

SQL / relational algebra

SELECT

σ

PROJECT

π

JOINS

\bowtie \times

Union

\cup

Intersections

\cap

Set differences

\setminus

$\sigma_P T$

$\pi_{c_1, c_2} T$

$Q_1 \cap Q_2$

① Finish evaluating Q_1 . Say T_1

② Finish evaluating Q_2 . Say T_2

③ Calculate intersection.

Alternative approach

Use T_1 to even prune which parts of Q_2 you want to evaluate.

Prolog top/down evaluation

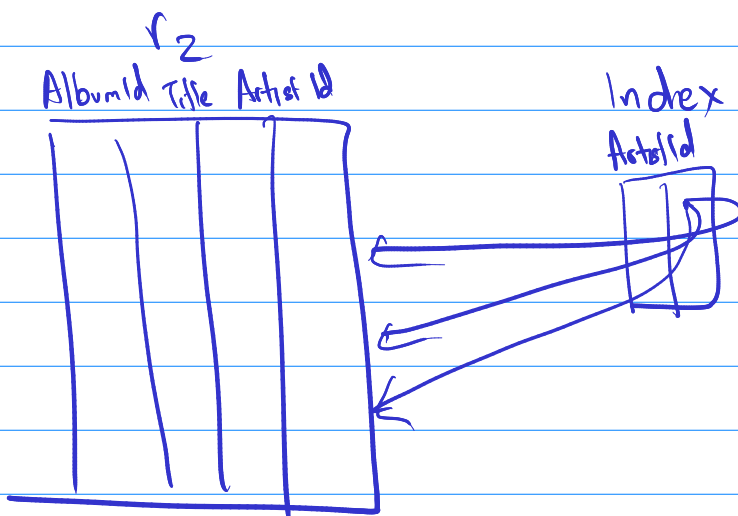
"Magic sets" algorithms

$Q_1 \bowtie Q_2$ $Q_1 \rightarrow T_1$ $Q_2 \rightarrow T_2$

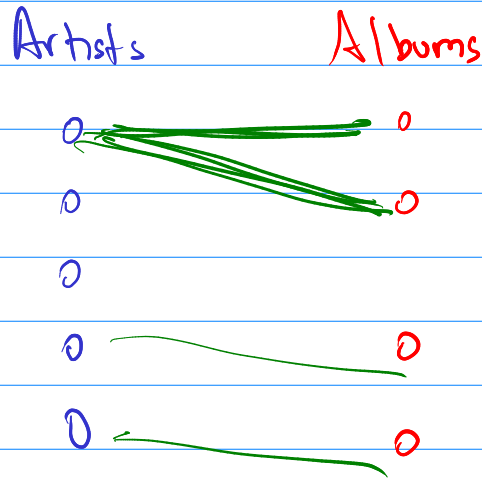
$\forall r_1 \in T_1$

\forall matching $r_2 \in T_2$

emit (r_1, r_2)



— Find all pairs of albums which were recorded by the same artist.

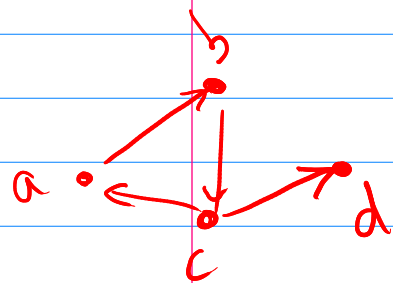


~~Q~~: Given graph G write down T_G

d: Find out if G has a triangle.

