

Tractable Orders for Direct Access to Ranked Answers of Conjunctive Queries

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Motivation

Employees

Name	Role	Address
Jack	Junior dev	Boston
Jill	Senior dev	Brookline
Joanna	Senior dev	Braintree

Remuneration

Period	Role	Salary
11/2020	Junior dev	4000
11/2020	Senior dev	4500
12/2020	Junior dev	7000
12/2020	Senior dev	7100

Travel

Address	Cost
Boston	50
Brookline	100
Braintree	200

$Q(\text{Name, Role, Address, Period, Salary, Cost})$

← $\text{Employees}(\text{Name, Role, Address}), \text{Remuneration}(\text{Period, Role, Salary}), \text{Travel}(\text{Role, Salary})$

Query Answers

Name	Role	Address	Period	Salary	Cost
Jack	Junior dev	Boston	11/2020	4000	50
Jill	Senior dev	Brookline	11/2020	4500	100
Joanna	Senior dev	Braintree	11/2020	4500	200
Jack	Junior dev	Boston	12/2020	7000	50
...					

sort by
salary+cost

Want:

- Median
- Boxplot
- Jump to any rank
without materializing all answers

← 4th result

Outline

- Direct access: Problem & Background
- Lexicographic orders
- Sum-of-weights orders
 - Selection Problem
- Conclusion

Ranked Direct Access Problem

- Also called: random access, j th answer
- Problem: query & ordering
- Input: database instance of size n
- Algorithm:
 - Preprocessing
 - Access: given k , return answer k in the ^{sorted} list of answers (or out-of-bound)
- Our focus: quasilinear preprocessing, polylog access time

$\langle n \text{ polylog } n, \text{ polylog } n \rangle$

 (data complexity)

Answer Orderings

Lexicographic

- Ordering of free variables
e.g. [Address, Salary, Cost, Role,
Name, Period]
- or just [Address, Salary]
(partial lex. order)

Salary	w
4000	1
4500	2
7000	3

Address	w
Boston	10
Braintree	20
Brookline	30

Name	Role	Address	Period	Salary	Cost	w
Jack	Junior dev	Boston	11/2020	4000	50	11
Jack	Junior dev	Boston	12/2020	7000	50	13
Joanna	Senior dev	Braintree	11/2020	4500	200	22
Jill	Senior dev	Brookline	11/2020	4500	100	32

Equivalent to
[Address, Salary]

Sum-of-weights

- Weights to domain values of free variables
- Ranking by the sum of weights
- Can simulate any lexicographic order

Related work

- (Unranked) Enumeration [[BaganDurandGrandjean CSL'07](#)] [[Brault-Baron PhD Thesis 13](#)]
const (or polylog) delay possible \Leftrightarrow^* free-connex
- Ranked enumeration [[TAjwaniGatterbauerRiedewaldYang PVLDB'20](#)]
sum of weights (or lexicographic), log delay, free-connex
- Direct access (restricted order support)
 - via elimination order [[Brault-Baron PhD Thesis 13](#)]
 - via join tree [[CZeeviBerkholzKimelfeldSchweikardt PODS'20](#)]
 - via q-tree (dynamic settings, q-hierarchical only) [[Keppeler PhD Thesis 20](#)]

All using: data complexity, RAM model

Definitions

An acyclic CQ has a graph with:

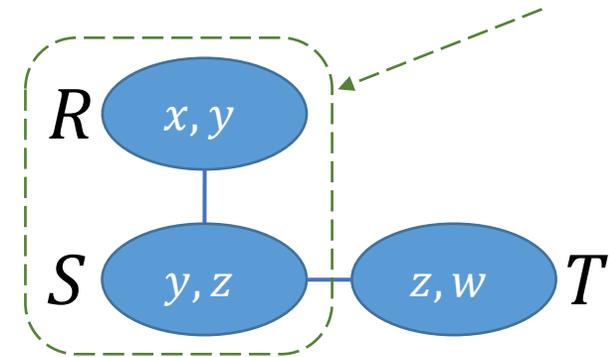
A free-connex CQ also requires:

1. a node for every atom
possibly also subsets
2. tree
3. for every variable X :
the nodes containing X
are connected
4. a subtree with
exactly the free
variables

