

### Configuration Knowledge Representation and Reasoning

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### **Constraint Technologies**

"Constraint technologies are one of the closest approaches computer science has yet made to the Holy Grail of programming: a user states the problem, the computer solves it"

[Freuder, 1997]



### Constraint Satisfaction Problem (CSP)

**Definition (Constraint Satisfaction Problem – CSP).** A constraint satisfaction problem (CSP) can be defined by a triple (V, D, C) where V is a set of finite domain variables {v1, v2, . . . , vn}, D represents variable domains {dom(v1), dom(v2), . . . , dom(vn)}, and C represents a set of constraints defining restrictions on the possible combinations of variable values ({c1, c2, . . . , cm}).



### Solution for a CSP

**Definition (CSP Solution).** A solution for a given CSP = (V, D, C) is represented by an assignment  $S = \{ins(v1), ins(v2), \ldots, ins(vn)\}$  where  $ins(vi) \in dom(vi)$ . S is required to be *complete*; that is each variable of the CSP definition has a value in S and is consistent (i.e., S fulfills the constraints in *C*).



# **Configuration Task**

**Definition (Configuration Task).** A configuration task can be defined as a CSP (V, D, C) where  $V = \{v1, v2, \ldots, vn\}, D = \{dom(v1), dom(v2), \ldots, dom(vn)\}, and C = CKB \cup REQ. CKB represents the configuration knowledge base (the configuration model) and REQ represents a set of user (customer) requirements.$ 

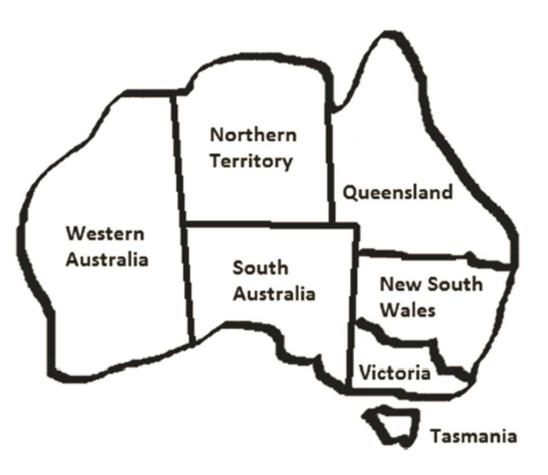


# Configuration (Solution)

**Definition (Configuration).** A configuration (solution) S for a given configuration task (V, D,  $CKB \cup REQ$ ) is represented by an assignment  $S = \{ins(v1), ins(v2), \ldots, ins(vn)\}$  where  $ins(vi) \in dom(vi)$  and S is complete and consistent with the constraints in  $CKB \cup REQ$ .



# A Simple Configuration Task: Map Coloring



All regions  $y \neq x$  that are direct neighbors of x must have a different color (different from the color of x)



### Corresponding Configuration Task

 $V = \{WA, NT, SA, Q, NSW, V, T\}$ 

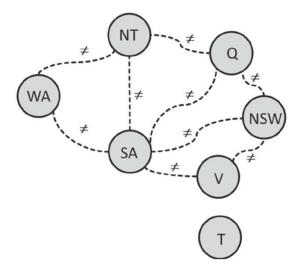
$$\label{eq:constraint} \begin{split} D &= \{ dom(WA) = \{ r,g,b \}, \ dom(NT) = \{ r,g,b \}, \ dom(SA) = \{ r,g,b \}, \ dom(Q) = \{ r,g,b \}, \ dom(NSW) = \{ r,g,b \}, \ dom(V) = \{ r,g,b \}, \ dom(V) = \{ r,g,b \}, \ dom(T) = \{ r,g,b \} \end{split}$$

 $CKB = \{WA \neq NT, WA \neq SA, NT \neq SA, NT \neq Q, SA \neq Q, SA \neq NSW, SA \neq V, Q \neq NSW, NSW \neq V\}$ 

 $REQ = \{WA = r\}$ 



# **Graphical CSP Representation**

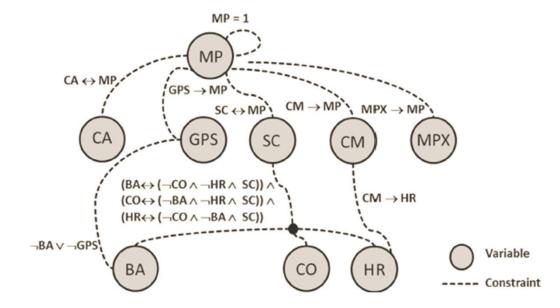


#### FIGURE 6.2

Map coloring configuration model: graphical representation of a CSP where the nodes represent the variables and the arcs represent constraints.



