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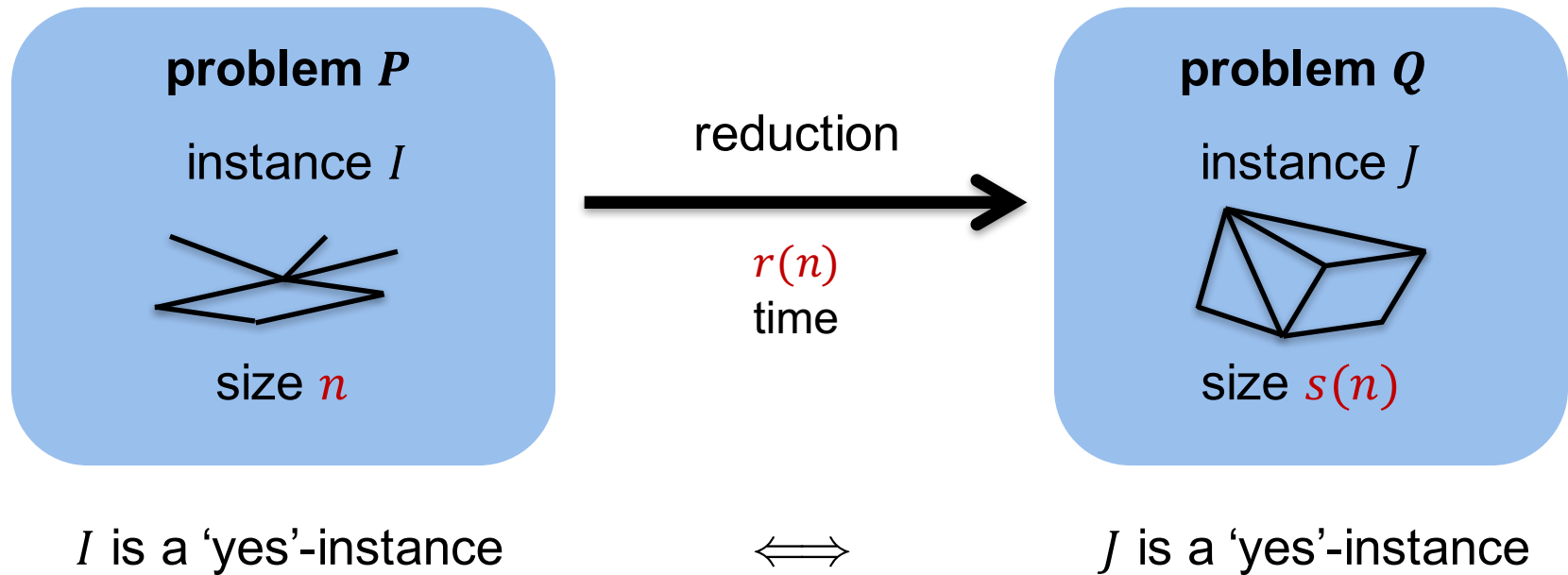
Complexity Theory of Polynomial-Time Problems

Lecture 5: Subcubic Equivalences

Karl Bringmann

Reminder: Relations = Reductions

transfer hardness of one problem to another one by reductions

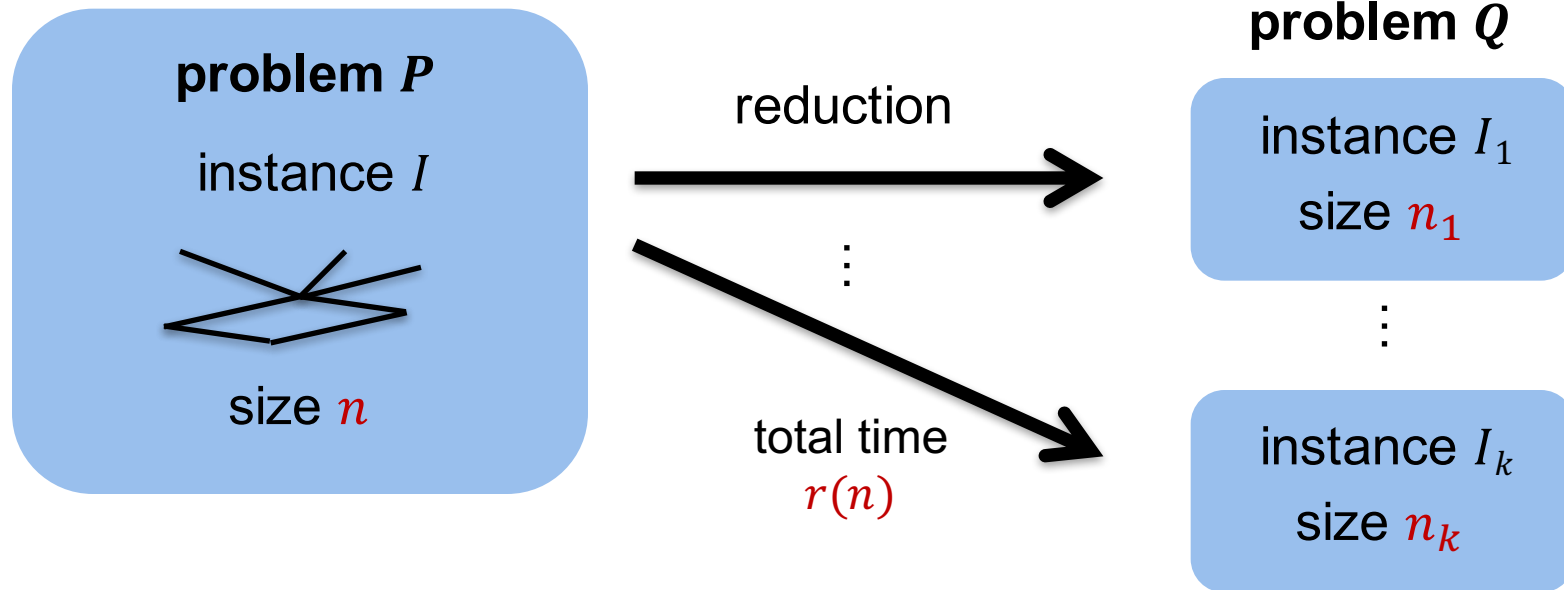


$t(n)$ algorithm for Q implies a $r(n) + t(s(n))$ algorithm for P

if P has no $r(n) + t(s(n))$ algorithm then Q has no $t(n)$ algorithm



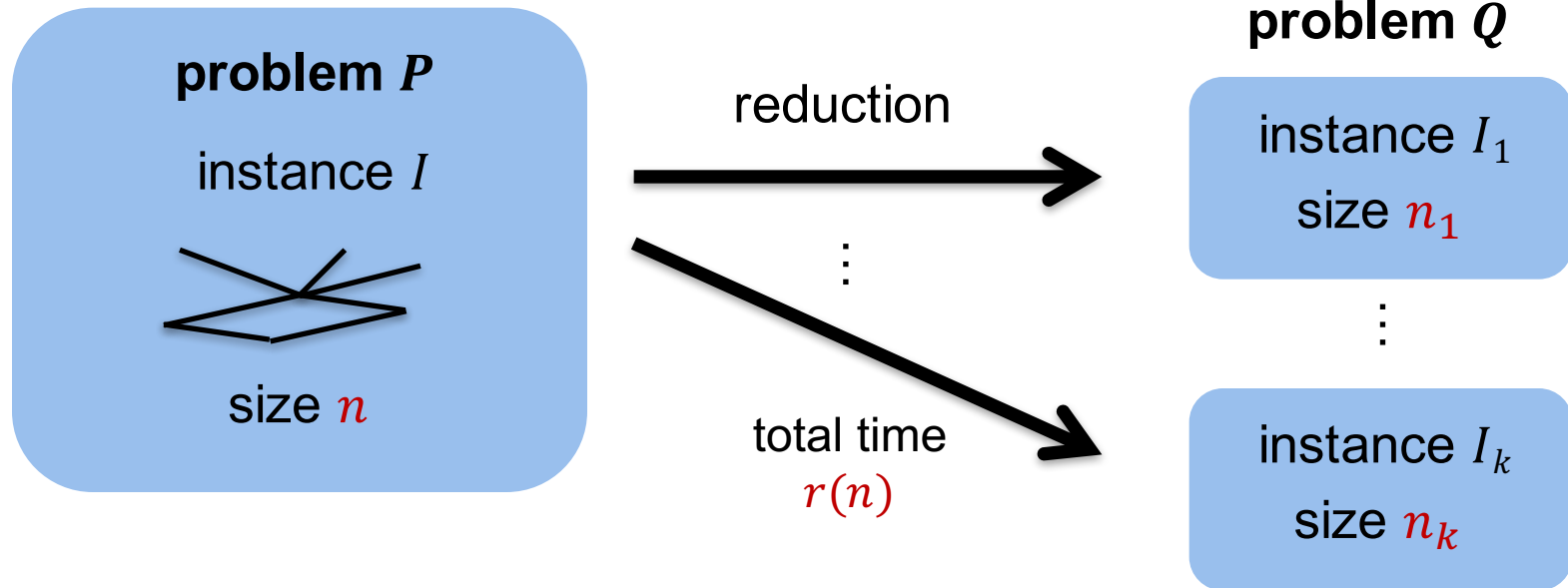
Reminder: Relations = Reductions



Subcubic Reduction

A **subcubic reduction** from P to Q is

an algorithm A for P with **oracle** access to Q s.t.:



Properties:

for any instance I , algorithm $A(I)$ correctly solves problem P on I

A runs in time $r(n) = O(n^{3-\gamma})$ for some $\gamma > 0$

for any $\varepsilon > 0$ there is a $\delta > 0$ s.t. $\sum_{i=1}^k n_i^{3-\varepsilon} \leq n^{3-\delta}$



Subcubic Reduction

A **subcubic reduction** from P to Q is
an algorithm A for P with **oracle** access to Q with:

A subcubic reduction implies:

If Q has an $O(n^{3-\alpha})$ algorithm for some $\alpha > 0$,
then P has an $O(n^{3-\beta})$ algorithm for some $\beta > 0$

Properties:

for any instance I , algorithm $A(I)$ correctly solves problem P on I

A runs in time $r(n) = O(n^{3-\gamma})$ for some $\gamma > 0$

for any $\varepsilon > 0$ there is a $\delta > 0$ s.t. $\sum_{i=1}^k n_i^{3-\varepsilon} \leq n^{3-\delta}$



Subcubic Reduction

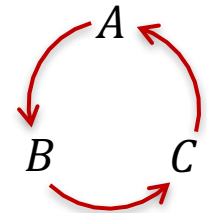
subcubic reduction: write $P \leq Q$

subcubic equivalent: write $P \equiv Q$ if $P \leq Q$ and $Q \leq P$

Transitivity: (Exercise)

For problems A, B, C with $A \leq B$ and $B \leq C$ we have $A \leq C$.