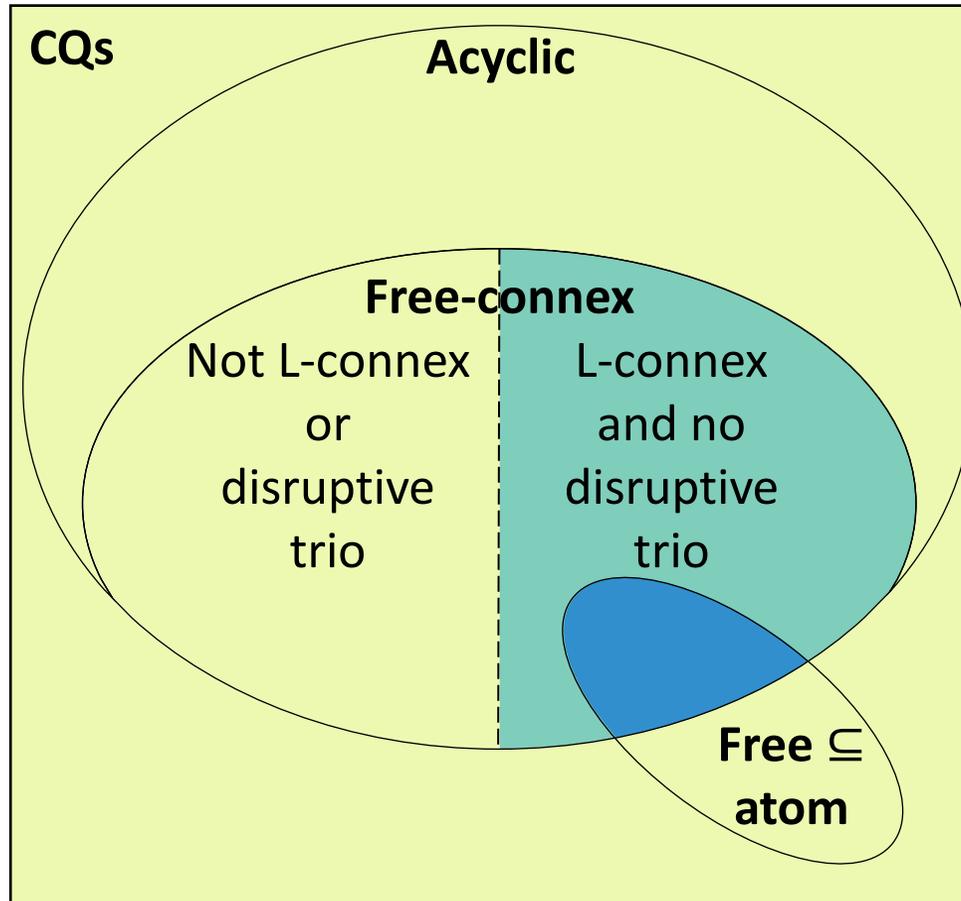
free – connex

acyclic

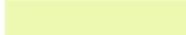
$$Q(x, y, z) \leftarrow R(x, y), S(y, z), T(z, w)$$



Overview of Direct Access



Tractable $\equiv \langle n \text{ polylog } n, \text{ polylog } n \rangle$

-  LEX, SUM intractable
-  LEX tractable, SUM intractable
-  Both tractable

Outline

- Direct access: Problem & Background
- **Lexicographic orders**
- Sum-of-weights orders
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Dichotomy

$$\checkmark Q_1(v_1, v_2, v_3) \leftarrow R(v_1, v_2), S(v_2, v_3)$$

$$\times Q_2(v_1, v_2, v_3) \leftarrow R(v_1, v_3), S(v_3, v_2)$$

Given: CQ Q , ordering L of $\text{free}(Q)$,

lexicographic access in $\langle n \text{ polylog } n, \text{polylog } n \rangle$

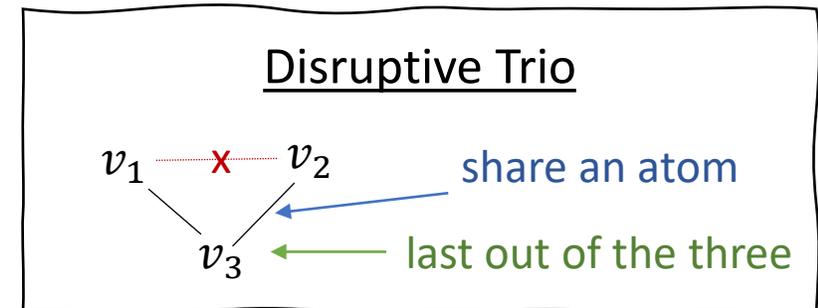
\Updownarrow^*

free-connex, no disruptive trio

* Lower bounds assume:

(1) no self-joins

(2) hardness of matrix multiplication and hyperclique detection



Partial Lexicographical Ordering

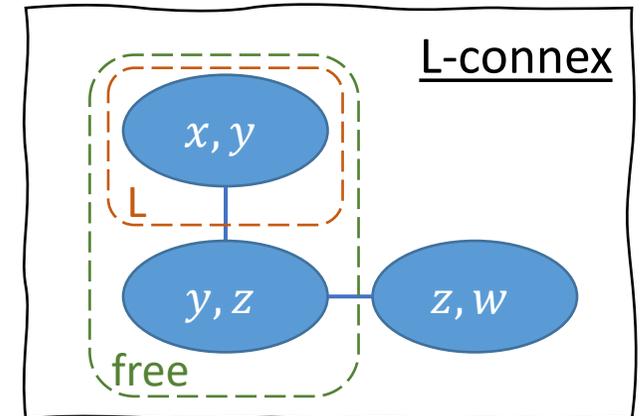
- possible \Leftrightarrow a completion for a feasible full ordering

Given: CQ Q , ordering L of ^{a subset of} $\text{free}(Q)$,
^{partial} lexicographic access in $\langle n \text{ polylog } n, \text{polylog } n \rangle$
 \updownarrow^*
^{L-connex,} free-connex, no disruptive trio

* Lower bounds assume:

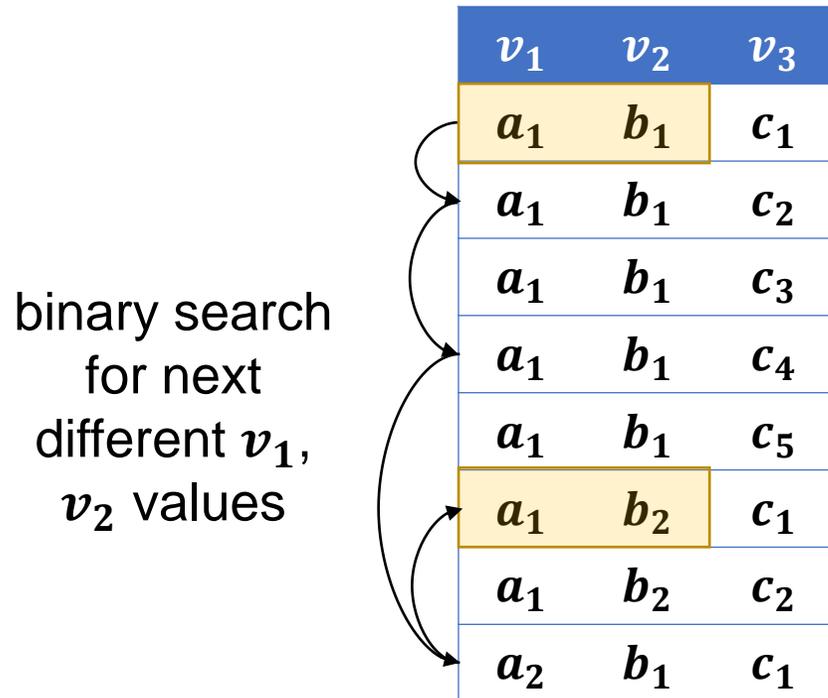
(1) no self-joins

(2) hardness of matrix multiplication and hyperclique detection



Hardness

- Assumption: Q_1 cannot be enumerated in $\langle n \text{ polylog } n, \text{polylog } n \rangle$
- Reduction:



Enumerate

$$Q_1(v_1, v_2) \leftarrow R(v_1, v_3), S(v_3, v_2)$$



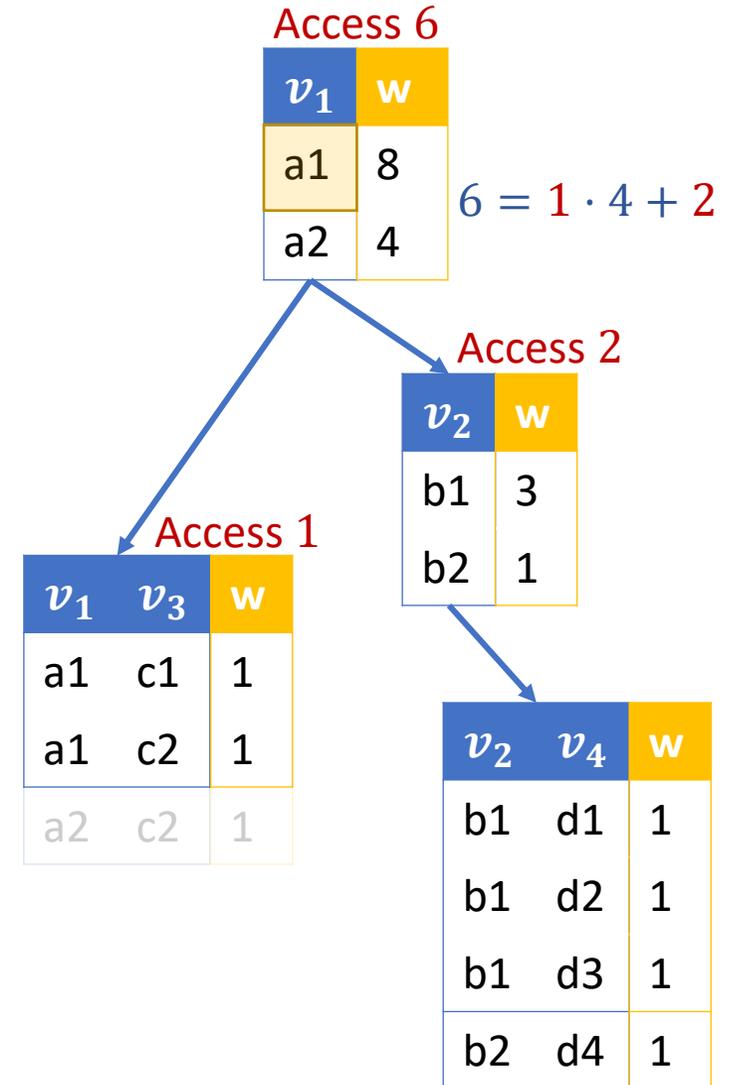
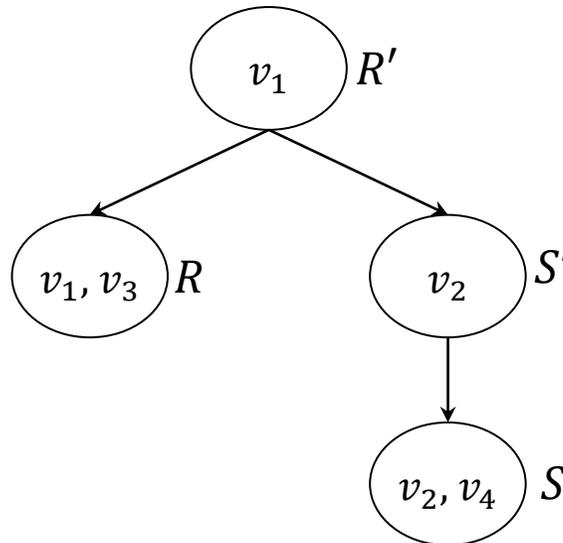
Lexicographic direct-access

$$Q_2(v_1, v_2, v_3) \leftarrow R(v_1, v_3), S(v_3, v_2)$$

- Log number of direct-access calls between answers
 - Q_1 enumeration with polylog delay, contradiction