### **Graphical CSP Representation**

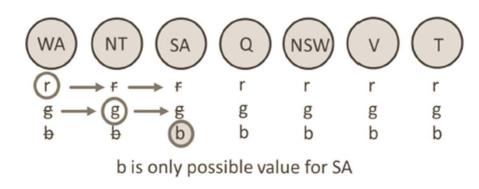


#### FIGURE 6.3

Simple Mobile Phone configuration model (represented as CSP). An abbreviation is used for the constraint representation; for example,  $CA \leftrightarrow MP$  is the short form of  $CA = 1 \leftrightarrow MP = 1$ . MP = Mobile Phone, CA = Calls, GPS = GPS, SC = Screen, CM = Camera, MPX = MPX Player, BA = Basic, CO = Color, HR = High Resolution.



# **CSP Solution Search: Forward Checking**



#### FIGURE 6.4

A simple example of forward checking. The variables WA and NT already have assigned values (r and g). The only possible remaining value for SA is b; r and g do not have to be checked for consistency with the settings of WA and NT.



# Dynamic Constraint Satisfaction

- Reasoning over variables states
- Only active variables are part of the solution
- Activation constraints determine activity status of a variable
- HighResolution (Camera) = yes → active(HighResolution).

[Mittal and Falkenhainer, 1990]



# Generative Constraint Satisfaction (GCSP)

- Representational limits of discussed approaches
- Component-oriented representation not possible (only variables and constraints)
- Not applicable if number of components depends on the preferences of a user
- Need for "on the fly" generation of components



# Generative Constraint Satisfaction (GCSP)

### **PC P DESCRIPTION:**

P.name := [String];

P.price := [Integer];

```
P.usage := {'internet','scientific','multimedia'};
```

```
P.efficiency := {'A', 'B', 'C'};
```

```
P.PORTS := {screen-of-pc-1[Screen], screen-of-pc-2[Screen],
hdunit-of-pc-1[HDUnit], ...};
```

```
P.screens := <screen-of-pc-1,screen-of-pc-2>;
```

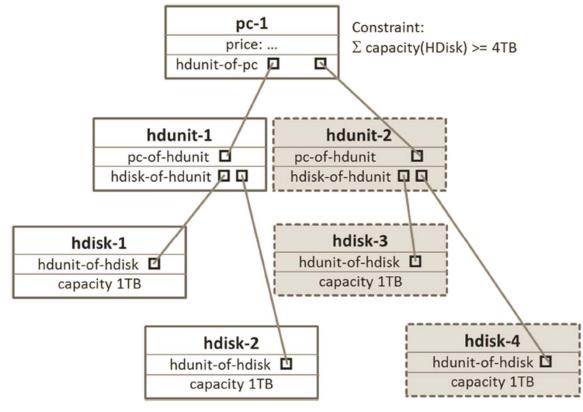
```
P.mb := <mb-of-pc-1>;
```

```
P.hdunits := <hdunit-of-pc-1,hdunit-of-pc-2>;
```

P.efficiency = P.mb.efficiency; /\* Example constraint\*/



### Solution Search (GCSP)



#### FIGURE 6.5

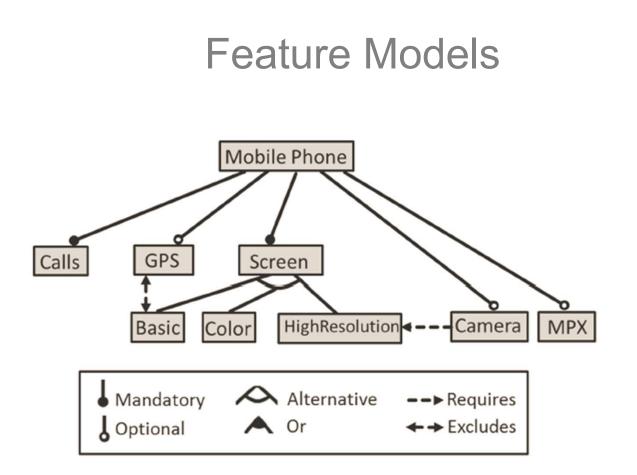
Simple GCSP dynamic component creation example. The constraint representation is simplified (i.e., it does not directly correspond to the GCSP constraint representation used in Stumptner et al., 1998).



