

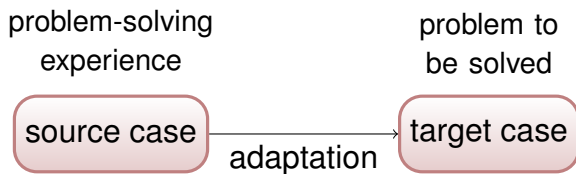
# An Algorithm for Adapting Cases Represented in an Expressive Description Logic

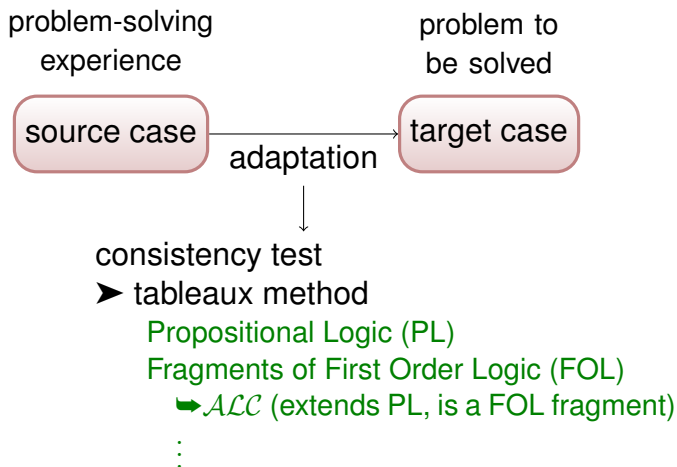
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# Introduction





problem-solving  
experience

problem to  
be solved



consistency test **and revision**

► tableaux method **+ extension**

Propositional Logic (PL)

Fragments of First Order Logic (FOL)

    ► *ALC* (extends PL, is a FOL fragment)

    ⋮

# Adaptation in CBR

- A case describes an experience  
(in general, a problem-solving experience)

Example: a cooking recipe

Source: a starter dish with raw carrots and vinaigrette

- General knowledge about the domain of application
- Knowledge in complement of the cases

## Example

- Ingredient classes: vegetable, root
- The roots considered are: carrot, parsnip, and celery.
- Parsnips, carrots, and celeries can be grated.
- Raw parsnip are not edible.

# Reasoning objective: making the target case precise

**Target** : case with an incomplete description  
(The “solution part” is missing.)

## Example

**Target**: I want a starter without carrots.



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## Adaptation principle:

Reusing the source case to solve the target case (i.e., making it precise)

# Reasoning objective: making the target case precise

**Target** : case with an incomplete description  
(The “solution part” is missing.)

## Example

**Target**: I want a starter without carrots.

## Adaptation principle:

Reusing the source case to solve the target case (i.e., making it precise)

The inconsistencies must be dealt with.

**Example**: **Source** is inconsistent with **Target**

Carrots are inconsistent with the target case.

So, we need

- A mean for detecting inconsistencies
  
- a mean to solve it

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- A mean for detecting inconsistencies
  - tableaux algorithm
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Example of an adaptation of **Source** to **Target**:

**CompletedTarget**: starter obtained by substituting in **Source** carrots with celeries

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- $\mathcal{ALC}$  is a description logic (DL)
- It extends PL  
(i.e., it is an *expressive* DL)
- It is a fragment of FOL (up to the syntax)
- In this talk: use of the well-known syntax of FOL
- In the paper: use of the  $\mathcal{ALC}$  syntax with technical details on the algorithm

# Representation of DK, Source, and Target

In  $\mathcal{ALC}$  within FOL syntax:

$$\begin{aligned} \text{DK} = & \forall x \text{ gratedRawCarrot}(x) \Leftrightarrow \text{carrot}(x) \wedge \text{raw}(x) \wedge \text{grated}(x) \\ & \wedge \forall x \text{ root}(x) \Leftrightarrow \text{carrot}(x) \vee \text{parsnip}(x) \vee \text{celery}(x) \\ & \wedge \forall x \text{ parsnip}(x) \Rightarrow \neg \text{raw}(x) \end{aligned}$$

$$\text{Source}(\sigma) = \text{starter}(\sigma) \wedge \exists y \text{ ing}(\sigma, y) \wedge \text{gratedRawCarrot}(y) \\ \wedge \exists y \text{ ing}(\sigma, y) \wedge \text{vinaigrette}(y)$$

$$\text{Target}(\theta) = \text{starter}(\theta) \wedge \neg(\exists y \text{ ing}(\theta, y) \wedge \text{carrot}(y))$$

# Representation of DK, Source, and Target

In  $\mathcal{ALC}$  under NNF within FOL syntax:

$$\begin{aligned} & \forall x \quad \neg \text{gratedRawCarrot}(x) \vee (\text{carrot}(x) \wedge \text{raw}(x) \wedge \text{grated}(x)) \\ & \quad \wedge \text{gratedRawCarrot}(x) \vee \neg \text{carrot}(x) \vee \neg \text{raw}(x) \vee \neg \text{grated}(x) \\ \text{DK} = & \quad \wedge \neg \text{root}(x) \vee \text{carrot}(x) \vee \text{parsnip}(x) \vee \text{celery}(x) \\ & \quad \wedge \text{root}(x) \vee (\neg \text{carrot}(x) \wedge \neg \text{parsnip}(x) \wedge \neg \text{celery}(x)) \\ & \quad \wedge \neg \text{parsnip}(x) \vee \neg \text{raw}(x) \end{aligned}$$

$$\text{Source}(\sigma) = \quad \wedge \text{starter}(\sigma) \wedge \exists y \text{ing}(\sigma, y) \wedge \text{gratedRawCarrot}(y) \\ \quad \wedge \exists y \text{ing}(\sigma, y) \wedge \text{vinaigrette}(y)$$

$$\text{Target}(\theta) = \quad \text{starter}(\theta) \wedge \forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$$

