

THE EXTENSIONAL CONSTRAINT

Public defense

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The extensional constraint

Extensional representation

Constraint programming

The extensional constraint

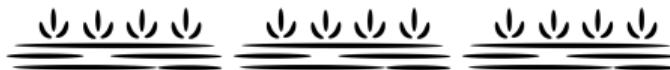
Extensional representation

Constraint programming

WHAT IS CONSTRAINT PROGRAMMING?













Variables



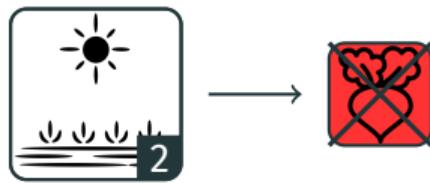
Variables

Domains



Variables

Domains



Unary constraints

$$\#_i \left(\begin{array}{c} \text{Icon: Sun over plants with index } i \\ \longrightarrow \end{array} \right) \geq 10$$

$$\#_i \left(\begin{array}{c} \text{Icon: Sun over plants with index } i \\ \longrightarrow \end{array} \right) = 5$$

Arithmetic constraints



Logical constraints



Logical constraints



Combinatorial constraints

The problem

Variables and domains



Constraints



$$\#_i (\text{sun over water} \rightarrow \text{crop}) \geq 10$$

if  then 

...

?

A solution



...

The problem

Variables and domains



Constraints



$$\#_i \left(\text{sun over water} \rightarrow \text{crop} \right) \geq 10$$

if  →  then  → 

...

Constraint
Programming
solver

A solution



...

The problem

Variables and domains



Constraints



$$\#_i \left(\text{sun over water} \rightarrow \text{crop} \right) \geq 10$$

if  →  then  → 

...

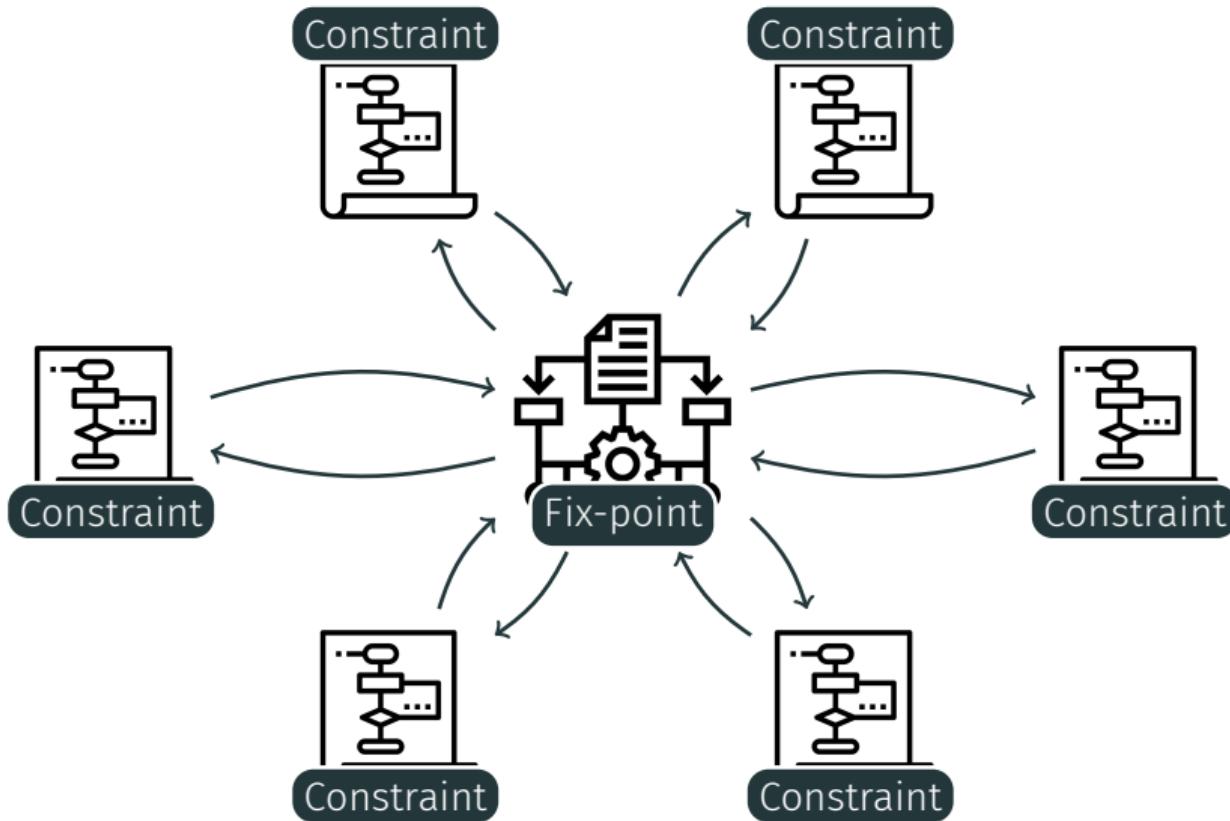
Constraint
Programming
solver

A solution



...





The extensional constraint

Extensional representation

Constraint programming



The extensional constraint

Extensional representation

Constraint programming



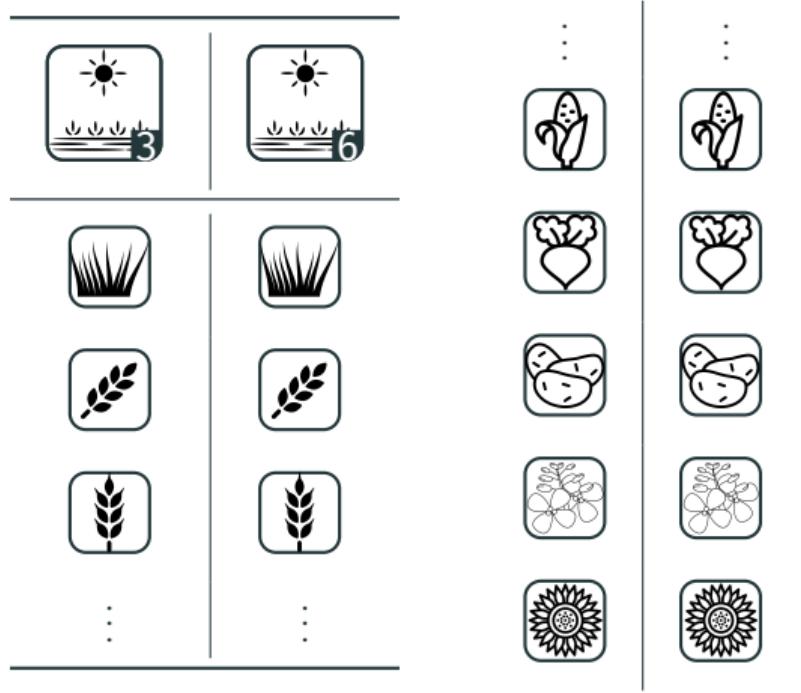
WHAT IS AN EXTENSIONAL REPRESENTATION?



Intensional representation



Intensional representation



Extensional representation

Big question time!

Big question time!

Why should we use extensional representation instead of intensional ones?

Big question time!

Why should we use extensional representation instead of intensional ones?

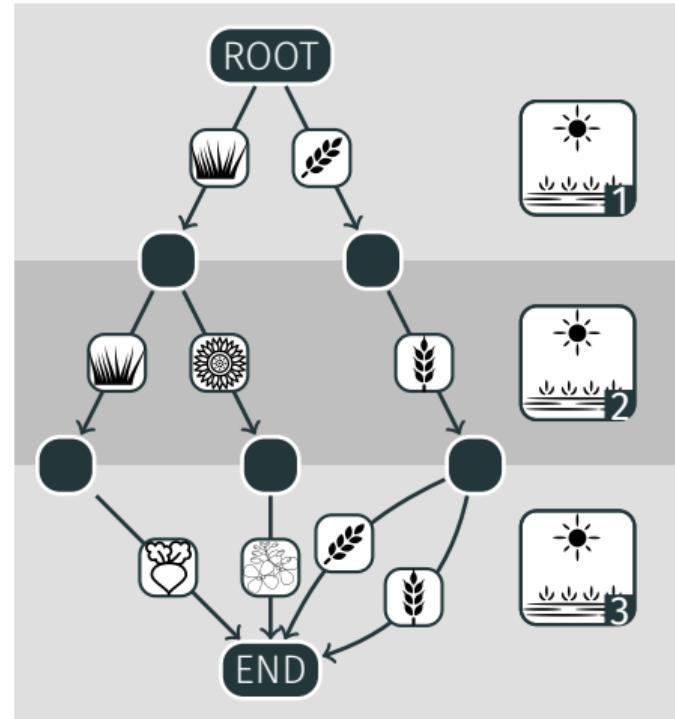
They can modelize any intensional formulas

Tables

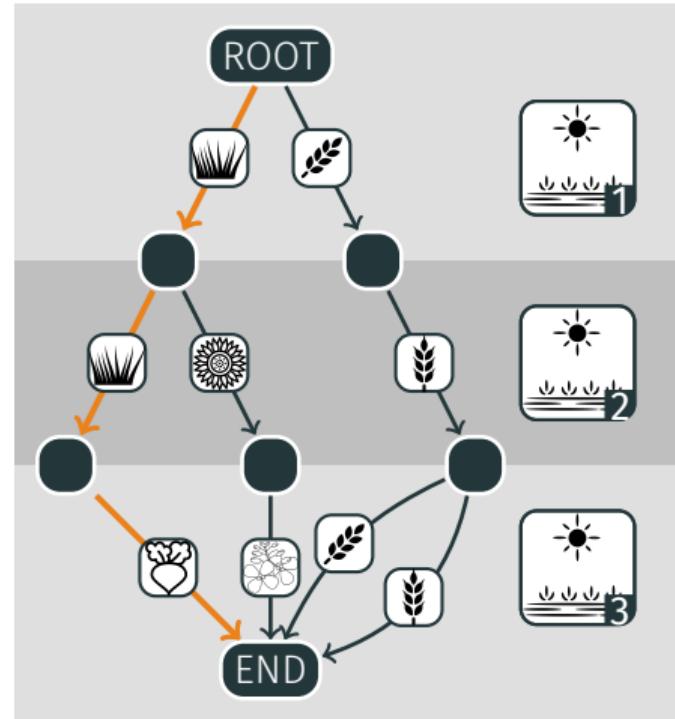
Tables



Diagrams (MDDs, MVDs,...)

Tables



Diagrams (MDDs, MVDs,...)

Table or diagram?

It depends!

