# Direct Access for Conjunctive Queries with Negations

*Florent Capelli*, Oliver Irwin CRIL, Université d'Artois April 19, 2024

# Direct Access on Join Queries



Join Query :  $Q(x_1, ..., x_n) = \bigwedge_{i=1}^k R_i(\mathbf{x_i})$ where  $\mathbf{x_i}$  is a tuple over  $X = \{x_1, ..., x_n\}$ 

Join Query:  $Q(x_1, ..., x_n) = \bigwedge_{i=1}^k R_i(\mathbf{x_i})$ where  $\mathbf{x}_i$  is a tuple over  $X = \{x_1, ..., x_n\}$ **Example**:

 $Q(city, country, name, id) = People(id, name, city) \land Capitals(city, country)$ People

id	name	city			
1	Alice	Paris		Capitals	
2	Bob	Lens	ci <sup>*</sup>	ity	country
2			Be	erlin	Germany
3	Chiara	Rome	Pa	aris	France
4	Djibril	Berlin	R	ome	Italy
5	Émile	Dortmund			Itury

Francesca Rome 6

Join Query:  $Q(x_1, ..., x_n) = \bigwedge_{i=1}^k R_i(\mathbf{x_i})$ where  $\mathbf{x}_i$  is a tuple over  $X = \{x_1, ..., x_n\}$ **Example**:

 $Q(city, country, name, id) = People(id, name, city) \land Capitals(city, country)$ People

id	name	city		
1	Alice	Paris		apitals
2	Bob	Lens	city	country
3	Chiara	Rome	Berlin	Germany
			Paris	France
4	Djibril	Berlin	Rome	Italy
5	Émile	Dortmund		J.

Francesca Rome 6

Join Query:  $Q(x_1, ..., x_n) = \bigwedge_{i=1}^k R_i(\mathbf{x_i})$ where  $\mathbf{x}_i$  is a tuple over  $X = \{x_1, ..., x_n\}$ **Example**:

 $Q(city, country, name, id) = People(id, name, city) \land Capitals(city, country)$ People

id	name	city
1	Alice	Paris
2	Bob	Lens
-	Chiara	Rome
4	Djibril	Berlin
5	Émile	Dortmund

Francesca Rome 6

#### $Q(\mathbb{D})$

city	country	name	id
Paris	France	Alice	1
Rome	Italy	Chiara	3
Berlin	Germany	Djibril	4
Rome	Italy	Francesca	6

### Direct Access

#### Quickly access $Q(\mathbb{D})[k]$ , the $k^{th}$ element of $Q(\mathbb{D})$ . $Q\left( \ \mathbb{D} \ ight)$

city	country	name	id
Paris	France	Alice	1
Rome	Italy	Chiara	3
Berlin	Germany	Djibril	4
Rome	Italy	Francesca	6

#### id

### Direct Access

#### Quickly access $Q(\mathbb{D})[k]$ , the $k^{th}$ element of $Q(\mathbb{D})$ . $Q \ ( \ \mathbb{D} \ )$

city	country	name	id
Paris	France	Alice	1
Rome	Italy	Chiara	3
Berlin	Germany	Djibril	4
Rome	Italy	Francesca	6
	$Q \;(\; \mathbb{D}\;)$	[2]?	
(Ror	ne, Italy,	Chiara, 3	5).

#### id

- ٠

### Naive Direct Access

#### Naive algorithm: materialize $Q(\mathbb{D})$ in an array, sort it. Access.

city	country	name	id
•••	•••	•••	•••
Berlin	Germany	Djibril	4
•••	•••	•••	•••
Paris	France	Alice	1
•••	•••	•••	•••
Rome	Italy	Chiara	3
Rome	Italy	Francesca	6
•••	•••	•••	•••

#### $Q(\mathbb{D})[1432] = ??$

### Naive Direct Access

#### Naive algorithm: materialize $Q(\mathbb{D})$ in an array, sort it. Access.

city	country	name	id
•••	•••	•••	•••
Berlin	Germany	Djibril	4
•••	•••	•••	•••
Paris	France	Alice	1
•••	•••	•••	•••
Rome	Italy	Chiara	3
Rome	Italy	Francesca	6
	•••	•••	•••

**Precomputation** :  $O(\#Q(\mathbb{D}))$  at least (may be worst), very costly Access : O(1), nearly free

#### $Q(\mathbb{D})[1432] = ??$

### Naive Direct Access

#### Naive algorithm: materialize $Q(\mathbb{D})$ in an array, sort it. Access.

city	country	name	id
•••	•••	•••	•••
Berlin	Germany	Djibril	4
••••	•••	•••	•••
Paris	France	Alice	1
•••	•••	•••	•••
Rome	Italy	Chiara	3
Rome	Italy	Francesca	6
•••		•••	•••

**Precomputation** :  $O(\#Q(\mathbb{D}))$  at least (may be worst), very costly Access : O(1), nearly free

#### $Q(\mathbb{D})[1432] = ??$

#### Orders

- Order by weights
- Lexicographical orders
  - $\hfill \,$  order on the vars of Q
  - ${\scriptstyle \bullet}$  order on domain D of  ${\mathbb D}$

6

### Orders

- Order by weights
- Lexicographical orders
  - order on the vars of Q
  - order on domain D of  $\mathbb{D}$

Variable order (*city*, *country*, *name*, *id*):

city	country	name	id
Berlin	Germany	Djibril	4
Paris	France	Alice	1
Rome	Italy	Chiara	3
Rome	Italy	Francesca	6

### Orders

Varia

- Order by weights
- Lexicographical orders
  - $\hfill \,$  order on the vars of Q
  - $\hfill \hfill \hfill$

In this talk: only lexicographical orders.

able order	$(\ city, country, name$	, id):	
------------	--------------------------	--------	--

4
1
3
<b>ca</b> 6

# Applications

Direct Access generalizes many tasks that have been previously studied:

- Uniform sampling without repetitions
- Ranked enumeration
- Counting queries:
  - how many answers between  $\tau_1$  and  $\tau_2$ ?
  - how many answers extend a *partial answer* etc.

d  $au_2$ ? *I answer* etc.

# Beating the Naive Approach



## Beating Naive Direct Access

Naive Direct Access:

- Preprocessing at least  $O(\#Q(\mathbb{D}))$ .
- Access time O(1).

**Can we have better preprocessing and reasonable access time?** 

## Beating Naive Direct Access

Naive Direct Access:

- Preprocessing at least  $O(\#Q(\mathbb{D}))$ .
- Access time O(1).

**Can we have better preprocessing and reasonable access time?** 

For example:

- $O(|\mathbb{D}|)$  preprocessing
- $O(\log |\mathbb{D}|)$  access time

## Complexity of Direct Access

Computing  $\#Q ( \mathbb{D} )$  given Q and  $\mathbb{D}$  is #P-hard.

No Direct Access algorithm with good guarantees for every Q and  $\mathbb{D}$ .

## Complexity of Direct Access

Computing  $\#Q ( \mathbb{D} )$  given Q and  $\mathbb{D}$  is #P-hard.

No Direct Access algorithm with good guarantees for every Q and  $\mathbb{D}$ .

**Data complexity assumption**: for a fixed Q, what is the best preprocessing  $f(|\mathbb{D}|)$  for an access time  $O(polylog|\mathbb{D}|)$ ?

In this work, all presented complexity in data complexity will also be polynomial for combined complexity.

#### An easy query? $Q(a, b, c) = A(a, b) \land B(b, c).$ с b а

# An easy query? $Q(a, b, c) = A(a, b) \land B(b)$

Direct Access for lexicographical order induced by (a, b, c)? • Precomputation  $O(|\mathbb{D}|)$ 

• Access time  $O(\log |\mathbb{D}|)$ 

$$b,c$$
 ) .