Algorithm

- Adopt previous approach [C Zeevi Berkholz Kimelfeld Schweikardt PODS'20]
 - Free-connex to full acyclic, then use a join-tree
 - Preprocessing:
 - DP up the tree
 - computes how many answers in a subtree use each tuple
 - Access:
 - recurse down the tree
 - splits the desired index between the children

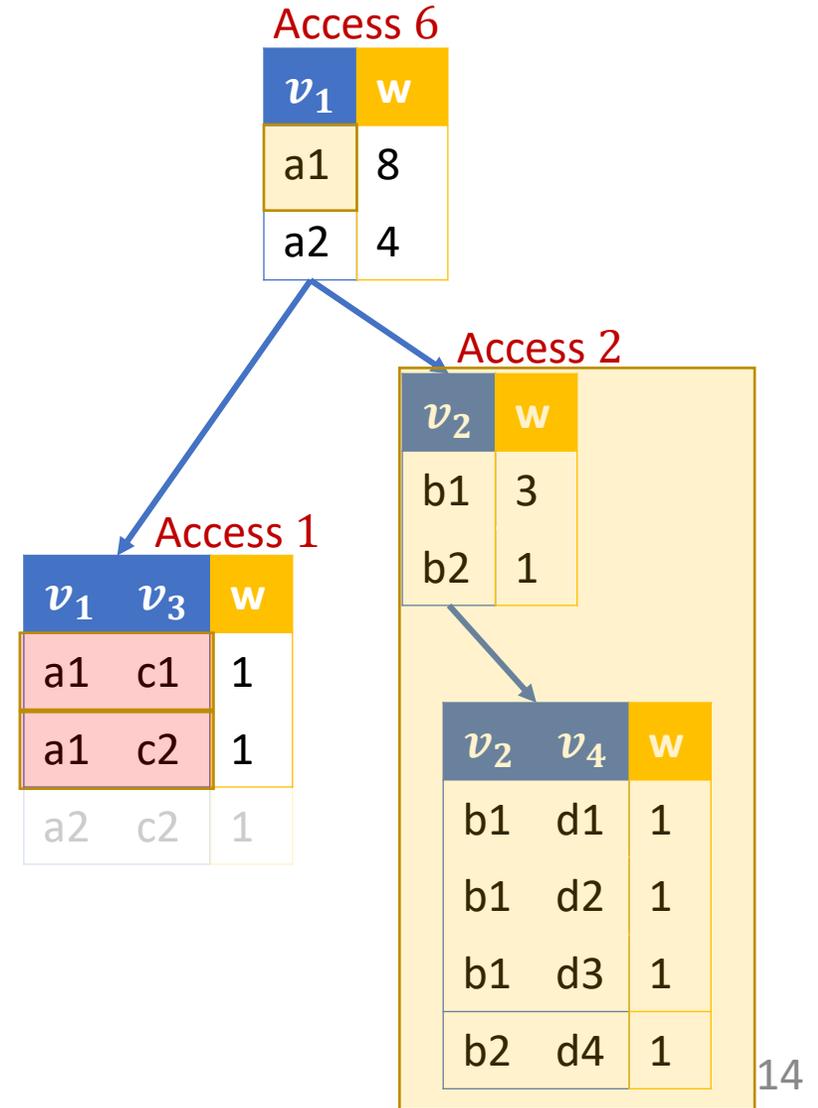


Algorithm

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Resulting order:

