



Redundancy Detection in Configuration Knowledge

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Example Knowledge Base

- *Variables* (V) = {type, fuel, skibag, 4 – wheel, pdc}
- *Domains* (D) = { $dom(\text{type}) = \{\text{city, limo, combi, xdrive}\}$,

$dom(\text{fuel}) = \{4l, 6l, 10l\}$,
 $dom(\text{skibag}) = \{\text{yes, no}\}$,
 $dom(4 - \text{wheel}) = \{\text{yes, no}\}$,
 $dom(\text{pdc}) = \{\text{yes, no}\}$

- *Knowledge Base* (C_{KB}) = {

$c_1 : 4 - \text{wheel} = \text{yes} \rightarrow \text{type} = \text{xdrive}$,
 $c_2 : \text{skibag} = \text{yes} \rightarrow \text{type} \neq \text{city}$,
 $c_3 : \text{fuel} = 4l \rightarrow \text{type} = \text{city}$,
 $c_4 : \text{fuel} = 6l \rightarrow \text{type} \neq \text{xdrive}$,
 $c_5 : \text{type} = \text{city} \rightarrow \text{fuel} \neq 10l$

- *Customer Requirements* (C_R) = {

$c_6 : 4 - \text{wheel} = \text{no}$,
 $c_7 : \text{fuel} = 4l$,
 $c_8 : \text{type} = \text{city}$,
 $c_9 : \text{skibag} = \text{no}$,
 $c_{10} : \text{pdc} = \text{yes}$



Redundant Knowledge Base

$C'_{KB} = \{$

$c_a : \text{skibag} \neq \text{no} \rightarrow \text{type} = \text{limo} \vee$
 $\text{type} = \text{combi} \vee$
 $\text{type} = \text{xdrive},$

**redundant
constraint**

$c_1 : 4 - \text{wheel} = \text{yes} \rightarrow \text{type} = \text{xdrive},$

$c_2 : \text{skibag} = \text{yes} \rightarrow \text{type} \neq \text{city},$

$c_3 : \text{fuel} = 41 \rightarrow \text{type} = \text{city},$

$c_4 : \text{fuel} = 61 \rightarrow \text{type} \neq \text{xdrive},$

$c_5 : \text{type} = \text{city} \rightarrow \text{fuel} \neq 101\}$

Redundant Constraint (Definition)

Redundancy can be described as follows: if $C = \{c_1, c_2, \dots, c_n\}$ is a set of constraints and one constraint $c_i \in C$ is redundant, then $(C - \{c_i\}) \cup \text{complement}(C)$ is inconsistent. In this context, $\text{complement}(C)$ is the negation of C : if $C = \{c_1, c_2, \dots, c_n\}$ then $\text{complement}(C) = \{\neg c_1 \vee \neg c_2 \vee \dots \vee \neg c_n\}$.

Redundant Constraint (Definition)

Definition (Redundant Constraint). Let ca be a constraint of the configuration knowledge base CKB . ca is called redundant iff $CKB - \{ca\} \models ca$. If this condition is not fulfilled, ca is said to be *nonredundant*. Redundancy can also be analyzed by checking $CKB - \{ca\} \cup \text{complement}(CKB)$ for consistency. If consistency is given, ca is nonredundant.

Minimal Core (Definition)

Definition (Minimal Core). Let CKB be a configuration knowledge base. CKB is denoted as minimal core iff $\forall ci \in CKB : CKB - \{ci\} \cup \text{complement}(CKB)$ is consistent. Obviously, $CKB \cup \text{complement}(CKB) \models \perp$.



Sequential Algorithm for Determining Redundant Constraints

Algorithm 12.1 SEQUENTIAL(C_{KB}): Δ

$\{C_{KB}$: configuration knowledge base}
 $\{\overline{C_{KB}}$: the complement of $C_{KB}\}$
 $\{\Delta$: set of redundant constraints}
 $\{C_{KBt}$: copy of C_{KB} used for redundancy elimination}
 $C_{KBt} \leftarrow C_{KB}$;
for all c_i in C_{KBt} do
 if *isInconsistent* $((C_{KBt} - \{c_i\}) \cup \{\neg c_i\})$ then
 $C_{KBt} \leftarrow C_{KBt} - \{c_i\}$;
 end if
end for
 $\Delta \leftarrow C_{KB} - C_{KBt}$;
return Δ ;

Execution Trace with SEQUENTIAL

Table 12.1 Example execution trace of SEQUENTIAL. The set of redundant constraints is $\Delta = \{c_a\}$.

