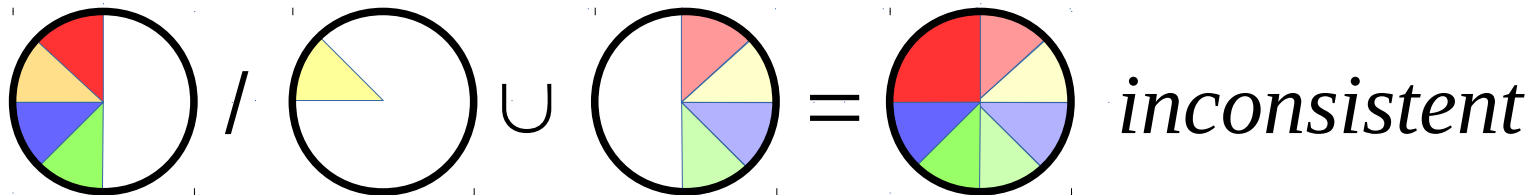
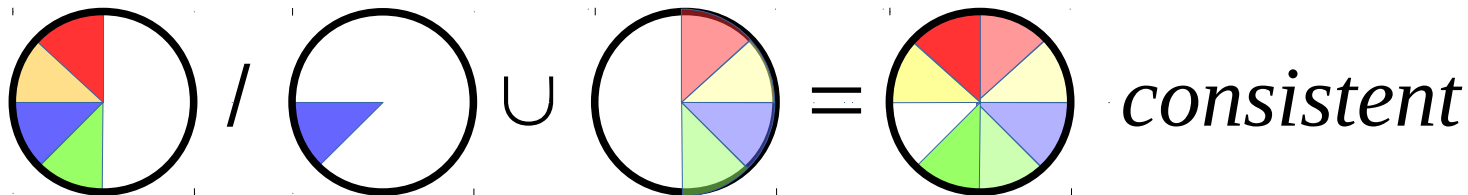
$KB/\{c\} \cup \bar{K}B = inconsistent$  means that  $c$  is redundant  
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# Anomaly management: example for explaining redundancies

$$V = \{ price, cpuCores, usageScenario \}$$

$$D = \{ dom(price) = \{ 399, 599, 799, 999 \},$$

$$dom(cpuCores) = \{ 2, 4 \},$$

$$dom(usageScenario) = \{ office, multimedia, gaming \} \}$$

$$C_{KB} =$$

$$\{ c_0 = (\neg(usageScenario = office \wedge price = 999)),$$

$$c_1 = (usageScenario = multimedia \rightarrow (price < 999 \wedge cpuCores = 4)) \wedge usageScenario = office \rightarrow ((price < 599 \wedge cpuCores = 2) \vee price < 799) \wedge usageScenario = gaming \rightarrow cpuCores = 4 \}$$

$$C_R = \emptyset$$

$$C_P = \{ p_0 = (price = 399 \wedge cpuCores = 2) \vee$$

$$p_1 = (price = 599 \wedge cpuCores = 4) \vee$$

$$p_2 = (price = 799 \wedge cpuCores = 2) \vee$$

$$p_3 = (price = 999 \wedge cpuCores = 4) \}$$

$$C = C_{KB} \cup C_R \cup C_P$$

$$KB = V \cup D \cup C$$

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# Assignment-based anomaly management