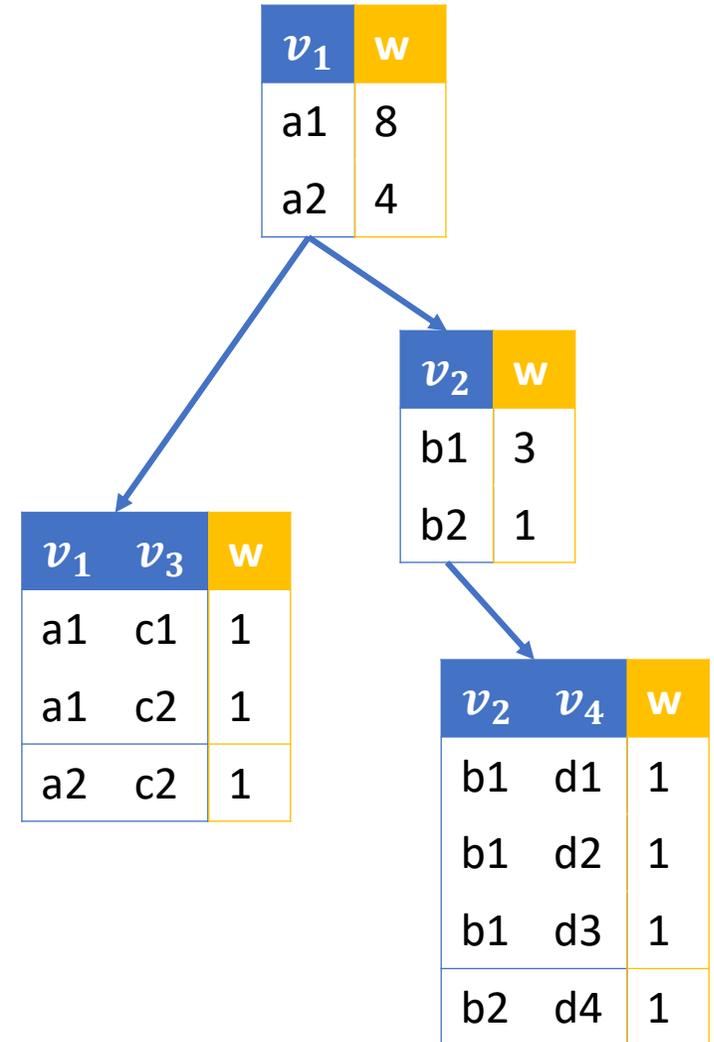
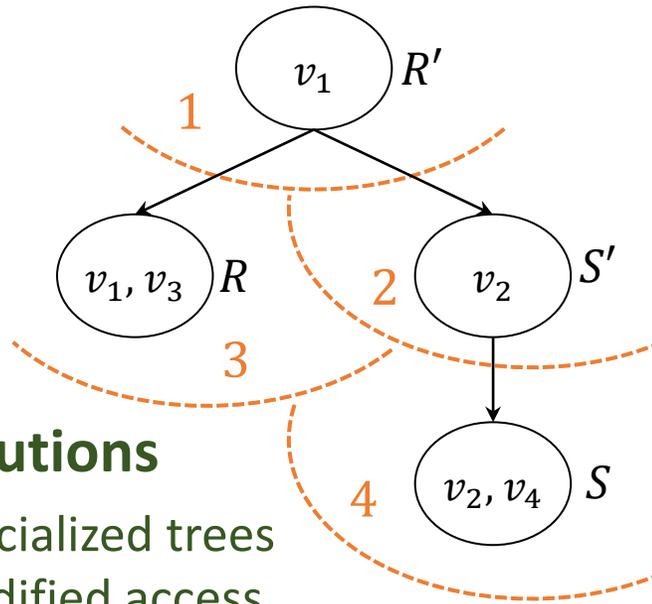
v_1	v_3	v_2	v_4
a1	c1	b1	d1
a1	c1	b1	d2
a1	c1	b1	d3
a1	c1	b2	d4
a1	c2	b1	d1
a1	c2	b1	d2
a1	c2	b1	d3
a1	c2	b2	d4
			...



Algorithm

- Adopt previous approach [C Zeevi Berkholz Kimelfeld Schweikardt PODS'20]
 - Free-connex to full acyclic, then use a join-tree
 - Preprocessing:
 - DP up the tree
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no disruptive trio \Rightarrow layered join-tree



Problems

1. Tree determines order
2. Independent branches

Solutions

1. Specialized trees
2. Modified access

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Dichotomy

Given: CQ Q ,

sum-of-weights access in $\langle n \text{ polylog } n, \text{polylog } n \rangle$



acyclic, an atom contains all free variables

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

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

* Lower bounds assume:

(1) no self-joins

(2) hardness of 3-SUM and hyperclique detection

Hardness

- Observation: Binary search finds a weight with logarithmic accesses

3SUM hypothesis

given 3 sets of integers $|A| = |B| = |C| = n$,
deciding $\exists a \in A, b \in B, c \in C$ s.t. $a + b + c = 0$
cannot be done in time $O(n^{2-\varepsilon})$ for any $\varepsilon > 0$

- Use two **independent** free variables

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

Direct access
impossible in
 $\langle n^{2-\varepsilon}, n^{1-\varepsilon} \rangle$

