

Fine-Grained Dichotomies for Evaluating Database Queries

Nofar Carmeli



Plan

- Introduction
- Join queries
 - Basic dichotomy
 - Self-joins
- Higher expressivity
 - Conjunctive queries
 - Unions of conjunctive queries
- Other Evaluation Tasks

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- **Introduction**
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Example: Join Query

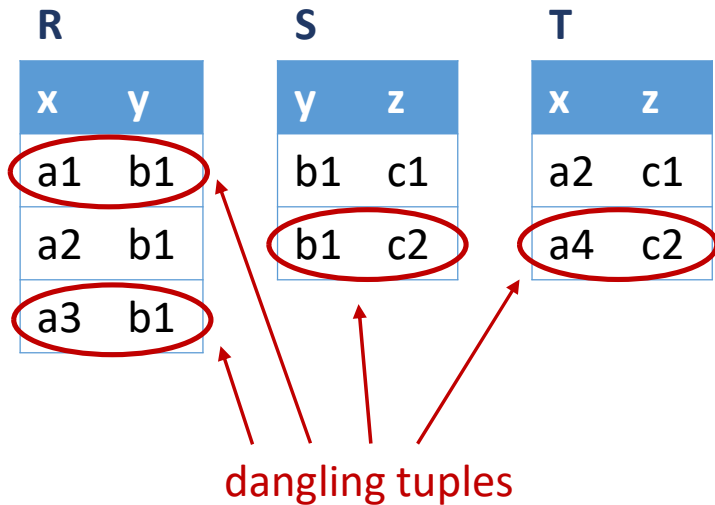
Problem		Office		Contact	
Description	Room	Room	Person	Person	Email
Moisture	5/129	5/127	Nofar	Nofar	nc@lirmm.fr
Broken ceiling	Cafeteria	5/128	Florent	Florent	ft@lirmm.fr
Missing board	5/127	5/128	Guillaume	Guillaume	gpk@lirmm.fr
		5/129	David	David	dc@lirmm.fr
		5/129	Akira		

$Q(E, P, R, D) \leftarrow \text{Problem}(D, R), \text{Office}(R, P), \text{Contact}(P, E)$
 $\{(E, P, R, D) \mid (D, R) \in \text{Problem}, (R, P) \in \text{Office}, (P, E) \in \text{Contact}\}$

Email	Person	Room	Description
nc@lirmm.fr	Nofar	5/127	Missing board
dc@lirmm.fr	David	5/129	Moisture

Challenges

- Many answers
- Many intermediate answers



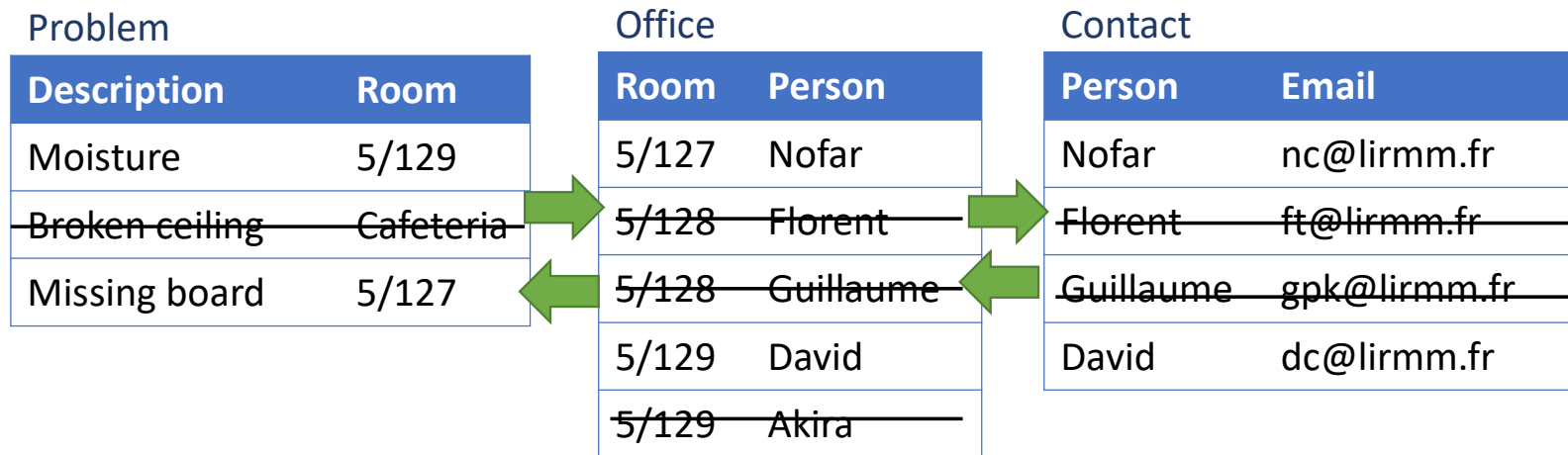
$$Q_1(x, y, z) \leftarrow R(x, y), S(y, z)$$

x	y	z
a1	b1	c1
a1	b1	c2
a2	b1	c1
a2	b1	c2
a3	b1	c1
a3	b1	c2

$$Q_2(x, y, z) \leftarrow R(x, y), S(y, z), T(x, z)$$

x	y	z
a2	b1	c1

Example: Algorithm



$$Q(E, P, R, D) \leftarrow \text{Problem}(D, R), \text{Office}(R, P), \text{Contact}(P, E)$$

Email	Person	Room	Description
nc@lirmm.fr	Nofar	5/127	Missing board
dc@lirmm.fr	David	5/129	Moisture

Example: Algorithm Fails

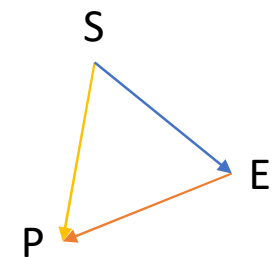
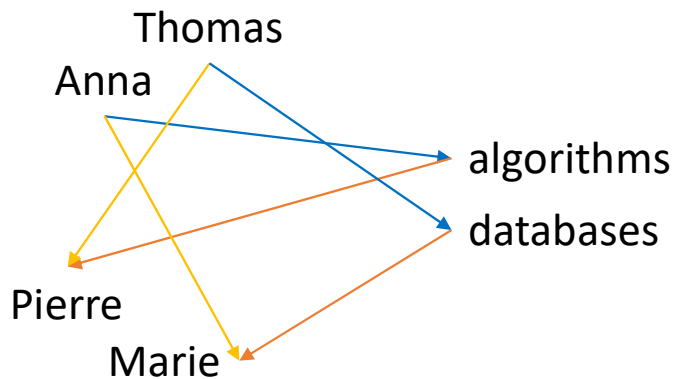
Registration			Staff			COI	
Student	Exam		Exam	Professor		Student	Professor
Anna	algorithms	→	algorithms	Pierre	→	Thomas	Pierre
Thomas	databases	←	databases	Marie	←	Anne	Marie

$$Q(S, E, P) \leftarrow \text{Registration}(S, E), \text{Staff}(E, P), \text{COI}(S, P)$$