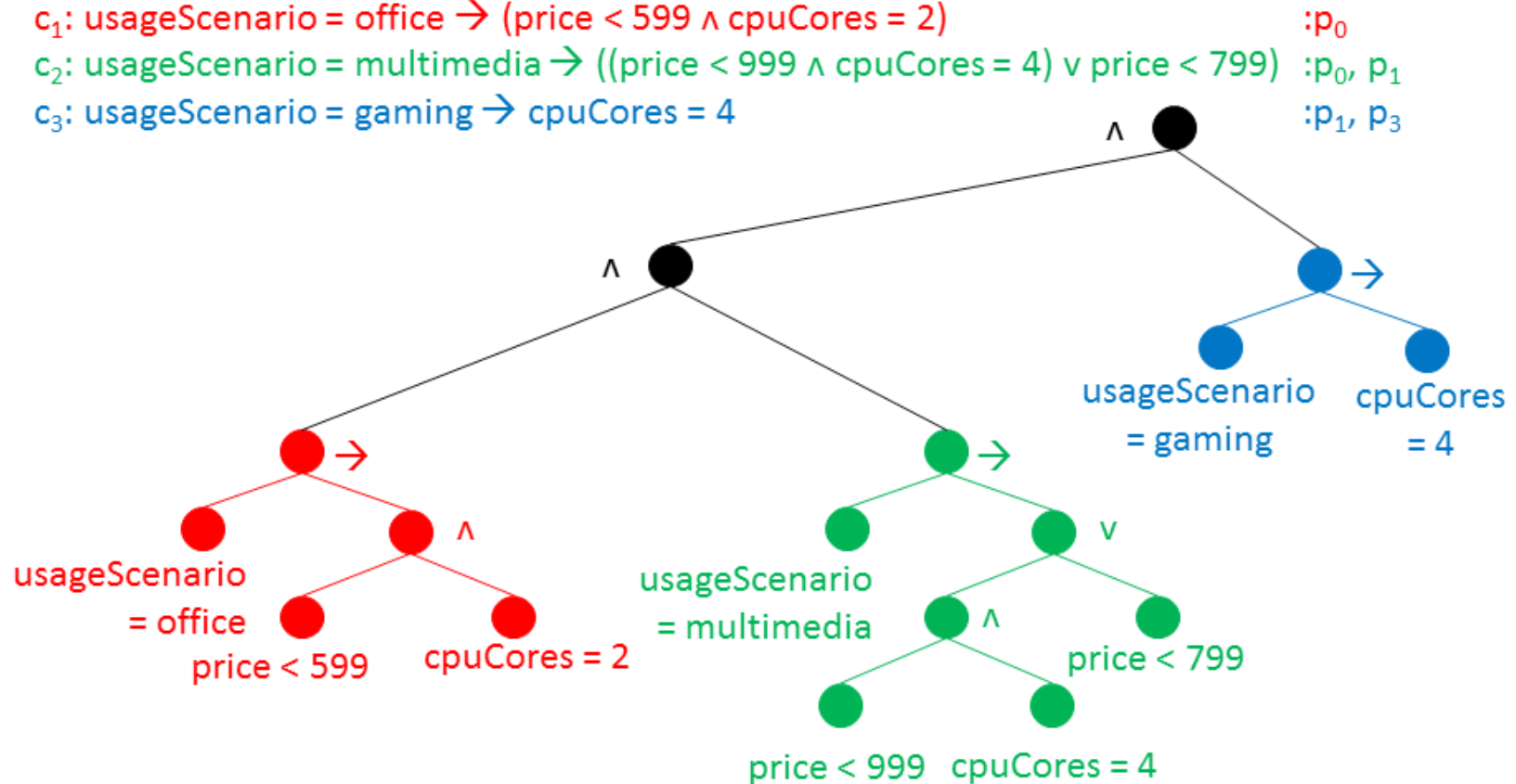
- A constraint consists of
  - A set of assignments
  - Relations between assignments
- An assignment consists of
  - One variable  $v$
  - One relation (e.g.  $<, \leq, =, \neq, \geq, >$ )
  - One element of the domain  $d \in \text{dom}(v)$

# Assignment-based redundancy detection

$c_1$ : usageScenario = office  $\rightarrow$  (price < 599  $\wedge$  cpuCores = 2)

$c_2$ : usageScenario = multimedia  $\rightarrow$  ((price < 999  $\wedge$  cpuCores = 4)  $\vee$  price < 799)