Tables are more straightforward to update

Diagrams can have a huge compression ratio

It depends on what you represent

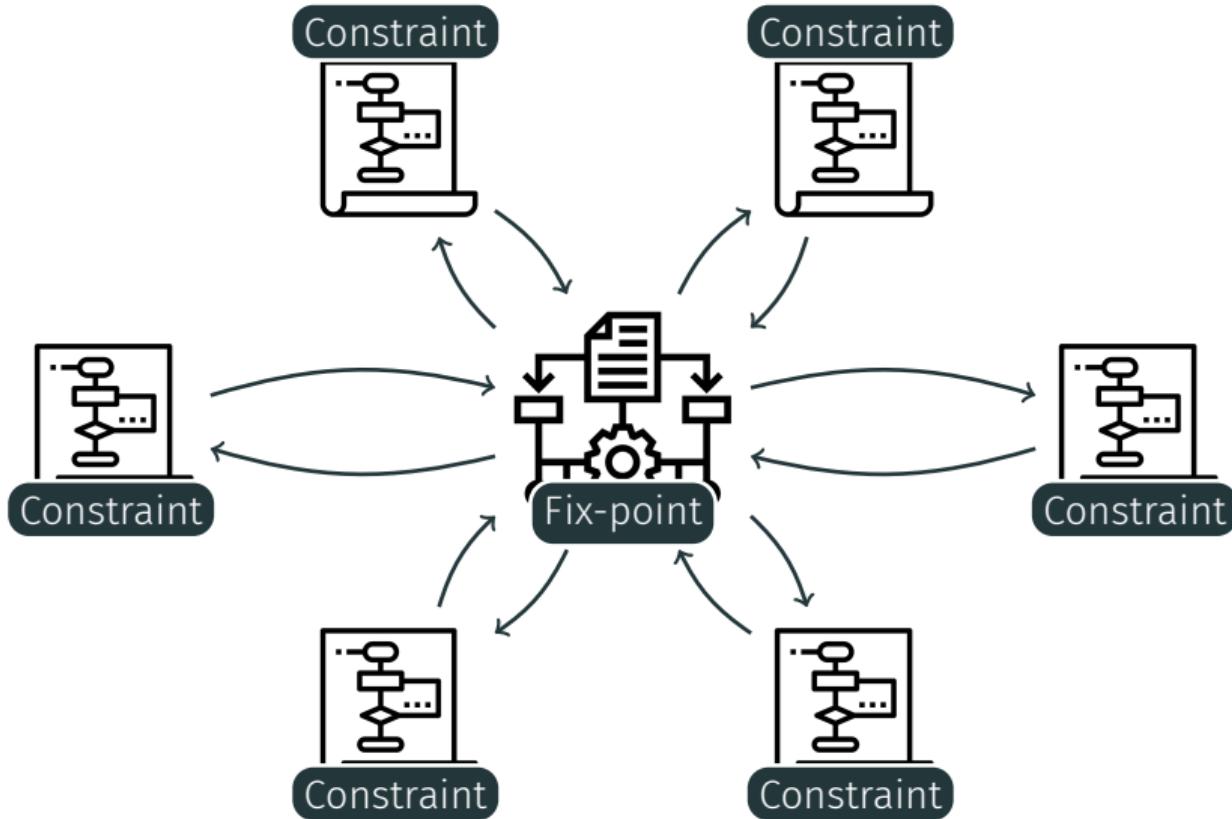
The extensional constraint

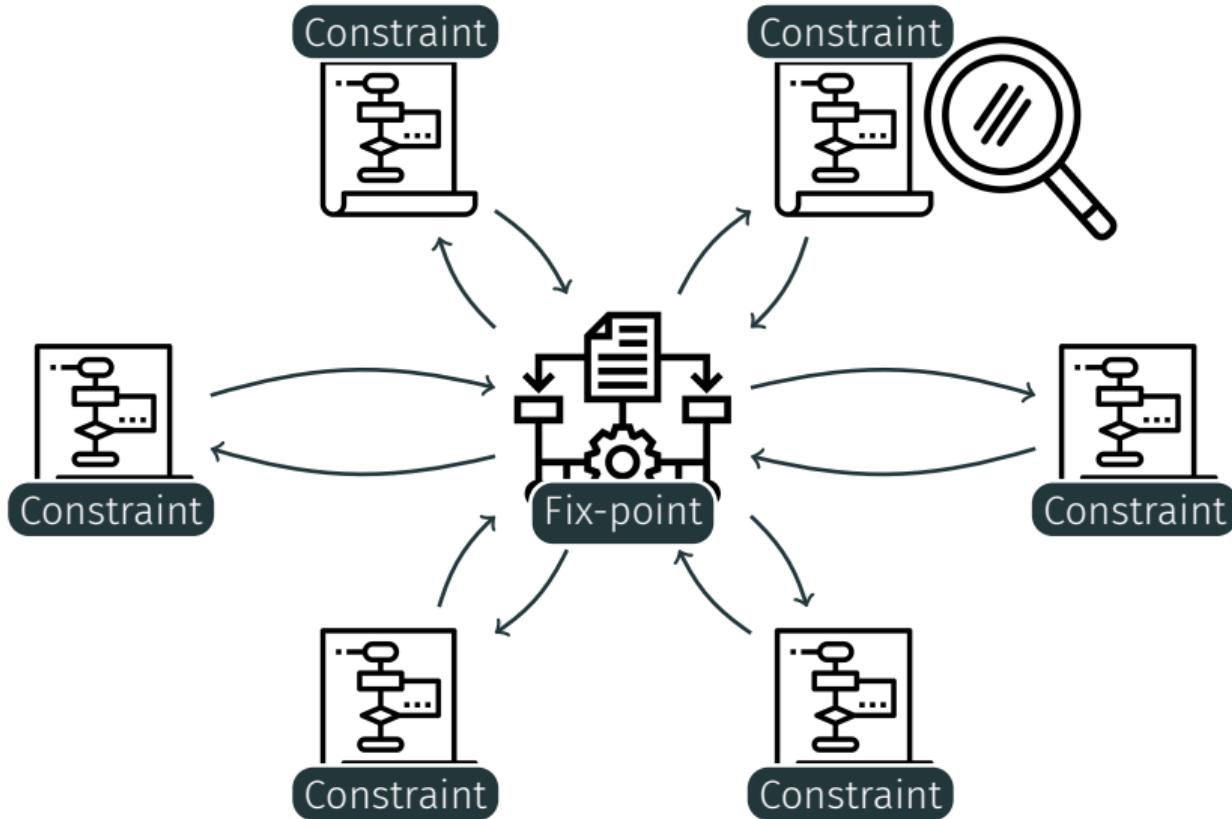
Extensional representation

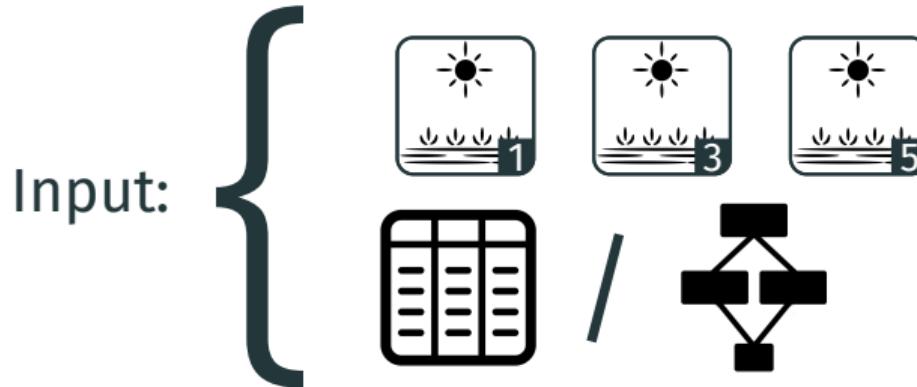
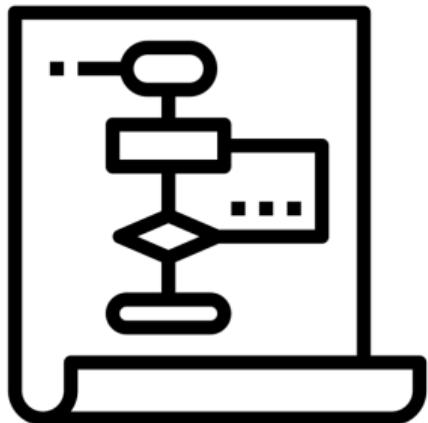
Constraint programming



WHAT IS AN EXTENSIONAL CONSTRAINT?



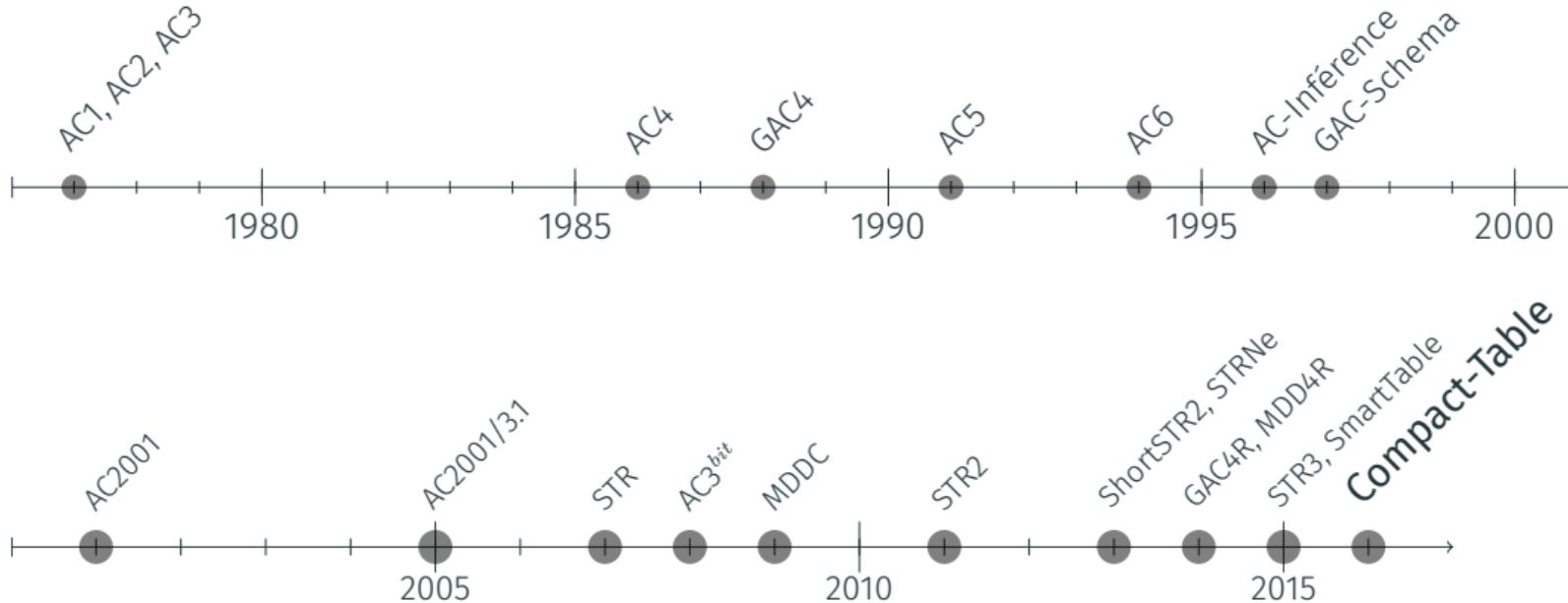




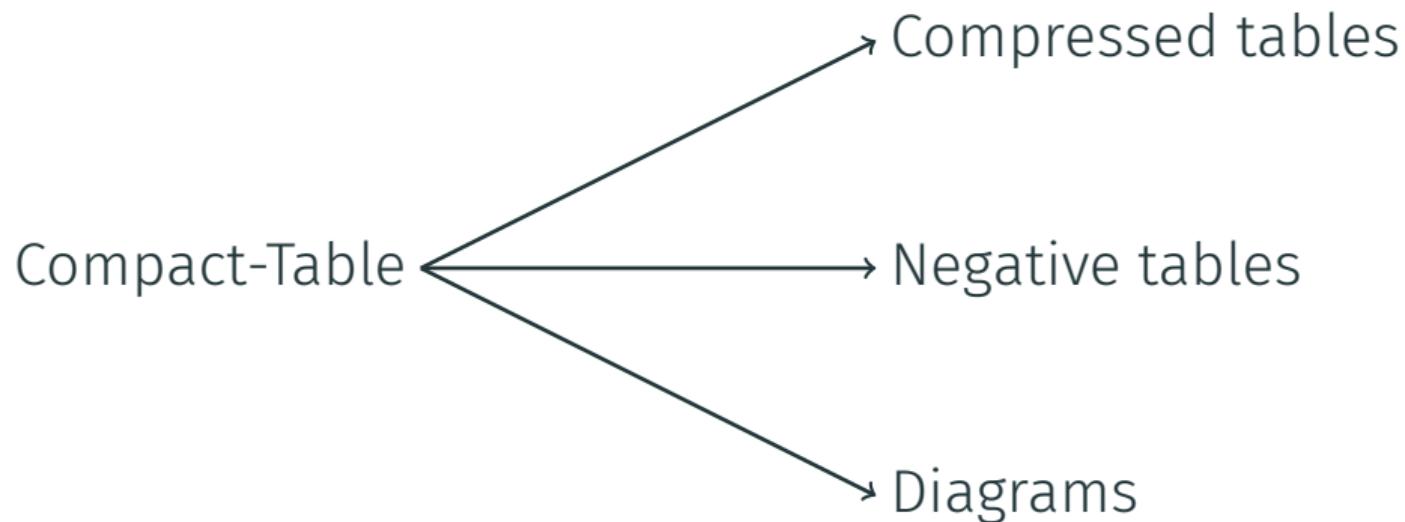
Goal:

Ensure solution belong to





CONTRIBUTION OF THIS THESIS



	1	2	3
τ_1			
τ_2			
τ_3			
τ_4			

Current table:

τ_1	τ_2	τ_3	τ_4
✓	✓	✓	✓

COMPTACT-TABLE: BITSETS ARE THE KEY

			
τ_1			
τ_2			
τ_3			
τ_4			

	τ_1	τ_2	τ_3	τ_4
				
				
				
				
				
				
				
				

support

How do we update current
table after



?

How do we update current
table after



?