So, we need

- A mean for detecting inconsistencies
  - tableaux algorithm
- a mean to solve it
  - extension of the tableaux algorithm

# The tableau method

# The tableau method (1/3)

- A classical deductive method in PL and on decidable fragments of FOL
- Input: a knowledge base KB  
(a formula or a set of formulas interpreted conjunctively)

→ Objective: determining whether KB is consistent is not

Example:  $\text{Source}(\theta)$  is in contradiction with  $\text{Target}(\theta)$ , given DK

$\text{DK} \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$  is inconsistent

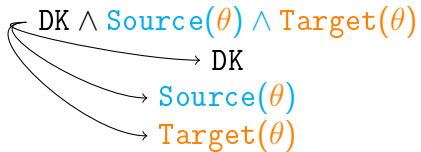


## The tableau method (2/3)

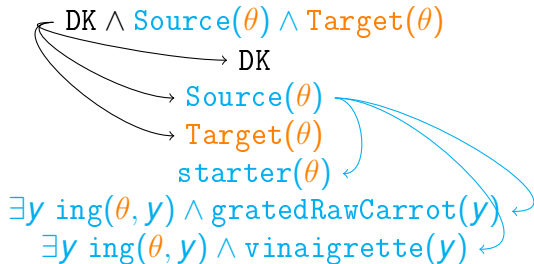
- Principle:
  - Some formalism-dependent transformation rules are applied on formulas to produce new (deduced) formulas, whenever it is possible.
  - KB is inconsistent *iff* there is a clash in every branch.

$$DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$$

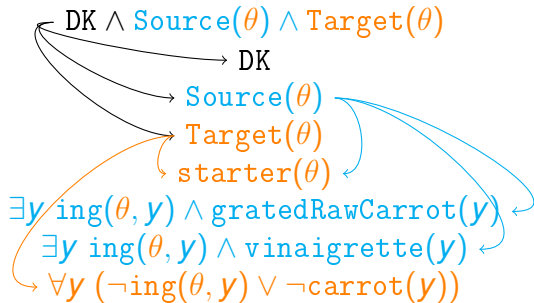
## The tableau method (3/3) Ex. on $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$



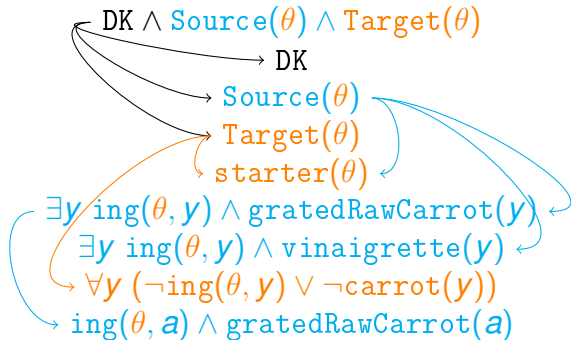
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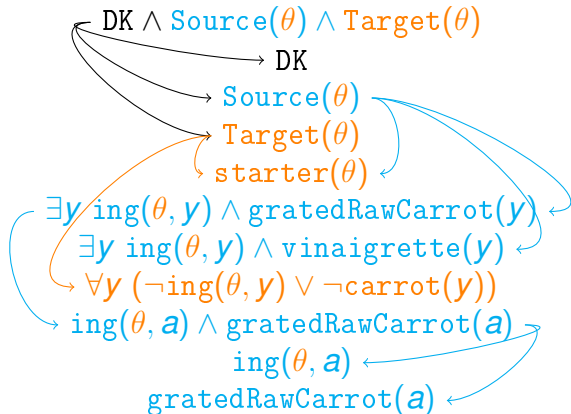
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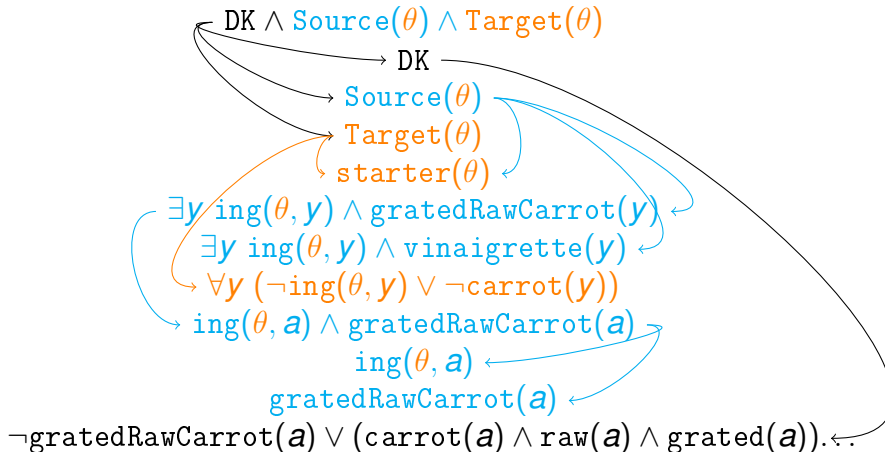
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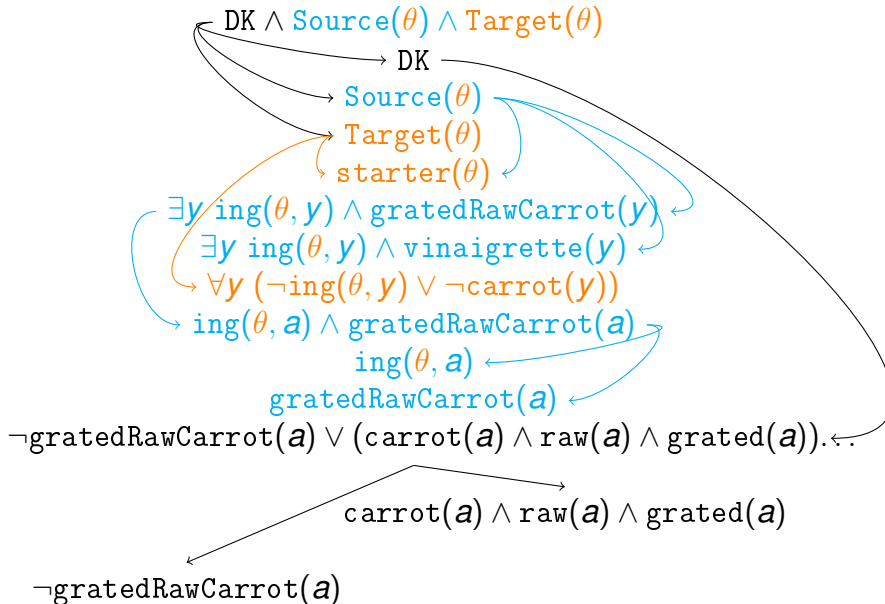