Database

No query answers

Query



Complexity Guarantees

- Data complexity
 - input = database
 - query size = constant
- Possibly: output \gg input
$$|answers| = |database|^{|query|}$$
- Minimal requirements:
 - Linear time (to read input)
 - Constant time per answer (to print output)
- RAM model
- We allow log factors

Complexity Guarantees

- Worst-case-optimal total time [Atserias, Grohe, Marx; FOCS 08]
 - Linear in input + worst-case output



- Instance-optimal total time (also relevant)
 - Linear in input + output

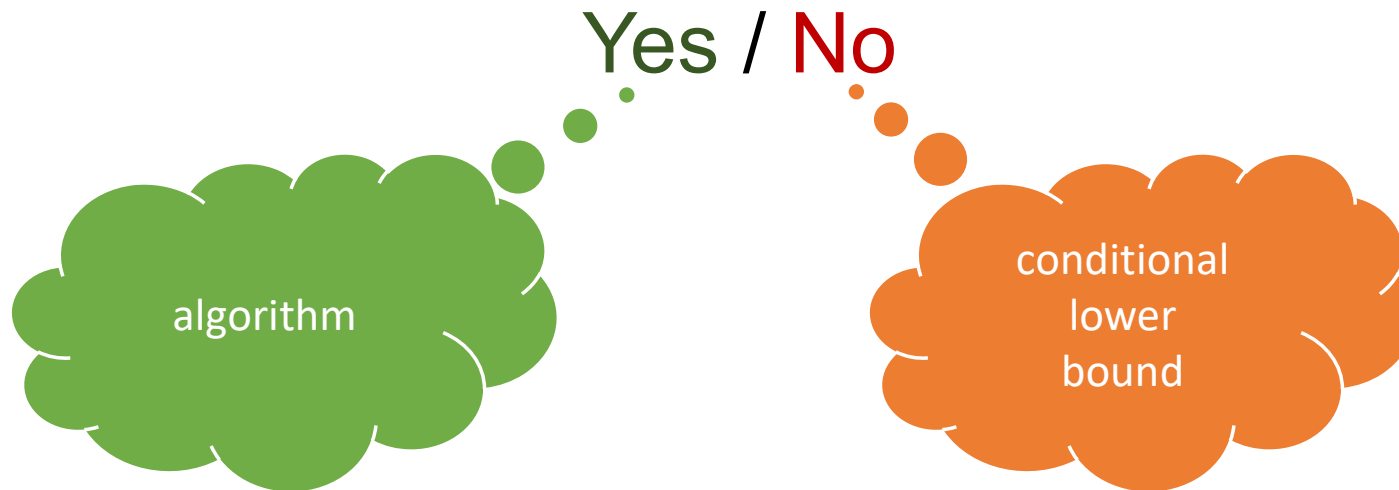


- Enumeration (“ideal”; our focus)
 - Preprocessing: linear in input
 - Delay: constant



Research Question

- Goal: Given a query, what is the most efficient algorithm?
- Type of results:
Can we solve a task for a given query in a given time complexity?

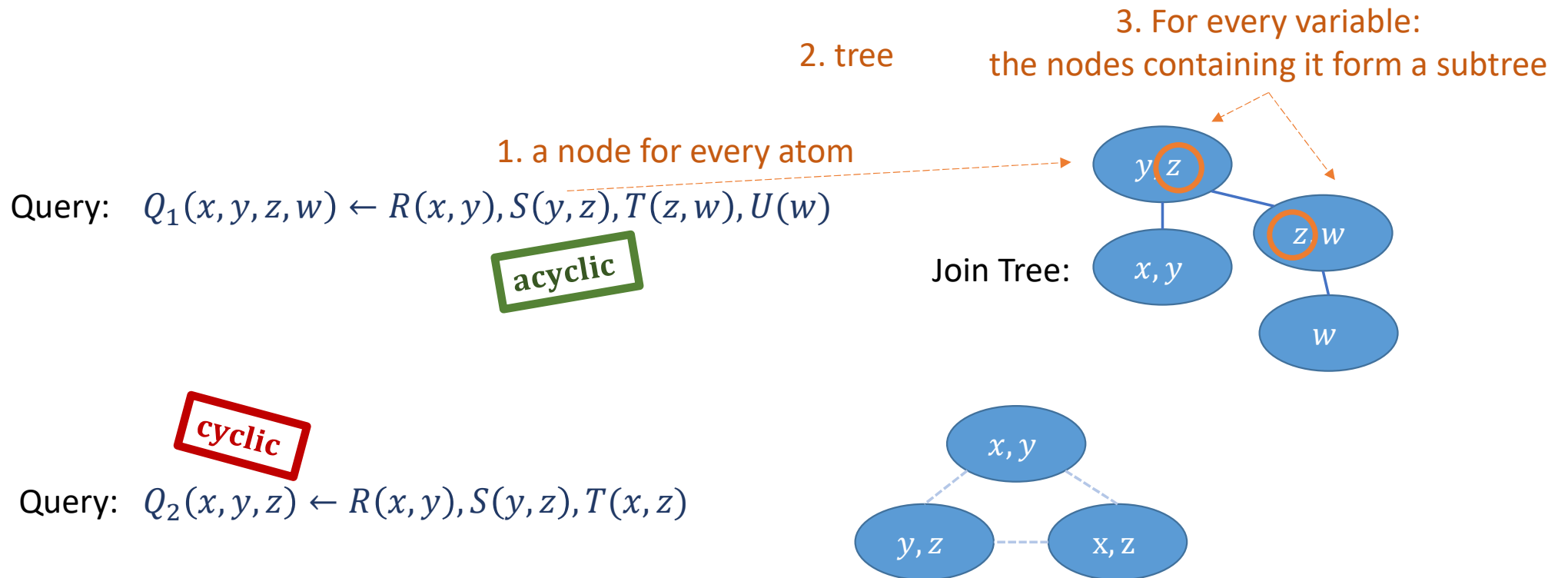


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Acyclicity

- A query that has a join tree is called acyclic



Dichotomy

[BaganDurandGrandjean; CSL 07]
[Brault-Baron 2013]
[Bringmann, C, Mengel; PODS 22]

- Given a join query Q ,

If Q is acyclic, $Q \in \text{Enum}\langle \text{lin}, \text{const} \rangle$

If Q is cyclic, $Q \notin \text{Enum}\langle \text{lin}, \text{const} \rangle^*$

* no self-joins, assuming sHyperclique or Zero-Clique

Acyclic Joins

[Yannakakis 81]