In particular: If $A \leq B$ and $B \leq C$ and $C \leq A$
then A, B, C are subcubic equivalent.



Lemma: (without proof)

If $A \leq B$ and B is in time $O\left(n^3 / 2^{\Omega(\log n)^{1/2}}\right)$
then A is in time $O\left(n^3 / 2^{\Omega(\log n)^{1/2}}\right)$.



Reminder

All-Pairs-Shortest-Paths (APSP):

given a weighted directed graph G , compute the (length of the) **shortest path between any pair** of vertices

each edge has a weight in $\{1, \dots, n^c\}$

Floyd-Warshall'62: $O(n^3)$

...

Williams'14: $O\left(n^3 / 2^{\Omega(\log n)^{1/2}}\right)$

Conjecture: for any $\varepsilon > 0$ APSP has no $O(n^{3-\varepsilon})$ algorithm

there exists $c > 0$ such that



Reminder

Min-Plus Matrix Product:

each entry in $\{1, \dots, n^c, \infty\}$

given $n_1 \times n_2$ -matrix A and $n_2 \times n_3$ -matrix B , define their min-plus product as the $n_1 \times n_3$ -matrix C with

$$C_{i,j} = \min_{1 \leq k \leq n_2} A_{i,k} + B_{k,j}$$

from definition: $O(n^3)$ (if $n = n_1 = n_2 = n_3$)

Conjecture: for any $\varepsilon > 0$ there is no $O(n^{3-\varepsilon})$ algorithm

there exists $c > 0$ such that



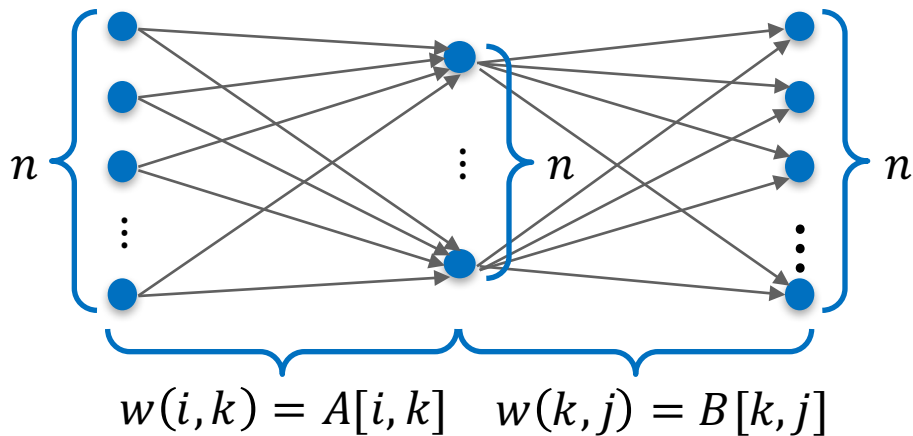
Reminder

Thm:

If APSP has a $T(n)$ algorithm then Min-Plus Product has an $O(T(n) + n^2)$ algorithm.

Thm:

If Min-Plus Product has a $T(n)$ algorithm then APSP has an $O((T(n) + n^2) \log n)$ algorithm.



Consider adjacency matrix A of G

Add selfloops with cost 0: $A + I$

Square $\lceil \log n \rceil$ times using Min-Plus Product:

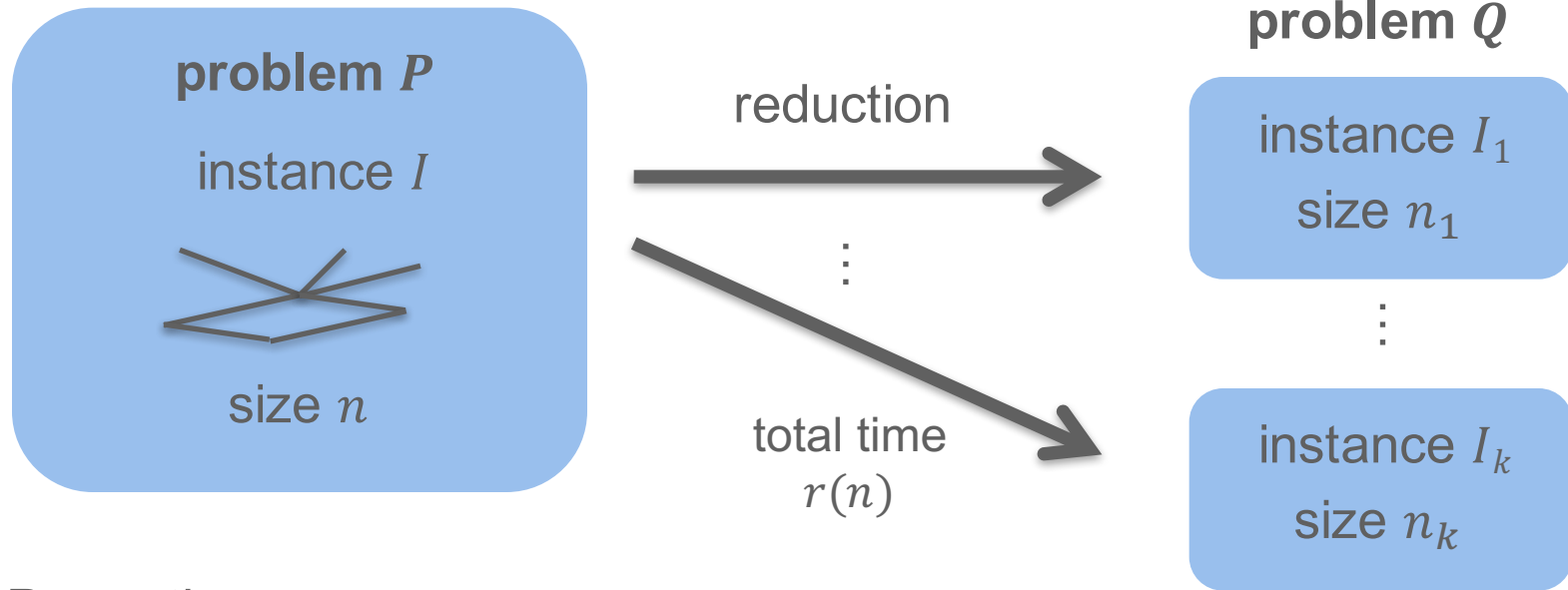
$$B := (A + I)^{2^{\lceil \log n \rceil}}$$

Then $B_{i,j}$ is the length of the shortest path from i to j

Subcubic Reduction

A **subcubic reduction** from P to Q is

an algorithm A for P with **oracle** access to Q with:



Properties:

for any instance I , algorithm $A(I)$ correctly solves problem P on I

A runs in time $r(n) = O(n^{3-\gamma})$ for some $\gamma > 0$

for any $\varepsilon > 0$ there is a $\delta > 0$ s.t. $\sum_{i=1}^k n_i^{3-\varepsilon} \leq n^{3-\delta}$



Subcubic Equivalences

Thm:

If APSP has a $T(n)$ algorithm then Min-Plus Product has an $O(T(n))$ algorithm.

Thm:

If Min-Plus Product has a $T(n)$ algorithm then APSP has an $O(T(n) \log n)$ algorithm.

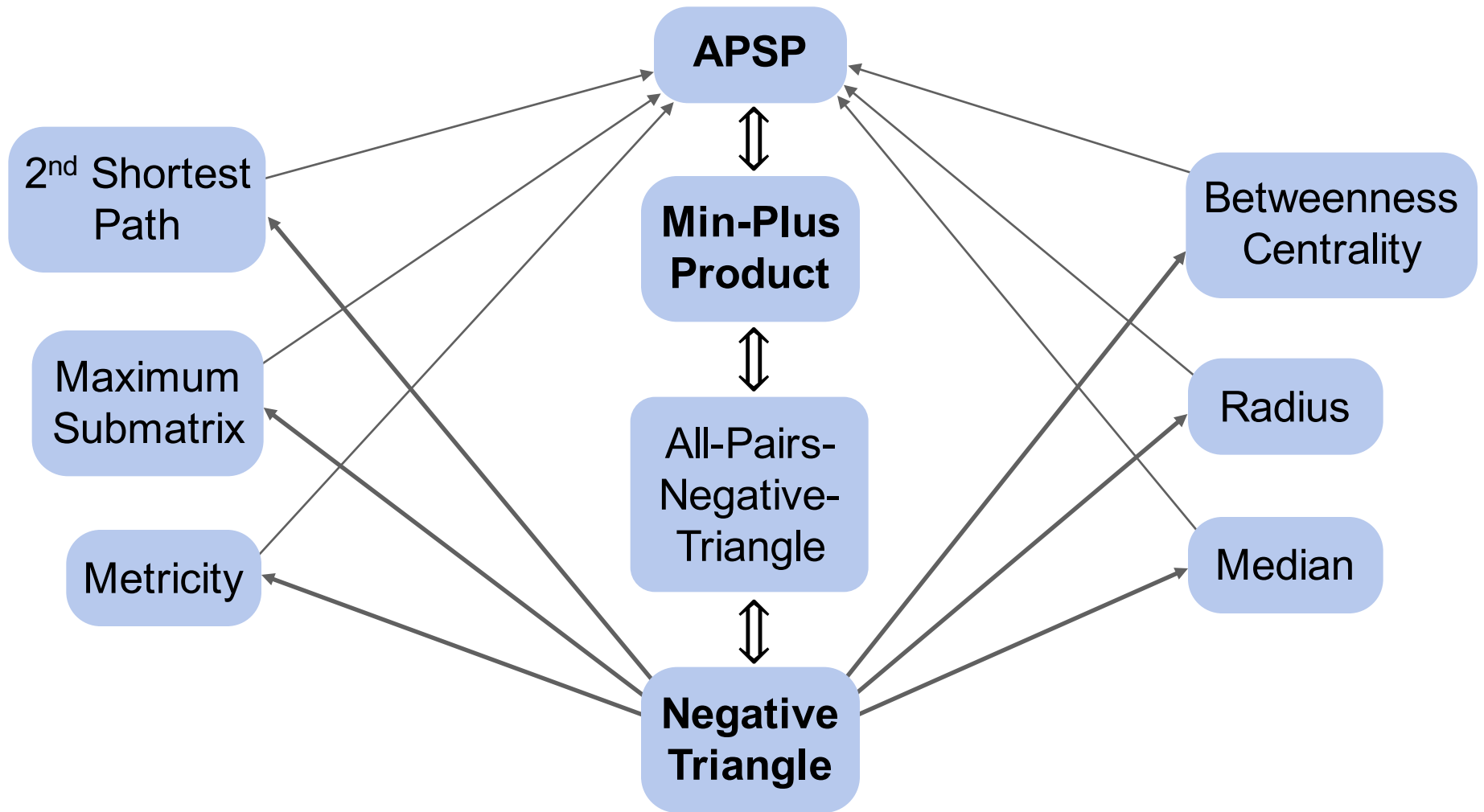
APSP and Min-Plus Product are **subcubic equivalent**