# ced by (a, b, c)?

#### An easy query? $Q(a, b, c) = A(a, b) \land B(b)$ (a) b) c

Direct Access for lexicographical order induc

- Precomputation  $O(|\mathbb{D}|)$
- Access time  $O(\log |\mathbb{D}|)$

			b	c
a	b		0	0
0	0	-	0	1
1	1	-	0	2
2	1	-	1	1
			1	2

#### **Precomputation** :

- $\#Q(0,0,\_) = 3$
- $\#Q(1,1,\_) = 2$
- $\#Q(2,1,_) = 2$

$$b,c$$
 ) .

ced by 
$$(a, b, c)$$
?

# An easy query? $Q(a, b, c) = A(a, b) \land B(b)$

Direct Access for lexicographical order induc

- Precomputation  $O(|\mathbb{D}|)$
- Access time  $O(\log |\mathbb{D}|)$

			b	c
a	b		0	0
0	0	-	0	1
1	1	-	0	2
2	1	-	1	1
			1	2

**Precomputation** :

- $\#Q(0,0,_{-}) = 3$
- $\#Q(1,1,\_) = 2$
- $\#Q(2,1,_{-}) = 2$

$$b,c$$
 ) .

ced by 
$$(a, b, c)$$
?

#### Access Q[5]:

• a = 0, b = 0: not enough solutions

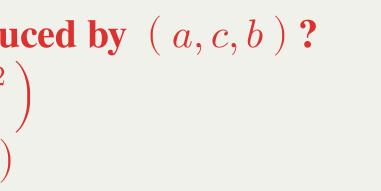
• a = 1, b = 1: enough! 3 solutions smaller than (1, 1, ...)

• Look for the second solution of  $B(1, _): a = 1, b = 1, c = 2$ 

A not so easy quer  $Q(a,c,b) = A(a,b) \land B(b)$ С

**Direct Access for lexicographical order induced by** (a, c, b)? • **Precomputation**  $O\left(\left|\mathbb{D}\right|^2\right)$ 

• Access time  $O(\log |\mathbb{D}|)$ 



A not so easy quer  $Q(a,c,b) = A(a,b) \wedge B(a,b)$ 

**Direct Access for lexicographical order indu** • **Precomputation**  $O\left(\left|\mathbb{D}\right|^2\right)$ 

• Access time  $O(\log |\mathbb{D}|)$ 

Reduces to multiplying two  $\{0, 1\}$ -matrices M, N over  $\mathbb{N}$ :

- $(i, j) \in A \text{ iff } M[i, j] = 1, (j, k) \in N \text{ iff } N[j, k] = 1$
- #Q(i, j, ]) = (MN)[i, j]
- Direct Access can be used to find #Q(i,j,) with  $O(\log |\mathbb{D}|)$  queries.

$$b, c$$
 )

uced by 
$$(a, c, b)$$
?

• **Tractable Direct access** for Q on  $\mathbb{D}$ :

• **Tractable Direct access** for Q on  $\mathbb{D}$ :

• preprocessing  $\tilde{O}\left(\left|\mathbb{D}\right|^{\iota\left(Q,\pi\right)}\right)$ 

- **Tractable Direct access** for Q on  $\mathbb{D}$ :
  - preprocessing  $\tilde{O}\left(\left|\mathbb{D}\right|^{\iota\left(Q,\pi\right)}\right)$
  - access  $O(\log |\mathbb{D}|)$

- **Tractable Direct access** for Q on  $\mathbb{D}$ :
  - preprocessing  $\tilde{O}\left(\left|\mathbb{D}\right|^{\iota\left(Q,\pi\right)}\right)$
  - access  $O(\log |\mathbb{D}|)$
- Tight fine-grained lower bounds:

- **Tractable Direct access** for Q on  $\mathbb{D}$ :
  - **preprocessing**  $\tilde{O}\left(\left|\mathbb{D}\right|^{\iota\left(Q,\pi\right)}\right)$
  - access  $O(\log |\mathbb{D}|)$
- Tight fine-grained lower bounds:
  - if possible with  $\tilde{O}\left(\left|\mathbb{D}\right|^{k}\right)$  preprocessing with  $k < \iota \left(Q, \pi\right)$

- **Tractable Direct access** for Q on  $\mathbb{D}$ :
  - preprocessing  $\tilde{O}\left(\left|\mathbb{D}\right|^{\iota\left(Q,\pi\right)}\right)$
  - access  $O(\log |\mathbb{D}|)$
- Tight fine-grained lower bounds:
  - if possible with  $\tilde{O}\left(\left|\mathbb{D}\right|^{k}\right)$  preprocessing with  $k < \iota \left(Q, \pi\right)$
  - then *Zero-Clique Conjecture* is false

(we can find 0-weighted k-cliques in graphs in time  $< |G|^{k-\varepsilon}$ )

- **Tractable Direct access** for Q on  $\mathbb{D}$ :
  - **preprocessing**  $\tilde{O}\left(\left|\mathbb{D}\right|^{\iota\left(Q,\pi\right)}\right)$
  - access  $O(\log |\mathbb{D}|)$
- Tight fine-grained lower bounds:
  - if possible with  $\tilde{O}\left(\left|\mathbb{D}\right|^{k}\right)$  preprocessing with  $k < \iota \left(Q, \pi\right)$
  - then Zero-Clique Conjecture is false

(we can find 0-weighted k-cliques in graphs in time  $< |G|^{k-\varepsilon}$ )

• Function  $\iota$  closely related to fractional hypertree width.

1. Tractable Orders for Direct Access to Ranked Answers of Conjunctive Queries, N. Carmeli, N. Tziavelis, W. Gatterbauer, B. Kimelfeld, M. Riedewald

2. Tight Fine-Grained Bounds for Direct Access on Join Queries, K. Bringmann, N. Carmeli, S. Mengel

## End of the story?

#### So, if we understand everything for Direct Access and lexicographical orders, what is **our** contribution?



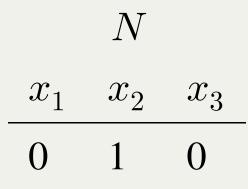
# Signed Join Queries



$$Q = \bigwedge_{i=1}^{k} P_i(\mathbf{z_i}) \bigwedge_{i=1}^{l} \neg N_i(\mathbf{z_i})$$
  
Negation interpreted **over a given domain** *D*:

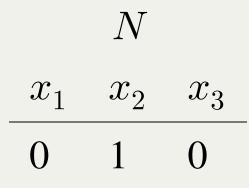
# $N_i \left( \mathbf{z_i} \right)$

$$Q = \bigwedge_{i=1}^{k} P_i(\mathbf{z_i}) \bigwedge_{i=1}^{l} \neg N_i(\mathbf{z_i})$$
  
Negation interpreted **over a given domain** *D*:



# $N_i \left( \mathbf{z_i} \right)$

$$Q = \bigwedge_{i=1}^{k} P_i(\mathbf{z_i}) \bigwedge_{i=1}^{l} \neg N_i(\mathbf{z_i})$$
  
Negation interpreted **over a given domain** *D*:



# $N_i \left( \mathbf{z_i} \right)$

$\neg N $ on $\{0,1\}$			
$x_1$	$x_2$	$x_3$	
0	0	0	
0	0	1	
0	1	1	
1	0	0	
1	0	1	
1	1	0	
1	1	1	

$$Q = \bigwedge_{i=1}^{k} P_i(\mathbf{z_i}) \bigwedge_{i=1}^{l} \neg N_i(\mathbf{z_i})$$
  
Negation interpreted over a given domain *D*:

N $x_1$   $x_2$   $x_3$ 0 1 0

- $\neg N(x_1, ..., x_k)$  encoded with  $|D|^k \#N$  tuples.
- Relation with SAT:  $\neg N$  is  $x_1 \lor \neg x_2 \lor x_3$

# $V_i \left( \, {f z_i} \, ight)$

$\neg N$	$\neg N $ on $\{0,1\}$		
$x_1$	$x_2$	$x_3$	
0	0	0	
0	0	1	
0	1	1	
1	0	0	
1	0	1	
1	1	0	
1	1	1	

# Positive Encoding not C

 $Q\;(\;x_1,...,x_n\;)\;= \neg N\;(\;x_1,...,x_n\;)\;, \mathsf{d}$ 

Ν

 $x_1$ 

1 0

0

 $x_2 \quad x_3$ 

1

1 0

Positive encoding: preprocessing

- Q(
- Q (
- Q (
- Q(

Optimal domain $\{0, 1\}$ .			
$\mathbf{g} O(2^n)$			
(D)[1]?			
(D)[2]?			
(D)[3]?			
( D ) [k]?			