$c_3$ : usageScenario = gaming  $\rightarrow$  cpuCores = 4

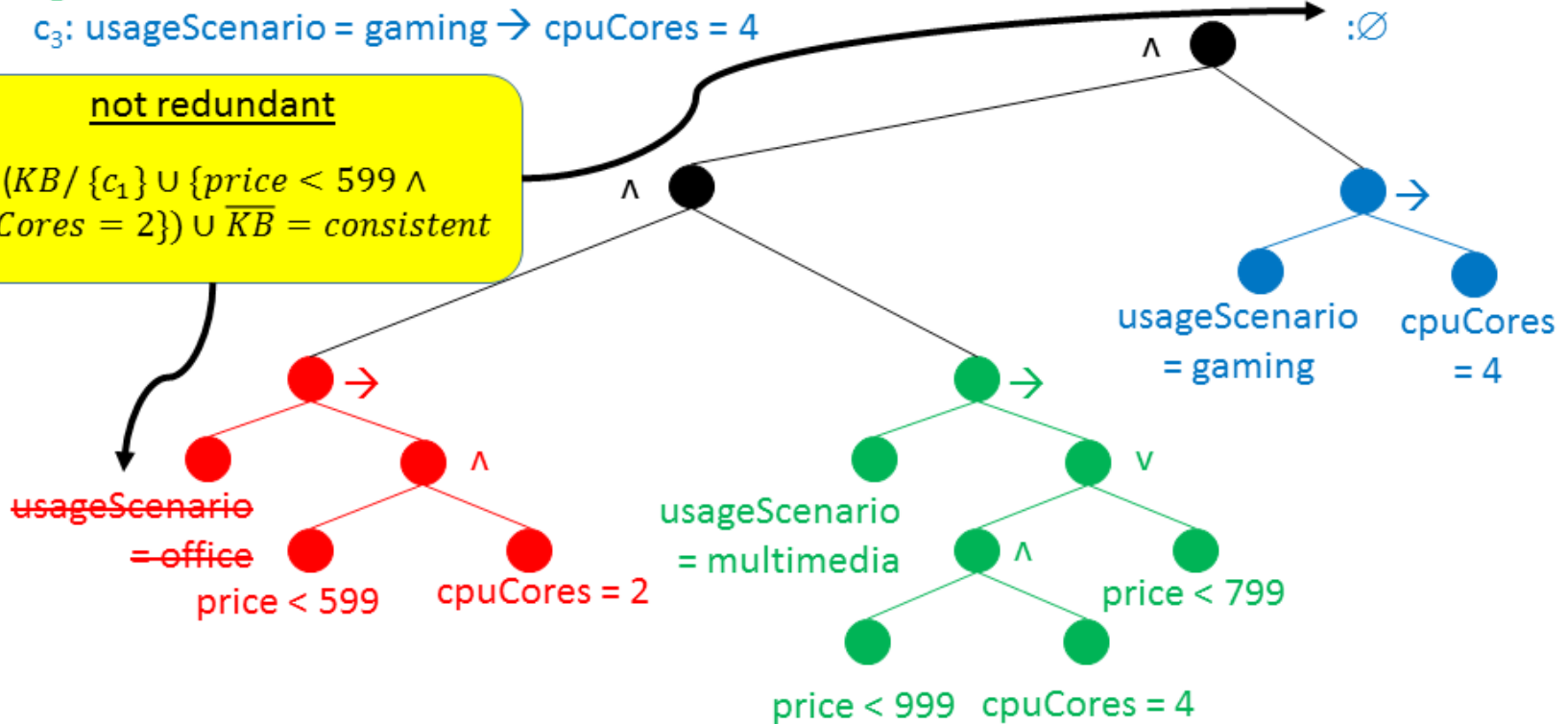


# Assignment-based redundancy detection

$c_1: \text{usageScenario} = \text{office} \rightarrow (\text{price} < 599 \wedge \text{cpuCores} = 2)$  :p<sub>0</sub>  
 $c_2: \text{usageScenario} = \text{multimedia} \rightarrow ((\text{price} < 999 \wedge \text{cpuCores} = 4) \vee \text{price} < 799)$  :∅  
 $c_3: \text{usageScenario} = \text{gaming} \rightarrow \text{cpuCores} = 4$  :∅

not redundant

$(KB / \{c_1\} \cup \{\text{price} < 599 \wedge \text{cpuCores} = 2\}) \cup \overline{KB} = \text{consistent}$



# Assignment-based redundancy detection

$c_1$ : usageScenario = office  $\rightarrow$  (price < 599  $\wedge$  cpuCores = 2)