Cor: APSP has an $O(n^{3-\varepsilon})$ algorithm for some $\varepsilon > 0$ if and only if Min-Plus Product has an $O(n^{3-\delta})$ algorithm for some $\delta > 0$

Cor: Min-Plus Product is in time $O\left(n^3 / 2^{\Omega(\log n)^{1/2}}\right)$



Subcubic Equivalences



[Vassilevska-Williams, Williams' 10]

[Abboud, Grandoni, Vassilevska-Williams' 15]



Triangle Problems

Negative Triangle

each edge has a weight in $\{-n^c, \dots, n^c\}$

Given a weighted directed graph G

Decide whether **there are vertices i, j, k** such that

$$w(j, i) + w(i, k) + w(k, j) < 0$$

from definition: $O(n^3)$

no $O(n^{3-\varepsilon})$ algorithm known (which works for all $c > 0$)

Intermediate problem:

All-Pairs-Negative-Triangle

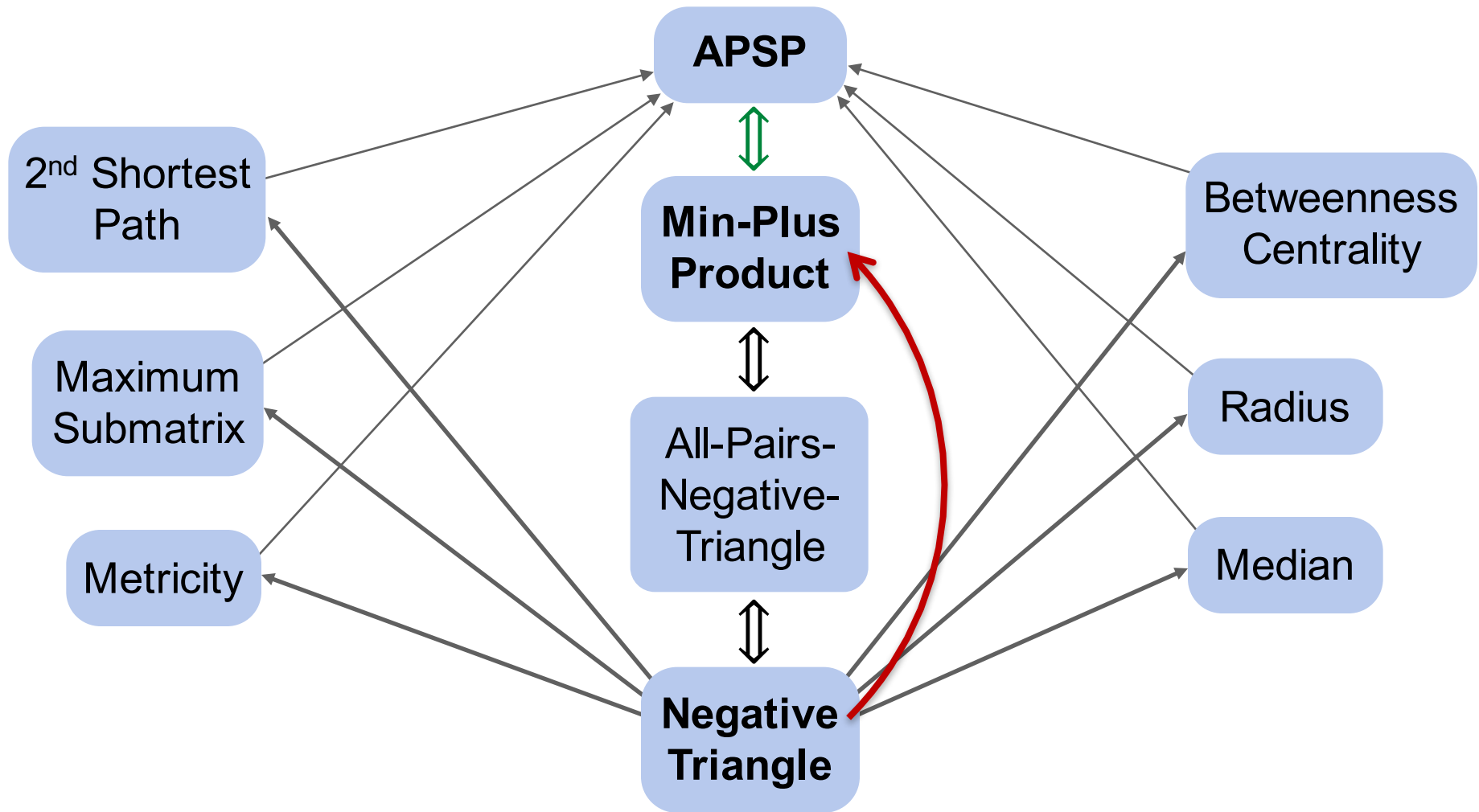
Given a weighted directed graph G with vertex set $V = I \cup J \cup K$

Decide **for every $i \in I, j \in J$ whether there is a vertex $k \in K$** s.t.

$$w(j, i) + w(i, k) + w(k, j) < 0$$



Subcubic Equivalences



[Vassilevska-Williams, Williams' 10]

[Abboud, Grandoni, Vassilevska-Williams' 15]



Neg-Triangle to Min-Plus-Product

Given a weighted directed graph G on vertex set $\{1, \dots, n\}$

Adjacency matrix A :

$A_{i,j}$ = weight of edge (i, j) , or ∞ if the edge does not exist

Min-Plus
Product

Negative
Triangle

1. Compute Min-Plus Product $B := A * A$:

$$B_{i,j} = \min_k A_{i,k} + A_{k,j}$$

A :