 $Q(x_1,...,x_n) = \neg N(x_1,...,x_n)$ , domain  $\{0,1\}$ .

Positive encoding: preprocessing  $O(2^n)$ 

Ν

 $\begin{array}{cccc} x_1 & x_2 & x_3 \end{array}$ 

0 1 0

1 0 1

- $[0]_{2}!$
- $Q(\mathbb{D})[1]$ ?  $x_1 = 0, x_2 = 0, x_3 = 0$  ie • Q(D)[2]?• Q(D)[3]?

•  $Q(\mathbb{D})[k]$ ?

 $Q(x_1,...,x_n) = \neg N(x_1,...,x_n)$ , domain  $\{0,1\}$ .

Positive encoding: preprocessing  $O(2^n)$ 

- Q( $\begin{bmatrix} 0 \end{bmatrix}$
- Q( $\begin{bmatrix} 1 \end{bmatrix}$
- Q(

Ν  $x_1 \quad x_2 \quad x_3$ 0 1 0 1 0 1

$$\begin{array}{c} \mathbb{D} \ ) \ \left[ \ 1 \ \right]? x_1 = 0, x_2 = 0, x_3 = 0 \text{ ie} \\ \\ \begin{array}{c} 2^! \\ \mathbb{D} \ ) \ \left[ \ 2 \ \right]? x_1 = 0, x_2 = 0, x_3 = 1 \text{ ie} \\ \\ \\ \begin{array}{c} 2^! \\ \mathbb{D} \ ) \ \left[ \ 3 \ \right]? \end{array}$$

•  $Q(\mathbb{D})[k]$ ?

 $Q(x_1,...,x_n) = \neg N(x_1,...,x_n)$ , domain  $\{0,1\}$ .

Positive encoding: preprocessing  $O(2^n)$ 

- Q (  $\begin{bmatrix} 0 \end{bmatrix}$
- Q( $\begin{bmatrix} 1 \end{bmatrix}$
- Q (
  - $x_1 =$
- Q (

Ν  $x_1 \quad x_2 \quad x_3$ 0 1 0 1 0 1

$$\begin{array}{l} \mathbb{D} \; ) \; \left[ \; 1 \; \right] \; ? \; x_1 = 0, x_2 = 0, x_3 = 0 \text{ is} \\ \begin{array}{l} 2 \\ 2 \\ \mathbb{D} \; ) \; \left[ \; 2 \; \right] \; ? \; x_1 = 0, x_2 = 0, x_3 = 1 \text{ is} \\ \begin{array}{l} 2 \\ 2 \\ 2 \\ \mathbb{D} \; ) \; \left[ \; 3 \; \right] \; ? \\ = \; 0, x_2 = 1, x_3 = 0 \text{ is} \; \left[ \; 2 \; \right] \; _2 ? \\ \mathbb{D} \; ) \; \left[ \; k \; \right] \; ? \end{array}$$

 $Q(x_1,...,x_n) = \neg N(x_1,...,x_n)$ , domain  $\{0,1\}$ .

Positive encoding: preprocessing  $O(2^n)$ 

- Q (  $\begin{bmatrix} 0 \end{bmatrix}$
- Q (  $\begin{bmatrix} 1 \end{bmatrix}$
- Q (
  - $x_1 =$
- Q (

Ν  $x_1 \quad x_2 \quad x_3$ 0 1 0 1 0 1

$$\begin{array}{l} \mathbb{D} \; ) \; \left[ \; 1 \; \right] \; ? \; x_1 = 0, x_2 = 0, x_3 = 0 \text{ is} \\ \begin{array}{l} 2 \\ 2 \\ \mathbb{D} \; ) \; \left[ \; 2 \; \right] \; ? \; x_1 = 0, x_2 = 0, x_3 = 1 \text{ is} \\ \begin{array}{l} 2 \\ 2 \\ 2 \\ \mathbb{D} \; ) \; \left[ \; 3 \; \right] \; ? \\ = \; 0, x_2 = 1, x_3 = 1 \text{ is} \; \left[ \; 3 \; \right] \; _2 ! \\ \mathbb{D} \; ) \; \left[ \; k \; \right] \; ? \end{array}$$

 $Q(x_1,...,x_n) = \neg N(x_1,...,x_n)$ , domain  $\{0,1\}$ .

Positive encoding: preprocessing  $O(2^n)$ 

- Q (  $\begin{bmatrix} 0 \end{bmatrix}$
- Q (  $\begin{bmatrix} 1 \end{bmatrix}$
- Q (
  - $x_1$
- Q ( when

Ν  $x_1 \quad x_2 \quad x_3$ 0 1 0 1 0 1

$$\begin{array}{l} \mathbb{D} \; ) \; \left[ \; 1 \; \right] \; ? \; x_1 = 0, x_2 = 0, x_3 = 0 \text{ is} \\ \begin{array}{l} 2 \\ 2 \\ \mathbb{D} \; ) \; \left[ \; 2 \; \right] \; ? \; x_1 = 0, x_2 = 0, x_3 = 1 \text{ is} \\ \begin{array}{l} 2 \\ 2 \\ 2 \\ \mathbb{D} \; ) \; \left[ \; 3 \; \right] \; ? \\ = \; 0, x_2 = 1, x_3 = 1 \text{ is} \; \left[ \; 3 \; \right]_2 ! \\ \mathbb{D} \; ) \; \left[ \; k \; \right] \; ? \; \left[ \; k - 1 + p \; \right]_2 \\ \mathbb{D} \; ) \; \left[ \; k \; \right] \; ? \; \left[ \; k - 1 + p \; \right]_2 \\ \text{re} \; p \; \text{\#tuples} \; \leq \; \left[ \; k \; \right]_2 \end{array}$$

 $Q(x_1,...,x_n) = \neg N(x_1,...,x_n)$ , domain  $\{0,1\}$ .

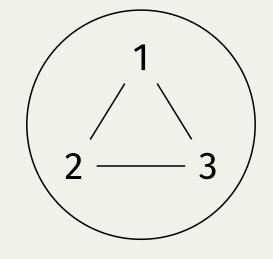
Positive encoding: preprocessing  $O(2^n)$ 

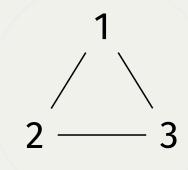


#### **Linear preprocessing!**

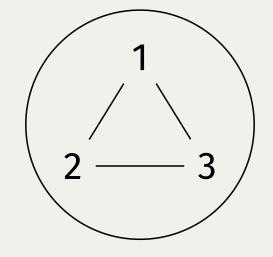
$$\begin{array}{l} \mathbb{D} \; ) \; \left[ \; 1 \; \right] \; ? \; x_1 = 0, x_2 = 0, x_3 = 0 \text{ is} \\ \begin{array}{l} 2 \\ 2 \\ \mathbb{D} \; ) \; \left[ \; 2 \; \right] \; ? \; x_1 = 0, x_2 = 0, x_3 = 1 \text{ is} \\ \begin{array}{l} 2 \\ 2 \\ 2 \\ \mathbb{D} \; ) \; \left[ \; 3 \; \right] \; ? \\ = \; 0, x_2 = 1, x_3 = 1 \text{ is} \; \left[ \; 3 \; \right]_2 ! \\ \mathbb{D} \; ) \; \left[ \; k \; \right] \; ? \; \left[ \; k - 1 + p \; \right]_2 \\ \mathbb{D} \; ) \; \left[ \; k \; \right] \; ? \; \left[ \; k - 1 + p \; \right]_2 \\ \text{re } p \; \text{\#tuples} \; \leq \; \left[ \; k \; \right]_2 \end{array}$$