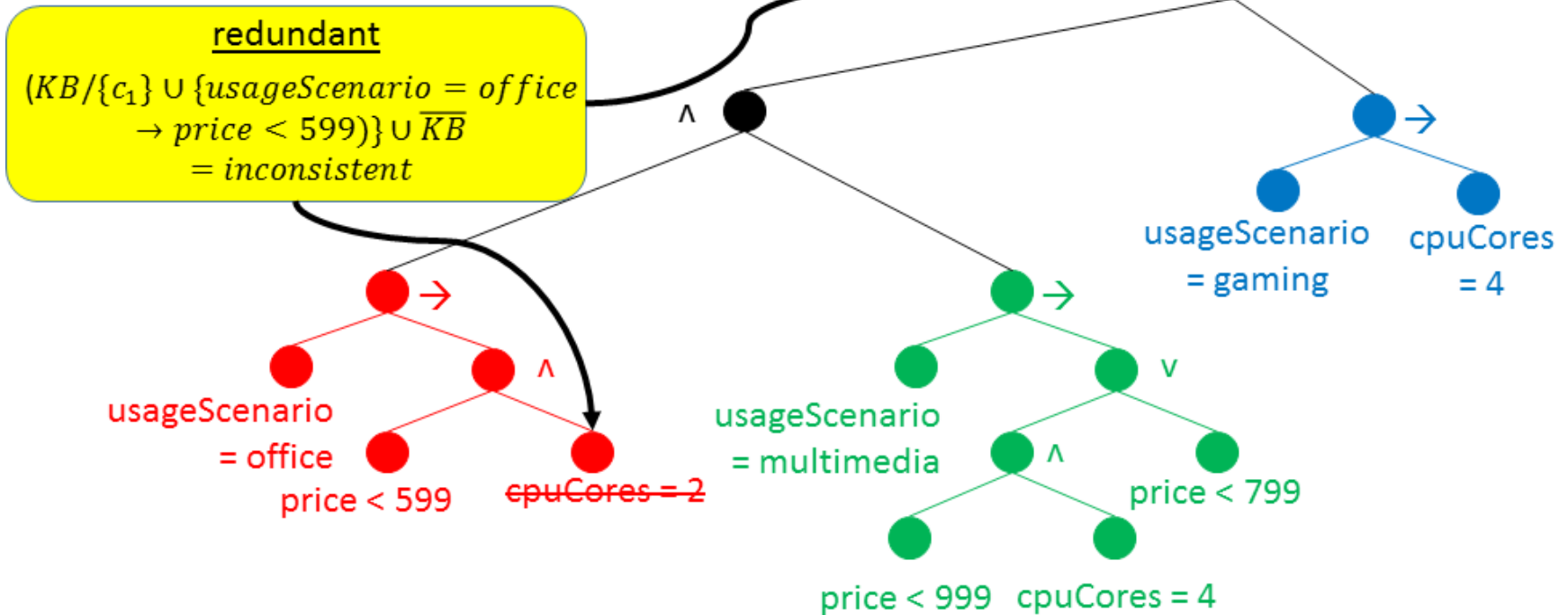
$c_2$ : usageScenario = multimedia  $\rightarrow$  ((price < 999  $\wedge$  cpuCores = 4)  $\vee$  price < 799)

$c_3$ : usageScenario = gaming  $\rightarrow$  cpuCores = 4

:p<sub>0</sub>

:p<sub>0</sub>, p<sub>1</sub>

:p<sub>1</sub>, p<sub>3</sub>





# Assignment-based redundancy detection

$c_1$ : usageScenario = office  $\rightarrow$  (price < 599  $\wedge$  cpuCores = 2)