The tableau method (3/3) Ex. on  $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

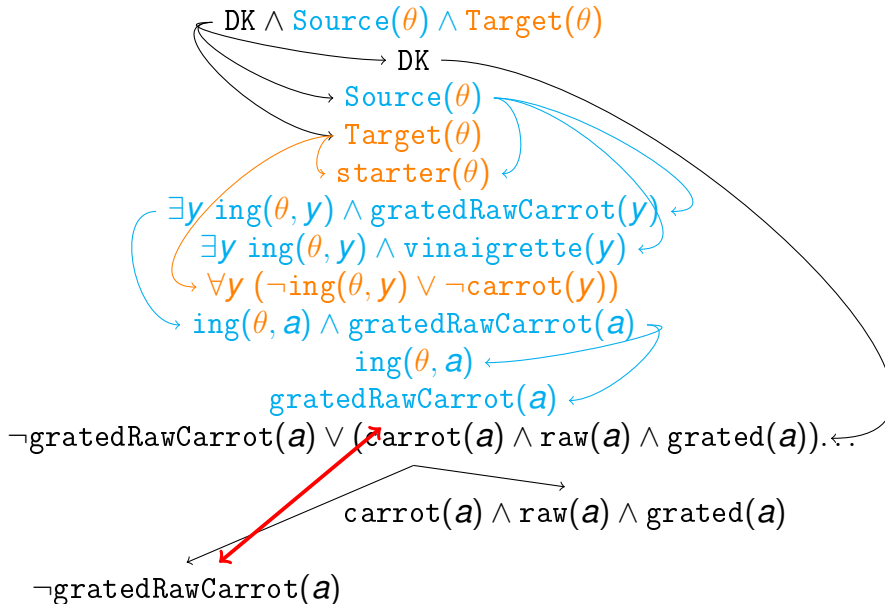




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# The tableau method (3/3) Ex. on $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$



$$\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$$

$$\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$$

$$\text{ing}(\theta, a)$$

$$\text{gratedRawCarrot}(a)$$

$$\neg \text{gratedRawCarrot}(a) \vee (\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)) \dots$$

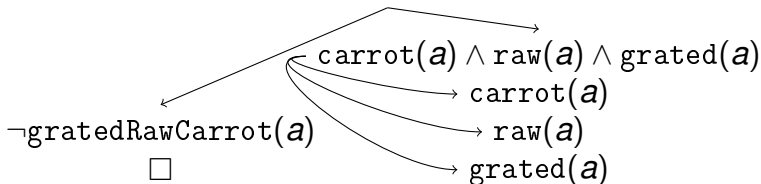
$$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$$

$$\neg \text{gratedRawCarrot}(a)$$



$\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$   
 $\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$   
 $\text{ing}(\theta, a)$   
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The tableau method (3/3) Ex. on  $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

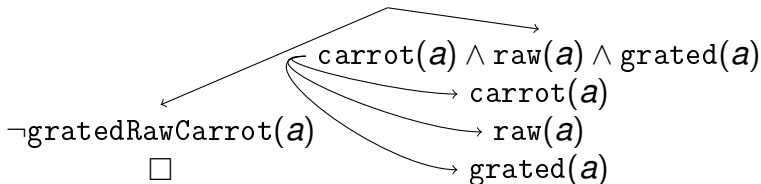
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$\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$