3	1	∞	∞
∞	∞	4	∞
1	5	∞	2
2	∞	7	1

2. Compute $\min_{i,j} A_{j,i} + B_{i,j}$

this equals $\min_{i,j,k} A_{j,i} + A_{i,k} + A_{k,j}$

i.e. the smallest weight of any triangle

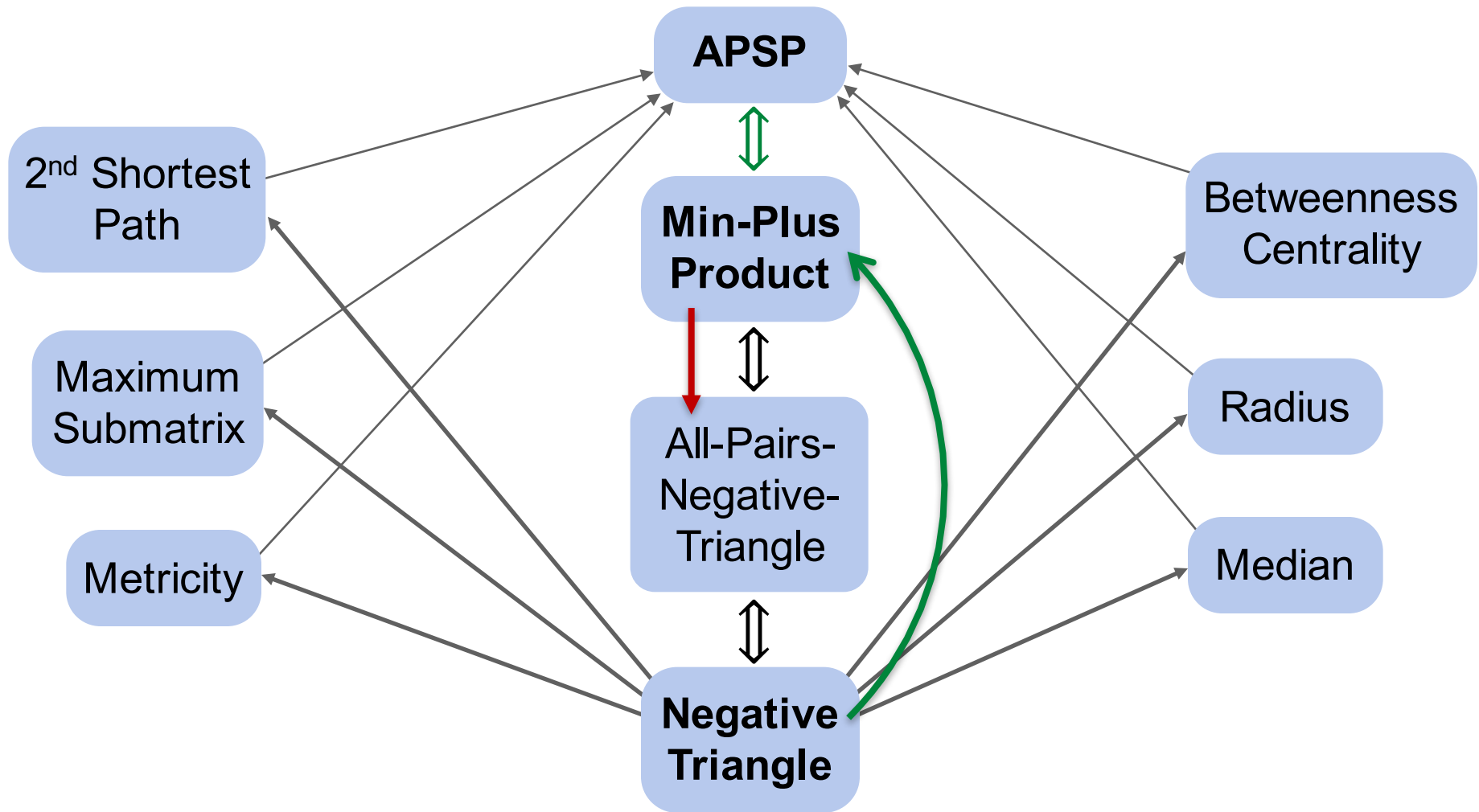
thus we solved Negative Triangle

Running Time: $T_{\text{NegTriangle}}(n) \leq T_{\text{MinPlus}}(n) + O(n^2)$

→ subcubic reduction



Subcubic Equivalences



[Vassilevska-Williams, Williams' 10]

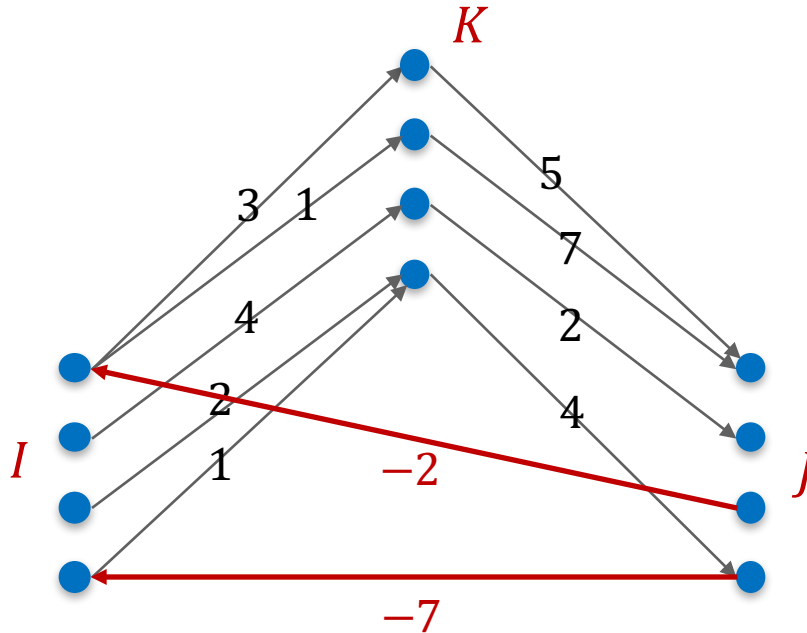
[Abboud, Grandoni, Vassilevska-Williams' 15]



Min-Plus to All-Pairs-Neg-Triangle

$3 \ 1 \ \infty \ \infty$
 $\infty \ \infty \ 4 \ \infty$
 $\infty \ \infty \ \infty \ 2$
 $\infty \ \infty \ \infty \ 1$

A



$5 \ \infty \ \infty \ \infty$
 $7 \ \infty \ \infty \ \infty$
 $\infty \ 2 \ \infty \ \infty$
 $\infty \ \infty \ \infty \ 4$

B

Min-Plus Product

All-Pairs-Negative-Triangle

$n = 4$ in the picture

Add all edges from J to I with (carefully chosen) weights $w(j, i)$

Run All-Pairs-Negative-Triangle algorithm

Result: for all i, j , is there a k such that $w(j, i) + w(i, k) + w(k, j) < 0$?

$$\Leftrightarrow w(i, k) + w(k, j) < -w(j, i)$$

WANTED: Min-Plus: for all i, j : $\min_k w(i, k) + w(k, j)$

= minimum number z s.t. there is a k s.t. $w(i, k) + w(k, j) < z + 1$



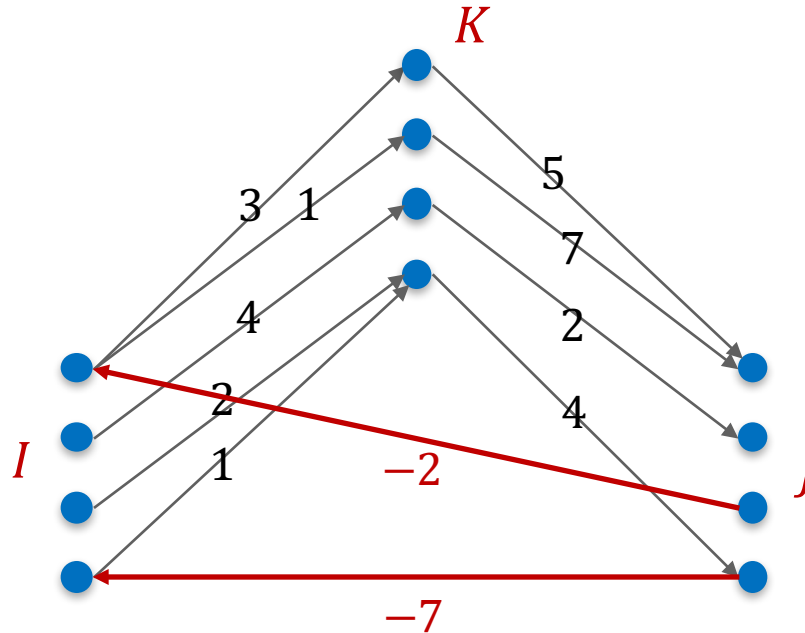
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binary search via $w(j, i)$! **simultaneous** for all i, j !

Min-Plus to All-Pairs-Neg-Triangle

3	1	∞	∞
∞	∞	4	∞
∞	∞	∞	2
∞	∞	∞	1

A



5	∞	∞	∞
7	∞	∞	∞
∞	2	∞	∞
∞	∞	∞	4

B

$n = 4$ in the picture

Min-Plus Product

All-Pairs-Negative-Triangle

binary search via $w(j, i)$! **simultaneous** for all i, j !

need that all (finite) weights are in $\{-n^c, \dots, n^c\}$

each entry of Min-Plus Product is in $\{-2n^c, \dots, 2n^c, \infty\}$

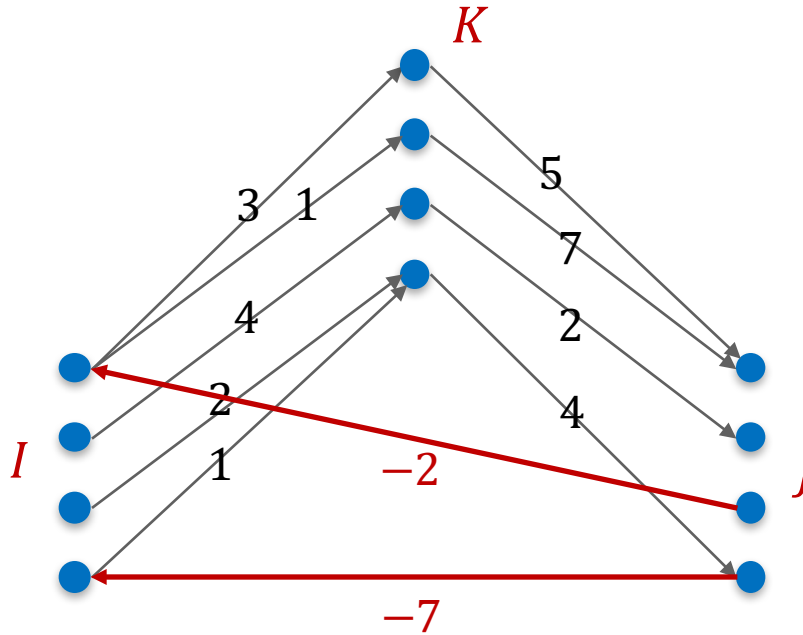
binary search takes $\log_2(4n^c + 1) = O(\log n)$ steps



Min-Plus to All-Pairs-Neg-Triangle

$3 \ 1 \ \infty \ \infty$
 $\infty \ \infty \ 4 \ \infty$
 $\infty \ \infty \ \infty \ 2$
 $\infty \ \infty \ \infty \ 1$

A



$5 \ \infty \ \infty \ \infty$
 $7 \ \infty \ \infty \ \infty$
 $\infty \ 2 \ \infty \ \infty$
 $\infty \ \infty \ \infty \ 4$

B

Min-Plus Product

All-Pairs-Negative-Triangle

$n = 4$ in the picture

binary search via $w(j, i)$! **simultaneous** for all i, j !