# Hardness of subqueries $Q_1 = R(1,2,3) \land S(1,2) \land T(2,3) \land U(3,1)$ $Q_2 = S(1,2) \land T(2,3) \land U(3,1)$

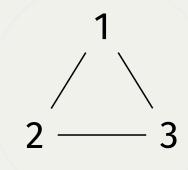




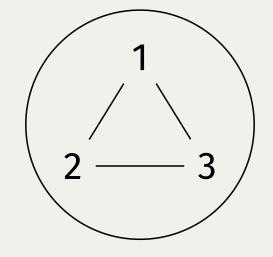
# Hardness of subqueries $Q_1 = R(1,2,3) \land S(1,2) \land T(2,3) \land U(3,1)$ $Q_2 = S(1,2) \land T(2,3) \land U(3,1)$



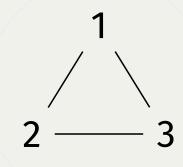
**linear** preprocessing



# Hardness of subqueries $Q_1 = R(1,2,3) \land S(1,2) \land T(2,3) \land U(3,1)$ $Q_2 = S(1,2) \land T(2,3) \land U(3,1)$

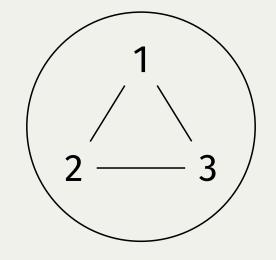


**linear** preprocessing



#### **non-linear** preprocessing

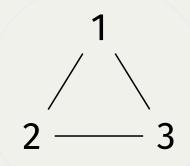
# Hardness of subqueries



**linear** preprocessing

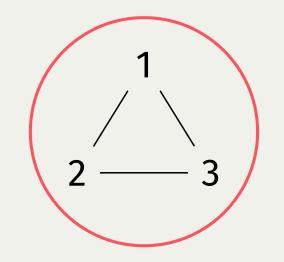
Subqueries may be harder to solve than the query itself!

#### **non-linear** preprocessing

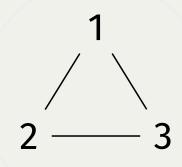


## Subqueries and negative atoms

$$Q_{1}' = \neg R(1, 2, 3) \\ \wedge S(1, 2) \wedge T(2, 3) \wedge U(3, 1) \qquad Q_{2}$$



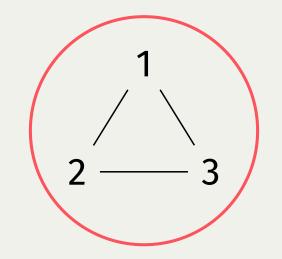
### $D_2 = S\,(\,1,2\,)\ \wedge T\,(\,2,3\,)\ \wedge U\,(\,3,1\,)$



#### **non-linear** preprocessing (triangle)

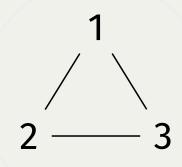
## Subqueries and negative atoms

$$Q_{1}' = \neg R(1, 2, 3) \\ \wedge S(1, 2) \wedge T(2, 3) \wedge U(3, 1)$$



Equivalent to  $Q_2$  if  $R = \emptyset$ 

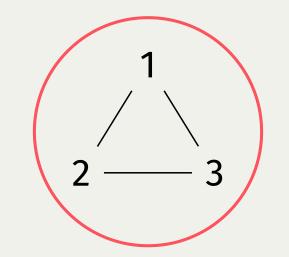
### $Q_2 = S \; (\; 1,2\;) \; \wedge T \; (\; 2,3\;) \; \wedge U \; (\; 3,1\;)$



#### **non-linear** preprocessing (triangle)

## Subqueries and negative atoms

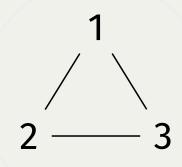
$$Q_{1}' = \neg R (1, 2, 3) \\ \wedge S (1, 2) \wedge T (2, 3) \wedge U (3, 1) \qquad Q_{2}$$



Equivalent to  $Q_2$  if  $R = \emptyset$ 

**DA** for  $Q = P \land N$  implies **DA** for  $Q = P \land N'$  for every  $N' \subseteq N!$ 

### $_{2} = S(1,2) \land T(2,3) \land U(3,1)$



#### **non-linear** preprocessing (triangle)

Measuring hardness of SJQ Good candidate for  $Q = Q^+ \wedge Q^-$ :

Signed-HyperOrder Width show  $(Q, \pi) = \max_{Q' \subset Q^-} \iota (Q^+ \land Q', \pi)$ 

For Q a (positive) JQ, and  $\pi$  a variable ordering, we can solve DA with

- Preprocessing  $\tilde{O}\left(\left|\mathbb{D}\right|^{\iota\left(Q,\pi\right)}\right)$
- Access time  $O\left( \log |\mathbb{D}| \right)$

Measuring hardness of SJQ Good candidate for  $Q = Q^+ \wedge Q^-$ :

Signed-HyperOrder Width show  $(Q, \pi) = \max_{Q' \subset Q^-} \iota (Q^+ \land Q', \pi)$ 

For Q a signed JQ, and  $\pi$  a variable ordering, we can solve DA with

- Preprocessing  $\tilde{O}\left(\left|\mathbb{D}\right|^{1+show(Q,\pi)}\right)$
- Access time  $O(\log |\mathbb{D}|)$

#### **Our contribution : new island of tractability for Signed JQ!**

## A word on show

Signed HyperOrder Width (and incidentally, our result) generalizes:

- $\beta$ -acyclicity (#SAT and #NCQ are already known tractable)
- *signed*-acyclicity (Model Checking for SCQ known to be tractable)
- Nest set width (SAT / Model Checking for NCQ known to be tractable)

Basically, everything that is known to be tractable on SCQ/NCQ.

1. Understanding model counting for  $\beta$ -acyclic CNF-formulas, J. Brault-Baron, F. C., S. Mengel

2. De la pertinence de l'énumération: complexité en logiques propositionnelle et du premier ordre, J. Brault-Baron

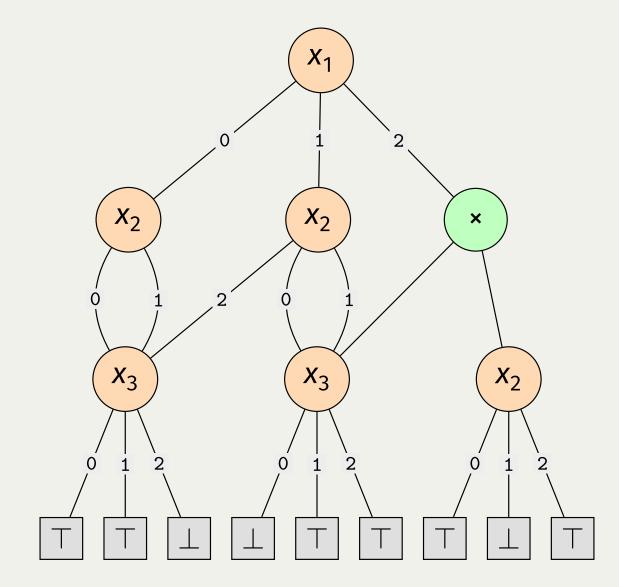
3. Tractability Beyond *β*-Acyclicity for Conjunctive Queries with Negation, M. Lanzinger

vn tractable) own to be tractable) Q known to be tractable)