$\text{ing}(\theta, a)$

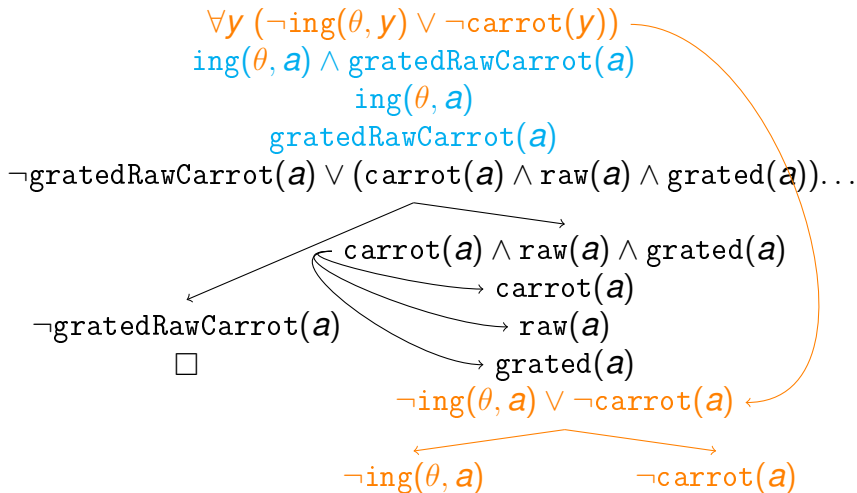
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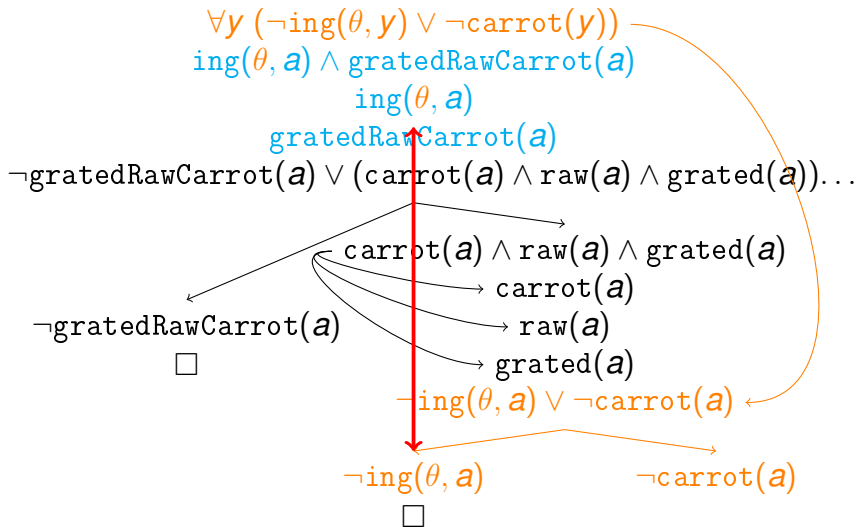


$\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$

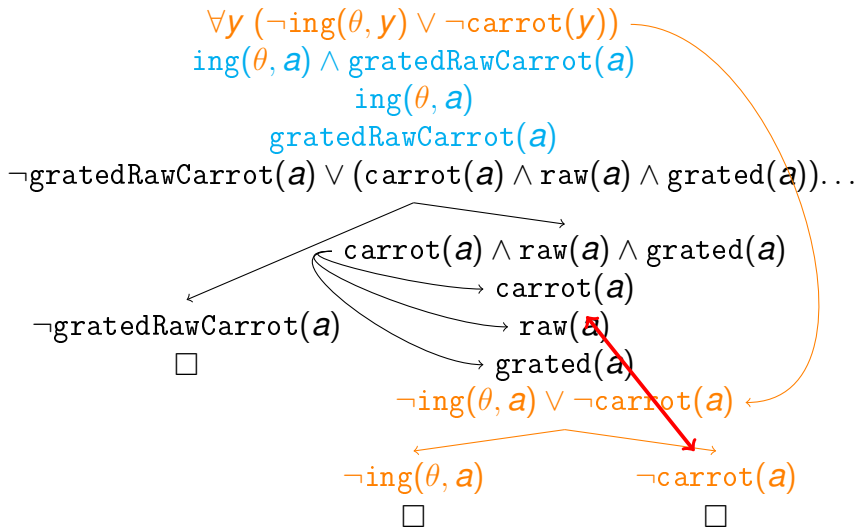
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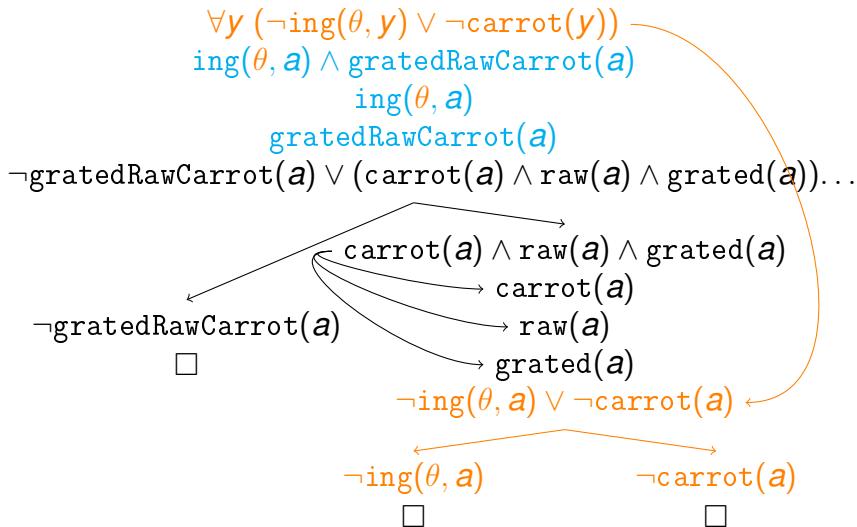


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# The tableau method (3/3) Ex. on $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$



# Adaptation by reestablishing consistency

# Adaptation by correction of $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

- Pretend that  $\text{Source}(\sigma)$  solves  $\text{Target}(\theta)$ 
  - $\text{Source}(\theta)$

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- Pretend that  $\text{Source}(\sigma)$  solves  $\text{Target}(\theta)$ 
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- If  $\text{Source}(\theta)$  is consistent with  $\text{Target}(\theta)$ :  
 $\text{CompletedTarget} = DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

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- Apply tableau method

# Adaptation by correction of $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

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- Else, minimal change on  $\text{Source}(\theta)$ : keep as much as possible from the consequences of  $DK \wedge \text{Source}(\theta)$
- Apply tableau method
  - To generate the consistent branches  $S_i$  from  $DK \wedge \text{Source}(\theta)$

# Adaptation by correction of $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

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- Else, minimal change on  $\text{Source}(\theta)$ : keep as much as possible from the consequences of  $DK \wedge \text{Source}(\theta)$
- Apply tableau method
  - To generate the consistent branches  $S_j$  from  $DK \wedge \text{Source}(\theta)$
  - To generate the consistent branches  $T_j$  from  $DK \wedge \text{Target}(\theta)$