for all i, j : initialize $m(i, j) := -2n^c$ and $M(i, j) := 2n^c$

repeat $\log(4n^c)$ times:

for all i, j : set $w(j, i) := -[(m(i, j) + M(i, j))/2]$

compute All-Pairs-Negative-Triangle

for all i, j : if i, j is in negative triangle: $M(i, j) := -w(j, i) - 1$

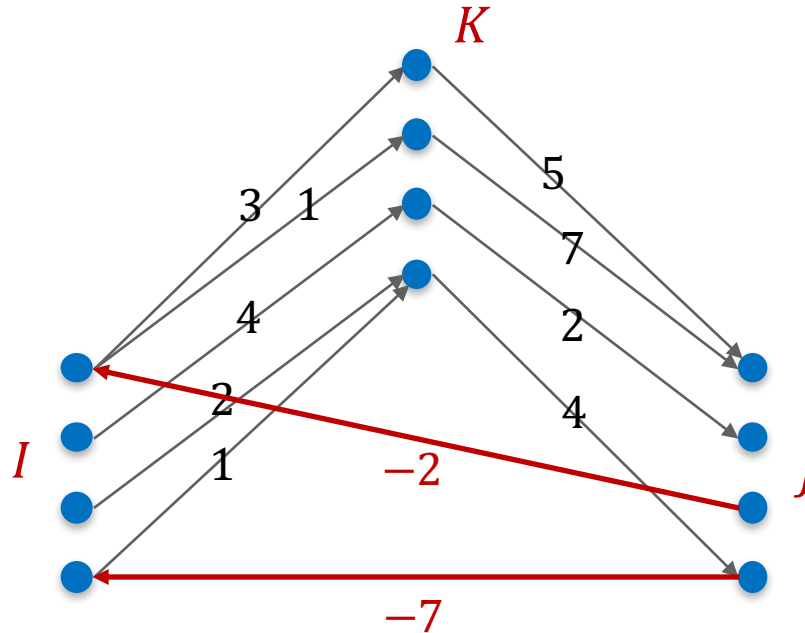
otherwise: $m(i, j) := -w(j, i)$



Min-Plus to All-Pairs-Neg-Triangle

3	1	∞	∞
∞	∞	4	∞
∞	∞	∞	2
∞	∞	∞	1

A



5	∞	∞	∞
7	∞	∞	∞
∞	2	∞	∞
∞	∞	∞	4

B

$n = 4$ in the picture

Min-Plus Product

All-Pairs-Negative-Triangle

binary search takes $\log_2(4n^c + 1) = O(\log n)$ steps

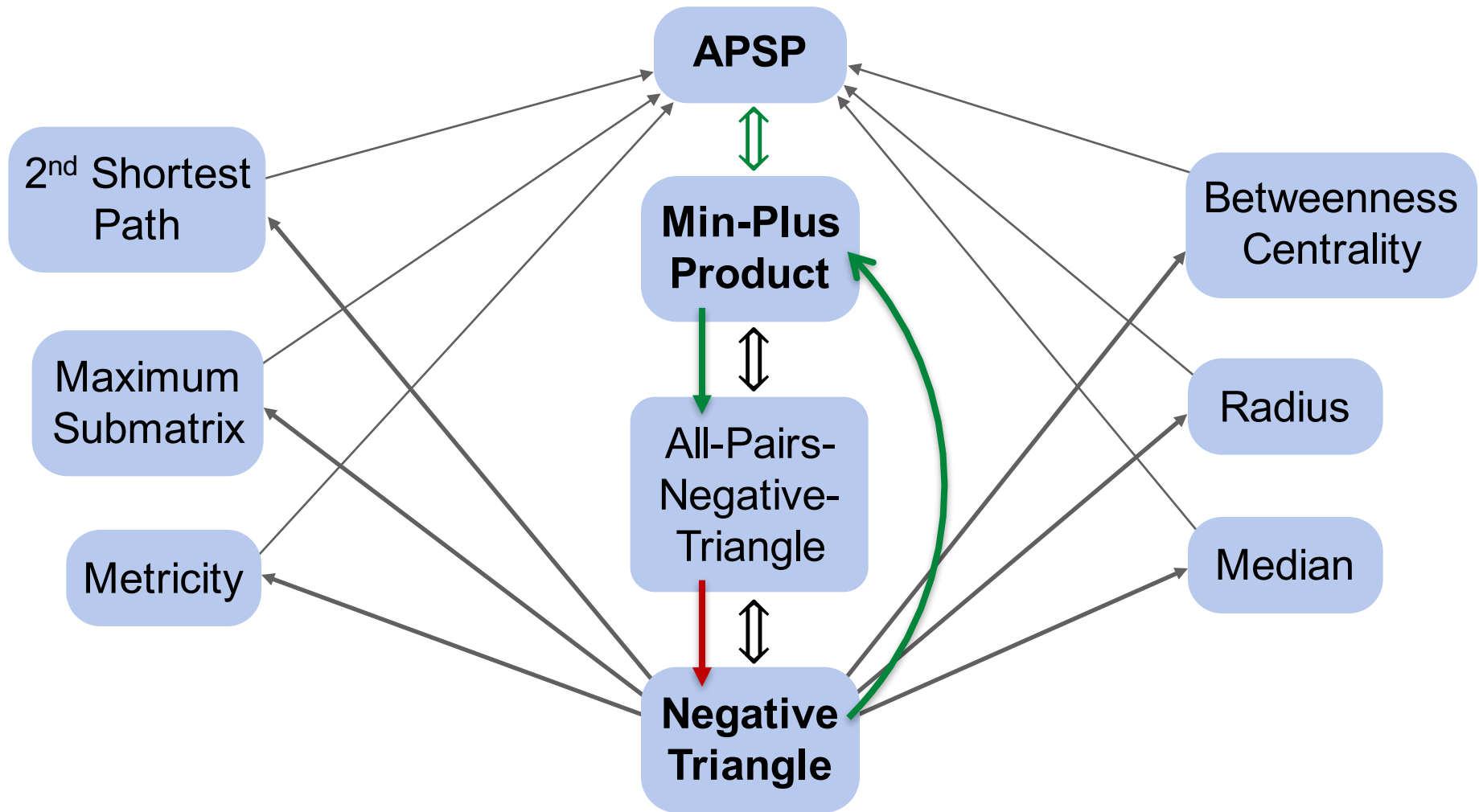
$T(n)$ algorithm for All-Pairs-Neg-Triangle yields
 $O(T(n) \log n)$ algorithm for Min-Plus Product

In particular: $O(n^{3-\varepsilon})$ algorithm for All-Pairs-Neg-Triangle for some $\varepsilon > 0$ implies $O(n^{3-\varepsilon})$ algorithm for Min-Plus Product for some $\varepsilon > 0$

→ subcubic reduction



Subcubic Equivalences



[Vassilevska-Williams, Williams' 10]

[Abboud, Grandoni, Vassilevska-Williams' 15]



All-Pairs-Neg-Triangle to Neg-Triangle

All-Pairs-Negative-Triangle

Negative Triangle

Negative Triangle Given graph G

Decide whether there are vertices i, j, k such that

$$w(j, i) + w(i, k) + w(k, j) < 0$$

All-Pairs-Negative-Triangle Given graph G with vertex set $V = I \cup J \cup K$

Decide for every $i \in I, j \in J$ whether there is a vertex $k \in K$ such that

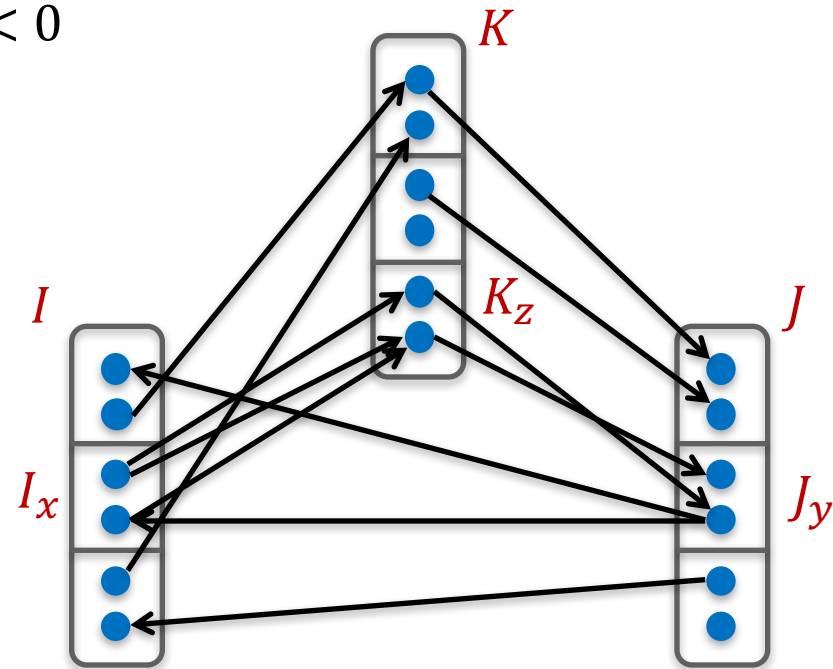
$$w(j, i) + w(i, k) + w(k, j) < 0$$

Split I, J, K into n/s parts of size s :

$$I_1, \dots, I_{n/s}, J_1, \dots, J_{n/s}, K_1, \dots, K_{n/s}$$

For each of the $(n/s)^3$ triples (I_x, J_y, K_z) :

consider graph $G[I_x \cup J_y \cup K_z]$



All-Pairs-Neg-Triangle to Neg-Triangle

Initialize C as $n \times n$ all-zeroes matrix

For each of the $(n/s)^3$ triples of parts (I_x, J_y, K_z) :

While $G[I_x \cup J_y \cup K_z]$ contains a negative triangle:

Find a negative triangle (i, j, k) in $G[I_x \cup J_y \cup K_z]$

Set $C[i, j] := 1$

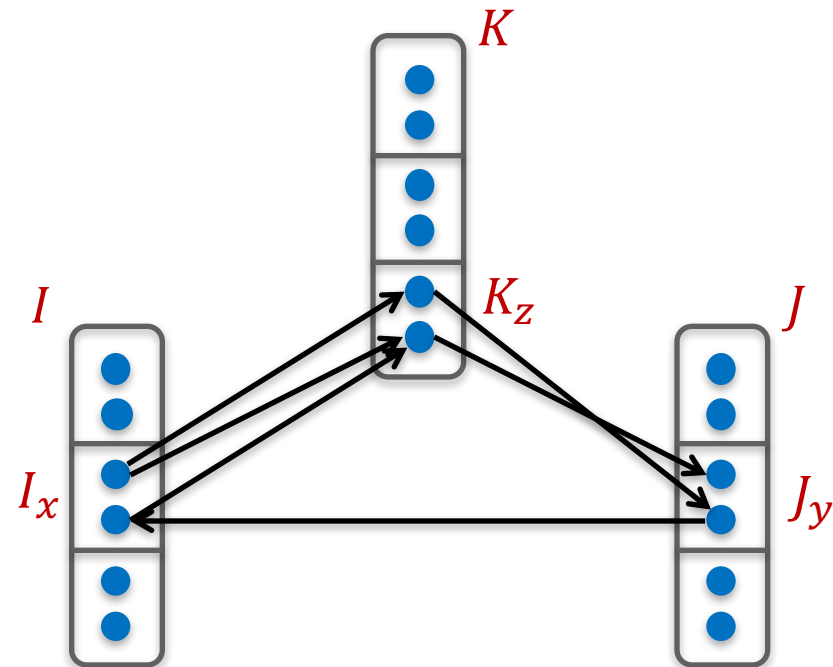
Set $w(i, j) := \infty$

(i, j) is in no more negative triangles

- ✓ guaranteed termination:
can set $\leq n^2$ weights to ∞
- ✓ correctness:
if (i, j) is in negative triangle,
we will find one

All-Pairs-Negative-Triangle

Negative Triangle



All-Pairs-Neg-Triangle to Neg-Triangle

Find a negative triangle (i, j, k) in $G[I_x \cup J_y \cup K_z]$

How to **find** a negative triangle
if we can only **decide** whether one exists?