T_G
 ↑
 adjacency relation written down in table form

a	b
b	c
c	a
c	d



Alg 1: For each vertex u

For each neighbor v st. $u \rightarrow v$

For each neighbor w of v

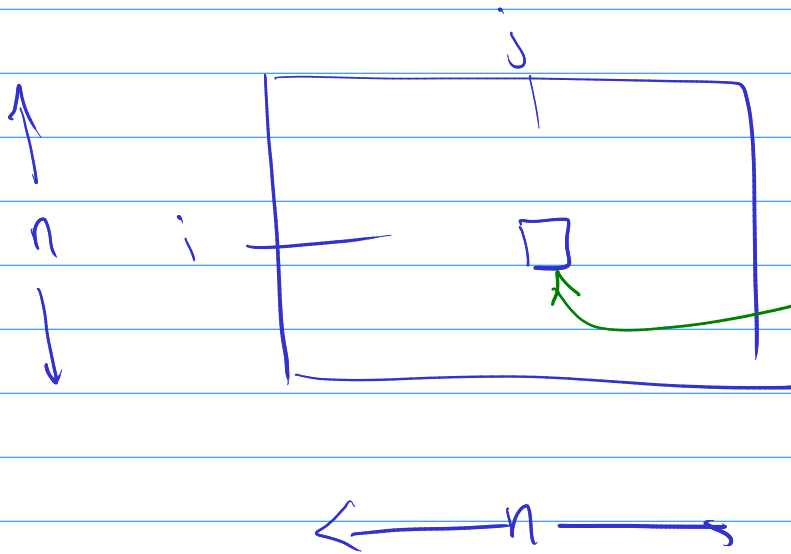
if $w \rightarrow u$, return true.

$O(n^3)$

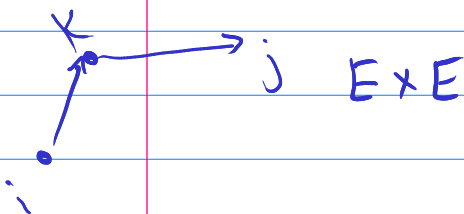
↑
number of vertices

Return false.

Alg 2: Assume G provided as its adjacency matrix E .

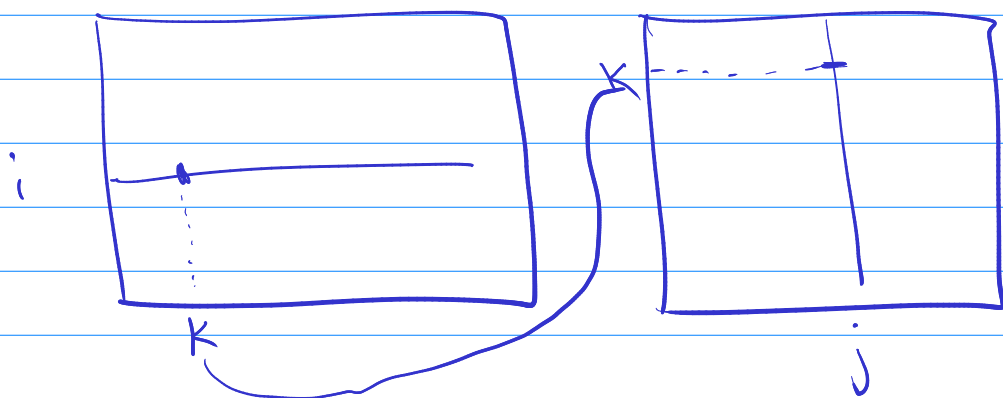


Is there an edge from $v_i \rightarrow v_j$.