# Adaptation by correction of $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

- Pretend that  $\text{Source}(\sigma)$  solves  $\text{Target}(\theta)$ 
  - ▶  $\text{Source}(\theta)$
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- Apply tableau method
  - To generate the consistent branches  $S_i$  from  $DK \wedge \text{Source}(\theta)$
  - To generate the consistent branches  $T_j$  from  $DK \wedge \text{Target}(\theta)$
  - To generate the (inconsistent) branches  $B_{ij}$  from each  $S_i \wedge T_j$

# Adaptation by correction of $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

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- If  $\text{Source}(\theta)$  is consistent with  $\text{Target}(\theta)$ :  
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- Repair (some of) the  $B_{ij}$ 's

# Adaptation by correction of $DK \wedge \text{Source}(\theta) \wedge \text{Target}(\theta)$

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- Apply tableau method
  - To generate the consistent branches  $S_i$  from  $DK \wedge \text{Source}(\theta)$
  - To generate the consistent branches  $T_j$  from  $DK \wedge \text{Target}(\theta)$
  - To generate the (inconsistent) branches  $B_{ij}$  from each  $S_i \wedge T_j$
- Repair (some of) the  $B_{ij}$ 's
- Use of a cost function to give a priority in the repairs

$$\begin{aligned}
& \text{DK} \wedge \text{Source}(\theta) \\
& \quad \text{DK} \\
& \quad \text{Source}(\theta) \\
& \quad \text{starter}(\theta) \\
& \exists y \text{ ing}(\theta, y) \wedge \text{gratedRawCarrot}(y) \\
& \quad \exists y \text{ ing}(\theta, y) \wedge \text{vinaigrette}(y) \\
& \quad \text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a) \\
& \quad \quad \text{ing}(\theta, a) \\
& \quad \quad \text{gratedRawCarrot}(a) \\
& \quad \text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a) \\
& \quad \quad \text{carrot}(a) \\
& \quad \quad \text{raw}(a) \\
& \quad \quad \text{grated}(a) \\
& \text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a) \\
& \quad \text{root}(a) \\
& \quad \neg \text{parsnip}(a) \text{ [...] }
\end{aligned}$$

$$S_1$$

$DK \wedge \text{Target}(\theta)$

DK

$\text{Target}(\theta)$

$\text{starter}(\theta)$

$\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$

$\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$

$\neg \text{gratedRawCarrot}(a) \vee (\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a))$

$\text{gratedRawCarrot}(a) \vee \neg \text{carrot}(a) \vee \neg \text{raw}(a) \vee \neg \text{grated}(a)$

$\neg \text{root}(a) \vee \text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$

$\text{root}(a) \vee \neg \text{carrot}(a) \wedge \neg \text{parsnip}(a) \wedge \neg \text{celery}(a)$

$\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$

$\neg \text{carrot}(a)$

$\text{celery}(a)$

$\text{root}(a)$

$\text{grated}(a)$

$\text{raw}(a)$

$T_1$

$\neg \text{carrot}(a)$

$\text{parsnip}(a)$

$\text{root}(a)$

$\text{grated}(a)$

$\neg \text{raw}(a)$

$T_2$

...

...

$S_1 \wedge T_1$ DK  $\wedge$  Source( $\theta$ )

DK

Source( $\theta$ )starter( $\theta$ ) $\exists y \text{ ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$  $\exists y \text{ ing}(\theta, y) \wedge \text{vinaigrette}(y)$  $\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$  $\text{ing}(\theta, a)$  $\text{gratedRawCarrot}(a)$  $\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$  $\text{carrot}(a)$  $\text{raw}(a)$  $\text{grated}(a)$  $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$  $\text{root}(a)$  $\neg \text{parsnip}(a)$ DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$  $\text{celery}(a)$  $\text{root}(a)$  $\text{grated}(a)$  $\text{raw}(a)$  $\square \pm \text{carrot}(a)$

$S_1 \wedge T_1$ DK  $\wedge$  Source( $\theta$ )

DK

Source( $\theta$ )starter( $\theta$ ) $\exists y \text{ ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$  $\exists y \text{ ing}(\theta, y) \wedge \text{vinaigrette}(y)$  $\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$  $\text{ing}(\theta, a)$  $\text{gratedRawCarrot}(a)$  $\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$  $\text{carrot}(a)$  $\text{raw}(a)$  $\text{grated}(a)$  $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$  $\text{root}(a)$  $\neg \text{parsnip}(a)$ DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$  $\text{celery}(a)$  $\text{root}(a)$  $\text{grated}(a)$  $\text{raw}(a)$  $\Box \perp \text{carrot}(a)$

$S_1 \wedge T_1$ DK  $\wedge$  Source( $\theta$ )

DK

Source( $\theta$ )starter( $\theta$ ) $\exists y \text{ ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$  $\exists y \text{ ing}(\theta, y) \wedge \text{vinaigrette}(y)$  $\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$  $\text{ing}(\theta, a)$  $\text{gratedRawCarrot}(a)$  $\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$  $\text{carrot}(a)$  $\text{raw}(a)$  $\text{grated}(a)$  $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$  $\text{root}(a)$  $\neg \text{parsnip}(a)$ DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$  $\text{celery}(a)$  $\text{root}(a)$  $\text{grated}(a)$  $\text{raw}(a)$  $\Box \perp \text{carrot}(a)$



$S_1 \wedge T_1$ DK  $\wedge$  Source( $\theta$ )