Partition I_x into $I_x^{(1)}, I_x^{(2)}$, J_y into $J_y^{(1)}, J_y^{(2)}$, K_z into $K_z^{(1)}, K_z^{(2)}$

Since $G[I_x \cup J_y \cup K_z]$ contains a negative triangle,
at least one of the 2^3 subgraphs

$$G[I_x^{(a)} \cup J_y^{(b)} \cup K_z^{(c)}]$$

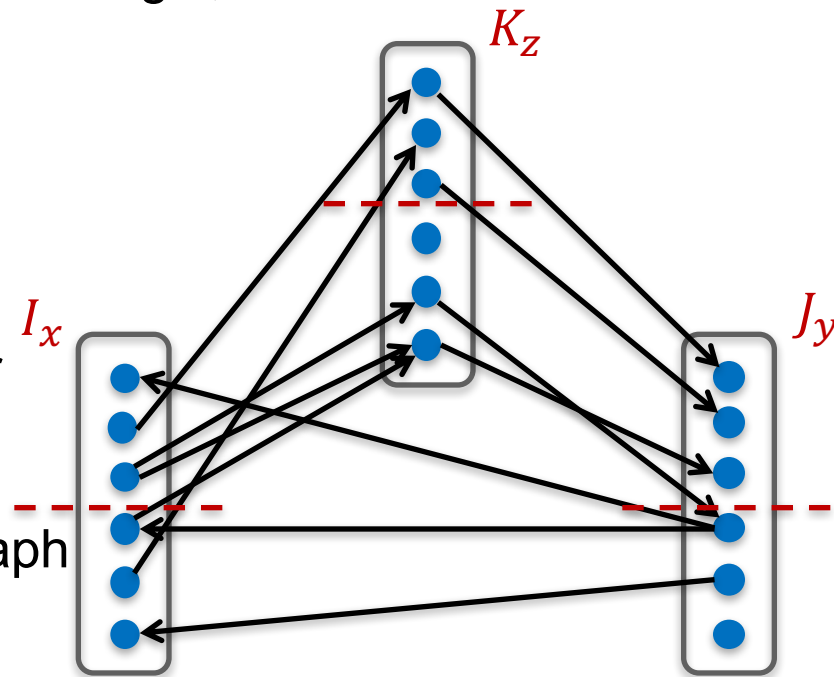
contains a negative triangle

Decide for each such subgraph whether
it contains a negative triangle

Recursively find a triangle in one subgraph

All-Pairs-
Negative-
Triangle

Negative
Triangle



All-Pairs-Neg-Triangle to Neg-Triangle

Find a negative triangle (i, j, k) in $G[I_x \cup J_y \cup K_z]$

How to **find** a negative triangle
if we can only **decide** whether one exists?

Partition I_x into $I_x^{(1)}, I_x^{(2)}$, J_y into $J_y^{(1)}, J_y^{(2)}$, K_z into $K_z^{(1)}, K_z^{(2)}$

Since $G[I_x \cup J_y \cup K_z]$ contains a negative triangle,
at least one of the 2^3 subgraphs

$$G[I_x^{(a)} \cup J_y^{(b)} \cup K_z^{(c)}]$$

contains a negative triangle

Decide for each such subgraph whether
it contains a negative triangle

Recursively find a triangle in one subgraph

All-Pairs-
Negative-
Triangle



Negative
Triangle

Running Time:

$$T_{\text{FindNegTriangle}}(n) \leq$$

$$2^3 \cdot T_{\text{DecideNegTriangle}}(n)$$

$$+ T_{\text{FindNegTriangle}}(n/2)$$

$$= O(T_{\text{DecideNegTriangle}}(n))$$



All-Pairs-Neg-Triangle to Neg-Triangle

Initialize C as $n \times n$ all-zeroes matrix

For each of the $(n/s)^3$ triples of parts (I_x, J_y, K_z) :

While $G[I_x \cup J_y \cup K_z]$ contains a negative triangle:

Find a negative triangle (i, j, k) in $G[I_x \cup J_y \cup K_z]$

Set $C[i, j] := 1$

Set $w(i, j) := \infty$

} (*)

All-Pairs-Negative-Triangle

Negative Triangle

Running Time:

$$(*) = O(T_{\text{FindNegTriangle}}(s)) = O(T_{\text{DecideNegTriangle}}(s))$$

$$\text{Total time: } ((\# \text{triples}) + (\# \text{triangles found})) \cdot (*)$$

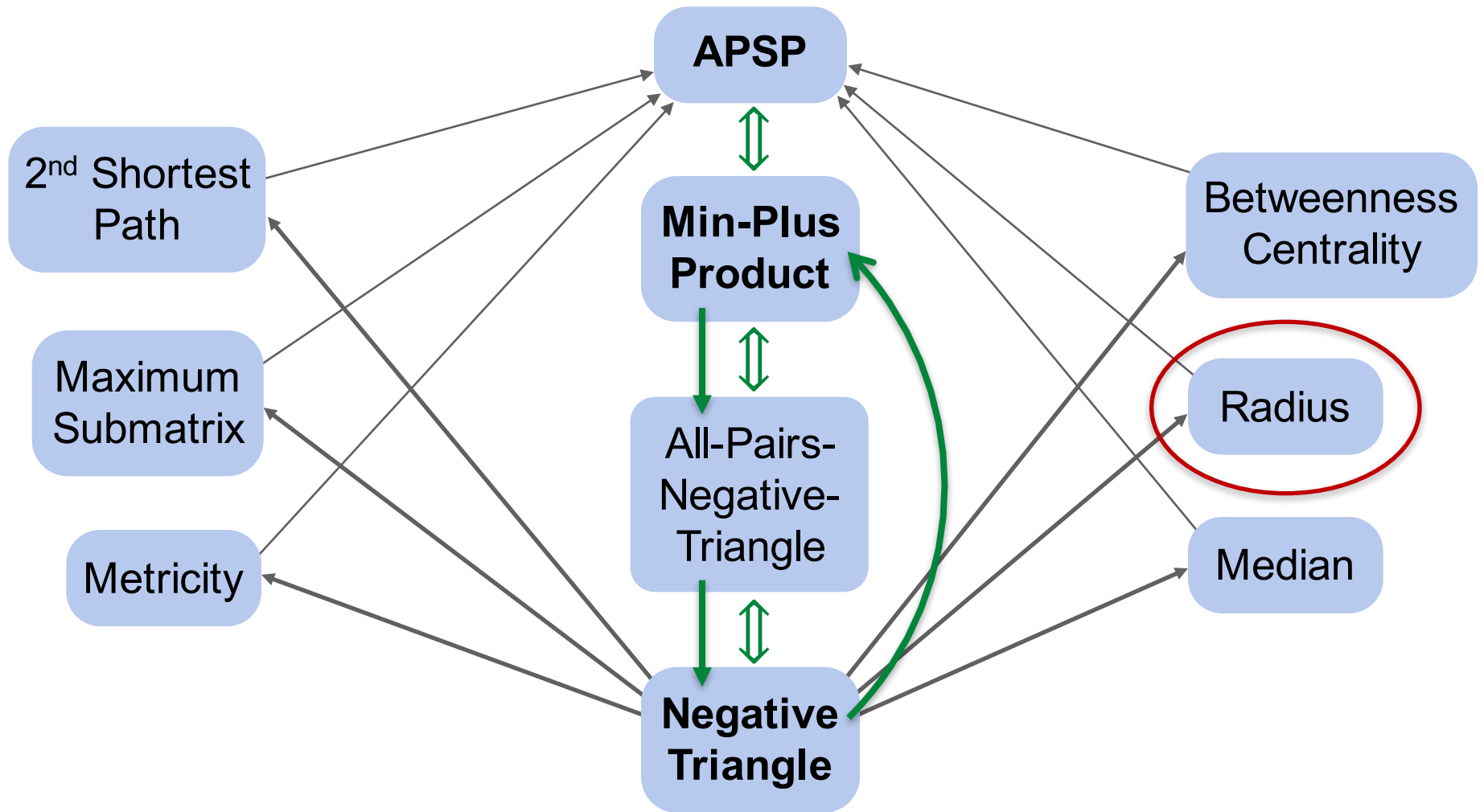
$$\leq ((n/s)^3 + n^2) \cdot T_{\text{DecideNegTriangle}}(s)$$

$$\text{Set } s = n^{1/3} \text{ and assume } T_{\text{DecideNegTriangle}}(n) = O(n^{3-\varepsilon})$$

$$\text{Total time: } O(n^2 \cdot n^{1-\varepsilon/3}) = O(n^{3-\varepsilon/3})$$



Subcubic Equivalences



[Vassilevska-Williams, Williams' 10]

[Abboud, Grandoni, Vassilevska-Williams' 15]