x	y
a_1	0
a_2	0

A

y	z
0	b_1
0	b_2

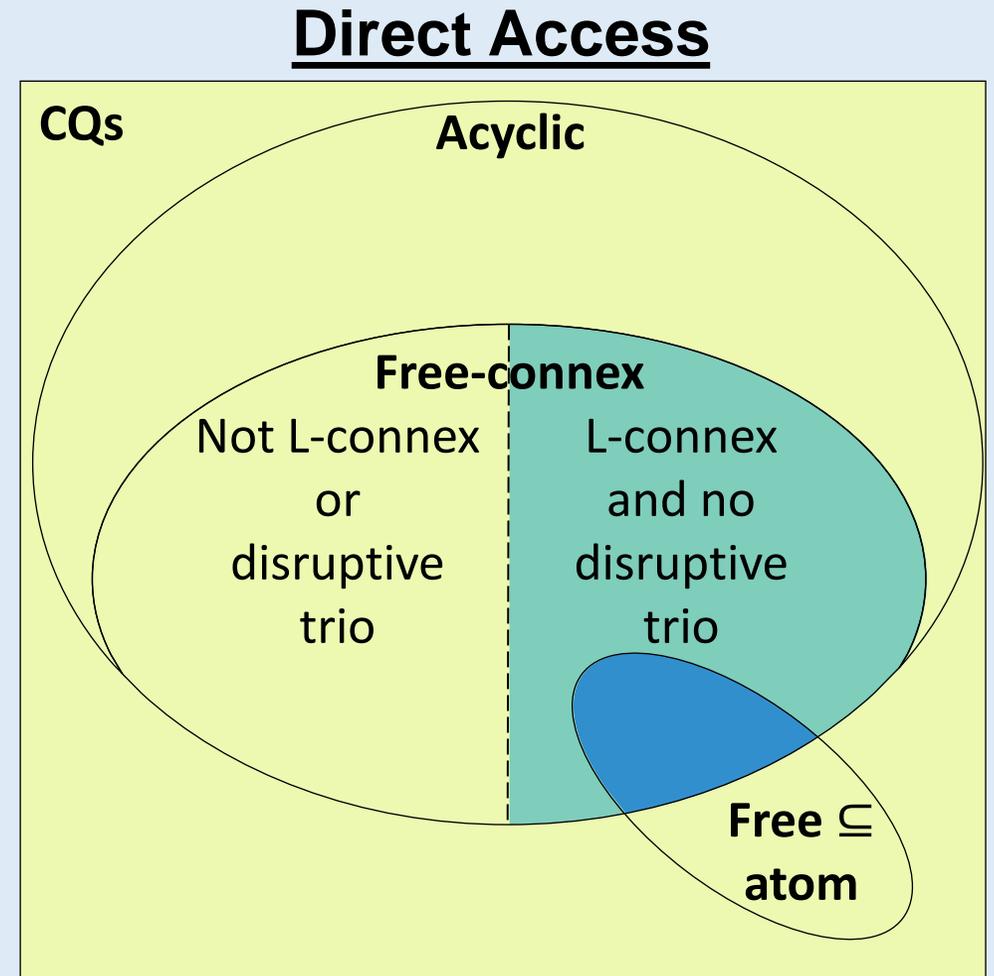
B

x	y	z	w
a_1	0	b_1	$a_1 + b_1$
a_1	0	b_2	$a_1 + b_2$
a_2	0	b_1	$a_2 + b_1$
a_2	0	b_2	$a_2 + b_2$

Binary
search
for $-c$ ($\forall c$)

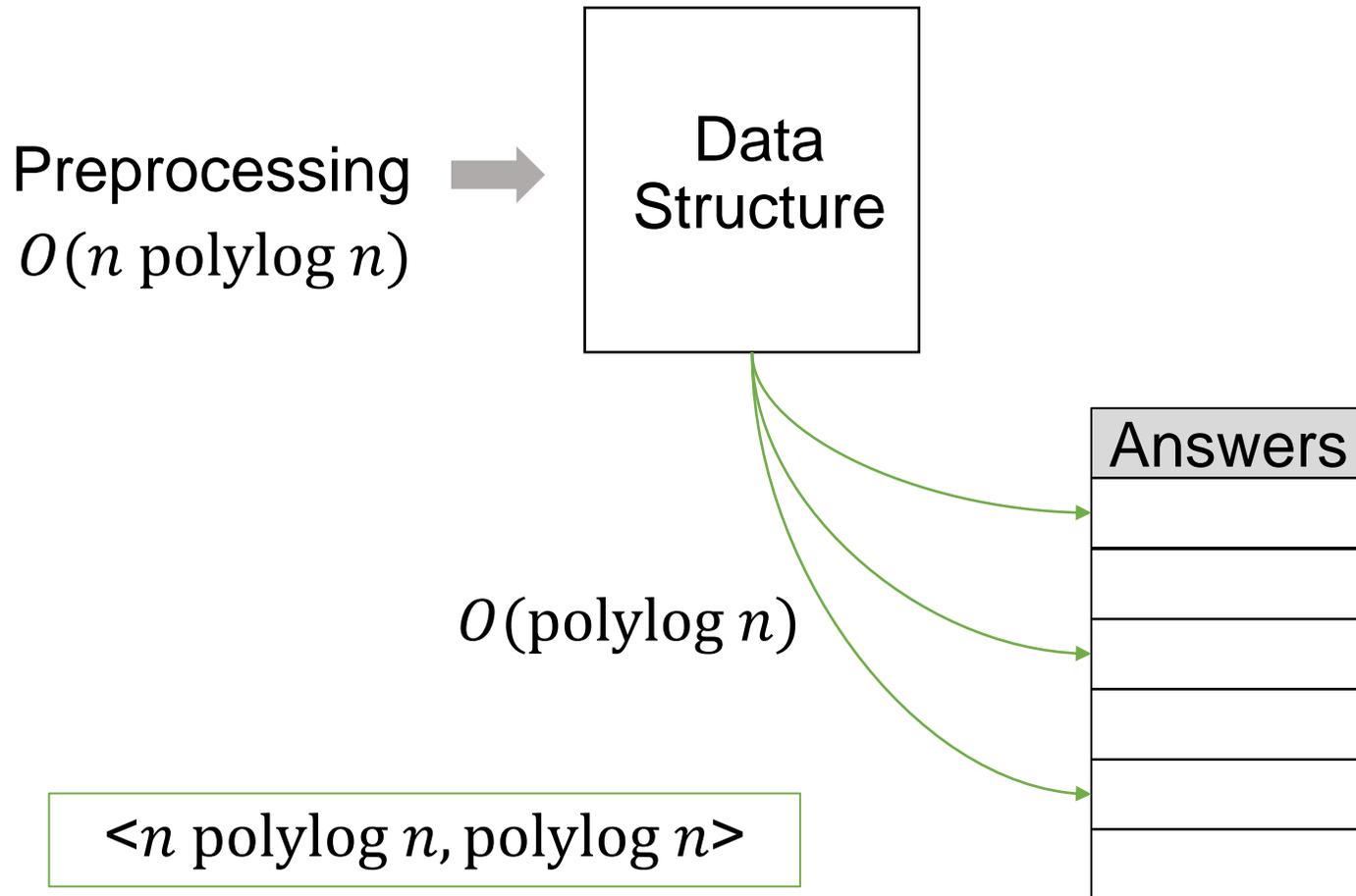
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Selection vs Direct Access