Supports help identify which
tuples are no more valid

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
support of removed value	✓	✗	✓	✓	✗	✗	✗	✓
intersection	✓	✗	✗	✓	✗	✗	✗	✗

← tuples now invalid

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
support of removed value	✓	✗	✓	✓	✗	✗	✗	✓
intersection	✓	✗	✗	✓	✗	✗	✗	✗
	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
intersection	✓	✗	✗	✓	✗	✗	✗	✗
removal	✗	✓	✗	✗	✓	✓	✗	✗

← tuples now invalid

new value of current table

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
support of removed value	✓	✗	✓	✓	✗	✗	✗	✓
intersection	✓	✗	✗	✓	✗	✗	✗	✗
	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
intersection	✓	✗	✗	✓	✗	✗	✗	✗
removal	✗	✓	✗	✗	✓	✓	✗	✗

← tuples now invalid

new value of current table

Incremental update

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
support value 1	✓	✗	✗	✓	✓	✗	✗	✗
	:	:	:	:	:	:	:	:
support value n	✗	✗	✓	✗	✗	✗	✗	✓
union	✓	✓	✓	✓	✓	✓	✗	✓

remaining values
in the domain of
the variable

← tuples valid for
the given variable

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
support value 1	✓	✗	✗	✓	✓	✗	✗	✗
	:	:	:	:	:	:	:	:
support value n	✗	✗	✓	✗	✗	✗	✗	✓
union	✓	✓	✓	✓	✓	✓	✗	✓

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
union	✓	✓	✓	✓	✓	✓	✗	✓
intersection	✓	✓	✗	✓	✓	✓	✗	✗

remaining values
in the domain of
the variable

← tuples valid for
the given variable

new value of
current table

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
support value 1	✓	✗	✗	✓	✓	✗	✗	✗
	:	:	:	:	:	:	:	:
support value n	✗	✗	✓	✗	✗	✗	✗	✓
union	✓	✓	✓	✓	✓	✓	✗	✓

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
union	✓	✓	✓	✓	✓	✓	✗	✓
intersection	✓	✓	✗	✓	✓	✓	✗	✗

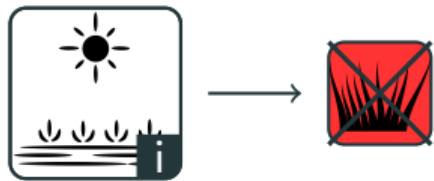
remaining values
in the domain of
the variable

← tuples valid for
the given variable

new value of
current table

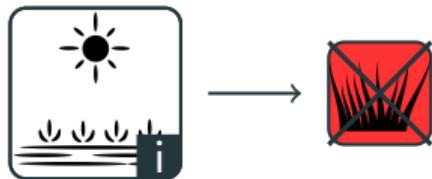
Reset update

How do we know
if



?

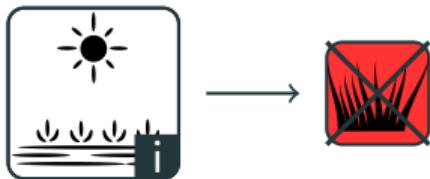
How do we know
if



?

No tuples with the
value anymore

How do we know
if

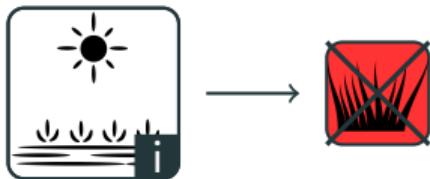


?

No tuples with the
value anymore

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
support	✓	✗	✓	✓	✗	✗	✗	✓
intersection	✓	✗	✗	✓	✗	✗	✗	✗

How do we know
if



?

No tuples with the
value anymore

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
support	✓	✗	✓	✓	✗	✗	✗	✓
intersection	✓	✗	✗	✓	✗	✗	✗	✗

if $|\text{intersection}| = 0$



POSITIVE TABLE CONSTRAINTS

	 1	 2	 3
τ_1			
τ_2			
τ_3		 	 
τ_4	 ⋮	 ⋮	 ⋮

			
τ_1			
τ_2			
τ_3			
τ_4			
	⋮	⋮	⋮



single value

			
τ_1			
τ_2			
τ_3			
τ_4			
	⋮	⋮	⋮



single value



universal value

					single value
τ_1					universal value
τ_2					except one value
τ_3					
τ_4					
	⋮	⋮	⋮		

					single value
τ_1					universal value
τ_2					except one value
τ_3					from a set of values
τ_4					
	⋮	⋮	⋮		

					single value
τ_1		*		*	universal value
τ_2				\neq	except one value
τ_3		\neq	\neq	$\in \{$ $\}$	from a set of values
τ_4	$\in \{$ $\}$	$\in \{$ $\}$		$\leq k$	bounded values (only with ordered domains)
	:	:	:		

How to adapt the update for



?

How to adapt the update for



?

If $|\text{dom}| = 1 \rightarrow$ reset update

How to adapt the update for

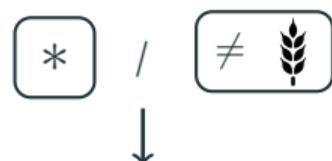


?

If $|\text{dom}| = 1 \rightarrow$ reset update

If $|\text{dom}| > 1 \rightarrow$ stays valid

Incremental update



	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
support of removed value	✓	✗	✓	✓	✗	✗	✗	✓
intersection	✓	✗	✗	✓	✗	✗	✗	✗

← tuples now invalid

Incremental update



	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
exclusive support of removed value	✓	✗	✓	✗	✗	✗	✗	✓
intersection	✓	✗	✗	✗	✗	✗	✗	✗

← tuples now
invalid

How to adapt the update for

$$\leq j$$

$$\geq k$$

?

How to adapt the update for

$$\leq j \quad \geq k$$

?

If $\min(\text{dom}) > j \rightarrow \leq j$ not supported

How to adapt the update for

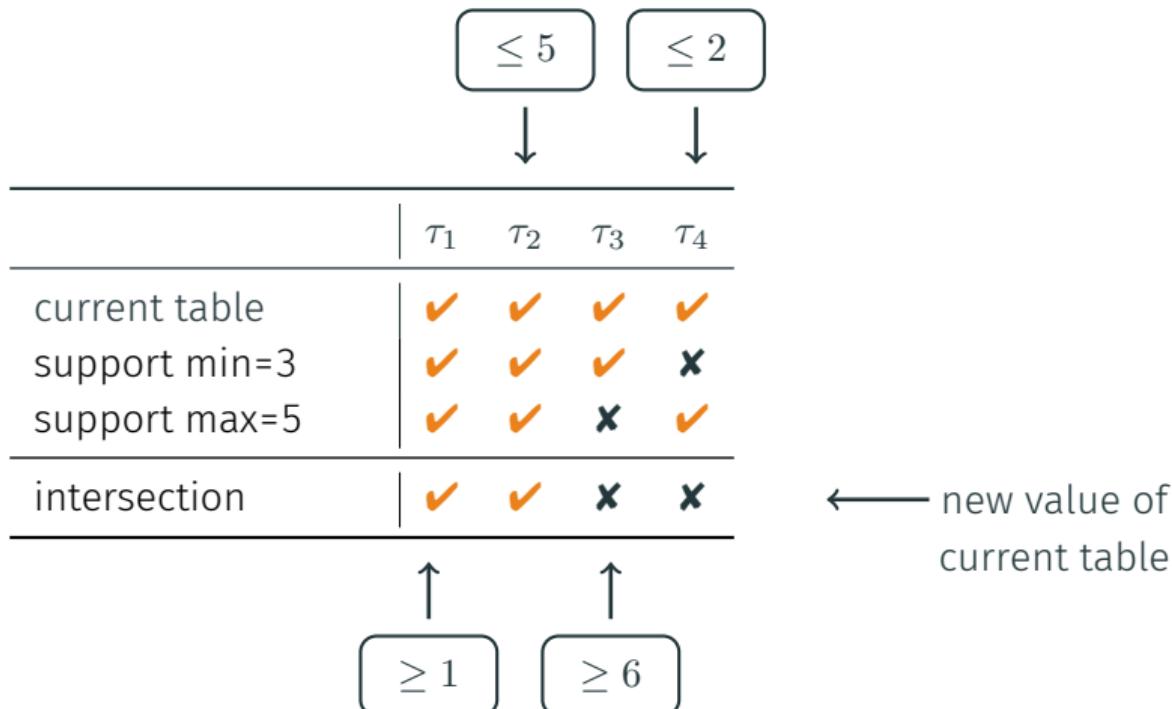
$$\begin{array}{c} \leq j \\ \geq k \end{array}$$

?

If $\min(\text{dom}) > j \rightarrow$  not supported

If $\max(\text{dom}) < k \rightarrow$  not supported

Incremental update



The diagram illustrates an incremental update process using two sets of bounds and a table with support counts.

Top row: Two boxes containing bounds: ≤ 5 and ≤ 2 .

Middle row: Two arrows pointing downwards from the top row boxes to the table.

Table structure:

	τ_1	τ_2	τ_3	τ_4
current table	✓	✓	✓	✓
support min=3	✓	✓	✓	✗
support max=5	✓	✓	✗	✓
intersection	✓	✓	✗	✗

Bottom row: Two boxes containing bounds: ≥ 1 and ≥ 6 .

Two arrows point upwards from the bottom row boxes to the table.

Annotation: An arrow points from the text "new value of current table" to the intersection row of the table.



What are the problems here?



What are the problems here?

Problem 1: the number of different sets

$$\sum_{k=1}^{n-1} \frac{n!}{(n-k)!k!}$$

$$\sum_{k=1}^{8-1} \frac{8!}{(8-k)!k!} = 256$$



What are the problems here?

Problem 2: incrementally detecting unsupported set requires individual counters for each set



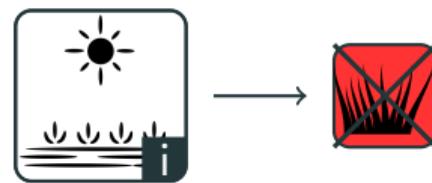
Reset update is the only choice

NEGATIVE TABLE CONSTRAINTS

	1	2	3
τ_1			
τ_2			
τ_3			
τ_4			

	1	2	3
τ_1			
τ_2			
τ_3			
τ_4			

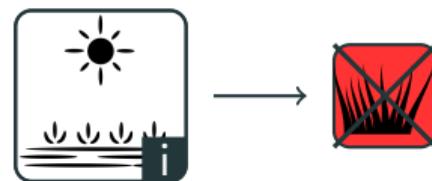
How do we know if



?

	1	2	3
τ_1			
τ_2			
τ_3			
τ_4			

How do we know if



?

All combinations should be in
the table

	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
support	✓	✗	✓	✓	✗	✗	✗	✓
intersection	✓	✗	✗	✓	✗	✗	✗	✗

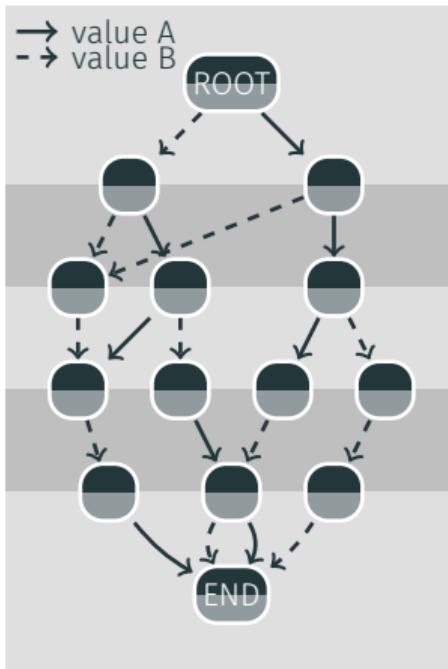
	τ_1	τ_2	τ_3	τ_4	τ_5	τ_6	τ_7	τ_8
current table	✓	✓	✗	✓	✓	✓	✗	✗
support	✓	✗	✓	✓	✗	✗	✗	✓
intersection	✓	✗	✗	✓	✗	✗	✗	✗