# Graphical Knowledge Representations

- Need to improve maintainability of configuration models
- Approach: graphical knowledge representations
- Automated translation into executable representation
- Examples:
  - Feature Models
  - UML Configuration Models





#### **FIGURE 6.6**

Feature model of a mobile phone (adapted version of Benavides et al., 2010). This feature model is equivalent to the constraint-based representation of Figure 6.3.



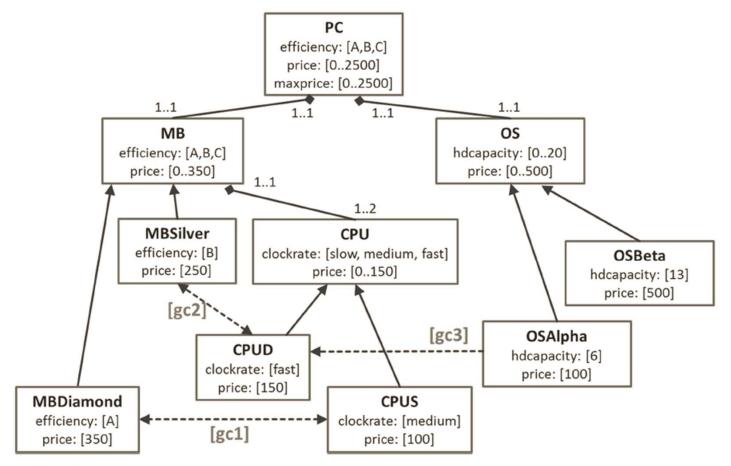
### **Semantics of Feature Models**

**Table 6.1** Semantics of feature models defined in terms of constraints (propositional logic).Features are represented by Boolean variables.

Relationship/Constraint	Semantics
mandatory(P,C)	$P \leftrightarrow C$
optional(P,C)	$C \rightarrow P$
or (P, $C_1, C_2,, C_n$ )	$P \leftrightarrow (C_1 \lor C_2 \lor \ldots \lor C_n)$
alternative	$(C_1 \leftrightarrow (\neg C_2 \land \ldots \land \neg C_n \land P)) \land (C_2 \leftrightarrow (\neg C_1 \land \neg C_3 \land \ldots \land \neg C_n \land P))$
$(P, C_1, C_2, \ldots, C_n)$	$\wedge \ldots \wedge (C_n \leftrightarrow (\neg C_1 \land \ldots \land \neg C_{n-1} \land P))$
requires(P,C)	$P \rightarrow C$
excludes(P,C)	$\neg P \lor \neg C$



# **UML Configuration Model**



#### FIGURE 6.9

Fragment of the PC model (adapted part of Figure 6.7).



### **UML Configuration Model: Constraints**

Table 6.3	Constraints related to the configuration model in Figure 6.9.	
Name		Description
gc1		CPUs of type CPUS are incompatible with motherboards of type MBDiamond
gc2		CPUs of type CPUD are incompatible with motherboards of type MBSilver
gc3		Each OS of type OSAlpha requires a CPU of type CPUD
prc2'		The price of one personal computer (PC) is determined by the prices of
		the motherboard (MB), the CPUs, and the operating system (OS)
resc1		The computer price must be less or equal to the
		maxprice defined by the customer



# UML Configuration Model: Formalization of Product Structure

**Table 6.4** Example formalizations of the model ( $C_{KB}$ ) depicted in Figure 6.9. *getcpus* denotes a collection operator (Felfernig et al., 2000a) that collects all *cpus* connected with mother-board Y. For reasons of readability we limit the example to attribute range restrictions (e.g., PC(efficiency)).