DK

Source( $\theta$ )starter( $\theta$ ) $\exists y \text{ ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$  $\exists y \text{ ing}(\theta, y) \wedge \text{vinaigrette}(y)$  $\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$  $\text{ing}(\theta, a)$  $\text{gratedRawCarrot}(a)$  ~~$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$~~  $\text{carrot}(a)$  $\text{raw}(a)$  $\text{grated}(a)$  $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$  $\text{root}(a)$  $\neg \text{parsnip}(a)$ DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$  $\text{celery}(a)$  $\text{root}(a)$  $\text{grated}(a)$  $\text{raw}(a)$  $\Box \perp \text{carrot}(a)$

$S_1 \wedge T_1$ DK  $\wedge$  Source( $\theta$ )

DK

Source( $\theta$ )starter( $\theta$ ) $\exists y \text{ ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$  $\exists y \text{ ing}(\theta, y) \wedge \text{vinaigrette}(y)$  $\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$  $\text{ing}(\theta, a)$  $\text{gratedRawCarrot}(a)$  ~~$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$~~  $\text{carrot}(a)$  $\text{raw}(a)$  $\text{grated}(a)$  $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$  $\text{root}(a)$  $\neg \text{parsnip}(a)$ DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$  $\text{celery}(a)$  $\text{root}(a)$  $\text{grated}(a)$  $\text{raw}(a)$  $\Box \perp \text{carrot}(a)$

$S_1 \wedge T_1$  $DK \wedge \text{Source}(\theta)$ 

DK

Source( $\theta$ )starter( $\theta$ ) $\exists y \text{ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$  $\exists y \text{ing}(\theta, y) \wedge \text{vinaigrette}(y)$  ~~$\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$~~ ing( $\theta, a$ )gratedRawCarrot( $a$ ) ~~$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$~~ carrot( $a$ )raw( $a$ )grated( $a$ )carrot( $a$ )  $\vee$  parsnip( $a$ )  $\vee$  celery( $a$ )root( $a$ ) $\neg$ parsnip( $a$ ) $DK \wedge \text{Target}(\theta)$ 

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$ gratedRawCarrot( $a$ )  $\vee \dots$  $\neg$ root( $a$ )  $\vee \dots$ root( $a$ )  $\vee \dots$  $\neg$ parsnip( $a$ )  $\vee \neg$ raw( $a$ ) $\neg$ carrot( $a$ )celery( $a$ )root( $a$ )grated( $a$ )raw( $a$ ) $\Box \perp \text{carrot}(a)$

$S_1 \wedge T_1$  $DK \wedge \text{Source}(\theta)$ 

DK

Source( $\theta$ )starter( $\theta$ ) ~~$\exists y \text{ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$~~  $\exists y \text{ing}(\theta, y) \wedge \text{vinaigrette}(y)$  ~~$\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$~~ ing( $\theta, a$ ) $\text{gratedRawCarrot}(a)$  ~~$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$~~  $\text{carrot}(a)$ raw( $a$ )grated( $a$ ) $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$ root( $a$ ) $\neg \text{parsnip}(a)$  $DK \wedge \text{Target}(\theta)$ 

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$ celery( $a$ )root( $a$ )grated( $a$ )raw( $a$ ) $\Box \perp \text{carrot}(a)$

$S_1 \wedge T_1$  $DK \wedge \text{Source}(\theta)$ 

DK

 $\text{Source}(\theta)$  $\text{starter}(\theta)$  ~~$\exists y \text{ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$~~  $\exists y \text{ing}(\theta, y) \wedge \text{vinaigrette}(y)$  ~~$\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$~~  $\text{ing}(\theta, a)$  $\text{gratedRawCarrot}(a)$  ~~$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$~~  $\text{carrot}(a)$  $\text{raw}(a)$  $\text{grated}(a)$  $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$  $\text{root}(a)$  $\neg \text{parsnip}(a)$  $DK \wedge \text{Target}(\theta)$ 

DK

 $\text{Target}(\theta)$  $\text{starter}(\theta)$  $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$  $\text{celery}(a)$  $\text{root}(a)$  $\text{grated}(a)$  $\text{raw}(a)$  $\Box \perp \text{carrot}(a)$

$S_1 \wedge T_1$ ~~DK  $\wedge$  Source( $\theta$ )~~

DK

Source( $\theta$ )starter( $\theta$ ) ~~$\exists y$  ing( $\theta, y$ )  $\wedge$  gratedRawCarrot( $y$ )~~ $\exists y$  ing( $\theta, y$ )  $\wedge$  vinaigrette( $y$ )~~ing( $\theta, a$ )  $\wedge$  gratedRawCarrot( $a$ )~~ing( $\theta, a$ )gratedRawCarrot( $a$ )~~carrot( $a$ )  $\wedge$  raw( $a$ )  $\wedge$  grated( $a$ )~~carrot( $a$ )raw( $a$ )grated( $a$ )carrot( $a$ )  $\vee$  parsnip( $a$ )  $\vee$  celery( $a$ )root( $a$ ) $\neg$ parsnip( $a$ )DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y$  ( $\neg$ ing( $\theta, y$ )  $\vee$   $\neg$ carrot( $y$ )) $\neg$ ing( $\theta, a$ )  $\vee$   $\neg$ carrot( $a$ ) $\neg$ gratedRawCarrot( $a$ )  $\vee$  (...)gratedRawCarrot( $a$ )  $\vee$  ... $\neg$ root( $a$ )  $\vee$  ...root( $a$ )  $\vee$  ... $\neg$ parsnip( $a$ )  $\vee$   $\neg$ raw( $a$ ) $\neg$ carrot( $a$ )celery( $a$ )root( $a$ )grated( $a$ )raw( $a$ ) $\Box \perp$  carrot( $a$ )