C., S. Mengel *remier ordre*, J. Brault-Baror nger

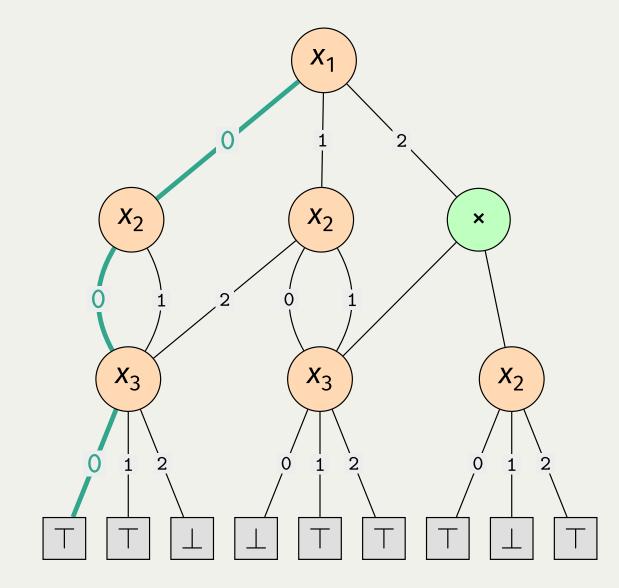
# Our algorithm: a circuit approach

# **Relational Circuits**



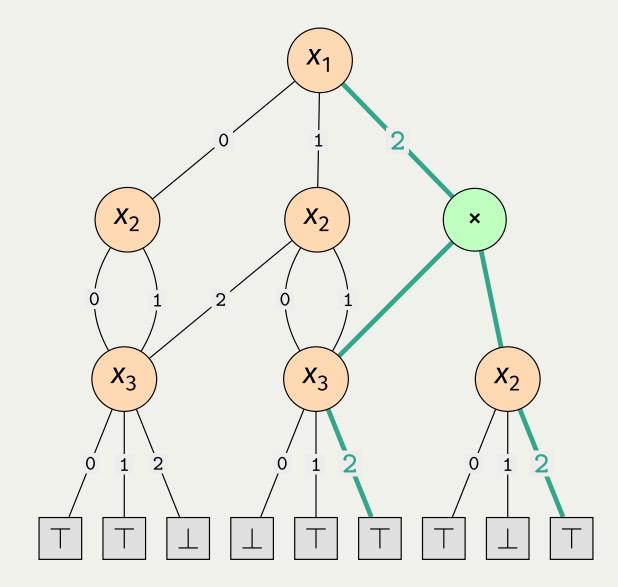
$x_1$	$x_2$	$x_3$
0	0	0
0	0	1
0	1	0
0	1	1
1	0	1
1	0	2
1	1	1
1	1	2
1	2	0
1	2	1
2	0	1
2	0	2
2	2	1
2	2	2

# **Relational Circuits**



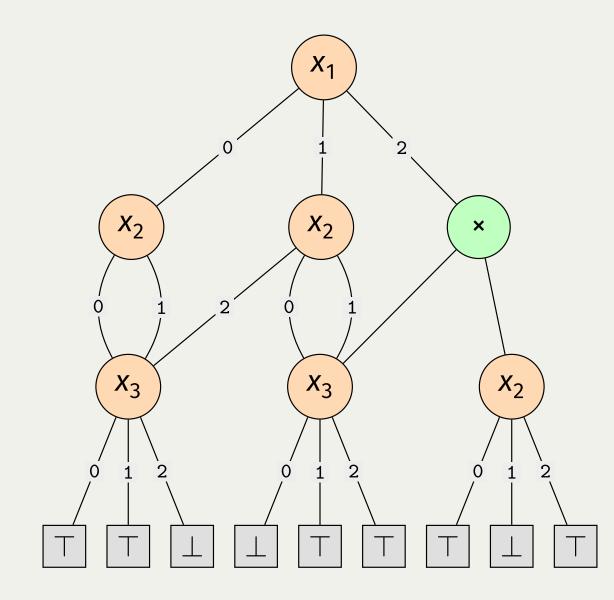
$x_1$	$x_2$	$x_3$
0	0	0
0	0	1
0	1	0
0	1	1
1	0	1
1	0	2
1	1	1
1	1	2
1	2	0
1	2	1
2	0	1
2	0	2
2	2	1
2	2	2

# **Relational Circuits**



$x_1$	$x_2$	$x_3$
0	0	0
0	0	1
0	1	0
0	1	1
1	0	1
1	0	2
1	1	1
1	1	2
1	2	0
1	2	1
2	0	1
2	0	2
2	2	1
2	2	2

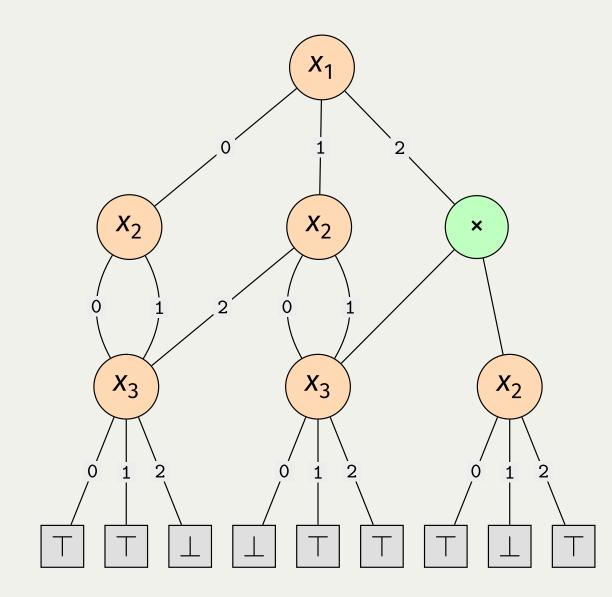
# Ordered Relational Circuits



Factorized representation of relation  $R \subseteq D^X$ :

- Inputs gates :  $\top \& \bot$
- **Decision** gates
- **Cartesian products**: × -gates

# **Ordered Relational Circuits**



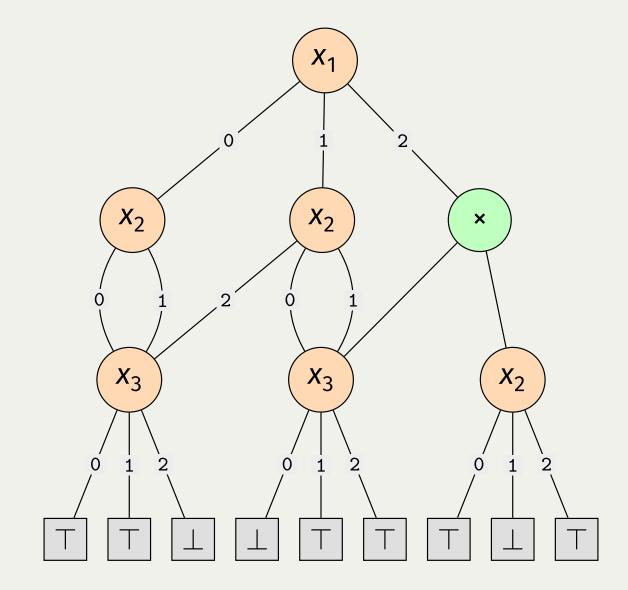


#### **Ordered:** decision gates below $x_i$ only mention $x_j$ with j > i.

Factorized representation of relation  $R \subseteq D^X$ :

- Inputs gates :  $\top \& \bot$
- **Decision** gates
- **Cartesian products**: × -gates

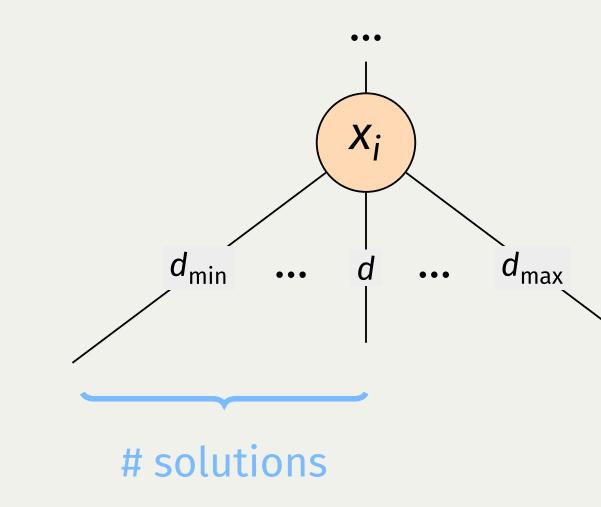
# **Direct Access on Relational Circuits**