- An efficient algorithm for acyclic joins

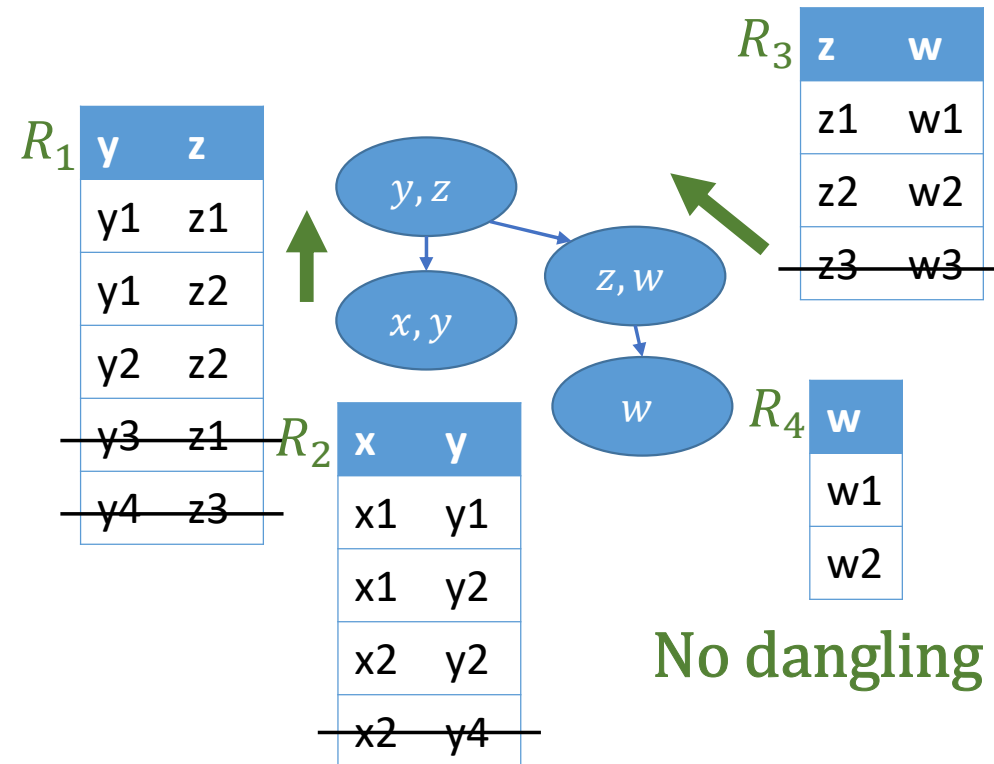
- ➔ 1. Find a join tree and set a root
- ➔ 2. Remove dangling tuples
3. Join

1. Leaf-to-root:

$$r_{parent} \leftarrow r_{parent} \bowtie r_{child}$$

2. Root-to-leaf:

$$r_{child} \leftarrow r_{child} \bowtie r_{parent}$$



No dangling tuples!

Acyclic Joins

- An efficient algorithm for acyclic joins
 1. Find a join tree and set a root
 2. Remove dangling tuples
 - ➔ 3. Join

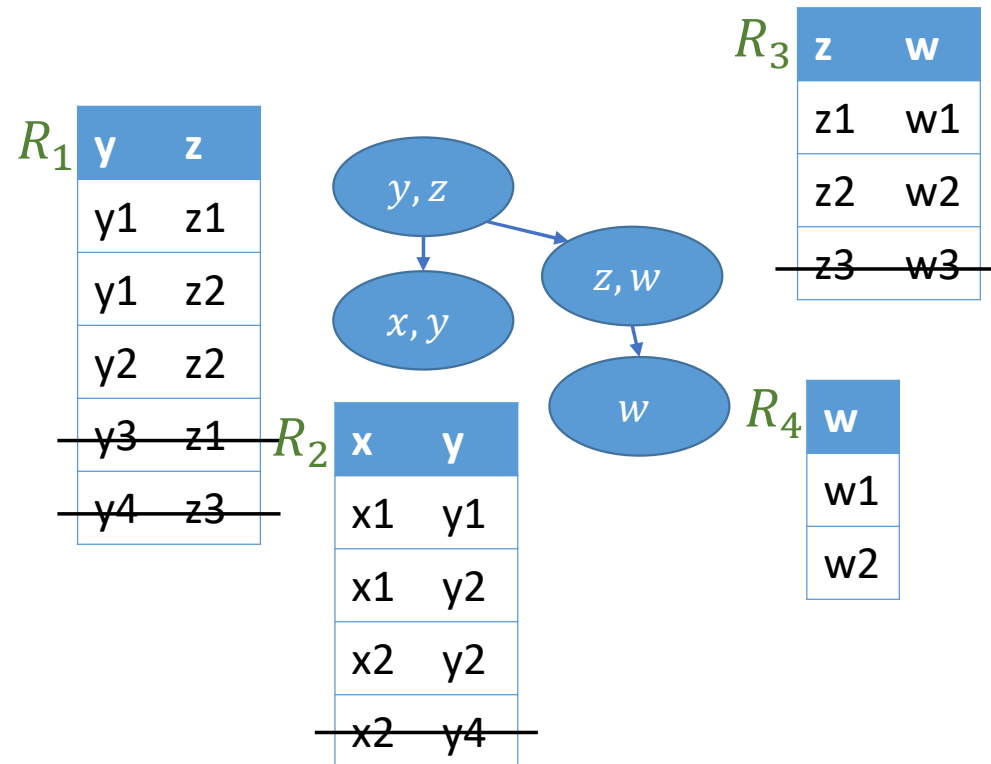
for t1 in R1:

 for t2 in R2 matching t1:

 for t3 in R3 matching t1,t2:

 for t4 in R4 matching t1,t2,t3:

 output t1,t2,t3,t4



Dichotomy

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Example: Algorithm Fails

Registration

Student	Exam
Anna	algorithms
Thomas	databases

Staff

Exam	Professor
algorithms	Pierre
databases	Marie

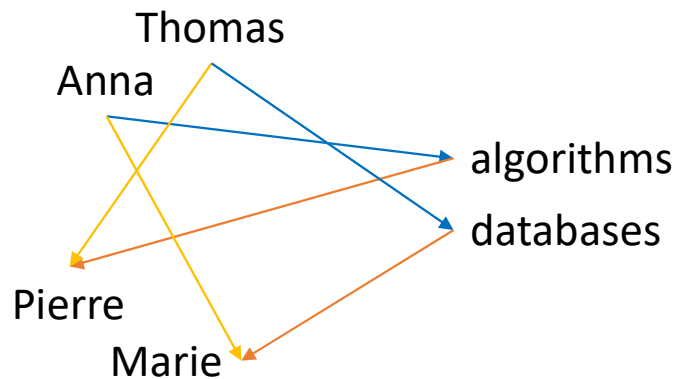
COI

Student	Professor
Thomas	Pierre
Anne	Marie

$$Q_{\Delta}(x, y, z) \leftarrow R_1(x, y), R_2(y, z), R_3(x, z)$$

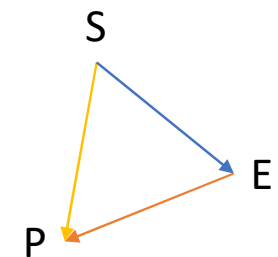
$$Q(S, E, P) \leftarrow \text{Registration}(S, E), \text{Staff}(E, P), \text{COI}(S, P)$$