Modeling Facility	Example in FOL
Component types	{PC/1, MB/1, MBDiamond/1, MBSilver/1, CPU/1, CPUS/1, CPUD/1, OS/1, OSAlpha/1, OSBeta/1} $\subseteq CLANG$
Attributes	{efficiency/2, price/2, maxprice/2, clockrate/2, hdcapacity/2} $\subseteq CLANG$
Relationships	{pc-of-mb/2, mb-of-pc/2, mb-of-cpu/2, cpu-of-mb/2, pc-of-os/2, os-of-pc/2} $\subseteq CLANG$
PC (efficiency)	$\{\forall X : PC(X) \to \exists_1^1 A_X : efficiency(X, A_X) \land A_X = A \lor A_X = B \lor A_X = C.\}$ $\subseteq C_{KB}$
MB (efficiency)	$\{\forall X : MB(X) \to \exists_1^1 A_X : efficiency(X, A_X) \land A_X = A \lor A_X = B \lor A_X = C.\}$ $\subseteq C_{KB}$
MB (price)	$\{\forall X: MB(X) \to \exists_1^1 A_X: price(X, A_X) \land A_X \ge 0 \land A_X \le 350.\} \subseteq C_{KB}$
CPUS (price)	$\{\forall X : CPUS(X) \rightarrow \exists A_X : price(X, A_X) \land A_X = 100.\} \subseteq C_{KB}$
part-of(PC,MB)	$\{\forall X : PC(X) \to \exists_1^1 Y : MB(Y) \land \text{pc-of-mb}(X, Y).\} \subseteq C_{KB}$ $\{\forall X : MB(X) \to \exists_1^1 Y : PC(Y) \land \text{mb-of-pc}(X, Y).\} \subseteq C_{KB}$
part-of (PC,OS)	$ \{ \forall X : PC(X) \to \exists_1^{\uparrow} Y : OS(Y) \land \text{pc-of-os}(X, Y) \} \subseteq C_{KB} \\ \{ \forall X : OS(X) \to \exists_1^{\downarrow} Y : PC(Y) \land \text{os-of-pc}(X, Y) \} \subseteq C_{KB} $



# UML Configuration Model: Formalization of Constraints

$ \begin{array}{c} \label{eq:gc3} \{\forall X, Y : PC(X) \land OSAlpha(Y) \land \\ pc \text{-}of \text{-}os(X, Y) \rightarrow \exists_1^1 U, V : MB(U) \land CPUD(V) \land pc \text{-}of \text{-}mb(X, U) \land \\ mb \text{-}of \text{-}cpu(U, V).\} \subseteq C_{KB} \\ \hline prc2' \qquad \{\forall X : PC(X) \land price(X, PCP) \land pc \text{-}of \text{-}mb(X, Y) \land \\ pc \text{-}of \text{-}os(X, Z) \land getcpus(Y, CPUs) \rightarrow PCP = \\ \sum_{c \in \{Y, Z\} \cup CPUs \land price(c, P)} P.\} \subseteq C_{KB} \\ \hline resc1 \qquad \{\forall X : PC(X) \land price(X, PCP) \land maxprice(X, PCMP) \rightarrow PCP \leq PCMP.\} \subseteq \\ \hline \end{array} $	gc1	$\{\forall X, Y : mb-of-cpu(X, Y) \land MBDiamond(X) \land CPUS(Y) \rightarrow false.\} \subseteq C_{KB}$
$\begin{array}{ll} pc\text{-of-os}(X,Y) \rightarrow \exists_{1}^{1}U,V:MB(U) \wedge CPUD(V) \wedge pc\text{-of-mb}(X,U) \wedge \\ mb\text{-of-cpu}(U,V).\} \subseteq C_{KB} \end{array}$ $\begin{array}{l} prc2' \qquad \{\forall X:PC(X) \wedge price(X,PCP) \wedge pc\text{-of-mb}(X,Y) \wedge \\ pc\text{-of-os}(X,Z) \wedge getcpus(Y,CPUs) \rightarrow PCP = \\ & \sum_{c \in \{Y,Z\} \cup CPUs \wedge price(c,P)} P.\} \subseteq C_{KB} \end{array}$ $\begin{array}{l} resc1 \qquad \{\forall X:PC(X) \wedge price(X,PCP) \wedge maxprice(X,PCMP) \rightarrow PCP \leq PCMP.\} \subseteq \end{array}$	gc2	$\{\forall X, Y : mb-of-cpu(X, Y) \land MBSilver(X) \land CPUD(Y) \rightarrow false.\} \subseteq C_{KB}$
$\begin{array}{c} mb\text{-of-cpu}(U, V).\} \subseteq C_{KB} \\ \texttt{prc2'} \qquad \{\forall X: PC(X) \land \textit{price}(X, PCP) \land \texttt{pc-of-mb}(X, Y) \land \\ \texttt{pc-of-os}(X, Z) \land \textit{getcpus}(Y, CPUs) \rightarrow PCP = \\ & \sum_{c \in \{Y, Z\} \cup CPUs \land \textit{price}(c, P)} P.\} \subseteq C_{KB} \\ \texttt{resc1} \qquad \{\forall X: PC(X) \land \textit{price}(X, PCP) \land \textit{maxprice}(X, PCMP) \rightarrow PCP \leq PCMP.\} \subseteq PCMP.\} \subseteq PCMP. \\ \texttt{presc2} \qquad \qquad$	gc3	
prc2' $\{\forall X : PC(X) \land price(X, PCP) \land pc\text{-of-mb}(X, Y) \land pc\text{-of-os}(X, Z) \land getcpus(Y, CPUs) \rightarrow PCP = $ $\sum_{c \in \{Y, Z\} \cup CPUs \land price(c, P)} P.\} \subseteq C_{KB}$ resc1 $\{\forall X : PC(X) \land price(X, PCP) \land maxprice(X, PCMP) \rightarrow PCP \leq PCMP.\} \subseteq $		$pc-of-os(X, Y) \rightarrow \exists_1^1 U, V : MB(U) \land CPUD(V) \land pc-of-mb(X, U) \land$
$\begin{array}{l} \text{pc-of-os}(X,Z) \land getcpus(Y, CPUs) \rightarrow PCP = \\ & \sum_{c \in \{Y,Z\} \cup CPUs \land price(c,P)} P.\} \subseteq C_{KB} \\ \hline \text{resc1} \qquad \{\forall X : PC(X) \land price(X, PCP) \land maxprice(X, PCMP) \rightarrow PCP \leq PCMP.\} \subseteq \\ \end{array}$		mb-of-cpu $(U, V)$ .} $\subseteq C_{KB}$
$\begin{array}{l} \sum_{c \in \{Y, Z\} \cup CPUs \land price(c, P)} P.\} \subseteq C_{KB} \\ \hline \\ \text{resc1} \qquad \{\forall X : PC(X) \land price(X, PCP) \land maxprice(X, PCMP) \rightarrow PCP \leq PCMP.\} \subseteq \\ \end{array}$	prc2'	$\{\forall X : PC(X) \land price(X, PCP) \land pc\text{-of-mb}(X, Y) \land$
resc1 $\{\forall X : PC(X) \land price(X, PCP) \land maxprice(X, PCMP) \rightarrow PCP \leq PCMP.\} \subseteq$		$pc-of-os(X, Z) \land getcpus(Y, CPUs) \rightarrow PCP =$
		$\sum_{c \in \{Y, Z\} \cup CPUs \land price(c, P)} P.\} \subseteq C_{KB}$
CVD	resc1	$\{\forall X : PC(X) \land price(X, PCP) \land maxprice(X, PCMP) \rightarrow PCP \leq PCMP.\} \subseteq$
~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~		$C_{KB}$