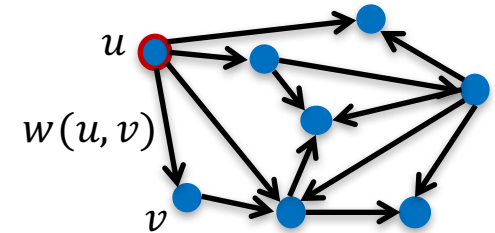
Radius

G is a weighted directed graph

$d(u, v)$ is the distance from u to v in G

Radius: $\min_u \max_v d(u, v)$

u is in some sense the *most central vertex*



Radius \longrightarrow APSP

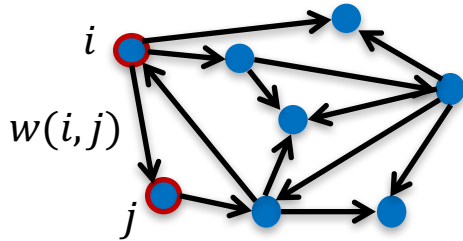
compute all pairwise distances,
then evaluate definition of radius in time $O(n^2)$

\rightarrow subcubic reduction

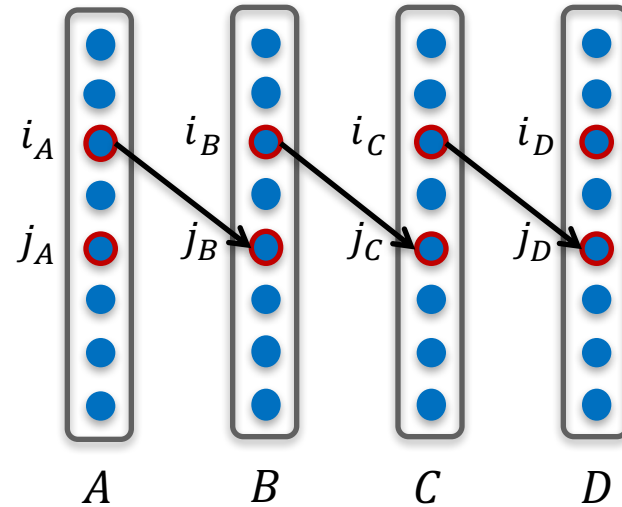
\Rightarrow Radius is in time $O\left(n^3 / 2^{\Omega(\log n)^{1/2}}\right)$

Negative Triangle to Radius

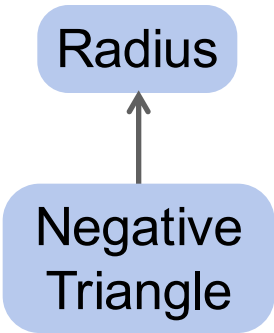
Negative Triangle instance:
graph G with n nodes,
edge-weights in $\{-n^c, \dots, n^c\}$



Radius instance:
graph H with $O(n)$ nodes,
edge-weights in $\{0, \dots, O(n^c)\}$



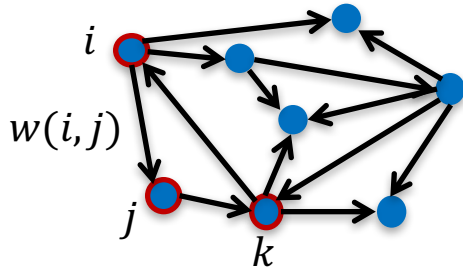
$$M := 3n^c$$



- 1) Make four layers with n nodes
- 2) For any edge (i, j) : Add (i_A, j_B) , $(i_B, j_C), (i_C, j_D)$ with weight $M + w(i, j)$

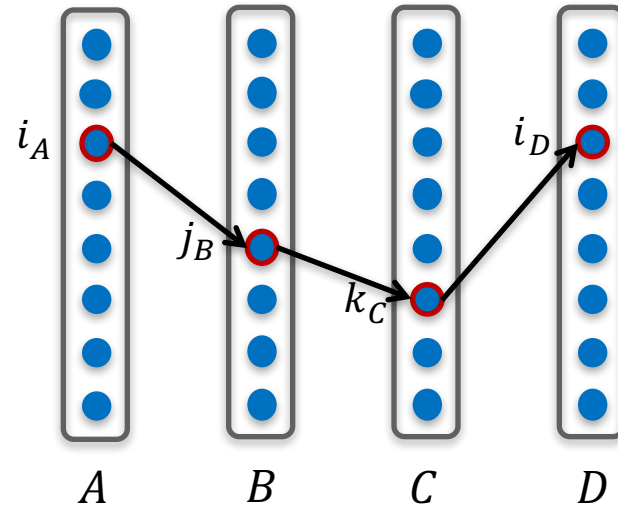
Negative Triangle to Radius

Negative Triangle instance:
graph G with n nodes,
edge-weights in $\{-n^c, \dots, n^c\}$



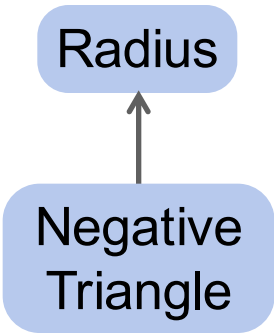
(i, j, k) has weight W

Radius instance:
graph H with $O(n)$ nodes,
edge-weights in $\{0, \dots, O(n^c)\}$



\Leftrightarrow path has length $3M + W$

$\rightarrow \exists i_A, j_B, k_C, i_D$ -path of length $\leq 3M - 1$?



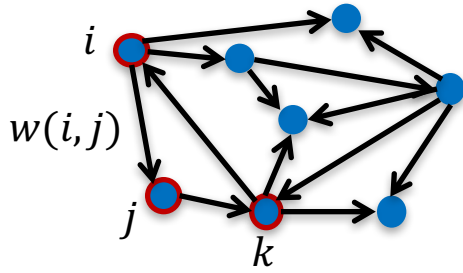
$$M := 3n^c$$

- 1) Make four layers with n nodes
- 2) For any edge (i, j) : Add $(i_A, j_B), (i_B, j_C), (i_C, j_D)$ with weight $M + w(i, j)$



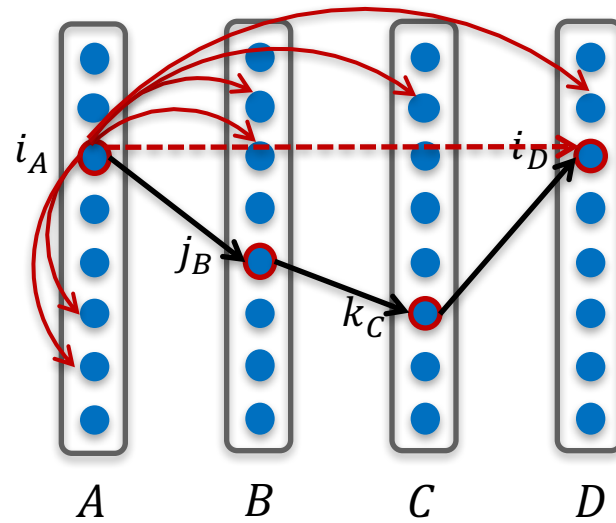
Negative Triangle to Radius

Negative Triangle instance:
graph G with n nodes,
edge-weights in $\{-n^c, \dots, n^c\}$



(i, j, k) has weight W

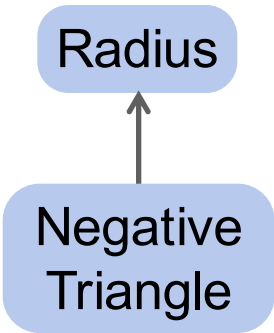
Radius instance:
graph H with $O(n)$ nodes,
edge-weights in $\{0, \dots, O(n^c)\}$



\Leftrightarrow path has length $3M + W$

$\rightarrow \exists i_A, j_B, k_C, i_D$ -path of length $\leq 3M - 1$?

$$M := 3n^c$$



- 1) Make four layers with n nodes
- 2) For any edge (i, j) : Add (i_A, j_B) , $(i_B, j_C), (i_C, j_D)$ with weight $M + w(i, j)$
- 3) Add edges of weight $3M - 1$ from any i_A to all nodes except i_D (and i_A)

Claim: Radius of H is $\leq 3M - 1$ iff there is a negative triangle in G

Radius: $\min_u \max_v d(u, v)$

Negative Triangle to Radius

Radius

Negative Triangle

Claim: Radius of H is $\leq 3M - 1$ iff there is a negative triangle in G

Proof:

If there is a negative triangle (i, j, k) then i_A is in distance $\leq 3M - 1$ to i_D (by (2)), and in distance $\leq 3M - 1$ to any other vertex (by (3)),

so the radius is $\leq \max_v d(i_A, v) \leq 3M - 1$

If there is no negative triangle (i, j, k) :

