

# Constraint Programming Arc-consistency and MAC

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# Arc-consistency: AC1 – AC3

Removes values of  $D(x_i)$  that are not consistent with  $c_{ij}$

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**Algorithm 1** revise(a variable  $x_i$ , a binary constraint  $c_{ij}$ )

---

```
1: change ← false
2: for  $v_i$  in  $D(x_i)$  do
3:   if there does not exist a support  $v_j$  in  $D(x_j)$  for  $v_i$  (i.e.  $(v_i, v_j) \notin \mathcal{R}(c)$ ) then
4:     remove  $v_i$  from  $D(x_i)$ 
5:     change ← true
6: return change
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**Algorithm 2** AC1

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```
1: change ← true
2: while change do
3:   change ← false
4:   for  $x_i \in \mathcal{X}$  and  $c_{ij} \in \mathcal{C}$  do
5:     if (revise( $x_i, c_{ij}$ )) then change ← true
6:     if ( $D(x_i) = \emptyset$ ) then return false;
7: return true
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**Algorithm 3** AC3

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```
1:  $Q \leftarrow \{(x_i, c_{ij}) \mid c_{ij} \in \mathcal{C}\}$ 
2: while  $Q \neq \emptyset$  do
3:   select and remove  $(x_i, c_{ij})$  from  $Q$ 
4:   if revise( $x_i, c_{ij}$ ) then
5:     if  $D(x_i) = \emptyset$  then return false;
6:     else  $Q \leftarrow Q \cup \{(x_k, c_{ki}) \mid c_{ki} \in \mathcal{C} \wedge k \neq i\}$ 
7: return true
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---

# The friendship view of Arc-consistency

*(borrowed and adapted from Romuald Debruyne)*

- AC = I (a value) **stay** (in the domain) **if I have at least one friend** (a support) **in each neighboring** (link by a constraint) **building** (domain)
- AC1 = A person leaving sends a letter to **everybody**  
“I am leaving”
  - everyone check they still have a friend in each neighboring building.
- AC3 = A person leaving sends a letter to **the neighboring buildings**  
“I am leaving building n°i”
  - Only the neighbors of building i check if they still have a friend in building n°i

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- AC4 = A person (let's say Alan) leaving sends a letter **to his friends**  
“I am leaving building n°i, take care, Alan”.
  - Only the friends of Alan update their list of friends and check it is not empty for building n°i.

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- AC6 = A person leaving sends a letter to **his friends who consider him as a “best” friend**  
“I am leaving building n°i, take care, Alan”
  - Only these people look for a new best-friend in building n°i.
  - A “best” friend is a friend leaving at the smallest possible number (so numbers i.e values are checked only once).

# Event-based propagation mechanism

*Propagation mechanism*

---

**Algorithm 6** propagate(Q)

---

```
1: while  $Q \neq \emptyset$  do  
2:   evt(x)  $\leftarrow$  pop(Q) //an event on variable x  
3:   for  $c \in \mathcal{C} \mid x \in \mathcal{X}(c)$  do  
4:     filter(c, evt(x), Q) // for example filter( $x \leq y, x_i \geq v_k, Q$ )
```

---

Typical events: instantiation ( $x = a$ ), value removal ( $x \neq a$ ), change of bounds ( $x \geq a$  or  $x \leq a$ )



# Event-based propagation mechanism

## *Propagation mechanism*

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## *Filtering mechanisms*

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### **Algorithm 8** filter( $x \leq y, x \geq v_k, Q$ )

---

```
1: if  $y < v_k$  then  
2:    $\underline{y} \leftarrow v_k$   
3:    $\overline{Q} \leftarrow Q \cup \{y \geq v_k\}$ 
```

---

**Note:** this is the algorithm applied in reaction to an update of the lower bound of x

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## *Filtering mechanisms*

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**Algorithm 7** filterAC4( $c_{ij}, x_i \neq v_k, Q$ )

---