Database



No query answers

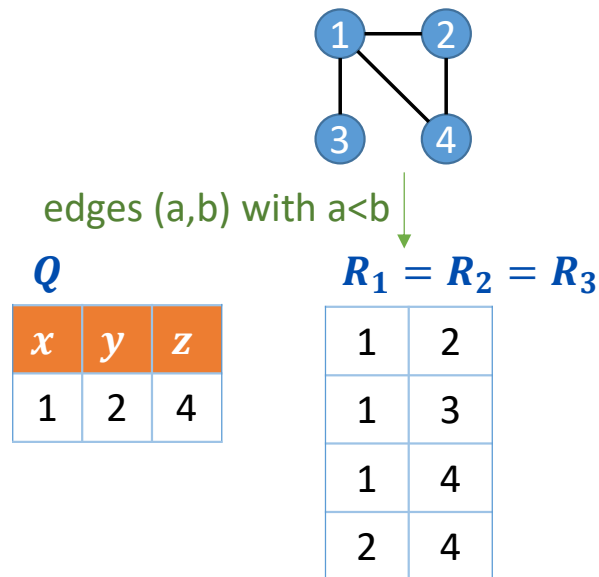
Query



Example: Conditional Lower Bound

[Brault-Baron 13]

Assumption: cannot detect triangles in a graph in linear time



$$Q_{\Delta}(x, y, z) \leftarrow R_1(x, y), R_2(y, z), R_3(x, z)$$

first answer in linear time \Rightarrow triangle in linear time \Rightarrow not possible

sHyperclique Hypothesis

- $(k, k - 1)$ -hyperclique: k vertices, each $k - 1$ of them form an edge.



- sHyperclique Hypothesis:
 $\forall k \geq 3$, deciding the existence of a $(k, k - 1)$ -hyperclique in a hypergraph with m edges cannot be done in time $O(m)$.
- Lemma:
A cyclic hypergraph contains an induced k -cycle or an induced $(k, k - 1)$ -hyperclique for some $k \geq 3$.

Dichotomy

[BaganDurandGrandjean; CSL 07]
[Brault-Baron 2013]
[Bringmann, C, Mengel; PODS 22]

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* no self-joins, assuming sHyperclique or Zero-Clique

RAM Model Subtleties

- Constant time in the RAM model, what does it mean?
- Assumptions:
 - Length of registers: $\theta(\log n)$
 - Basic operations in $O(1)$
 - Available memory: $O(n^c) / O(n)$
 - Modified memory: everything / $O(n)$
 - Modified memory during enumeration: everything / ... / $O(1)$
- Implications:
 - Domain values $\leq n^c$
 - Sorting the input in $O(n)$
 - Radix Sort handles k integers, each bounded by n^c , in time $O(ck + cn)$
 - If $O(n^c)$ available memory,
 - Lookup table with k elements: construction in $O(k)$, search in $O(1)$

“saves”
log factors

n = size of input database

RAM Model Subtleties

- Constant time in the RAM model, what does it mean?
- Assumptions:
 - Length of registers: $\theta(\log n)$
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 - Modified memory: **everything** / $O(n)$
 - Modified memory during enumeration: **everything** / ... / $O(1)$
- Implications:
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 - Sorting the input in $O(n)$
 - Radix Sort handles k integers, each bounded by n^c , in time $O(ck + cn)$
 - If $O(n^c)$ available memory,
 - Lookup table with k elements: construction in $O(k)$, search in $O(1)$
- **In this talk, assume the relaxed model**

“saves”
log factors

n = size of input database

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Dichotomy

[BaganDurandGrandjean; CSL 07]
[Brault-Baron 2013]
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- Given a join query Q ,

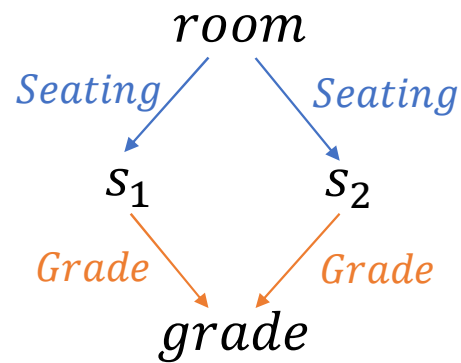
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If Q is cyclic, $Q \notin \text{Enum}\langle \text{lin}, \text{const} \rangle^*$

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Example 1

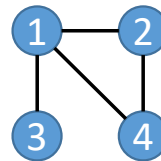
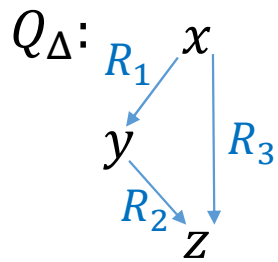
$Q(s_1, s_2, room, grade) \leftarrow$
 $Seating(room, s_1), Seating(room, s_2), Grade(s_1, grade), Grade(s_2, grade)$



Lower Bound: Cyclic Joins

[Brault-Baron 13]

Assumption: cannot detect triangles in a graph in linear time



edges (a,b) with $a < b$

Q

x	y	z
1	2	4

$R_1 = R_2 = R_3$

1	2
1	3
1	4
2	4

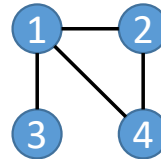
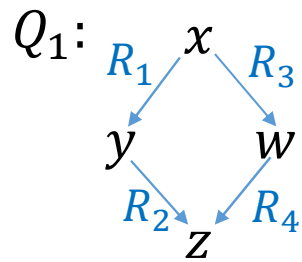
Cyclic: $Q_{\Delta}(x, y, z) \leftarrow R_1(x, y), R_2(y, z), R_3(x, z)$

first answer in linear time \Rightarrow triangle in linear time \Rightarrow not possible

Lower Bound: Cyclic Joins

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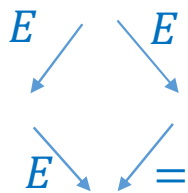
Assumption: cannot detect triangles in a graph in linear time



edges (a,b) with $a < b$

with self-joins,
cannot assign different relations
to different atoms

Construction:



Q

x	y	z	w
1	2	4	4

$R_1 = R_2 = R_3$

1	2
1	3
1	4
2	4

R_4

1	1
2	2
3	3
4	4

Cyclic: $Q_1(x, y, z, w) \leftarrow R_1(x, y), R_2(y, z), R_3(x, w), R_4(w, z)$

first answer in linear time \Rightarrow triangle in linear time \Rightarrow not possible

Algorithm

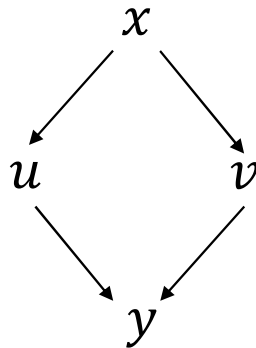
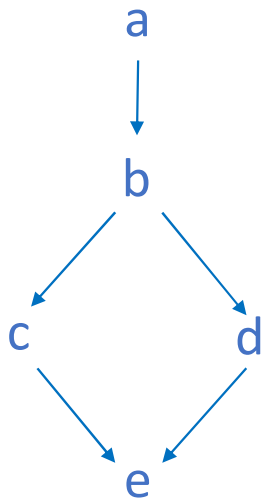
[C, Segoufin; PODS 23]