Direct Access



Selection

No Preprocessing

$O(n \text{ polylog } n)$

$\langle 1, n \text{ polylog } n \rangle$

Selection Dichotomy

Given: full CQ Q ,

sum-of-weights selection in $O(n \log n)$

\Updownarrow^* w.r.t. hyperedge containment

At most two maximal atoms

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

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

* Lower bounds assume:

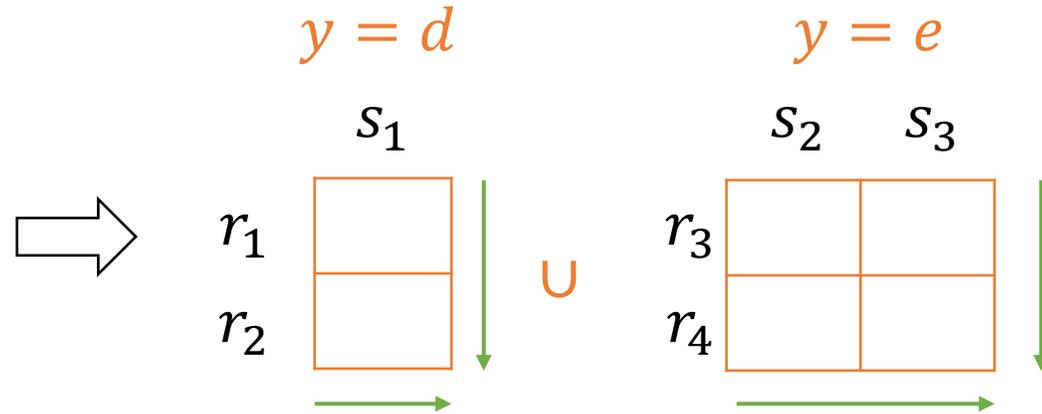
(1) no self-joins

(2) hardness of 3-SUM and hyperclique detection

Tractable Cases for Selection

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

	<i>R</i>		<i>S</i>		
	<i>x</i>	<i>y</i>	<i>y</i>	<i>z</i>	
<i>r</i> ₁	a	d	d	f	<i>s</i> ₁
<i>r</i> ₂	b	d	e	f	<i>s</i> ₂
<i>r</i> ₃	a	e	e	g	<i>s</i> ₃
<i>r</i> ₄	c	e			



Sort *R*, *S* on weights =>
Every row/column sorted

Selection on a union of sorted matrices [Frederickson
Johnson 1984]
of dimensions $m_i \times n_i$
possible in time $O(\sum \max(m_i, n_i))$

* We do not materialize the matrices, but compute the values of the cells on-the-fly

Tractable Cases for Selection (Lexicographic)

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

Lex Order $[x, z, y]$:

- **Direct access intractable** (disruptive trio)
- **Selection tractable** (as sum-of-weights)

Intractable Cases for Selection

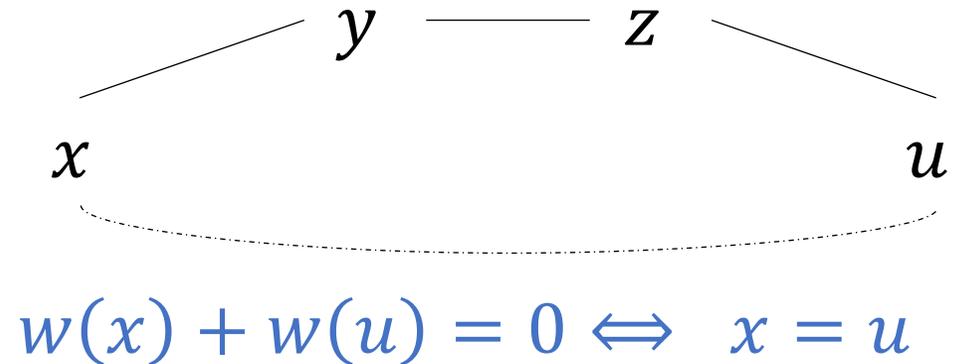
- 3-path Q_{3p} (reduction from Boolean triangle Q_{Δ})

$$Q_{\Delta}() \leftarrow R(x, y), S(y, z), T(z, x)$$



$$Q_{3p}(x, y, z) \leftarrow R(x, y), S(y, z), T(z, u)$$

Sum-of-weights Selection



- Identify answers to Q_{Δ} with $x = u$
- Set weights s.t. weight of “triangle” answers becomes 0
- Binary search to find zero weight answer