$$F = E \times E$$

$$f_{ij} = \sum_k e_{ik} \cdot e_{kj} = \bigvee_k e_{ik} \wedge e_{kj}$$



F = all pairs of vertices that are two apart

$$H = \underbrace{E \times E \times E}_{O(n^3)}$$

matrix multiplication exponent

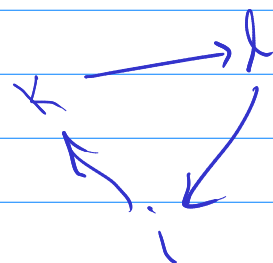
$$2 \leq \omega \leq 2.37$$

$$h_{ij} = \text{true} \iff \exists k, l$$

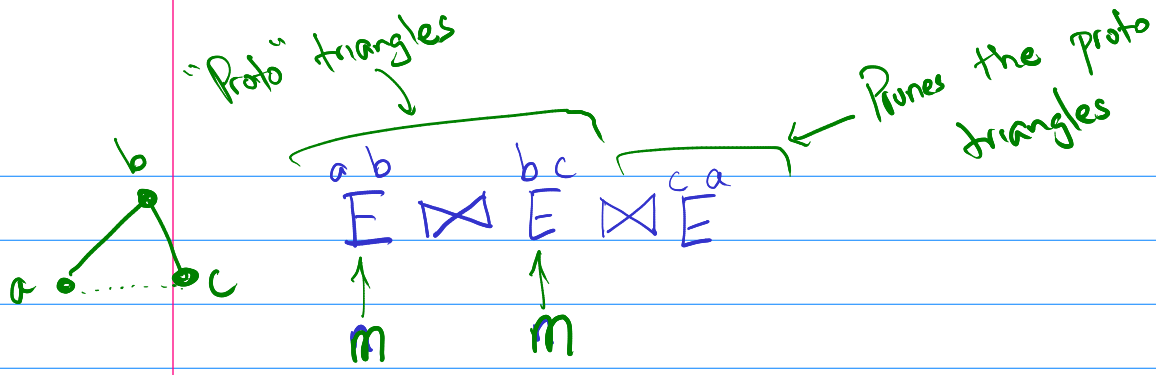
$$i \rightarrow k \rightarrow l \rightarrow j$$

$$\Rightarrow h_{ii} = \text{true} \iff \exists k, l$$

$$i \rightarrow k \rightarrow l \rightarrow i$$

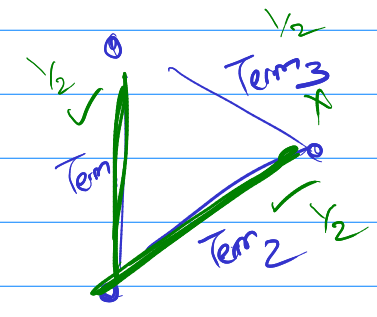
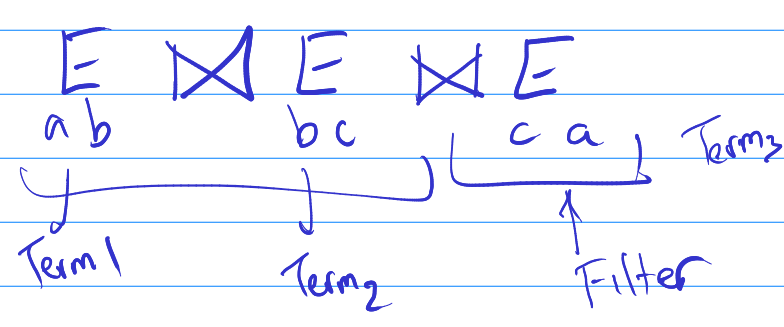


In other words: Diagonal entry $h_{ii} = \text{true}$ iff i is the corner of a triangle.



Claim: $E \otimes E \otimes E$ has at most $O(m^2)$ entries # of edges.

Question: How many triangles might a graph even have?



$$(E^1) \cdot (E^1) \cdot (E^0)$$

$$E^1 E^0 E^1 \quad E^0 E^1 E^1 \quad m^2$$

$$E^{1/2} E^{1/2} E^{1/2}$$

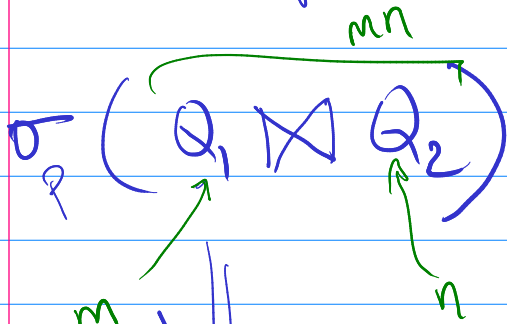
NPR: There is an algorithm which can achieve this bound

AGM: There is a family of graphs with $O(m^{3/2})$ triangles.