if $|\text{intersection}| = |\text{possible combinations}|$

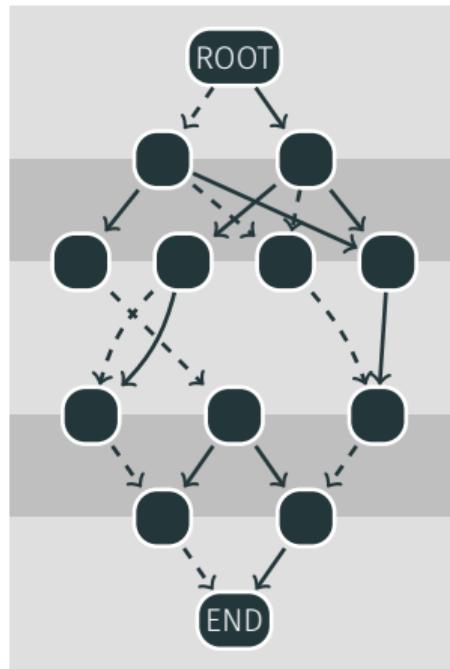


DIAGRAM CONSTRAINTS

MDD

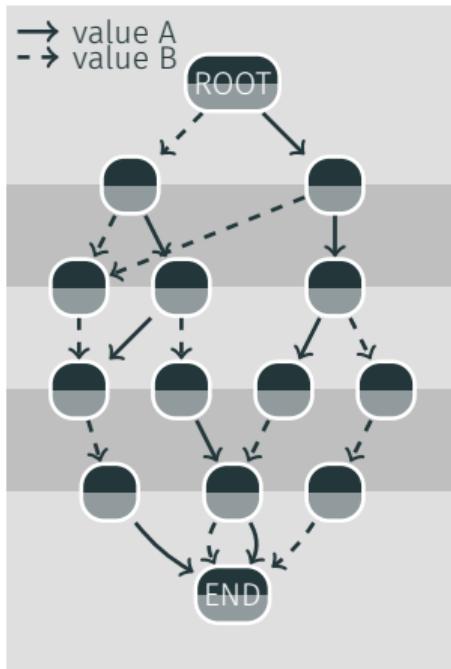


MVD

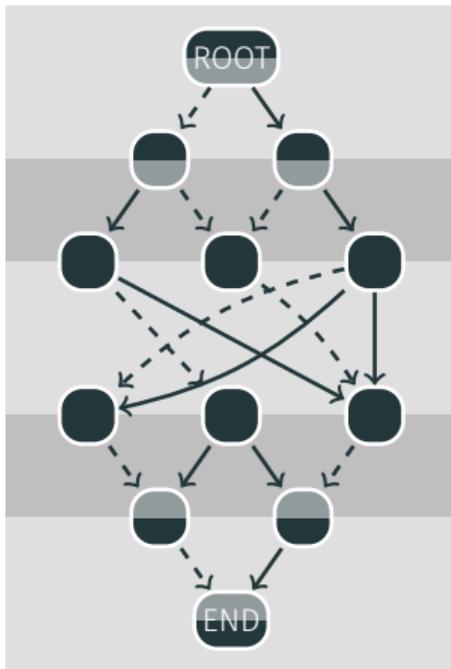


 in-nd & out-nd  in-nd & out-d

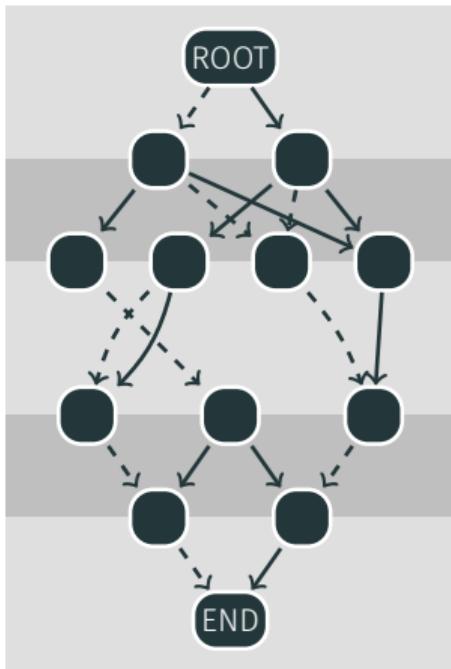
MDD

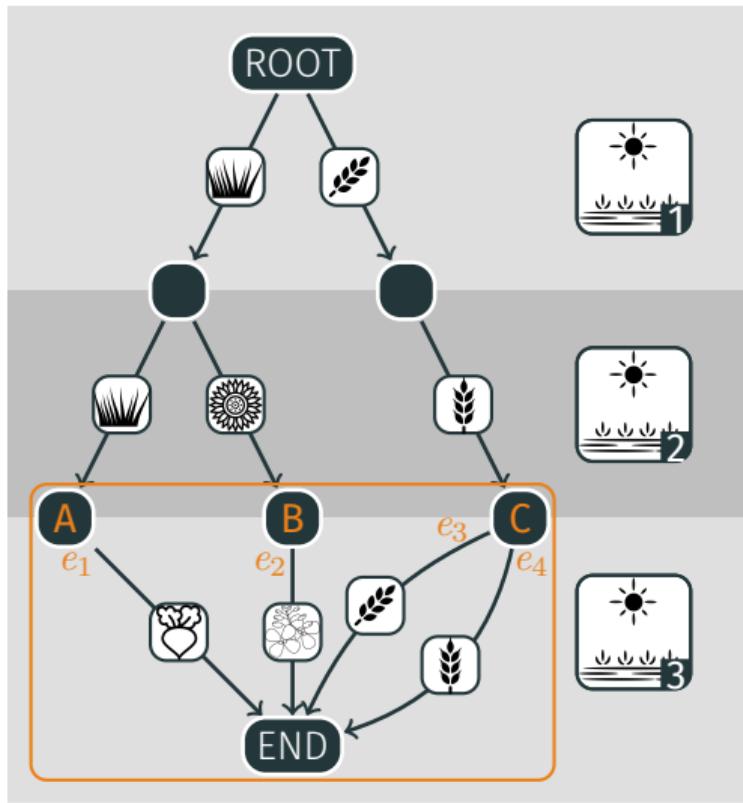


sMDD

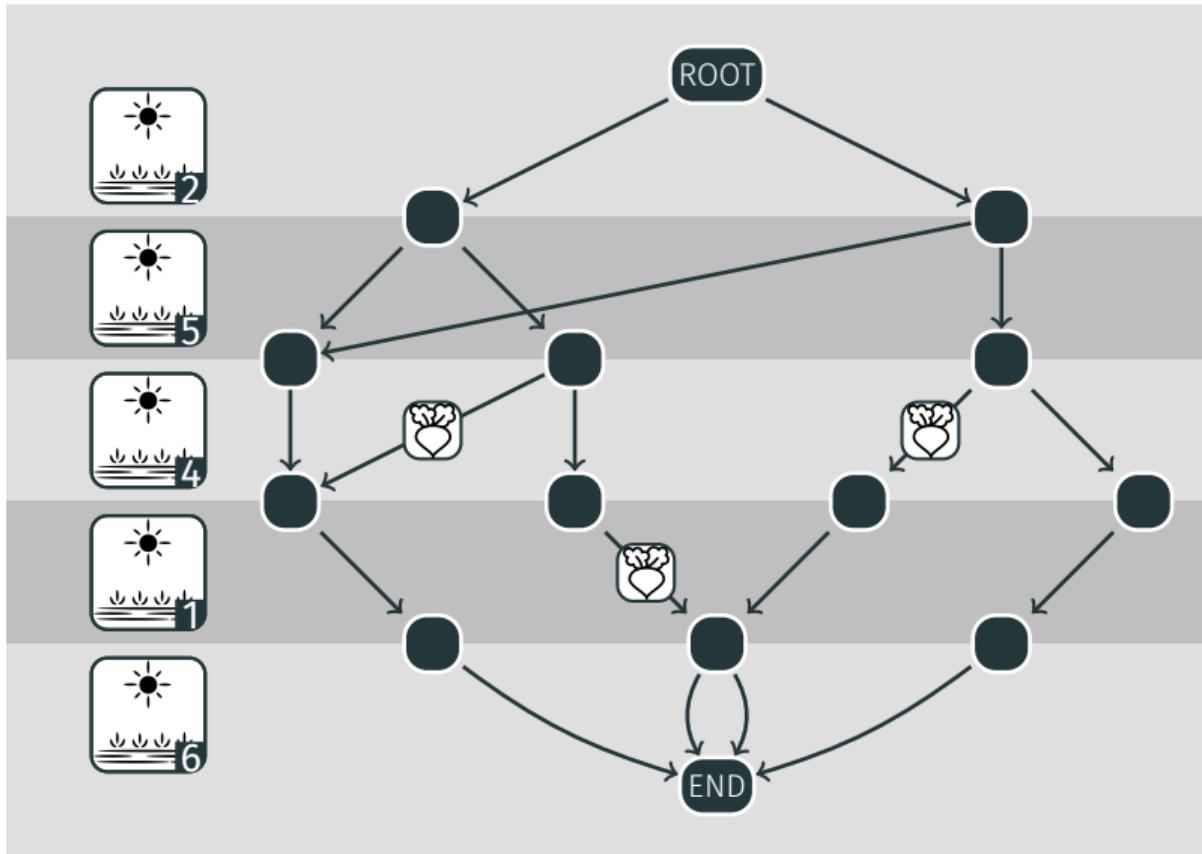