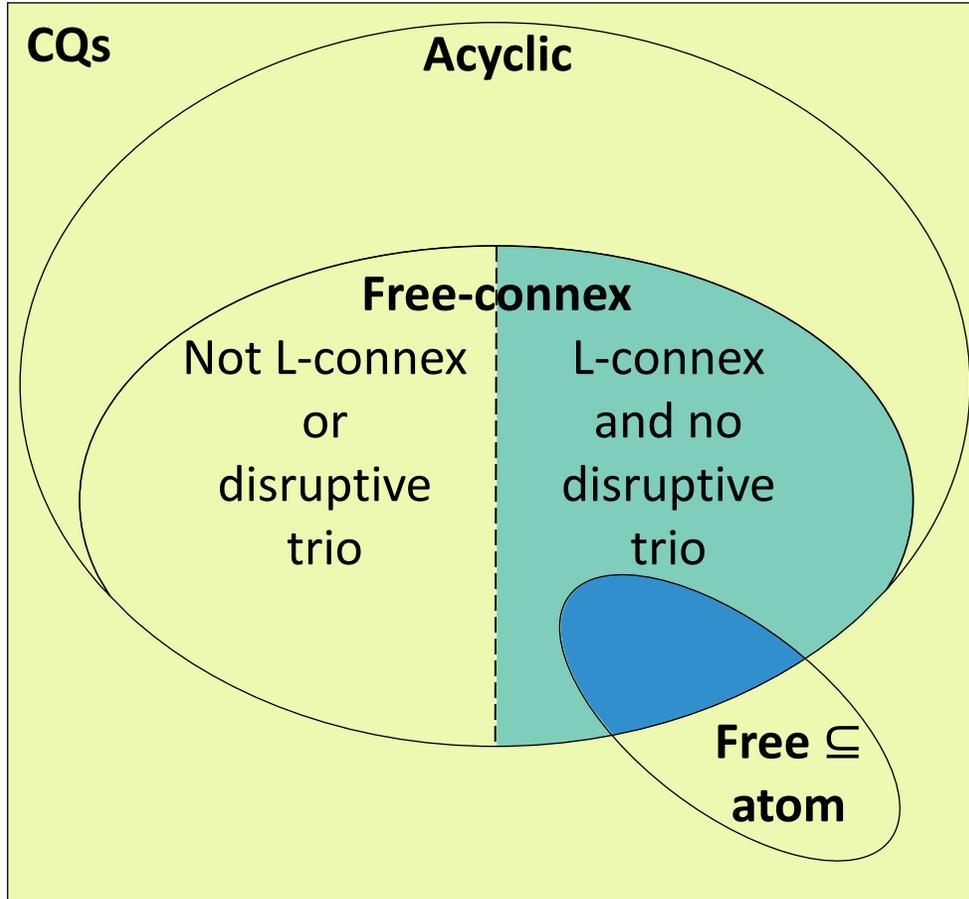
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Overview and Conclusion

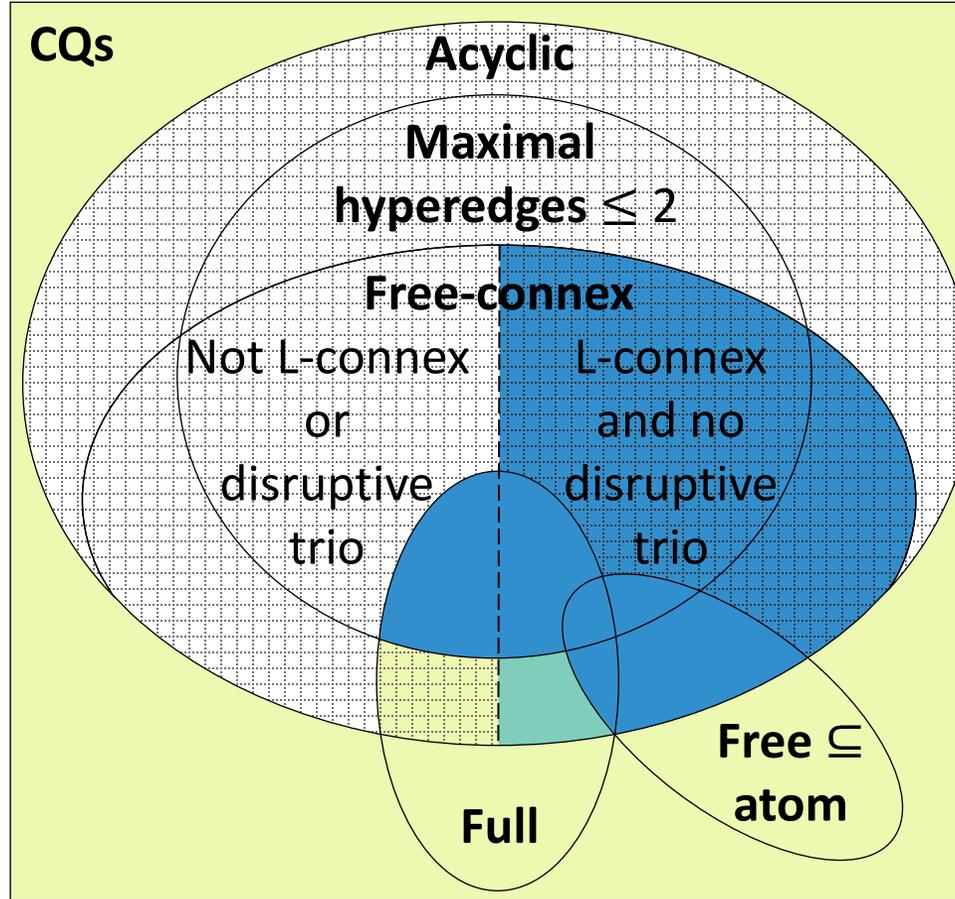
Direct Access

Tractable $\equiv \langle n \text{ polylog } n, \text{polylog } n \rangle$



Selection

Tractable $\equiv \langle 1, n \text{ polylog } n \rangle$



Explored

Both intractable

LEX tractable, SUM intractable

Both tractable

Unexplored

SUM intractable

Both unexplored

LEX tractable

* Upper bounds for direct access are $\langle \text{sorting-cost}, \log n \rangle$

* Lower bounds assume: no-self joins, hypotheses in fine-grained complexity

Thank you!