$S'_1 \wedge T_1$ ~~DK  $\wedge$  Source( $\theta$ )~~~~DK~~~~Source( $\theta$ )~~~~starter( $\theta$ )~~ ~~$\exists y$  ing( $\theta, y$ )  $\wedge$  gratedRawCarrot( $y$ )~~ ~~$\exists y$  ing( $\theta, y$ )  $\wedge$  vinaigrette( $y$ )~~~~ing( $\theta, a$ )  $\wedge$  gratedRawCarrot( $a$ )~~~~ing( $\theta, a$ )~~~~gratedRawCarrot( $a$ )~~~~carrot( $a$ )  $\wedge$  raw( $a$ )  $\wedge$  grated( $a$ )~~~~carrot( $a$ )~~~~raw( $a$ )~~~~grated( $a$ )~~~~carrot( $a$ )  $\vee$  parsnip( $a$ )  $\vee$  celery( $a$ )~~~~root( $a$ )~~ ~~$\neg$ parsnip( $a$ )~~DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y$  ( $\neg$ ing( $\theta, y$ )  $\vee$   $\neg$ carrot( $y$ )) $\neg$ ing( $\theta, a$ )  $\vee$   $\neg$ carrot( $a$ ) $\neg$ gratedRawCarrot( $a$ )  $\vee$  (...)gratedRawCarrot( $a$ )  $\vee$  ... $\neg$ root( $a$ )  $\vee$  ...root( $a$ )  $\vee$  ... $\neg$ parsnip( $a$ )  $\vee$   $\neg$ raw( $a$ ) $\neg$ carrot( $a$ )celery( $a$ )root( $a$ )grated( $a$ )raw( $a$ ) $\Box \perp$  carrot( $a$ )

$S_1 \wedge T_2$ 

$DK \wedge \text{Source}(\theta)$   
 $DK$   
 $\text{Source}(\theta)$   
 $\text{starter}(\theta)$   
 $\exists y \text{ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$   
 $\exists y \text{ing}(\theta, y) \wedge \text{vinaigrette}(y)$   
 $\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$   
 $\text{ing}(\theta, a)$   
 $\text{gratedRawCarrot}(a)$   
 $\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$   
 $\text{carrot}(a)$   
 $\text{raw}(a)$   
 $\text{grated}(a)$   
 $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$   
 $\text{root}(a)$   
 $\neg \text{parsnip}(a)$   
 $\square_{\pm} \text{carrot}(a)$

$DK \wedge \text{Target}(\theta)$   
 $DK$   
 $\text{Target}(\theta)$   
 $\text{starter}(\theta)$   
 $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$   
 $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$   
 $\neg \text{gratedRawCarrot}(a) \vee (\dots)$   
 $\text{gratedRawCarrot}(a) \vee \dots$   
 $\neg \text{root}(a) \vee \dots$   
 $\text{root}(a) \vee \dots$   
 $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$   
 $\neg \text{carrot}(a)$   
 $\text{parsnip}(a)$   
 $\text{root}(a)$   
 $\text{grated}(a)$   
 $\neg \text{raw}(a)$   
 $\square_{\pm} \text{raw}(a)$



$S_1 \wedge T_2$  $DK \wedge \text{Source}(\theta)$ 

DK

Source( $\theta$ )starter( $\theta$ ) $\exists y \text{ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$  $\exists y \text{ing}(\theta, y) \wedge \text{vinaigrette}(y)$  $\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$ ing( $\theta, a$ )gratedRawCarrot( $a$ ) $\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$ carrot( $a$ )raw( $a$ )grated( $a$ ) $\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$ root( $a$ ) $\neg \text{parsnip}(a)$  $\Box \perp \text{carrot}(a)$  $DK \wedge \text{Target}(\theta)$ 

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$ gratedRawCarrot( $a$ )  $\vee \dots$  $\neg \text{root}(a) \vee \dots$ root( $a$ )  $\vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$ parsnip( $a$ )root( $a$ )grated( $a$ ) $\neg \text{raw}(a)$  $\Box \perp \text{raw}(a)$

$S'_1 \wedge T_2$ 

~~DK  $\wedge$  Source( $\theta$ )~~  
~~DK~~  
~~Source( $\theta$ )~~  
~~starter( $\theta$ )~~  
 ~~$\exists y$  ing( $\theta, y$ )  $\wedge$  gratedRawCarrot( $y$ )~~  
 ~~$\exists y$  ing( $\theta, y$ )  $\wedge$  vinaigrette( $y$ )~~  
~~ing( $\theta, a$ )  $\wedge$  gratedRawCarrot( $a$ )~~  
~~ing( $\theta, a$ )~~  
~~gratedRawCarrot( $a$ )~~  
~~carrot( $a$ )  $\wedge$  raw( $a$ )  $\wedge$  grated( $a$ )~~  
~~carrot( $a$ )~~  
~~raw( $a$ )~~  
~~grated( $a$ )~~  
~~carrot( $a$ )  $\vee$  parsnip( $a$ )  $\vee$  celery( $a$ )~~  
~~root( $a$ )~~  
 ~~$\neg$ parsnip( $a$ )~~  
 ~~$\square \perp$  carrot( $a$ )~~

DK  $\wedge$  Target( $\theta$ )  
DK  
Target( $\theta$ )  
starter( $\theta$ )  
 $\forall y$  ( $\neg$ ing( $\theta, y$ )  $\vee$   $\neg$ carrot( $y$ ))  
 $\neg$ ing( $\theta, a$ )  $\vee$   $\neg$ carrot( $a$ )  
 $\neg$ gratedRawCarrot( $a$ )  $\vee$  (...)  
gratedRawCarrot( $a$ )  $\vee$  ...  
 $\neg$ root( $a$ )  $\vee$  ...  
root( $a$ )  $\vee$  ...  
 $\neg$ parsnip( $a$ )  $\vee$   $\neg$ raw( $a$ )  
 $\neg$ carrot( $a$ )  
parsnip( $a$ )  
root( $a$ )  
grated( $a$ )  
 $\neg$ raw( $a$ )  
 $\square \perp$  raw( $a$ )