SEQUENTIAL Iteration	C_{KBt}	c_j
1	$\{c_a, c_1, c_2, c_3, c_4, c_5\}$	c_a
2	$\{c_1, c_2, c_3, c_4, c_5\}$	c_1
3	$\{c_1, c_2, c_3, c_4, c_5\}$	c_2
4	$\{c_1, c_2, c_3, c_4, c_5\}$	c_3
5	$\{c_1, c_2, c_3, c_4, c_5\}$	c_4
6	$\{c_1, c_2, c_3, c_4, c_5\}$	c_5



CoreDiag

Algorithm 12.2 COREDIAG (C_{KB}): Δ

$\{C_{KB} = \{c_1, c_2, \dots, c_n\}\}$
 $\{\overline{C_{KB}}$: the complement of $C_{KB}\}$
 $\{\Delta$: set of redundant constraints}
 $\overline{C_{KB}} \leftarrow \{\neg c_1 \vee \neg c_2 \vee \dots \vee \neg c_n\}$;
 $\text{return}(C_{KB} - \text{CORED}(\overline{C_{KB}}, \overline{C_{KB}}, C_{KB}))$;

Algorithm 12.3 CORED($B, D, C = \{c_1, c_2, \dots, c_p\}$): Δ

$\{B$: consideration set}
 $\{D$: constraints added to $B\}$
 $\{C$: set of constraints to be checked for redundancy}
if $D \neq \emptyset$ and *inconsistent*(B) then
 return \emptyset ;
end if
if *singleton*(C) then
 return(C);
end if
 $k \leftarrow \lceil \frac{p}{2} \rceil$;
 $C_1 \leftarrow \{c_1, c_2, \dots, c_k\}$;
 $C_2 \leftarrow \{c_{k+1}, c_{k+2}, \dots, c_p\}$;
 $\Delta_1 \leftarrow \text{CORED}(B \cup C_2, C_2, C_1)$;
 $\Delta_2 \leftarrow \text{CORED}(B \cup \Delta_1, \Delta_1, C_2)$;
return($\Delta_1 \cup \Delta_2$);

Performance Evaluation

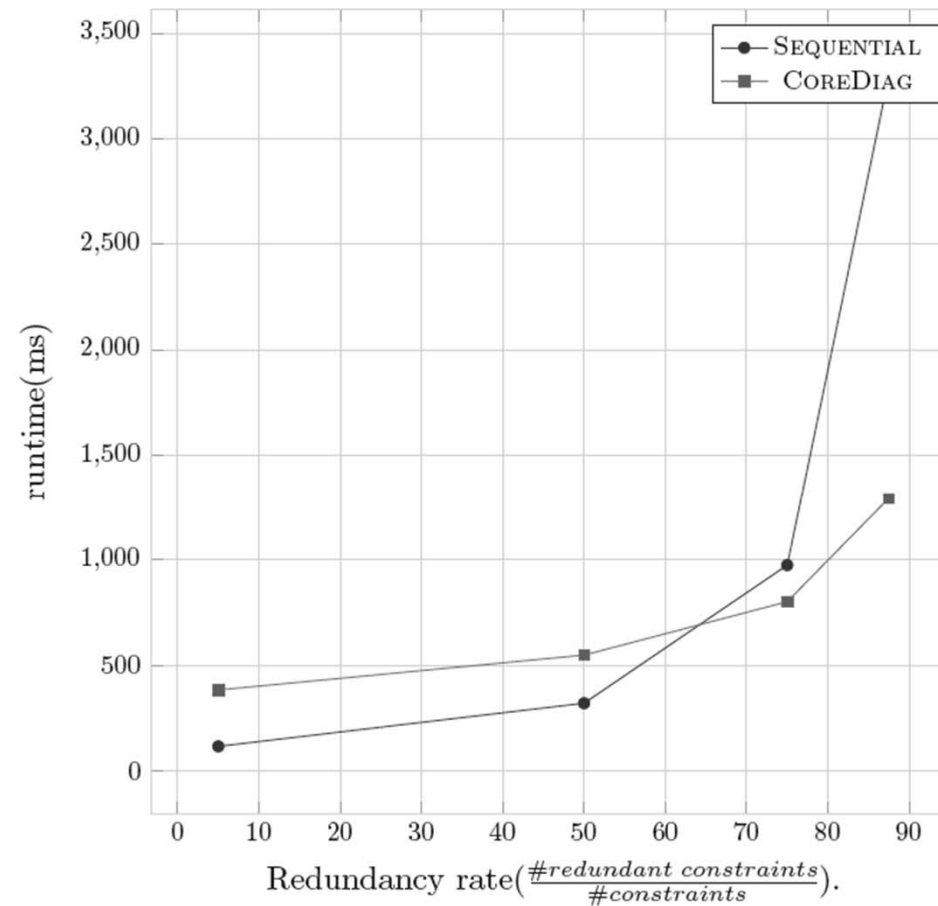


FIGURE 12.1

Performance of SEQUENTIAL and COREDIAG for a financial services knowledge base (see Felfernig et al. 2011).



Exercises

1. Develop a redundancy-free CSP-based configuration knowledge base.
2. Include two redundant constraints.
3. Show the identification of these two redundant constraints on the basis of SEQUENTIAL.



Thank You!

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