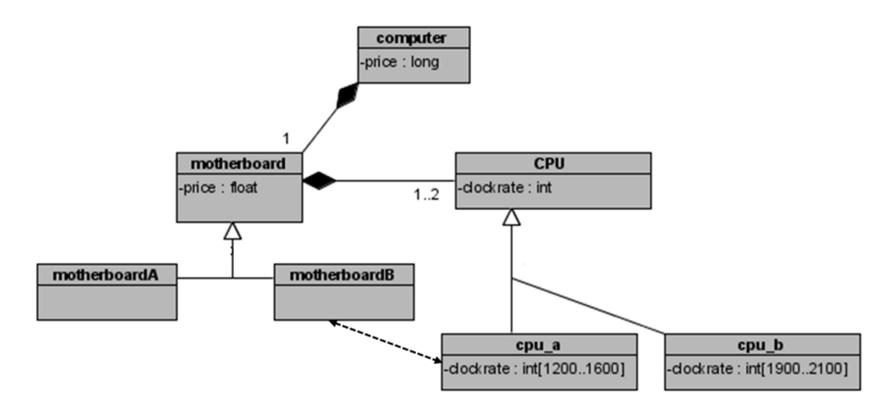


### Exercises

- 1. Explain the concept of forward checking on the basis of an example.
- 2. Translate the Mobile Phone feature model into a corresponding CSP-based representation.
- 3. Implement the Mobile Phone feature model with the CHOCO constraint solver (http://choco-solver.org)
- 4. Develop a feature model for a product domain of your own choice (not discussed in lecture).
- 5. Translate the following UML Model (next slide) into a logic-based representation.



# Exercises (UML Model)





# Thank You!



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