$S'_1 \wedge T_2$

~~DK  $\wedge$  Source( $\theta$ )~~  
DK  
~~Source( $\theta$ )~~  
~~starter( $\theta$ )~~  
 ~~$\exists y \text{ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$~~   
 ~~$\exists y \text{ing}(\theta, y) \wedge \text{vinaigrette}(y)$~~   
 ~~$\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$~~   
 ~~$\text{ing}(\theta, a)$~~   
 ~~$\text{gratedRawCarrot}(a)$~~   
 ~~$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$~~   
 ~~$\text{carrot}(a)$~~   
 ~~$\text{raw}(a)$~~   
 ~~$\text{grated}(a)$~~   
 ~~$\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$~~   
 ~~$\text{root}(a)$~~   
 ~~$\neg \text{parsnip}(a)$~~   
 ~~$\square \perp \text{carrot}(a)$~~

DK  $\wedge$  Target( $\theta$ )  
DK  
Target( $\theta$ )  
starter( $\theta$ )  
 $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$   
 $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$   
 $\neg \text{gratedRawCarrot}(a) \vee (\dots)$   
 $\text{gratedRawCarrot}(a) \vee \dots$   
 $\neg \text{root}(a) \vee \dots$   
 $\text{root}(a) \vee \dots$   
 $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$   
 $\neg \text{carrot}(a)$   
 $\text{parsnip}(a)$   
 $\text{root}(a)$   
 $\text{grated}(a)$   
 $\neg \text{raw}(a)$   
 $\square \perp \text{raw}(a)$

$S'_1 \wedge T_2$ ~~DK  $\wedge$  Source( $\theta$ )~~~~DK~~~~Source( $\theta$ )~~~~starter( $\theta$ )~~ ~~$\exists y \text{ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$~~  ~~$\exists y \text{ing}(\theta, y) \wedge \text{vinaigrette}(y)$~~  ~~$\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$~~  ~~$\text{ing}(\theta, a)$~~  ~~$\text{gratedRawCarrot}(a)$~~  ~~$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$~~  ~~$\text{carrot}(a)$~~  ~~$\text{raw}(a)$~~  ~~$\text{grated}(a)$~~  ~~$\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$~~  ~~$\text{root}(a)$~~  ~~$\neg \text{parsnip}(a)$~~  ~~$\square \perp \text{carrot}(a)$~~ DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$  $\text{parsnip}(a)$  $\text{root}(a)$  $\text{grated}(a)$  $\neg \text{raw}(a)$  $\square \perp \text{raw}(a)$

$S'_1 \wedge T_2$ ~~DK  $\wedge$  Source( $\theta$ )~~~~DK~~~~Source( $\theta$ )~~~~starter( $\theta$ )~~ ~~$\exists y \text{ing}(\theta, y) \wedge \text{gratedRawCarrot}(y)$~~  ~~$\exists y \text{ing}(\theta, y) \wedge \text{vinaigrette}(y)$~~  ~~$\text{ing}(\theta, a) \wedge \text{gratedRawCarrot}(a)$~~  ~~$\text{ing}(\theta, a)$~~  ~~$\text{gratedRawCarrot}(a)$~~  ~~$\text{carrot}(a) \wedge \text{raw}(a) \wedge \text{grated}(a)$~~  ~~$\text{carrot}(a)$~~  ~~$\text{raw}(a)$~~  ~~$\text{grated}(a)$~~  ~~$\text{carrot}(a) \vee \text{parsnip}(a) \vee \text{celery}(a)$~~  ~~$\text{root}(a)$~~  ~~$\neg \text{parsnip}(a)$~~  ~~$\Box \perp \text{carrot}(a)$~~ DK  $\wedge$  Target( $\theta$ )

DK

Target( $\theta$ )starter( $\theta$ ) $\forall y (\neg \text{ing}(\theta, y) \vee \neg \text{carrot}(y))$  $\neg \text{ing}(\theta, a) \vee \neg \text{carrot}(a)$  $\neg \text{gratedRawCarrot}(a) \vee (\dots)$  $\text{gratedRawCarrot}(a) \vee \dots$  $\neg \text{root}(a) \vee \dots$  $\text{root}(a) \vee \dots$  $\neg \text{parsnip}(a) \vee \neg \text{raw}(a)$  $\neg \text{carrot}(a)$  $\text{parsnip}(a)$  $\text{root}(a)$  $\text{grated}(a)$  $\neg \text{raw}(a)$  $\Box \perp \text{raw}(a)$

- $S_1 \wedge T_1$  requires less repair than  $S_1 \wedge T_2$
- In fact,  $S_1 \wedge T_1$  requires strictly less repair than  $S_1 \wedge T_j$  ( $j \neq 1$ )
- Therefore:

$$\text{CompletedTarget} = S'_1 \wedge T_1$$

- In other words:  
to adapt your raw and grated carrots with vinaigrette,  
substitute carrots with celery  
(better than parsnips, since raw parsnips cannot be eaten)

# Conclusion and Future Work

# Conclusion

- Extension of the tableau method to adaptation in CBR
- Studied and implemented for  $\mathcal{ALC}$   
(and propositional logic which is a fragment of  $\mathcal{ALC}$ )
- A prototype working with  $\mathcal{ALC}$  has been developed.
- Complexity  $\geq$  consistency test: 

{	• EXPTIME-hard for $\mathcal{ALC}$
	• Much quicker for practical applications



- Deeper study of the properties of this adaptation
- Links with other approaches of adaptation
- Towards an efficient implementation
  - What are the optimizations of the tableaux method that are compatible with our extension?
- Generalisation to more expressive DLs
  - E.g., to  $\mathcal{ALC}(\mathbb{D})$  with a numerical concrete domain