Query

$$Q(x, u, v, y) \leftarrow R(x, u), R(u, y), R(x, v), R(v, y)$$

Database

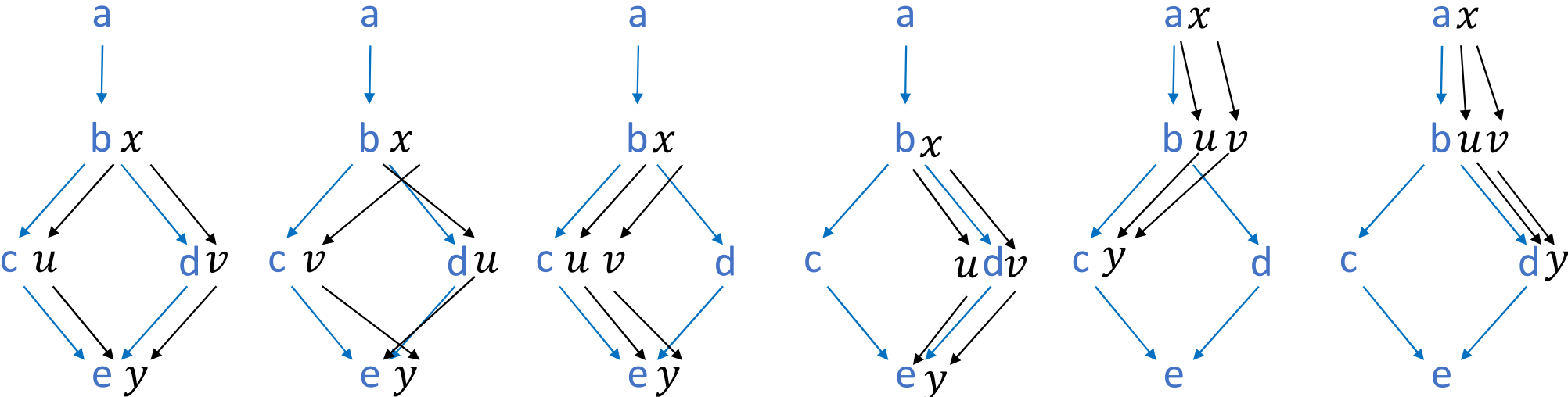
<i>R</i>	
a	b
b	c
b	d
c	e
d	e



Answers

Algorithm

[C, Segoufin; PODS 23]



Algorithm

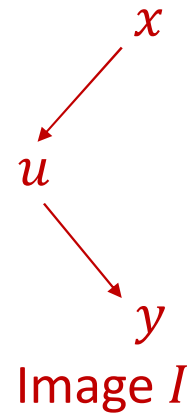
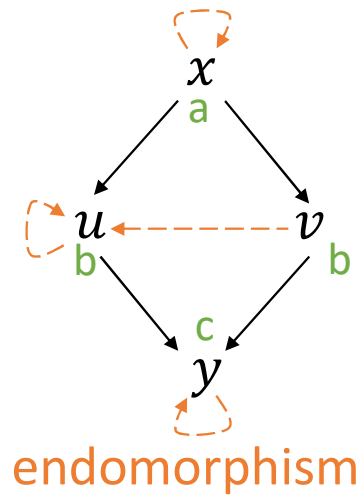
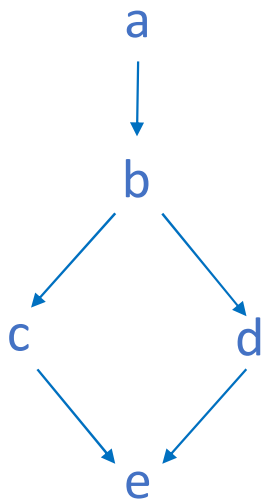
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Query

$$Q(x, u, v, y) \leftarrow R(x, u), R(u, y), R(x, v), R(v, y)$$

Database

R	
a	b
b	c
b	d
c	e
d	e

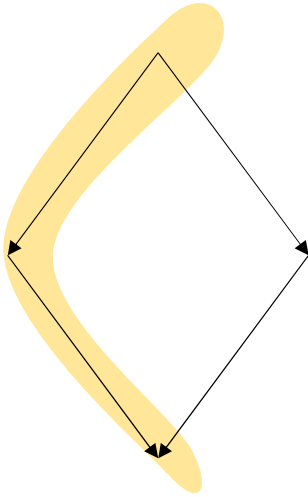


Algorithm

α = empty dictionary
 for answer (x, u, y) to I :
 output (x, u, u, y)
 for v in $\alpha(x, y)$:
 output (x, u, v, y)
 output (x, v, u, y)
 $\alpha(x, y).insert(u)$

I answers			Q answers			
x	u	y	x	u	v	y
a	b	c	b	c	d	e
a	b	d	b	d	c	e
b	c	e	a	b	b	c
b	d	e	a	b	b	d
			b	c	c	e
			b	d	d	e

Examples: Full CQs

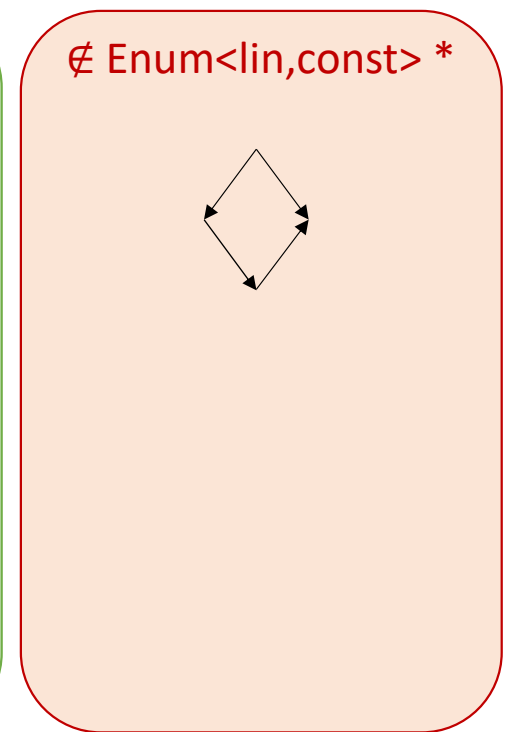
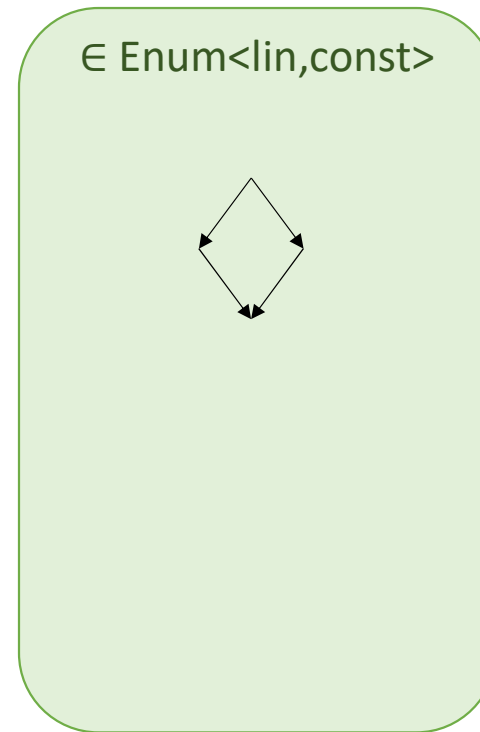
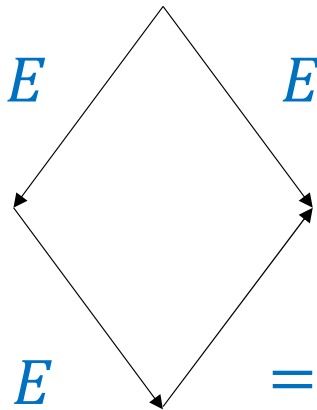