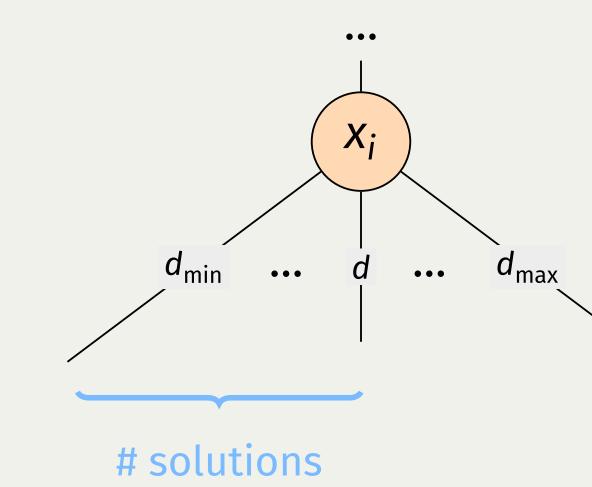
- For C on domain D, variables  $x_1, ..., x_n$ , DA possible :
  - **Preprocessing:**  $O(|C| \log |D|)$
  - Access time:  $O(n \log |D|)$

Idea : for each gate v over  $x_i$  and for each domain value d

Idea : for each gate v over  $x_i$  and for each domain value d

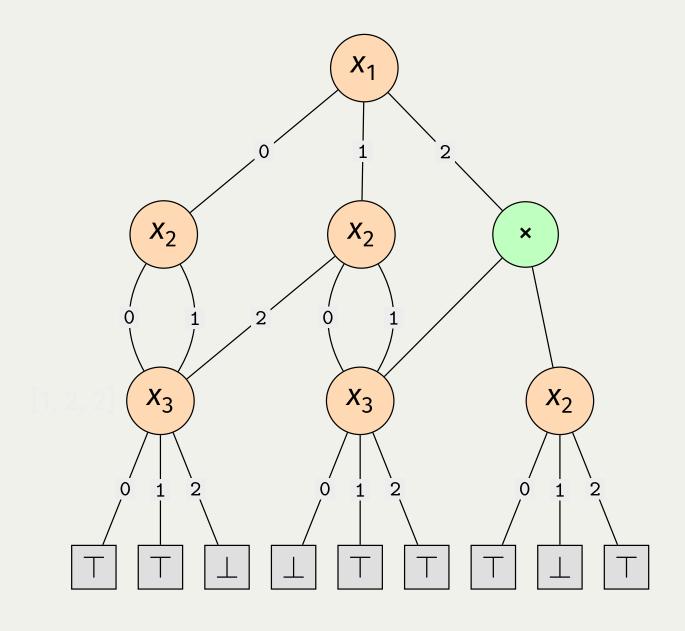


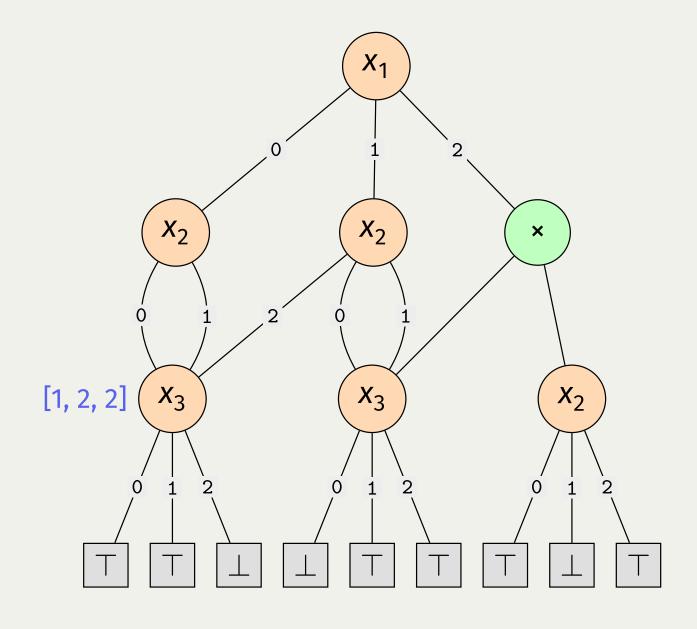
Idea : for each gate v over  $x_i$  and for each domain value d