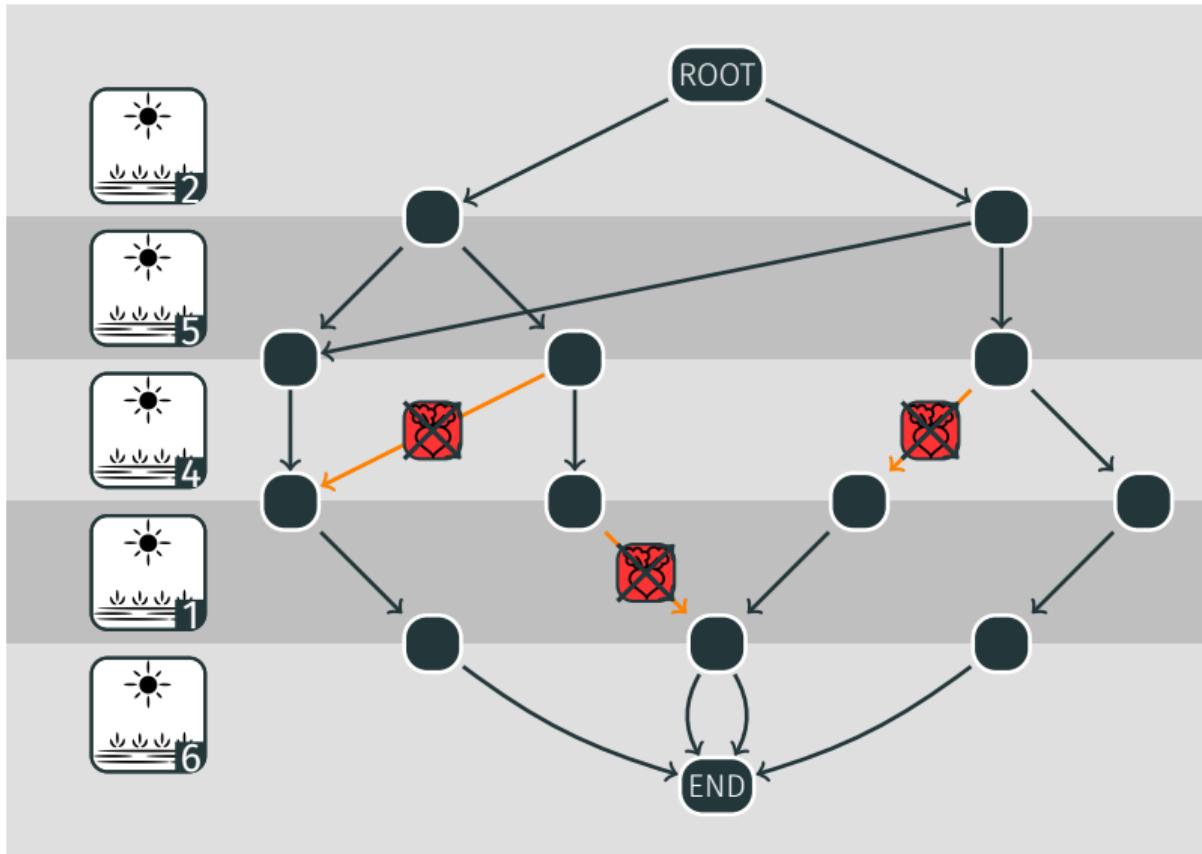
MVD

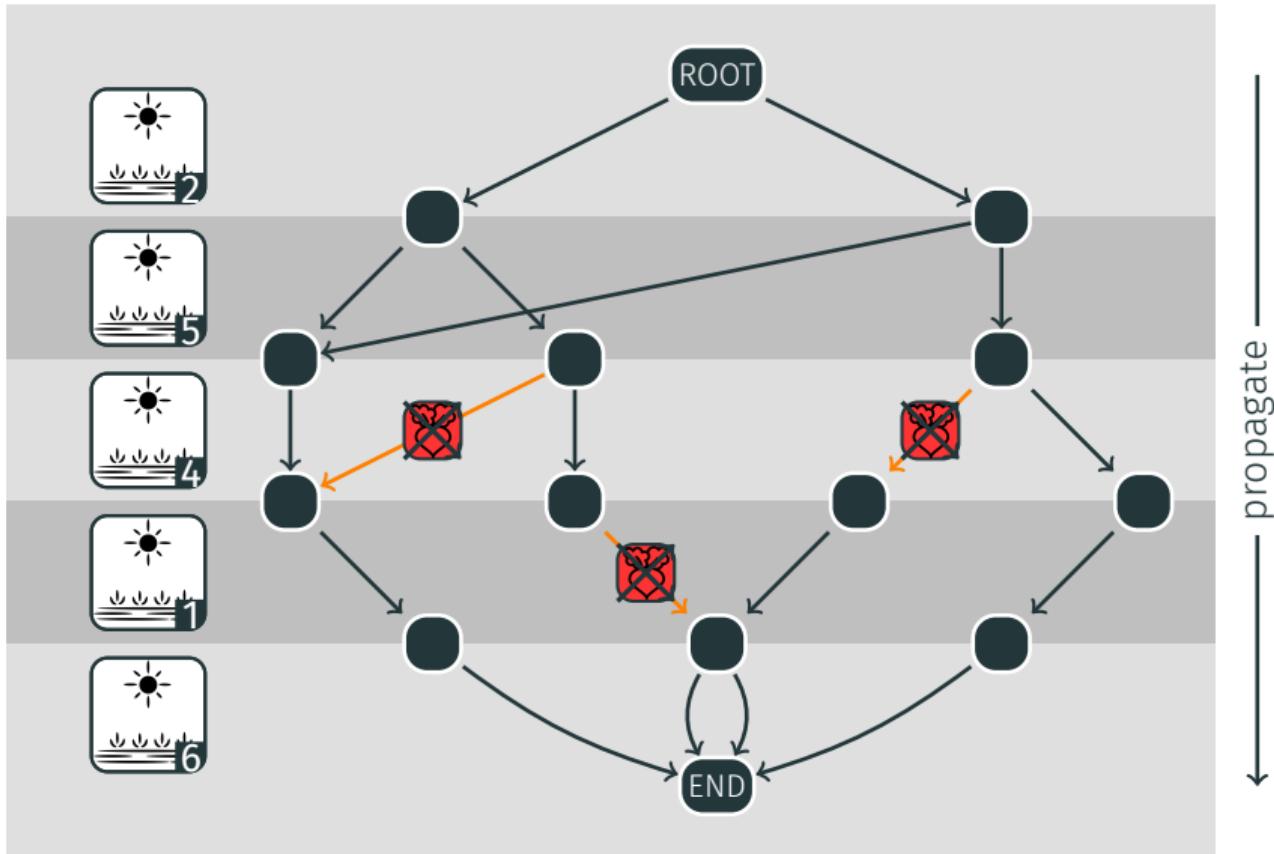
 in-nd & out-nd in-nd & out-d in-d & out-nd

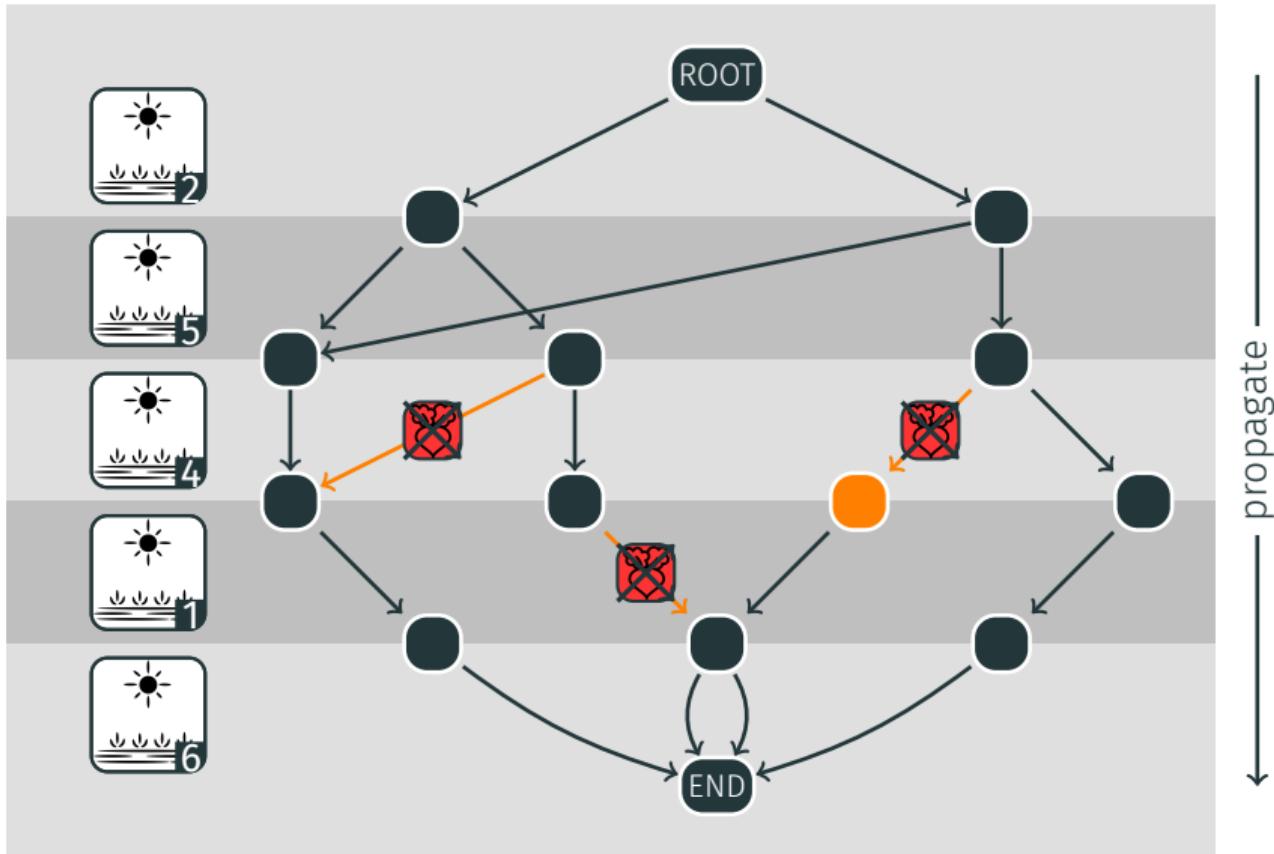


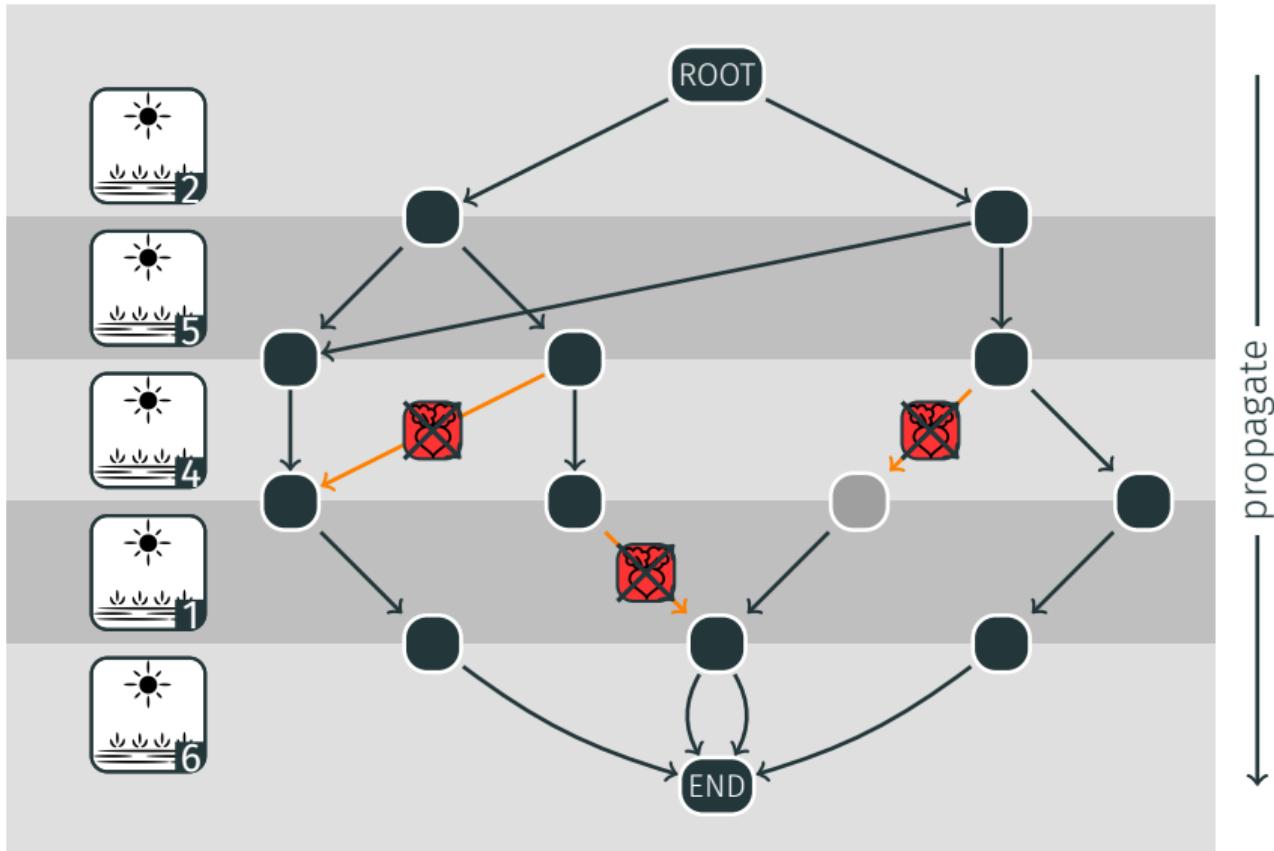
	e_1	e_2	e_3	e_4
current arc	✓	✓	✓	✓
support	✓	✗	✗	✗
support	✗	✓	✗	✗
support	✗	✗	✓	✗
support	✗	✗	✗	✓
arc out of A	✓	✗	✗	✗
arc out of B	✗	✓	✗	✗
arc out of C	✗	✗	✓	✓
arc into OUT	✓	✓	✓	✓