∈ Enum<lin,const>

∉ Enum<lin,const> *

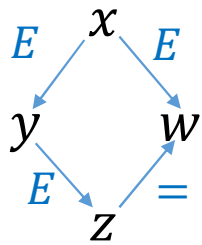
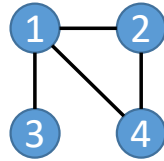
* assuming sTriangle

Examples: Full CQs



* assuming sTriangle

Hardness Proof



$R(x, y) \leftarrow E$

1	2
1	3
1	4
2	4

$R(y, z) \leftarrow E$

1	2
1	3
1	4
2	4

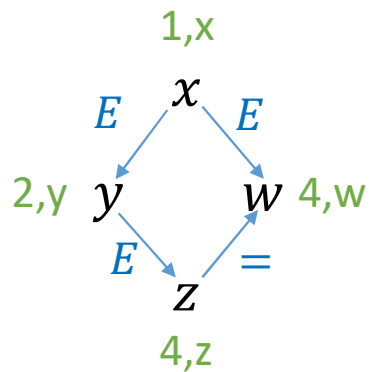
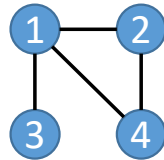
$R(x, w) \leftarrow E$

1	2
1	3
1	4
2	4

$R(w, z) \leftarrow =$

1	1
2	2
3	3
4	4

Hardness Proof (tagging technique)



Works because Q is a core!

$R(x, y) \leftarrow E$

1,x	2,y
1,x	3,y
1,x	4,y
2,x	4,y

$R(y, z) \leftarrow E$

1,y	2,z
1,y	3,z
1,y	4,z
2,y	4,z

$R(x, w) \leftarrow E$

1,x	2,w
1,x	3,w
1,x	4,w
2,x	4,w

$R(w, z) \leftarrow =$

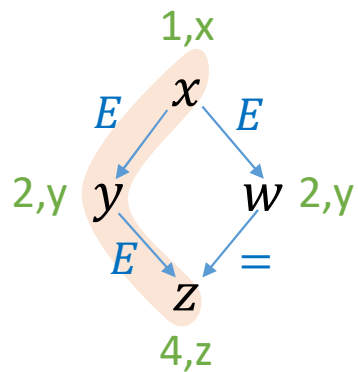
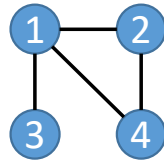
1,w	1,z
2,w	2,z
3,w	3,z
4,w	4,z

union
 \Rightarrow

R

1,x	2,y
1,x	3,y
1,x	4,y
2,x	4,y
1,y	2,z
1,y	3,z
1,y	4,z
2,y	4,z
1,x	2,w
1,x	3,w
1,x	4,w
2,x	4,w
1,w	1,z
...	...

Hardness Proof Fails



Finds triangles and 2-paths

$R(x, y) \leftarrow E$

1,x	2,y
1,x	3,y
1,x	4,y
2,x	4,y

$R(y, z) \leftarrow E$

1,y	2,z
1,y	3,z
1,y	4,z
2,y	4,z

$R(x, w) \leftarrow E$

1,x	2,w
1,x	3,w
1,x	4,w
2,x	4,w

$R(w, z) \leftarrow =$

1,w	1,z
2,w	2,z
3,w	3,z
4,w	4,z

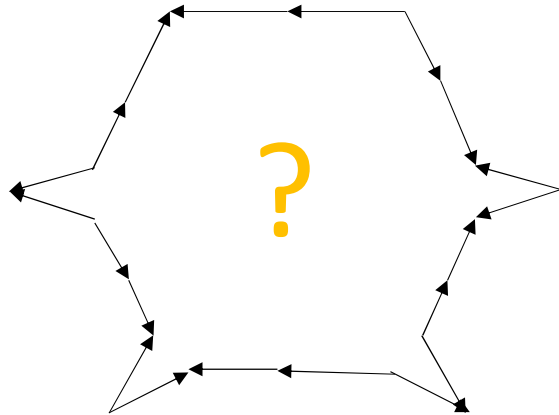
union
 \Rightarrow

R

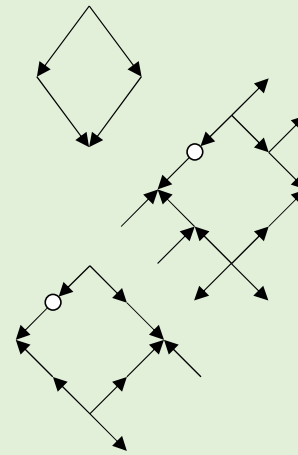
1,x	2,y
1,x	3,y
1,x	4,y
2,x	4,y
1,y	2,z
1,y	3,z
1,y	4,z
2,y	4,z
1,x	2,w
1,x	3,w
1,x	4,w
2,x	4,w
1,w	1,z
...	...

Examples: Full CQs

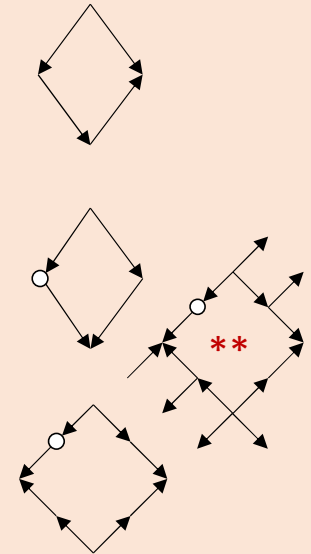
[C, Segoufin; PODS 2023]



∈ Enum<lin,const>



∉ Enum<lin,const> *



* assuming sTriangle

** assuming VUTD

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Example: Query

Problem	
Description	Room
Moisture	5/129
Broken ceiling	Cafeteria
Missing board	5/127

Office		
Room	Person	Phone
5/127	Nofar	9590
5/127	Nofar	9591
5/128	Florent	6548
5/128	Guillaume	6548
5/129	David	7544
5/129	Akira	7544

Contact	
Person	Email
Nofar	nc@lirmm.fr
Florent	ft@lirmm.fr
Guillaume	gpk@lirmm.fr
David	dc@lirmm.fr

Conjunctive query $\{(E, P, R, D, N) \mid (D, R) \in \text{Problem}, (R, P, N) \in \text{Office}, (P, E) \in \text{Contact}\}$
~~Join query: $Q(E, P, R, D, N) \leftarrow \text{Problem}(D, R), \text{Office}(R, P, N), \text{Contact}(P, E)$~~

Email	Person	Room	Description	Phone
nc@lirmm.fr	Nofar	5/127	Missing board	9590
nc@lirmm.fr	Nofar	5/127	Missing board	9591
dc@lirmm.fr	David	5/129	Moisture	7544

Dichotomy for CQs

[Bagan, Durand, Grandjean; CSL 07]

[Brault-Baron 2013]

- Given a conjunctive query Q ,

If Q is acyclic free-connex, $Q \in \text{Enum}\langle \text{lin}, \text{const} \rangle$