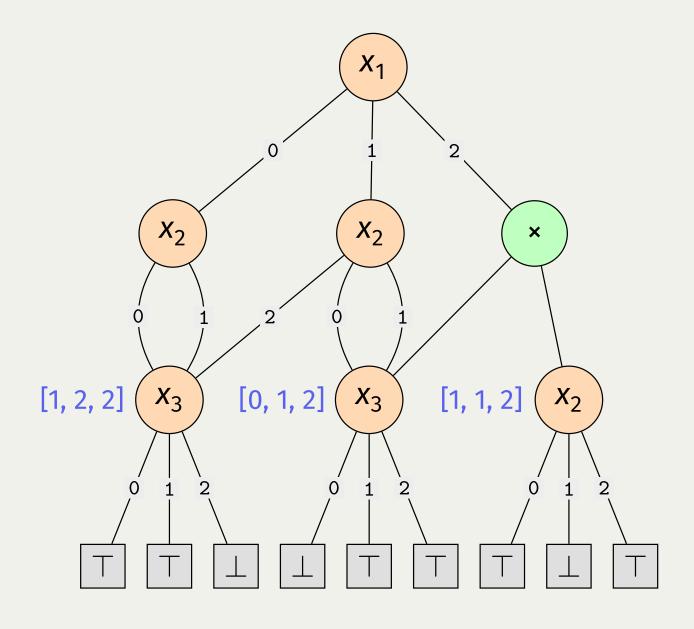


compute the size of the relation where  $x_i$  is set to a value  $d' \leq d$ 

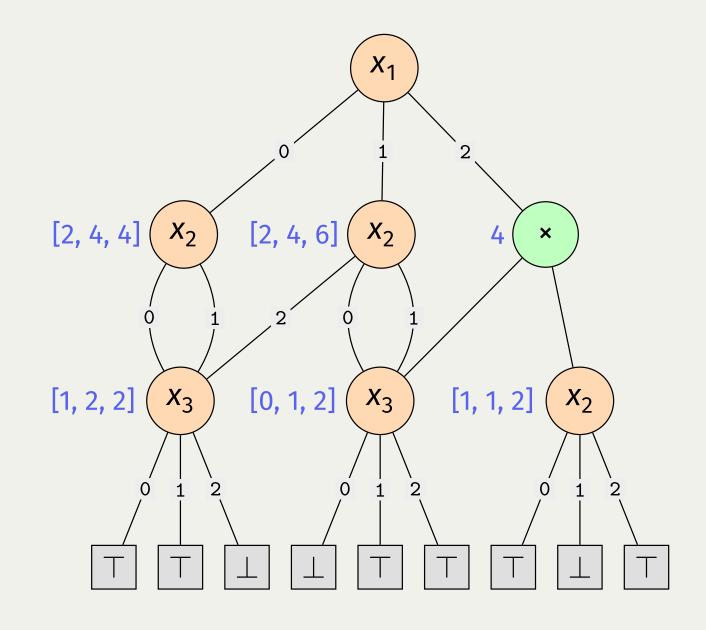
27



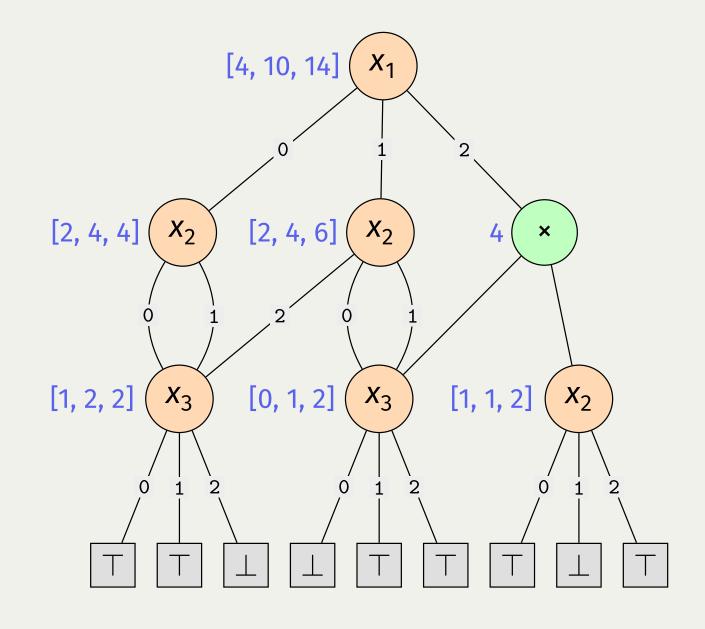


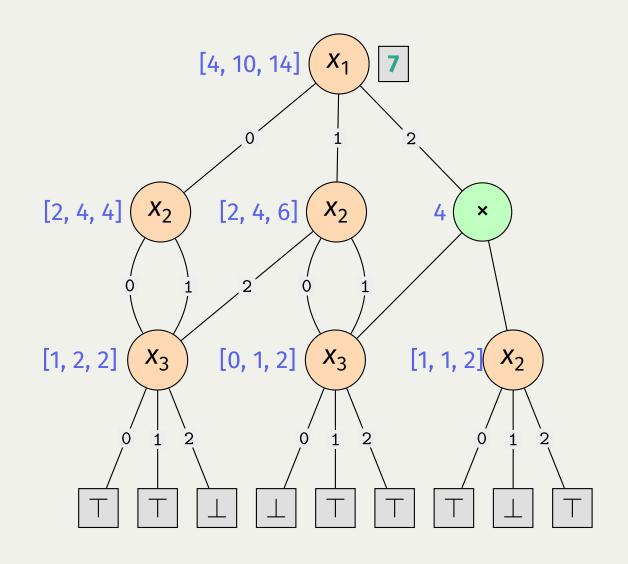


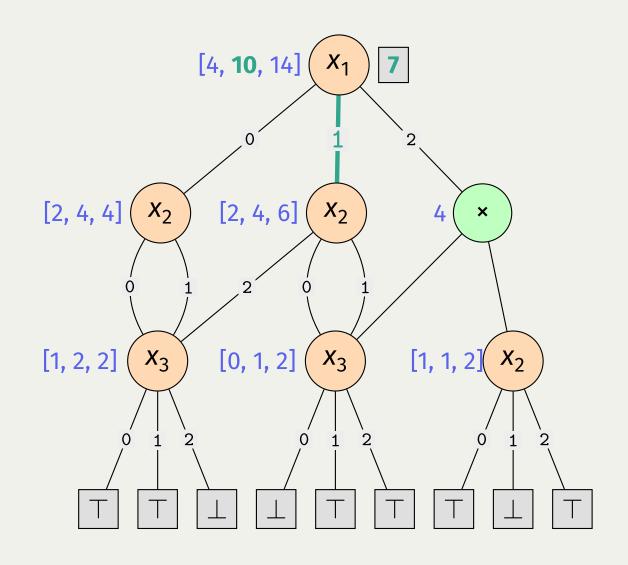
### Preprocessing

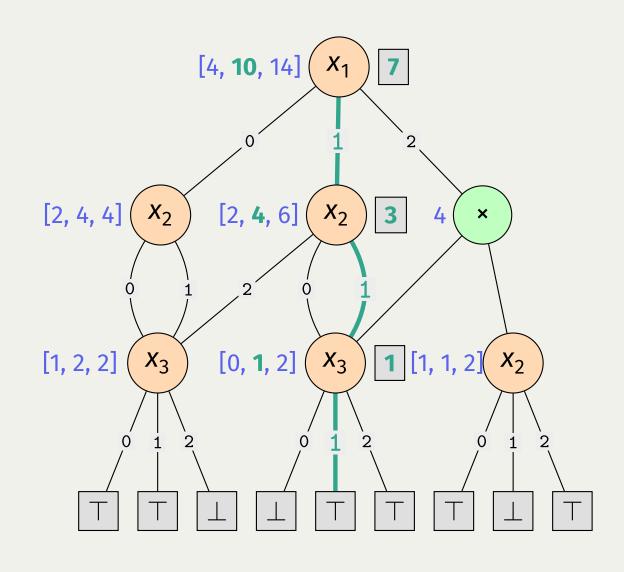


### Preprocessing

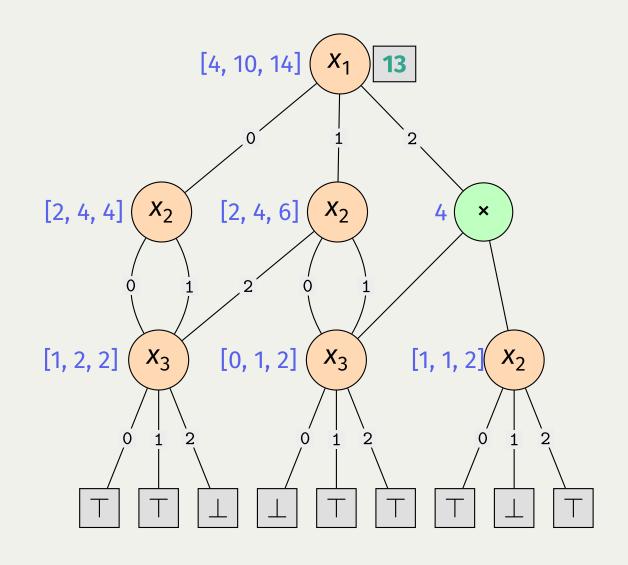


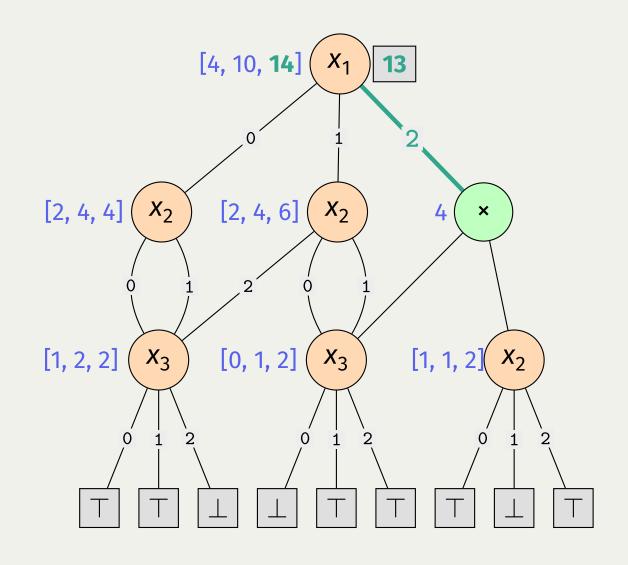


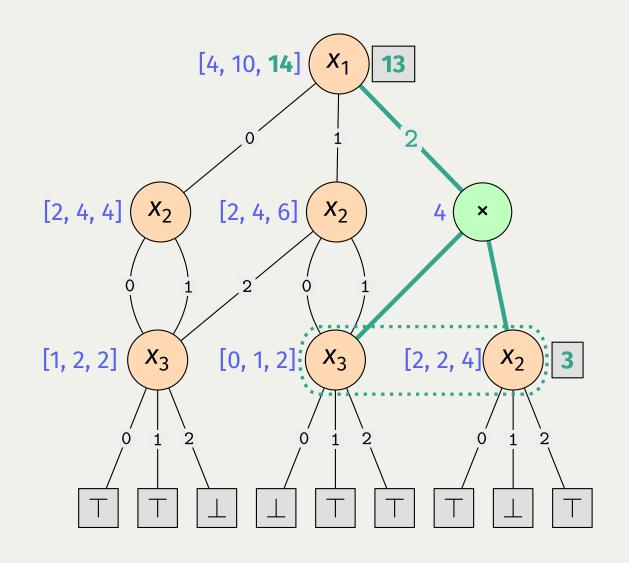


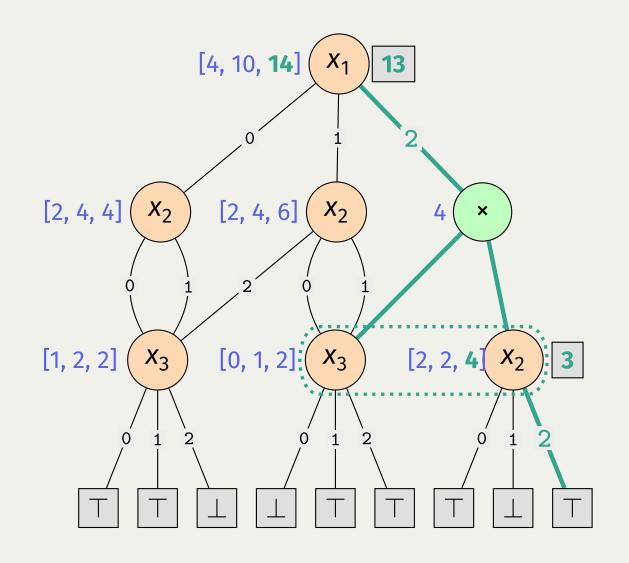


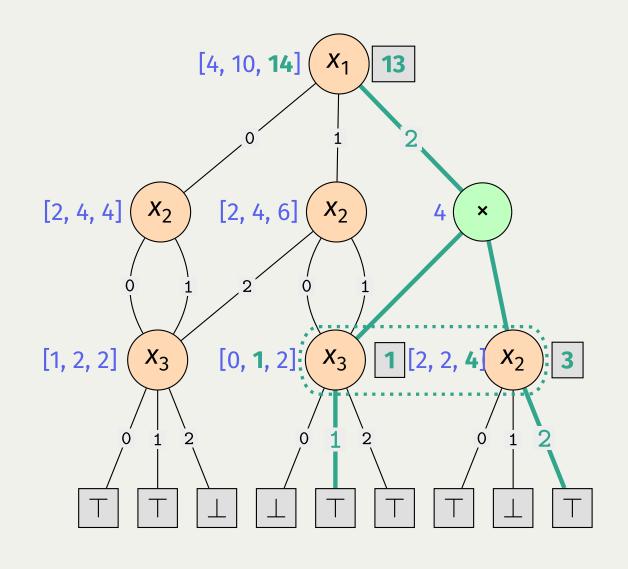
Compute the 7<sup>th</sup> solution  $\rightarrow 111$ 











Compute the 13<sup>th</sup> solution  $\rightarrow 221$ 

Solving DA for SCQ SCQ  $Q(x_1, ..., x_n)$ ,  $\pi = (x_1, ..., x_n)$ . **Preprocessing**:

1. Construct  $\pi$ -ordered circuit C of size  $\tilde{O}\left( \left| \mathbb{D} \right|^{1+show(Q,\pi)} poly(Q) \right)$ 2. Preprocess C in time O ( $|C| \log |D|$ ).

**Direct Access** :

1. Directly on C

2. in time  $O(n \log |D|)$  !

Solving DA for SCQ SCQ  $Q(x_1, ..., x_n)$ ,  $\pi = (x_1, ..., x_n)$ . **Preprocessing**:

1. Construct  $\pi$ -ordered circuit C of size  $\tilde{O}\left( \left| \mathbb{D} \right|^{1+show(Q,\pi)} poly(Q) \right)$ 2. Preprocess C in time O ( $|C| \log |D|$ ).

**Direct Access** :

1. Directly on C2. in time  $O(n \log |D|)$  !

Q, n considered constant here!

Solving DA for SCQ SCQ  $Q(x_1, ..., x_n)$ ,  $\pi = (x_1, ..., x_n)$ . **Preprocessing:**  $\tilde{O}\left(\left|\mathbb{D}\right|^{1+show(Q,\pi)}\right)$ 1. Construct  $\pi$ -ordered circuit C of size  $\tilde{O}\left(\left|\mathbb{D}\right|^{1+show(Q,\pi)}poly(Q)\right)$ 2. Preprocess C in time O ( $|C| \log |D|$ ). **Direct Access** : 1. Directly on C2. in time  $O(n \log |D|)$  !

Q, n considered constant here!

Solving DA for SCQ SCQ  $Q(x_1, ..., x_n)$ ,  $\pi = (x_1, ..., x_n)$ . **Preprocessing:**  $\tilde{O}\left(\left|\mathbb{D}\right|^{1+show(Q,\pi)}\right)$ 1. Construct  $\pi$ -ordered circuit C of size  $\tilde{O}\left(\left|\mathbb{D}\right|^{1+show(Q,\pi)}poly(Q)\right)$ 2. Preprocess C in time O ( $|C| \log |D|$ ). **Direct Access** :  $O(\log |\mathbb{D}|)$ 1. Directly on C2. in time  $O(n \log |D|)$  !