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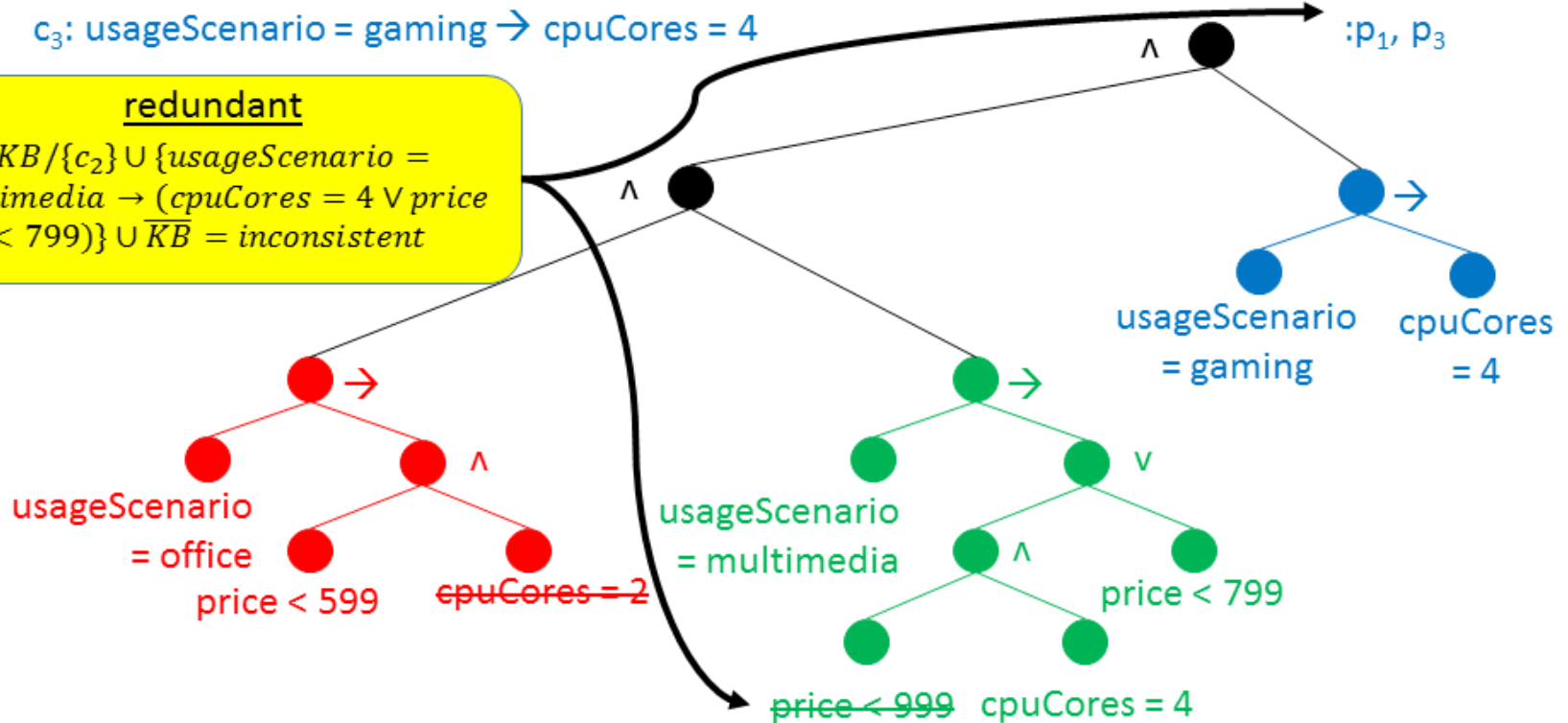
$c_3$ : usageScenario = gaming  $\rightarrow$  cpuCores = 4

:p<sub>0</sub>

:p<sub>0</sub>, p<sub>1</sub>

:p<sub>1</sub>, p<sub>3</sub>

**redundant**  
 $(KB/\{c_2\} \cup \{usageScenario = multimedia \rightarrow (cpuCores = 4 \vee price < 799)\}) \cup \overline{KB} = inconsistent$



# Assignment-based redundancy detection

$c_1$ : usageScenario = office  $\rightarrow$  (price < 599  $\wedge$  cpuCores = 2)