If Q is acyclic not free-connex, $Q \notin \text{Enum}\langle \text{lin}, \text{const} \rangle^*$

If Q is cyclic, $Q \notin \text{Enum}\langle \text{lin}, \text{const} \rangle^{**}$

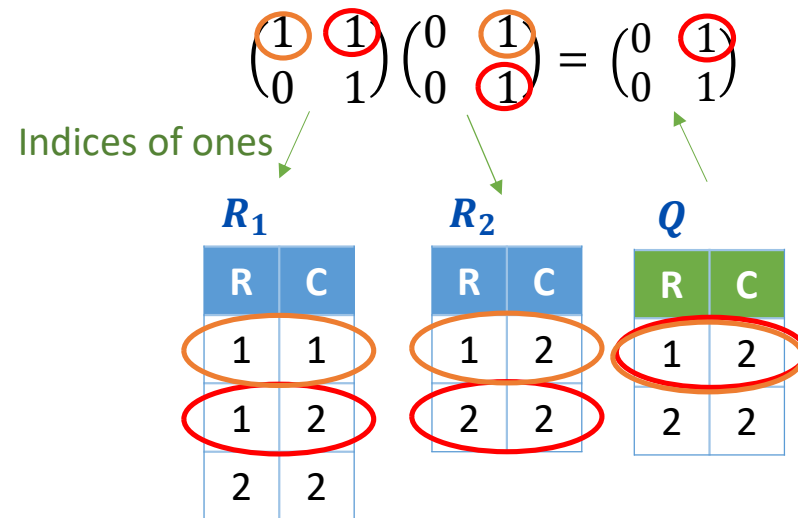
* no self-joins, assuming sBMM

** no self-joins, assuming sHyperclique

Lower Bound: acyclic non-free-connex

[Bagan, Durand, Grandjean; CSL 07]

Assumption: Boolean $n \times n$ matrices cannot be multiplied in time $O(n^2)$



Acyclic non-free-connex: $Q(x, z) \leftarrow R_1(x, y), R_2(y, z)$

$O(n^2)$ preprocessing + $O(1)$ delay = $O(n^2)$ total \Rightarrow not possible

Plan

- Introduction
- Join queries
 - Basic dichotomy
 - Self-joins
- **Higher expressivity**
 - Conjunctive queries
 - **Unions of conjunctive queries**
- Other Evaluation Tasks

Example: Union of CQs

Posts		Followers		Friends	
Amazing vacation	Alice	Alice	Bob	Bob	Carol
Amazing vacation	Bob	Bob	Carol	Carol	Dafni
Angry post	Bob				

$$Q_1(\text{post}, p_2, p_3) \leftarrow \text{Posts}(\text{post}, p_1), \text{Followers}(p_1, p_2), \text{Friends}(p_2, p_3)$$

$$\cup$$

$$Q_2(\text{post}, p_1, p_2) \leftarrow \text{Posts}(\text{post}, p_1), \text{Followers}(p_1, p_2)$$

Post	Person 1	Person 2	
Amazing vacation	Bob	Carol	due to Q_1 or Q_2
Amazing vacation	Alice	Bob	due to Q_1
Angry post	Carol	Dafni	due to Q_2
Angry post	Bob	Carol	due to Q_1

Cases for UCQs

All CQs are Easy

always easy

Some Easy, Some Hard

All CQs are Hard

Cases for UCQs

[C, Kröll; PODS 19]



Lower Bound: acyclic non-free-connex

[Bagan, Durand, Grandjean; CSL 07]

Assumption: Boolean $n \times n$ matrices cannot be multiplied in time $O(n^2)$

$$\begin{pmatrix} 1 & 1 \\ 0 & 1 \end{pmatrix} \begin{pmatrix} 0 & 1 \\ 0 & 1 \end{pmatrix} = \begin{pmatrix} 0 & 1 \\ 0 & 1 \end{pmatrix}$$

Indices of ones

R	C
1	1
1	2
2	2

R	C
1	2
2	2

R	C
1	2
2	2

Acyclic non-free-connex: $Q(x, z) \leftarrow R_1(x, y), R_2(y, z)$

$O(n^2)$ preprocessing + $O(1)$ delay = $O(n^2)$ total \Rightarrow not possible

Why this isn't hard

not free connex

$$Q_1(x, z, w) \leftarrow \overset{\text{hard part}}{R_1(x, y), R_2(y, z)}, R_3(z, w)$$

$$Q_2(a, b, c) \leftarrow R_1(a, b), R_2(b, c)$$

Q_1		
1	2	⊥
2	2	⊥
Q_2		
1	1	2
1	2	2
2	2	2

$O(n^3)$ solutions:
The computation does not contradict the assumption

R_1	
1	1
1	2
2	2

R_2	
1	2
2	2

R_3	
2	⊥

The hardness results do not hold within a union

Example: Tractable Union

acyclic non free-connex

$$Q_1(x, z, w) \leftarrow R_1(x, y), R_2(y, z), R_3(z, w)$$

hard part

Body-homomorphism \cup

free-connex

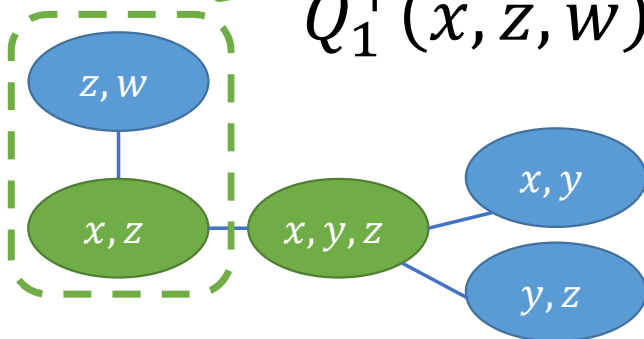
$$Q_2(a, b, c) \leftarrow R_1(a, b), R_2(b, c)$$

$\in \text{Enum}\langle \text{lin}, \text{const} \rangle$



free-connex

$$Q_1^+(x, z, w) \leftarrow R_1(x, y), R_2(y, z), R_3(z, w), Q_2(x, y, z)$$



	Step	Output	Side Effect
1	Solve Q_2	Q_2	Find $R_1 \bowtie R_2$
2	Solve Q_1^+	Q_1	

Cheater's Lemma

[C, Kröll; PODS 19]

If an enumeration problem can be solved with:

- Usually constant delay
- Almost no duplicates

constant number of
linear delay steps

constant
number of duplicates
per answer

Then*, it is $\in \text{Enum}\langle \text{lin}, \text{const} \rangle$

Can be solved in:
linear preprocessing,
constant delay,
no duplicates

* using polynomial space

Complexity Measures

[C, Kröll; TODS 21]

- (Instance-optimal) linear total time
 - Total time $O(n + N)$



- Linear partial time
 - Time before the i th answer is $O(n + i)$



- Linear preprocessing and constant delay
 - Time before the first answer $O(n)$
 - Time between successive answers $O(1)$



equivalent

assuming we can use polynomial space

n = input size, N = output size

Cases for UCQs

[C, Kröll; PODS 19]