Q, n considered constant here!

### **DPLL:** building circuits

Compilation based on a variation of DPLL :

1. 
$$Q(\mathbb{D}) = \biguplus_{d \in D} [x_1 = d] \times Q[x_1 = d] (\mathbb{D})$$

 $2.\ Q\ (\ \mathbb{D}\ )\ =Q_1\ (\ \mathbb{D}\ )\ \times Q_2\ (\ \mathbb{D}\ )\ \text{if}\ Q=Q_1\wedge Q_2\ \text{with}\ var\left(\ Q_1\ \right)\ \cap\ var\left(\ Q_2\ \right)\ =\emptyset$ 

3. Top down induction + caching



https://florent.capelli.me/cytoscape/dpll.html

## Going further



### Other usage of circuits

- 1. Extension to  $\exists$ SJQ:
  - Last variable in C can be existentially projected without increase in circuit size
  - Give DA for  $\exists x_k, ..., x_n Q (x_1, ..., x_n)$ .
- 2. Semi-ring Aggregation

• 
$$w: X \times D \to (\mathbb{K}, \oplus, \otimes)$$

•  $w: X \times D \to (\mathbb{K}, \oplus, \otimes)$ • Compute  $\bigoplus_{\tau \in Q(\mathbb{D})} \bigotimes_{x \in X} w(x, \tau(x))$ 

## 1. Improve preprocessing $\tilde{O}\left(\left|\mathbb{D}\right|^{show\left(Q,\pi\right)+1}\right)$

5

# 1. Improve preprocessing $\tilde{O}\left(\left|\mathbb{D}\right|^{show(Q,\pi)}\right)$

5

34.1

1. Improve preprocessing  $\tilde{O}\left(\left.\left|\mathbb{D}\right|^{show\left(\left.Q,\pi\right.
ight)}
ight.
ight)$ 

doable with a few tweaks in DPLL, joint work with S. Salvati.



1. Improve preprocessing  $ilde{O}\left( \left. \left| \mathbb{D} \right|^{show \left( \left. Q, \pi \right. 
ight)} 
ight.$ doable with a few tweaks in DPLL, joint work with S. Salvati. 2. Lower bounds: preprocessing in  $|\mathbb{D}|^{show(Q,\pi)}$ unavoidable under Zero-clique conjecture (join work with N. Carmeli).



1. Improve preprocessing  $ilde{O}\left(\left.\left|\mathbb{D}\right|^{show\left(\left.Q,\pi
ight.
ight)}
ight.$ 

doable with a few tweaks in DPLL, joint work with S. Salvati.

- 2. Lower bounds: preprocessing in  $|\mathbb{D}|^{show(Q,\pi)}$ unavoidable under Zero-clique conjecture (join work with N. Carmeli).
- 3. Aggregation

 $Q(x_1, ..., x_k, F(x_{k+1}, ..., x_n))$ , generalizing work by I. Eldar, N. Carmeli, B. Kimelfeld.