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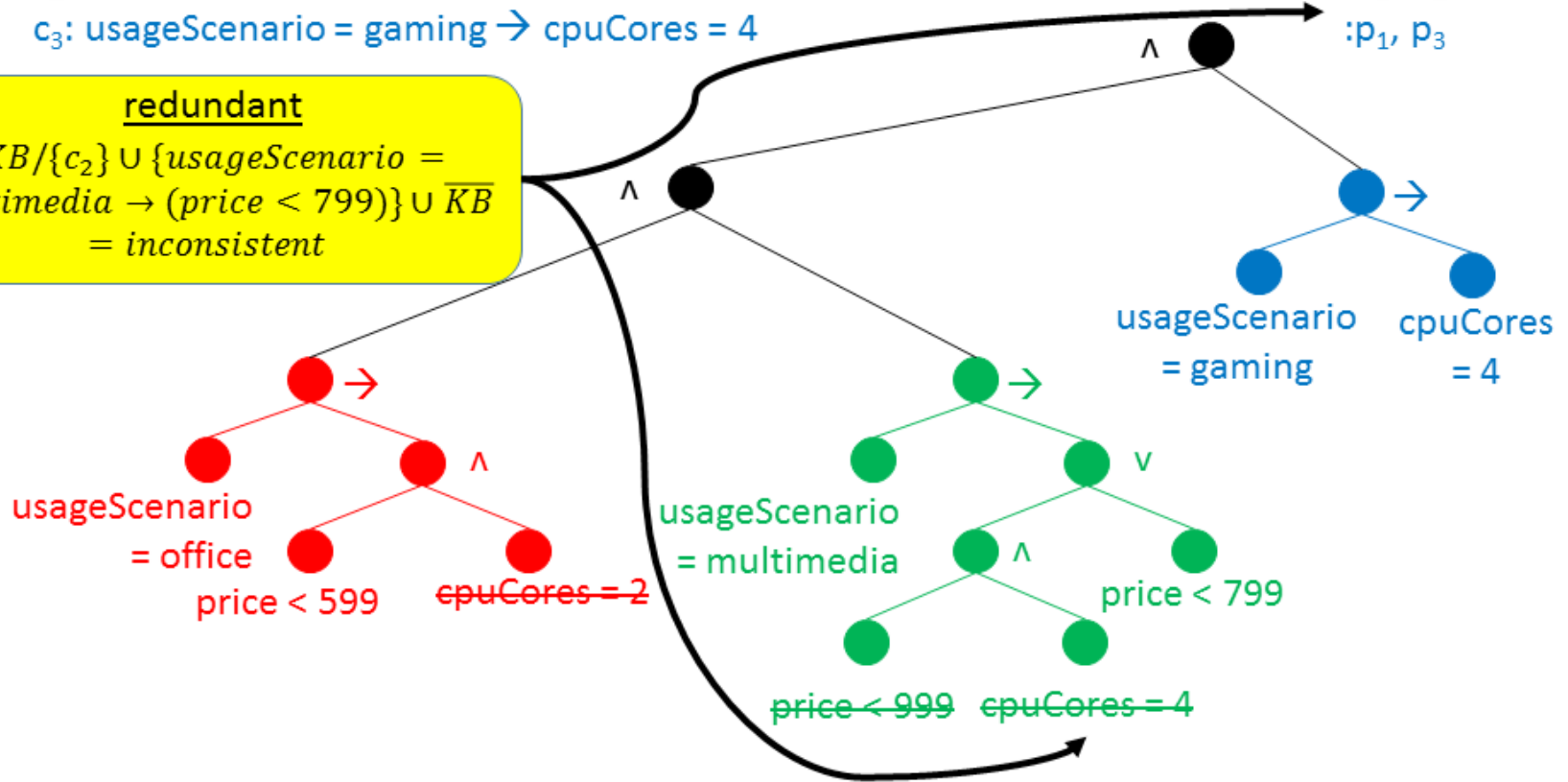
$c_3$ : usageScenario = gaming  $\rightarrow$  cpuCores = 4

:p<sub>0</sub>

:p<sub>0</sub>, p<sub>1</sub>

:p<sub>1</sub>, p<sub>3</sub>

redundant  
 $(KB/\{c_2\} \cup \{usageScenario = multimedia \rightarrow (price < 799)\}) \cup \overline{KB}$   
 = inconsistent



# Summary

- Focus on assignments of constraints instead of constraints
- Advantages
  - Detecting more redundancies
  - Getting better explanations
  - Faster consistency checks
- Further research
  - Applicability for well-formedness violations
  - Applicability for conflicts and diagnoses

# References

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# Assignment-based redundancy detection

$c_1$ : usageScenario = office  $\rightarrow$  (~~price < 599~~  $\wedge$  cpuCores = 2)

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: $p_0, p_2$

: $p_0, p_1$

: $p_1, p_3$

not redundant  
 $(KB/\{c_1\} \cup \{usageScenario = office \rightarrow cpuCores = 2\}) \cup \overline{KB}$   
 = consistent