```
1: for  $v_l \in D(x_j)$  and such that  $(v_k, v_l) \in \mathcal{R}(c_{ij})$  do
2:   nbSupports[( $x_j, v_l$ ),  $x_i$ ]  $\leftarrow$  nbSupports[( $x_j, v_l$ ),  $x_i$ ] - 1
3:   if nbSupports[( $x_j, v_l$ ),  $x_i$ ] = 0 then
4:      $D(x_j) \leftarrow D(x_j) - \{v_l\}$ ;
5:      $Q \leftarrow Q \cup \{x_j \neq v_l\}$ ;
```

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**Algorithm 8** filter( $x \leq y, x \geq v_k, Q$ )

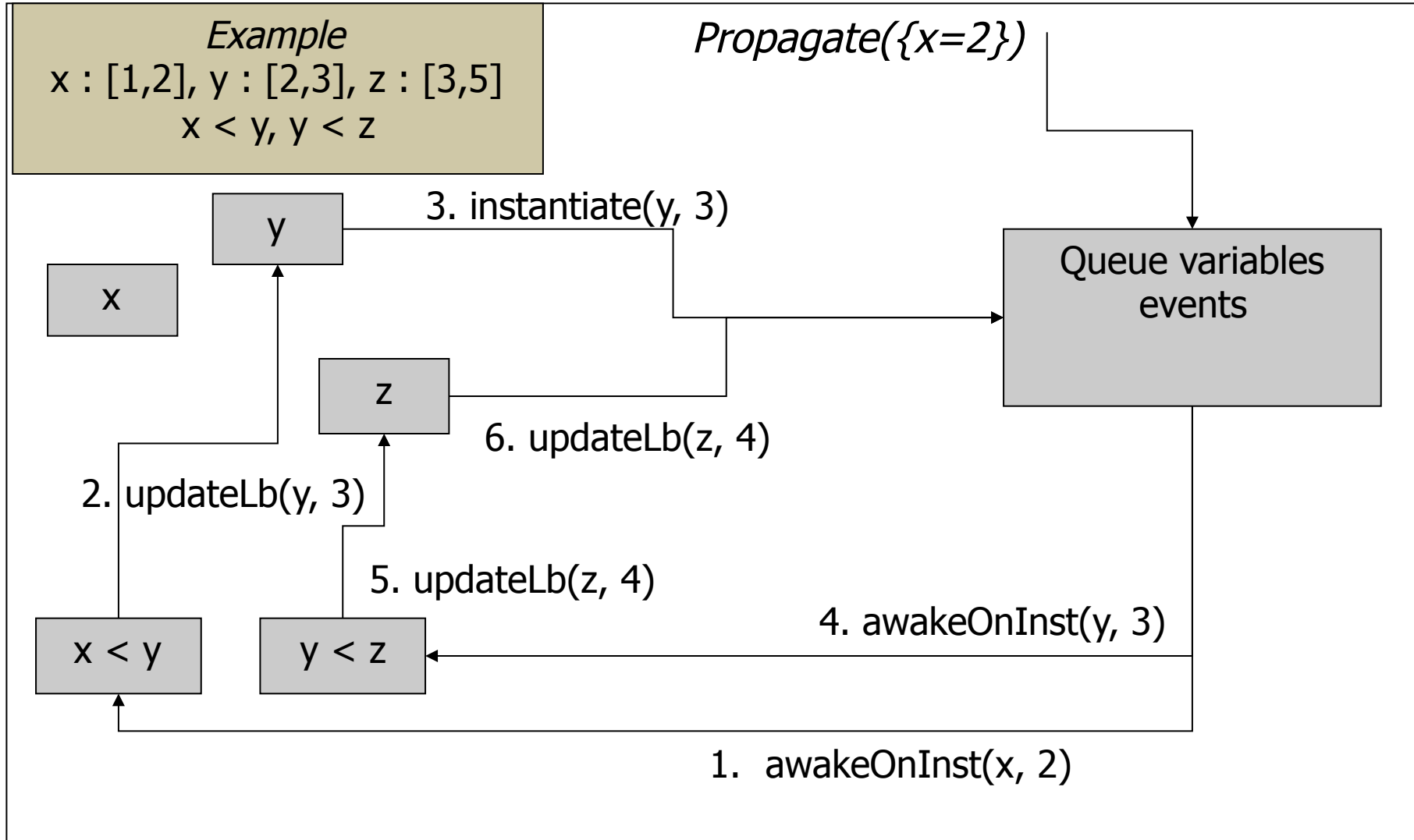
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# Event-based propagation mechanism



# Intentional constraints

- Usual properties expected of a filtering algorithm:
  - **Correction** :  
"no solution is lost"
  - **Assignment completeness** :  
"detect failure when all variables are instantiated"
  - **Contractance** :  
"domains are smaller after applying the propagator"
  - **Monotonic** :  
"applying the propagator on smaller domains give a smaller result"
  - **Idempotence (often)** :  
"is able to reach its own fixpoint"

# MAC algorithm

- Tree search:
  - Given a decision (a constraint), for example  $(x = a)$ , either:
    - There is a solution with  $(x = a)$ .
    - There is a solution with  $(x \neq a)$  (the negation of the decision)
    - There is no solution
  - Typical decision (fix a value, split a domain, enforce a precedence, ...)
  - Exploring both branches gives a complete algorithm
  - Local consistencies are enforced before each decision
- MAC : a tree search using AC as a local consistency

# MAC: Maintaining Arc-consistency

(borrowed from Romuald Debruyne)