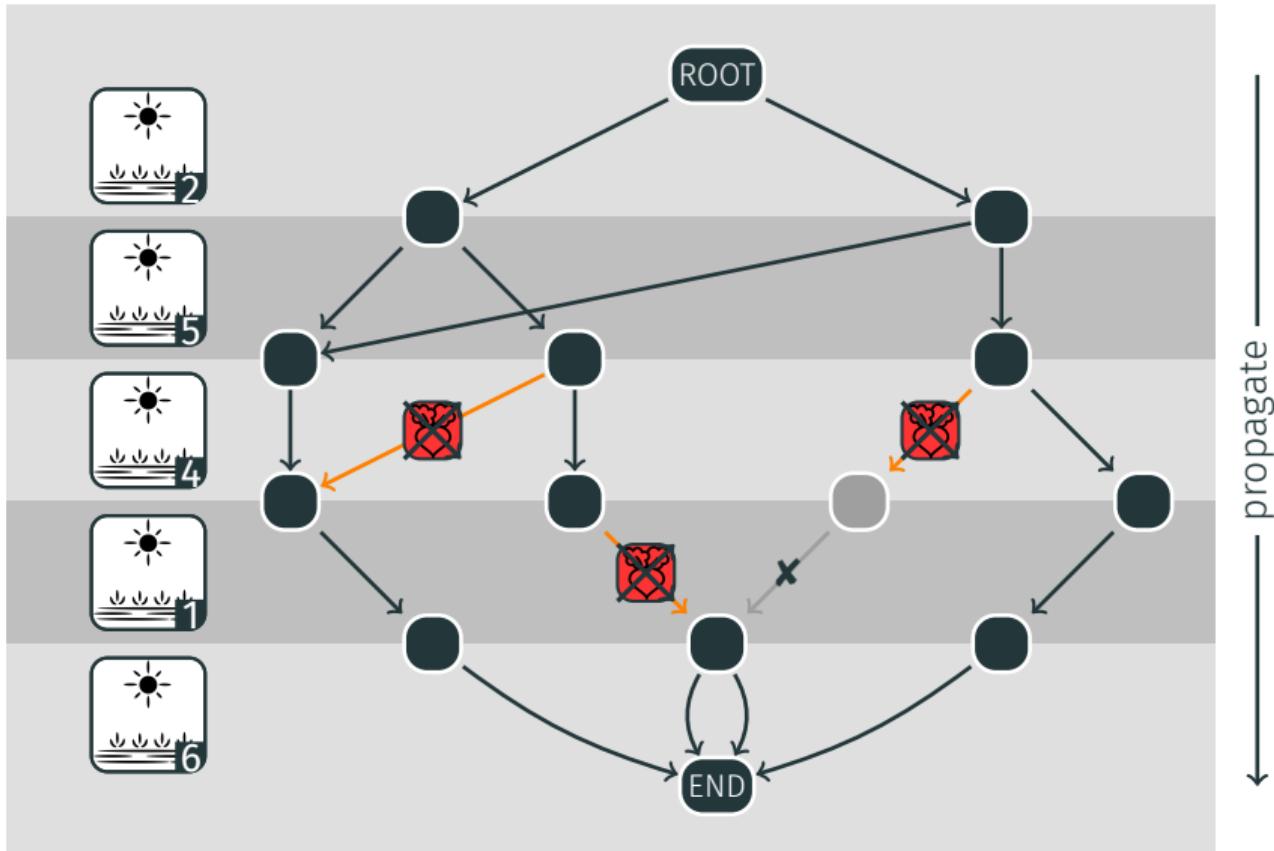


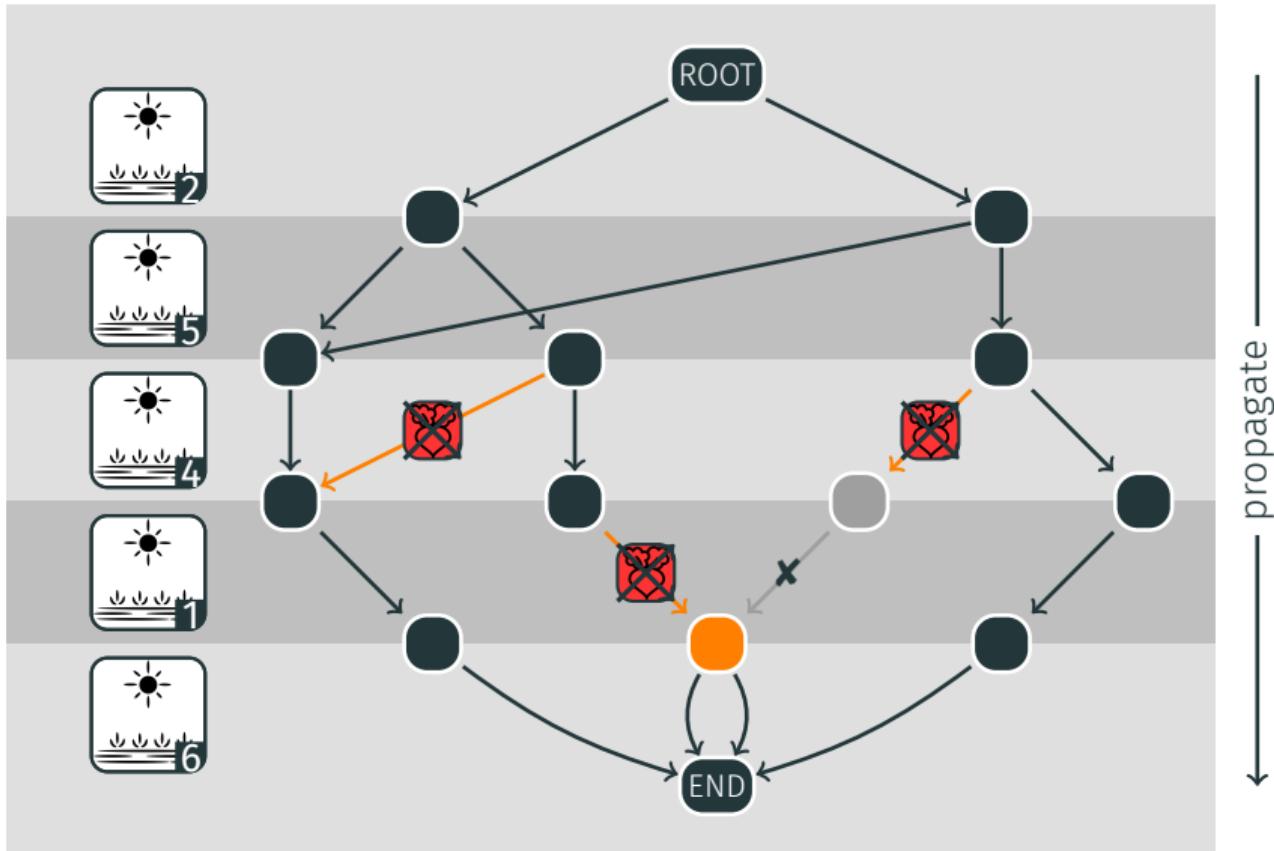


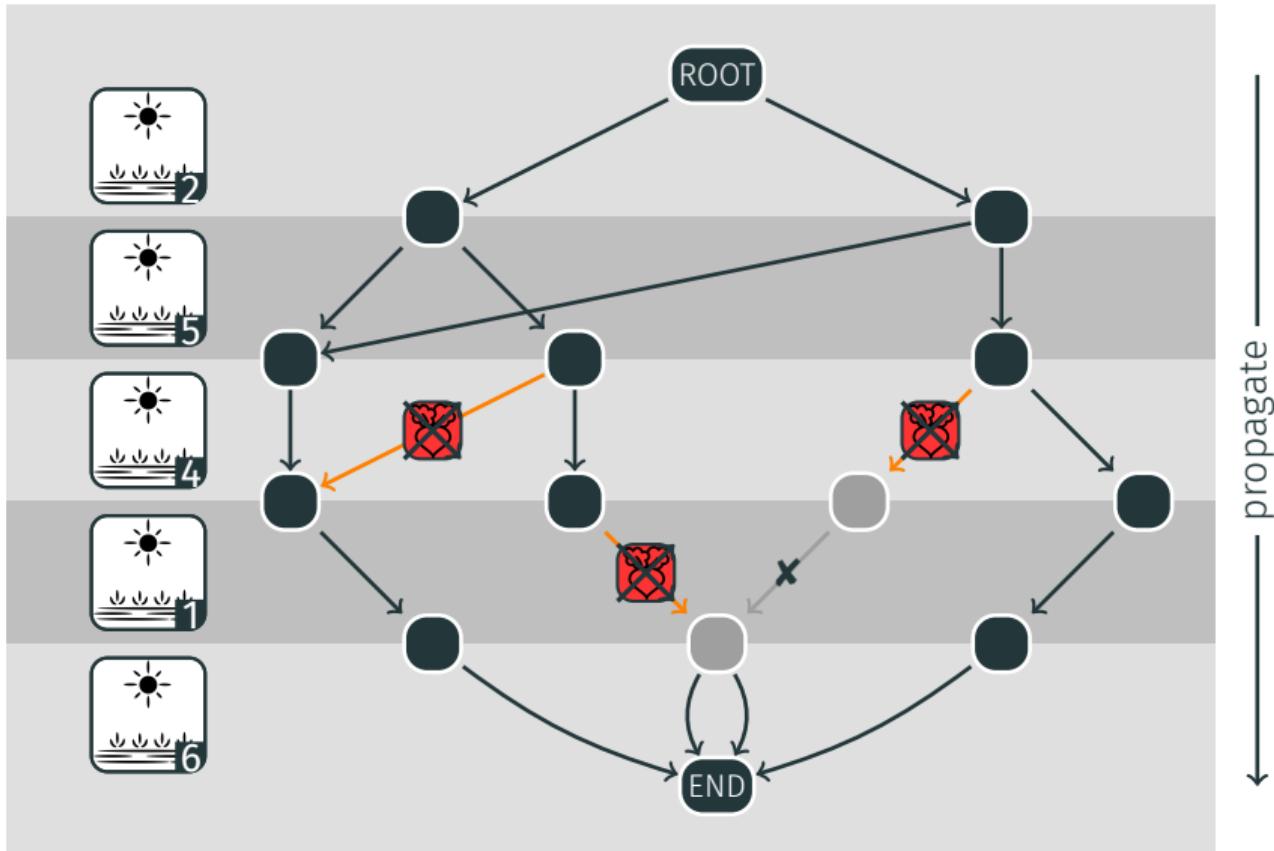


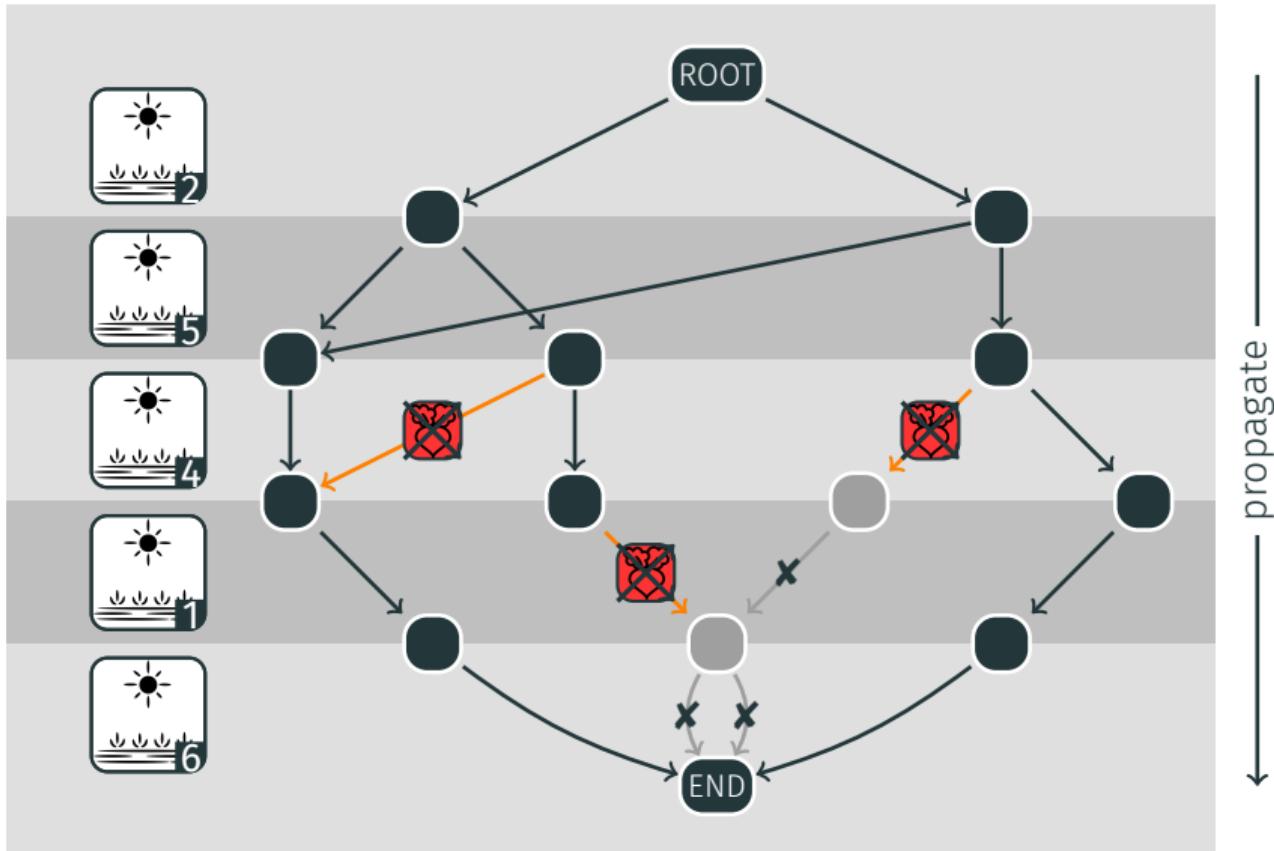


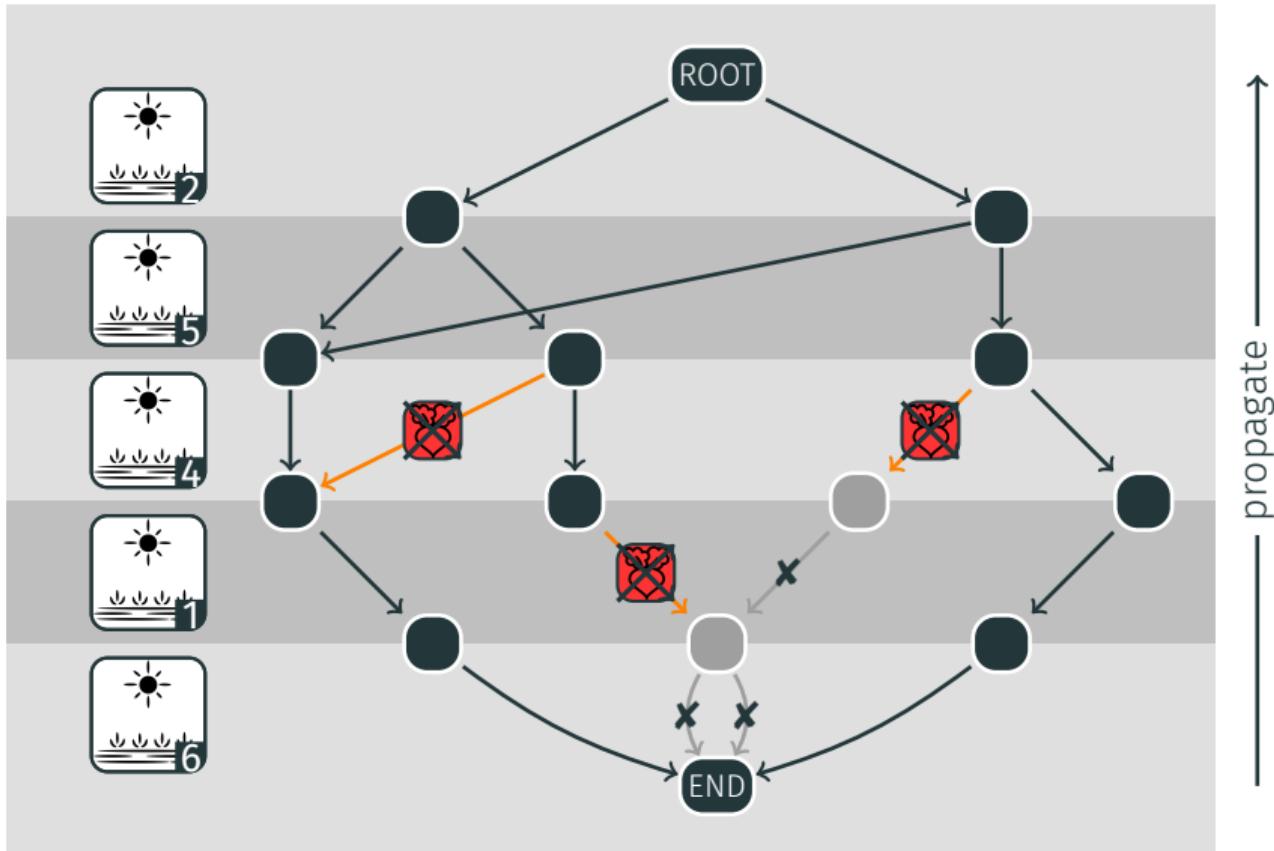


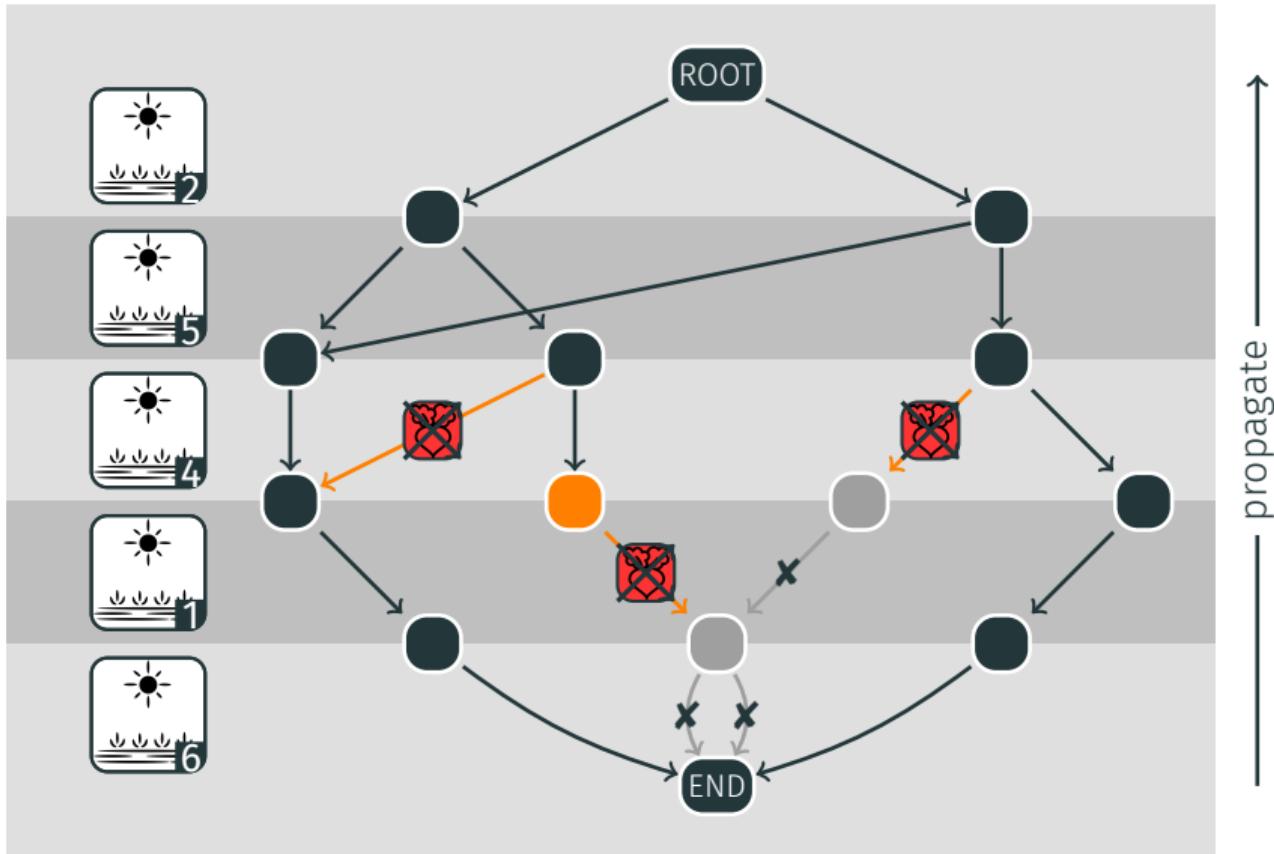


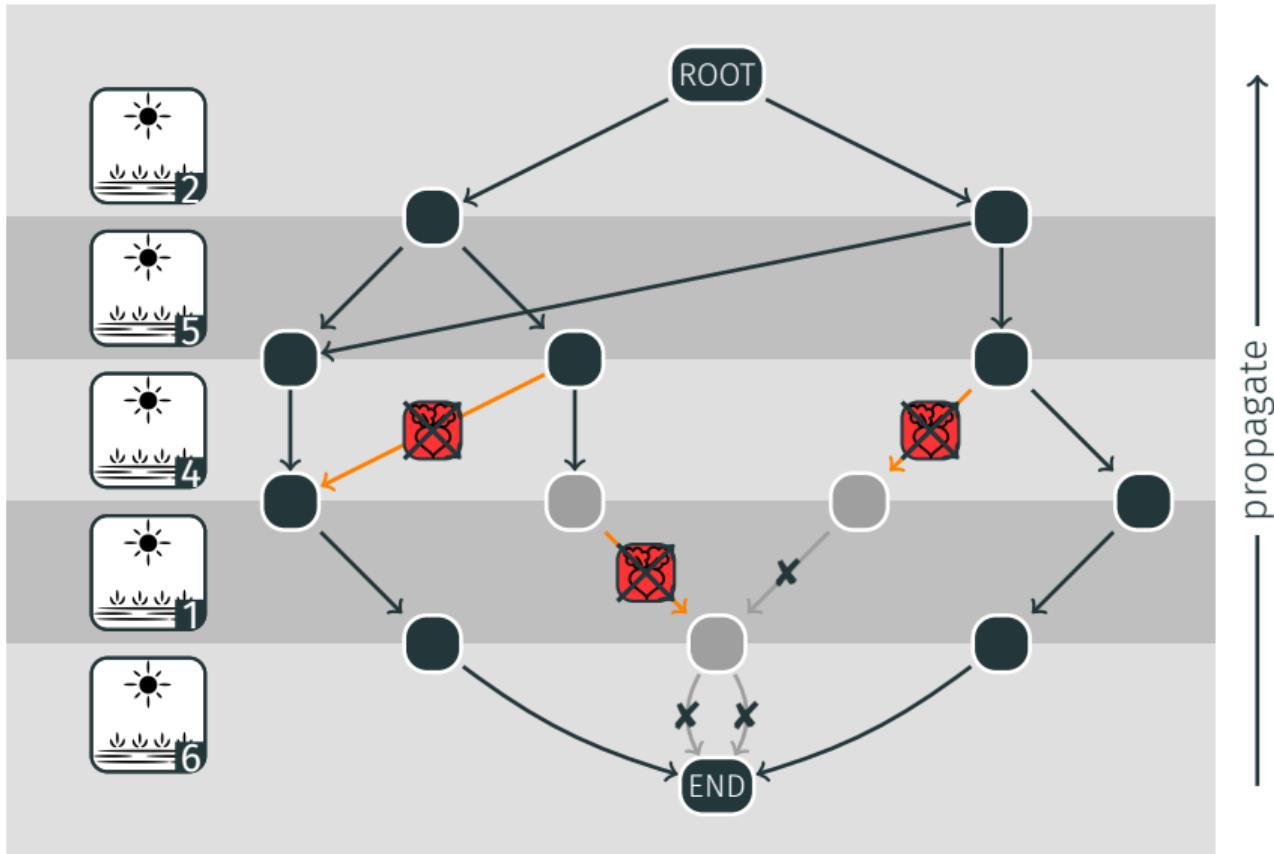


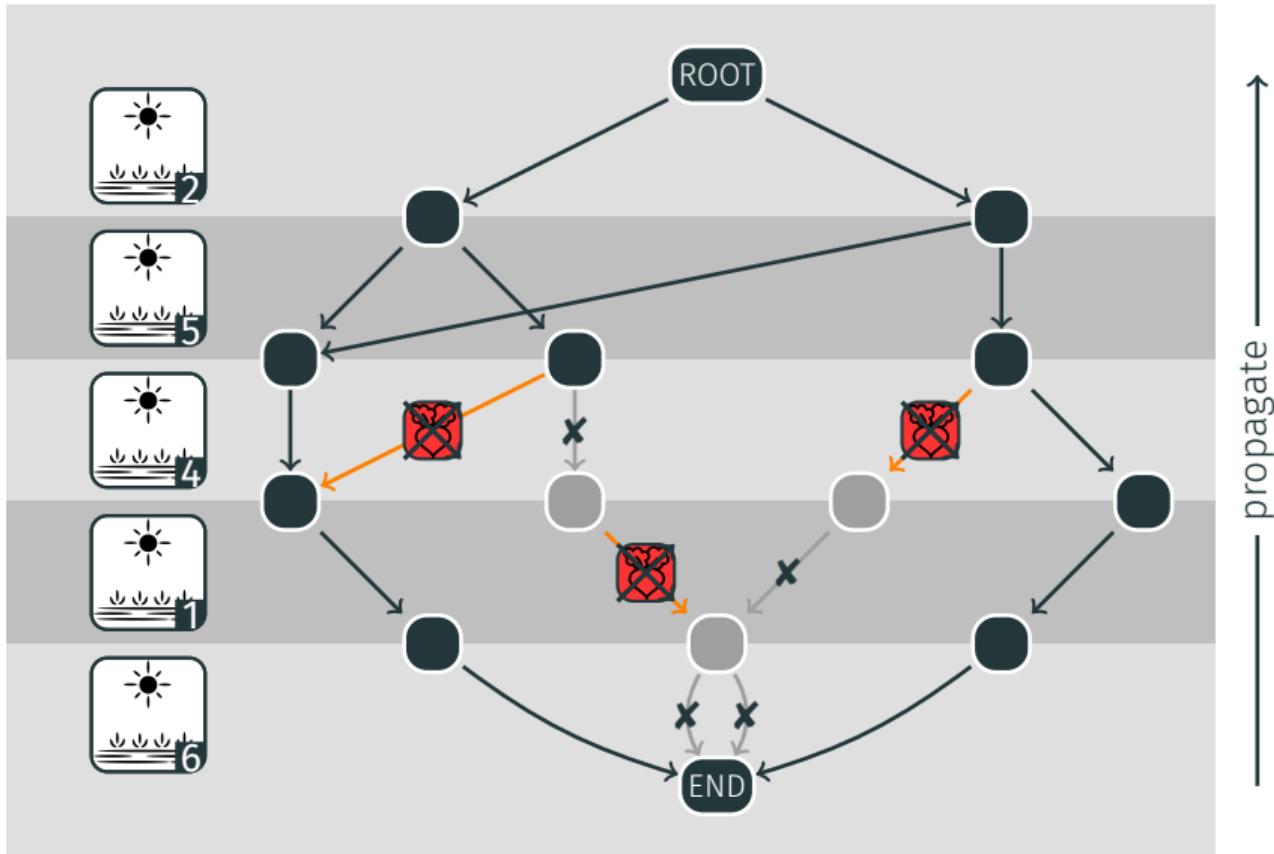


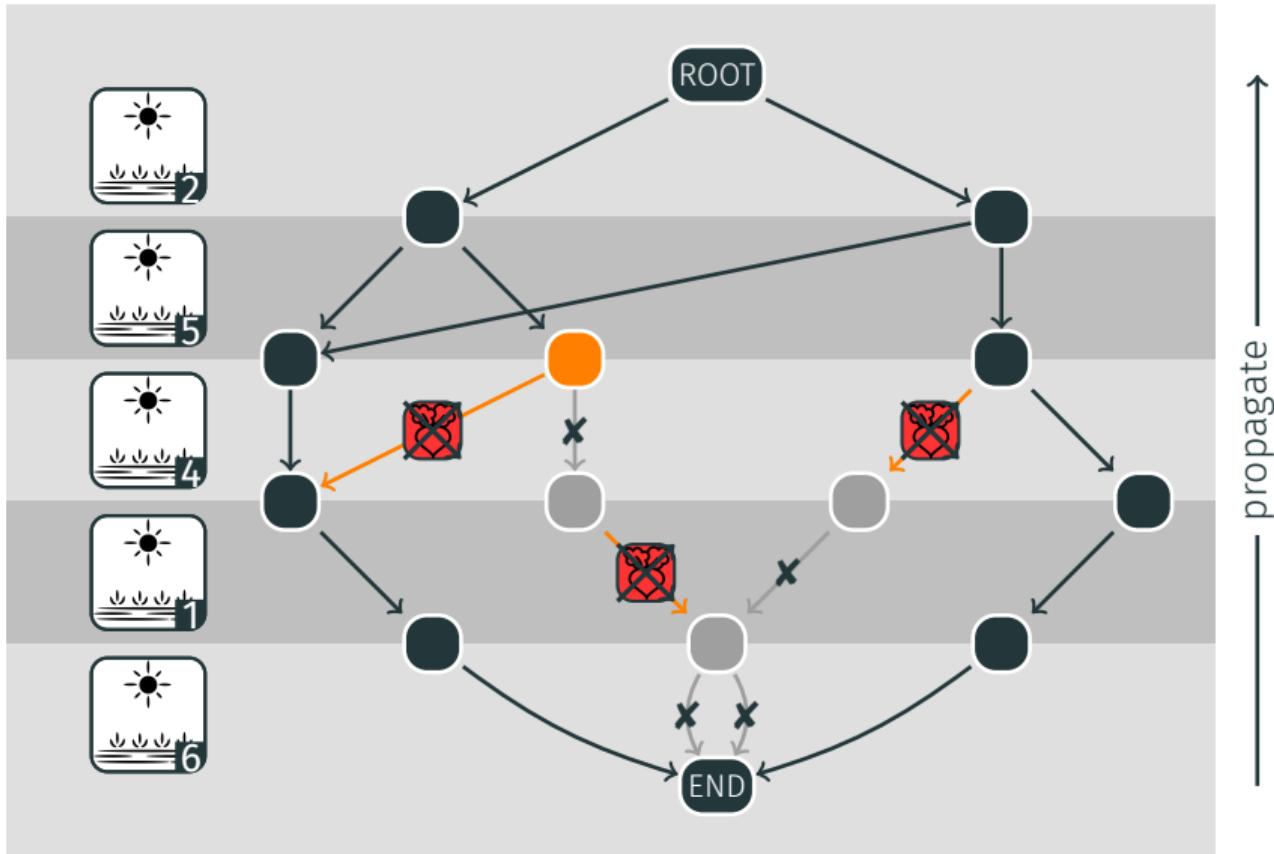


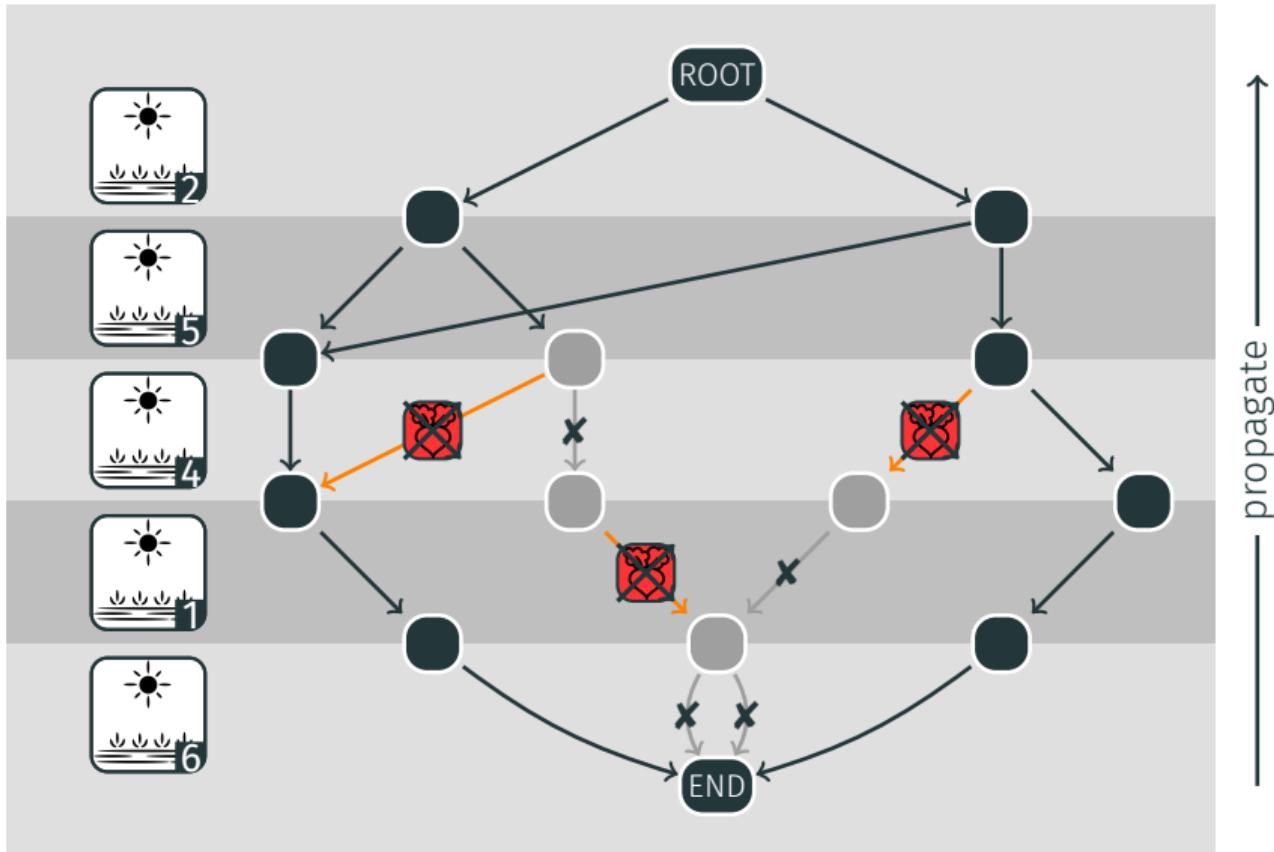


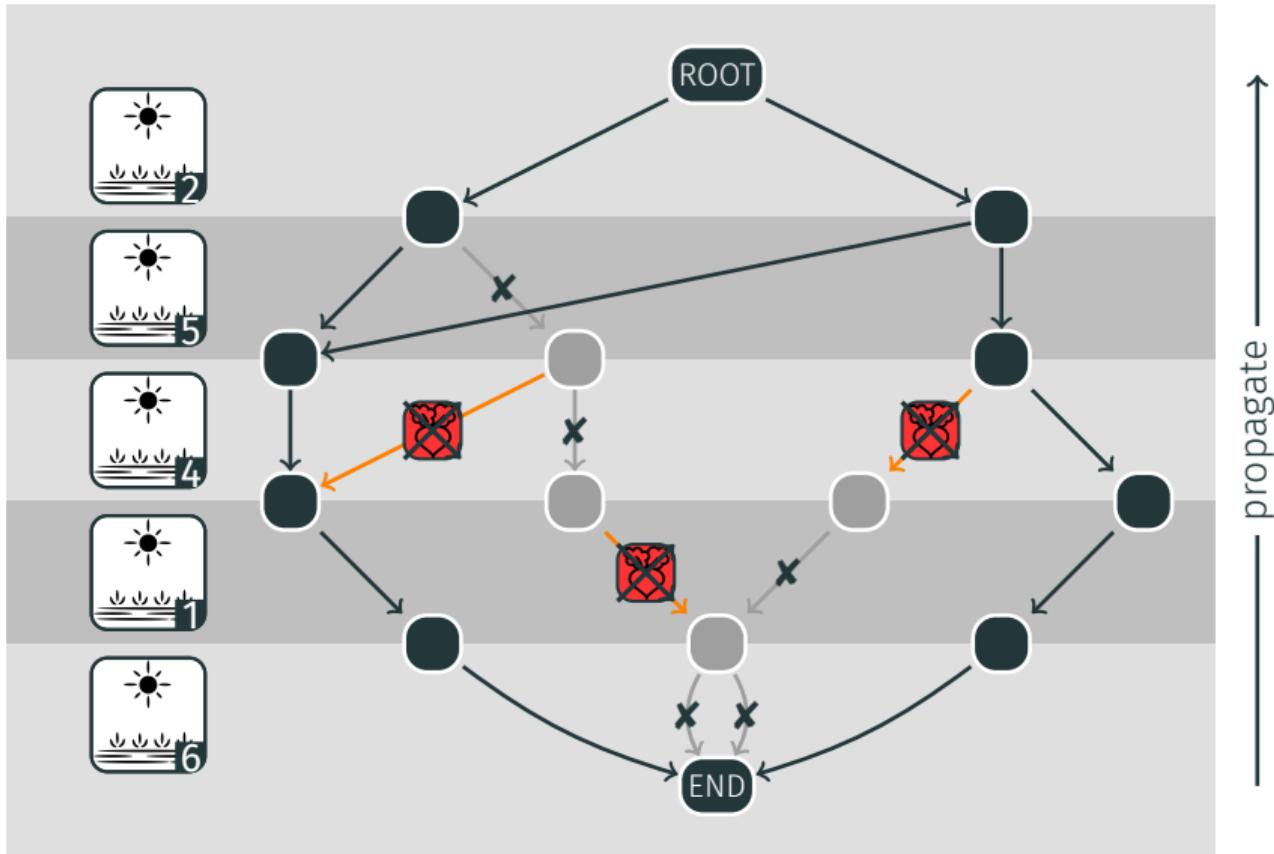


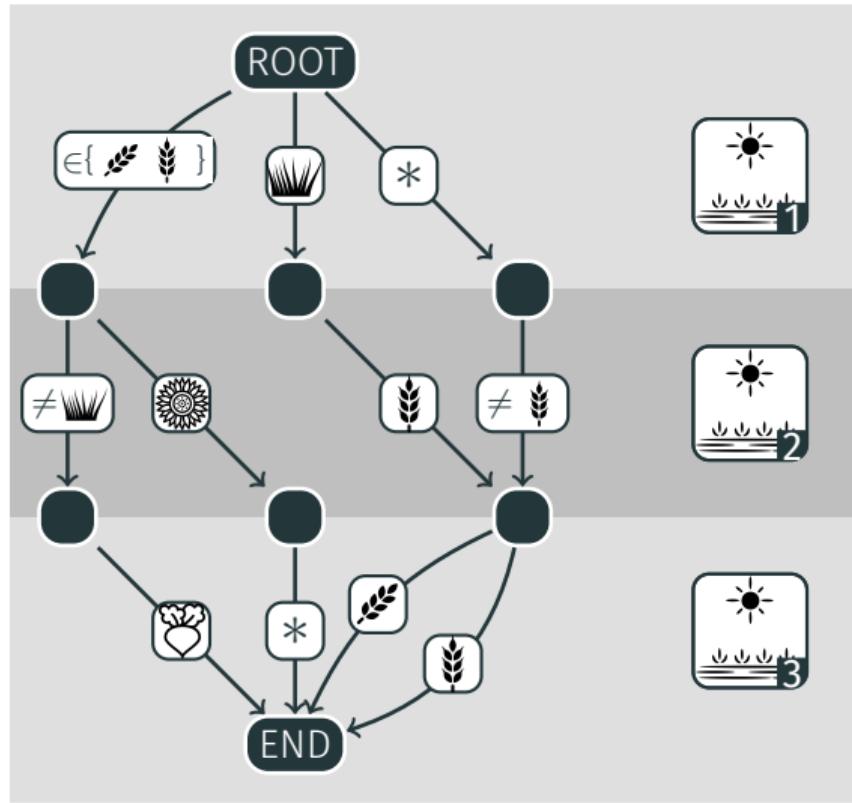












single value



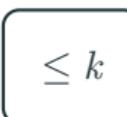
universal value



except one value



from a set of values



bounded values
(only with ordered domains)

CONCLUSION

Multiples contributions:

- a new diagram structure: **semi Multi-Valued Decision Diagram (sMDD)**
- a greedy compression algorithm for basic smart tables
- algorithms to create **sMDD**, **basic smart MDD**, **basic smart sMDD** and **basic smart MVD** from tables
- multiples extensions of Compact-Table: CT^* , CT^{bs} , CT_{neg} , CT_{neg}^* , CD , CD^{bs}
- 4 publications: AAAI17, CP2017, IJCAI18, CPAIOR19

Extensional constraints are key modelization tools in CP

Good modelization tools are useless without good algorithms
for the constraints

Thank you for listening!

Any questions?

Icons come from the Noun Project (thenounproject.com), graphists: Vineta Rendon, dojey, Rutmer Zijlstra, Becris, Eucalyp, Ben Davis, Symbolon, ffabio44, kareemovic3000, Handicon, Wan HD, Jolan Soens, Vectors Point, P Thanga Vignesh, IconMark, Alice Design