This bound is tight.

Two practical optimizations

Selection pushdown



When p only depends on columns in Q_1

$$(\sigma_p Q_1) \bowtie Q_2$$

Projection pushdown.

$$\pi_{c_1} (Q_1 \bowtie Q_2)$$



$$\pi_{c_1} \left(\left(\pi_{c_1, \text{col}(Q_1) \cap \text{col}(Q_2)} Q_1 \right) \bowtie Q_2 \right)$$

Invoice

Customer Id	Amount
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Salary

Person Id	Salary
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Ex: T_1

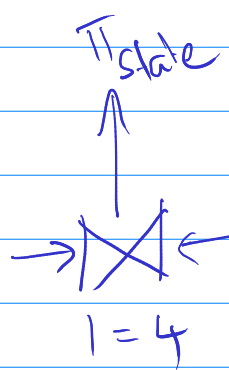
Company	State	City
Apple	CA	Cupertino
Microsoft	WA	Redmond
Oracle	TX	Austin
Twitter	CA	SF

Useless

T_2

Company	Social Network
Microsoft	LinkedIn
Microsoft	Github
Twitter	X

Useless



All states that have a social network HQ.

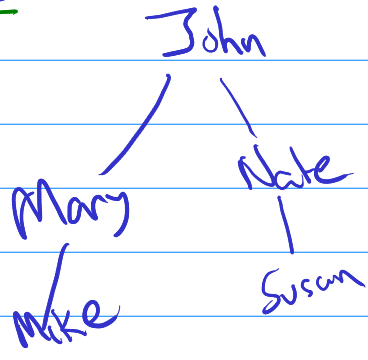
$$\pi_S \left(\pi_{CS} T_1 \quad \text{X} \quad \pi_C T_2 \right)$$

Datalog Relation algebra with recursion.

Ex: Non-recursive

All pairs of Cousins

People with the same grandparent.



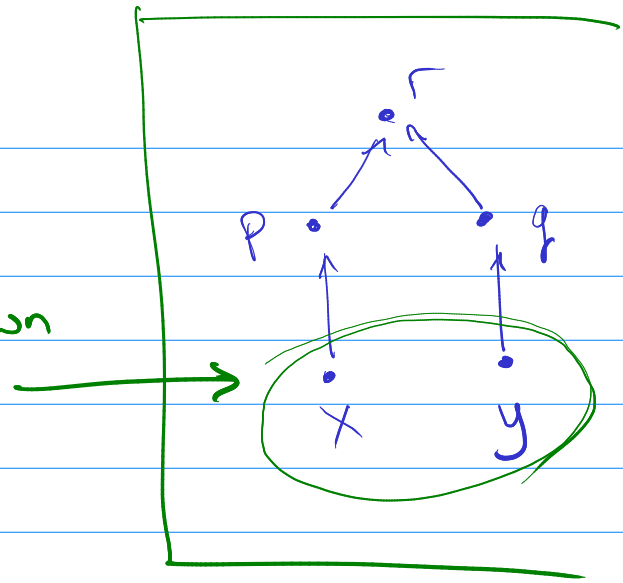
Parent	
P	Child
John	Mary
Mary	Mike
John	Nate
Nate	Susan

$\pi_{ad} \left(\text{Parent} \bowtie_{b=c} \text{Parent} \right) = \text{GP}$ "Views" Common Table Expression

$\pi_{bd} \left(\text{GP} \bowtie_{a=c} \text{GP} \right) = \text{Cousins.}$

Datalog (The big idea)

Why don't we just write down this picture?



$\text{Cousins}(x, y) :- \text{Parent}(p, x), \text{Parent}(r, p),$
 $\text{Parent}(q, y), \text{Parent}(r, q).$

② x & y
must be cousins.

① Whenever I can find five people (p, q, x, y, r) related in this way ...