All CQs are Easy

always easy

Some Easy, Some Hard

sometimes hard

sometimes easy

All CQs are Hard

sometimes hard

sometimes easy

Hard \cup Hard = Easy

[C, Kröll; PODS 19]

- Example: CQs with **isomorphic bodies**.

$$\begin{aligned} Q_1(x, z, w, u) &\leftarrow \overset{\text{hard part}}{R_1(x, y), R_2(y, z)}, R_3(z, w), R_4(w, u) \\ Q_2(x, y, z, u) &\leftarrow R_1(x, y), R_2(y, z), \underset{\text{hard part}}{R_3(z, w), R_4(w, u)} \end{aligned} \begin{array}{l} \uparrow \\ \downarrow \\ \text{Body-} \\ \text{homomorphisms} \end{array}$$

Step	Output	Side Effect
1	Solve Q_1'	$\subseteq Q_1$ Find $R_3 \bowtie R_4$
2	Solve Q_2^+	Q_2 Find $R_1 \bowtie R_2$
3	Solve Q_1^+	Q_1

Dichotomy for Unions of 2 CQs

[C, Bringmann; LMCS 25]

- Given a union of two conjunctive queries Q ,

If Q has an acyclic free-connex union extension,
 $Q \in \text{Enum}\langle \text{lin}, \text{const} \rangle$

Otherwise, $Q \notin \text{Enum}\langle \text{lin}, \text{const} \rangle^*$

* no self-joins, assuming VUTD

There exists a family of UCQs with no free-connex union extensions s.t.
VUTD hypothesis holds \Leftrightarrow no query of the family is in $\text{Enum}\langle \text{lin}, \text{const} \rangle$

Example: Intractable Union (Assuming VUTD)

[C, Bringmann; LMCS 25]

acyclic non free-connex

$$Q_1(x, y, w) \leftarrow R_1(x, z), R_2(z, y), R_3(y, w)$$

hard part

free-connex

U

$$Q_2(x, y, w) \leftarrow R_1(x, t_1), R_2(t_2, y), R_3(w, t_3)$$

Body-homomorphism

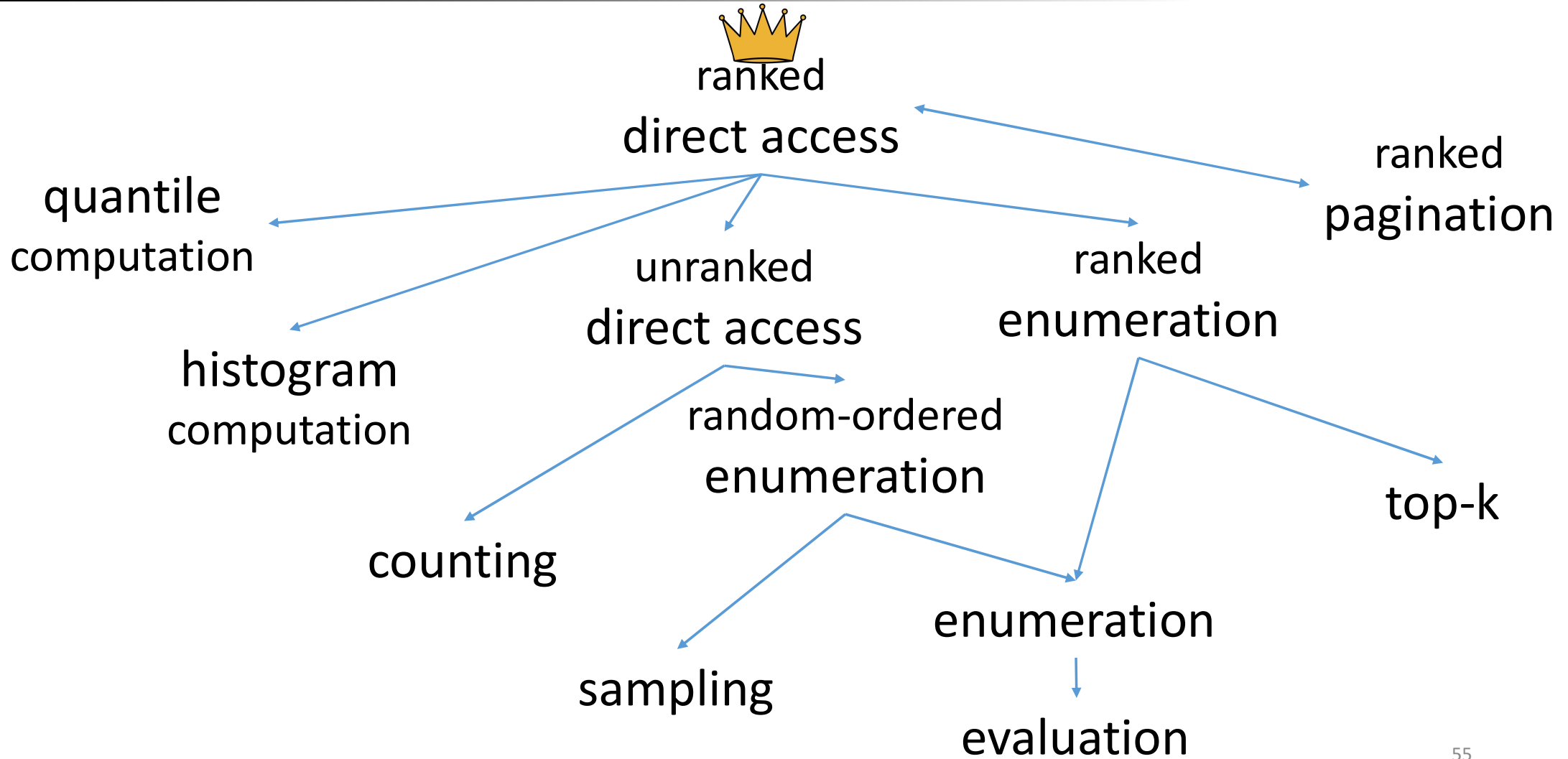
VUTD (Vertex-Unbalanced Triangle Detection) :
 $\forall \alpha \in (0, 1]$ the existence of a triangle in a tripartite graph
 with $|V_1| = n$ and $|V_2| = |V_3| = \Theta(n^\alpha)$ cannot be decided in time $O(n^{1+\alpha})$

- Q_2 can't help Q_1 : it doesn't provide z
- Construction: assigns large vertex set to z , small vertex sets to x and y , constant \perp to w
- Answers:
 - Ignore answers to Q_2 (there are $O(n^{2\alpha})$ such answers)
 - Check whether answers to Q_1 form an edge (if so, triangle detected)

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Overview of Tasks



Conclusion

- **Summary**

- Introduction (RAM model)
- Basic dichotomy (reduction from sHyperclique)
- Self-joins (tagging technique)
- Conjunctive queries (reduction from matrix multiplication)
- Unions of conjunctive queries (cheater's lemma)

- **Future**

- Dichotomy with self-joins
- Dichotomy for unions of conjunctive queries
- Connections to VUTD
- Beyond linear preprocessing time

- **More details**

- Survey: Enumeration Theory through the Lens of Database Challenges (section 5). PODS 26. Capelli, Carmeli, Conte, Kimelfeld, Pichler, and Tziavelis.
- Website: <https://nofar.carme.li/>