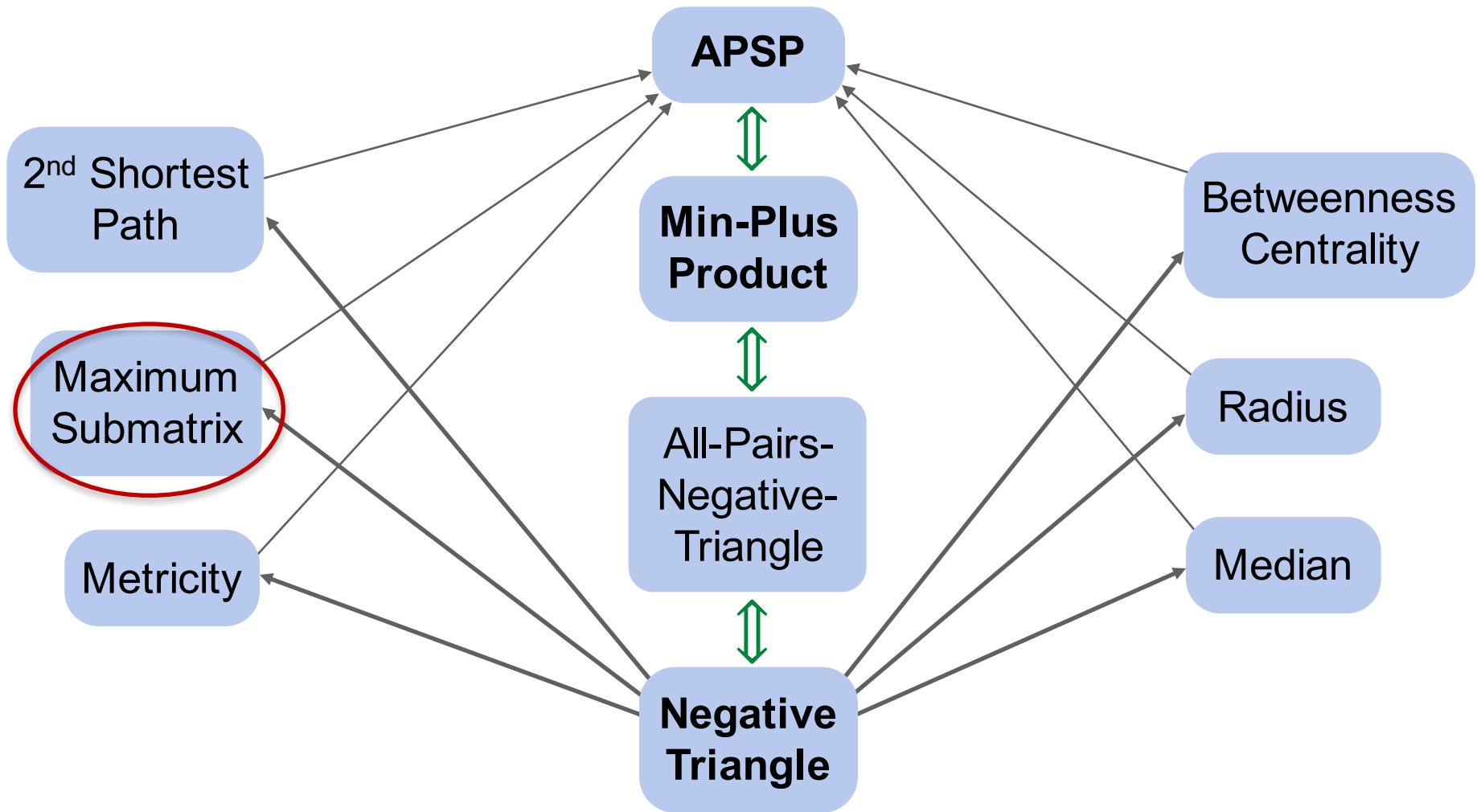
Any node u of the form $i_B/i_C/i_D$ cannot reach A , so it has $\max_v d(u, v) = \infty$

Any i_A is in distance $\geq 3M$ to i_D , since there is no i_A, j_B, k_C, i_D -path of length $\leq 3M - 1$ (note that the edges added in (3) also do not help)

Hence, for all u , $\max_v d(u, v) \geq 3M$, and thus the radius is at least $3M$



Subcubic Equivalences



[Vassilevska-Williams, Williams' 10]

[Abboud, Grandoni, Vassilevska-Williams' 15]



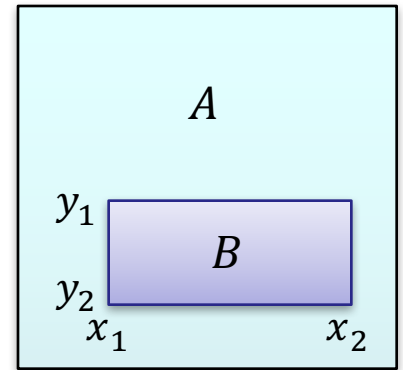
MaxSubmatrix

MaxSubmatrix:

given an $n \times n$ matrix A with entries in $\{-n^c, \dots, n^c\}$

$\Sigma(B) :=$ **sum of all entries** of matrix B

compute maximum $\Sigma(B)$ over all **submatrices** B of A



Thm: MaxSubmatrix is subcubic equivalent to APSP

[Tamaki, Tokuyama'98]

[Backurs, Dikkala, Tzamos'16]

there are $O(n^4)$ possible submatrices B

computing $\Sigma(B)$: $O(n^2)$

trivial running time: $O(n^6)$

Exercise: design an $O(n^3)$ algorithm



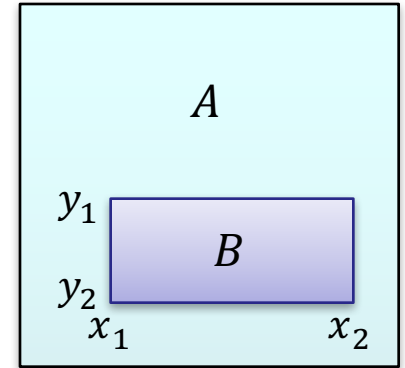
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Thm: MaxSubmatrix is subcubic equivalent to APSP

[Tamaki, Tokuyama'98]

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MaxCenteredSubmatrix:

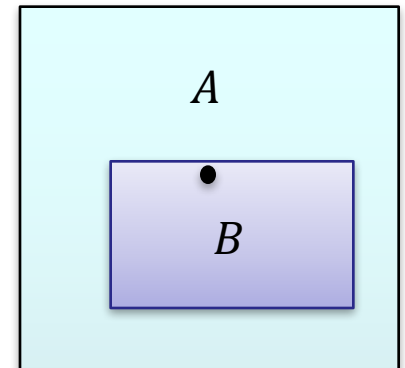
compute maximum $\Sigma(B)$ over all **submatrices** B of A **containing the center** of A

i.e. we require $x_1 \leq n/2 < x_2$ and $y_1 \leq n/2 < y_2$

Thm: MaxCenteredSubmatrix is subcubic equ. to APSP

we only prove: NegativeTriangle \leq MaxCenteredSubmatrix

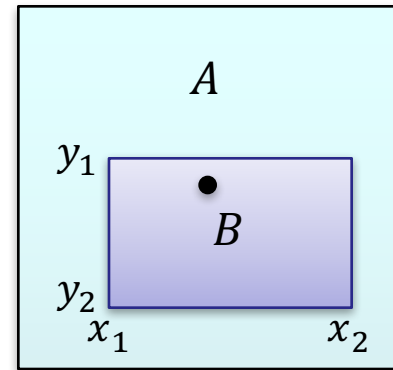
Exercise: MaxCenteredSubmatrix \leq APSP



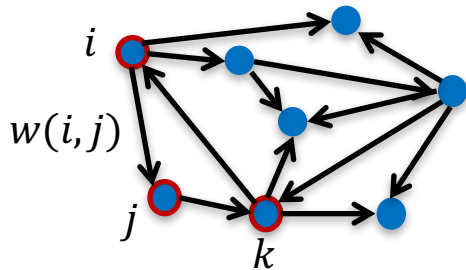
NegTriangle to MaxCentSubmatrix

Positive Triangle instance:
graph G with n nodes,
edge-weights in $\{-n^c, \dots, n^c\}$

MaxCenteredSubmatrix:
 $2n \times 2n$ -matrix A
entries in $\{-n^{O(c)}, \dots, n^{O(c)}\}$



$$M := 2n^{c+3}$$



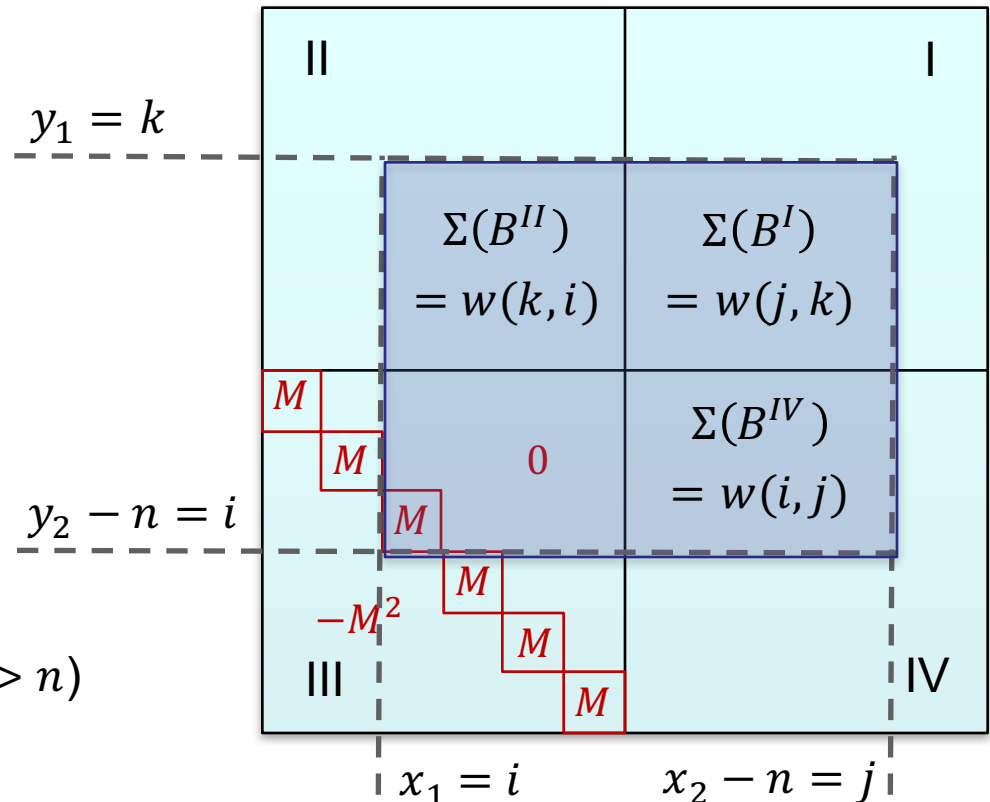
In quadrant II we want for any k, i :

$$\sum_{y=k}^n \sum_{x=i}^n A_{y,x} = w(k, i)$$

this is satisfied by defining:

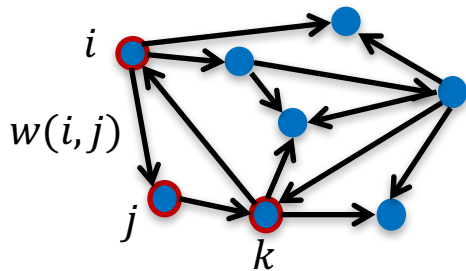
$$A_{k,i} := w(k, i) - w(k + 1, i) - w(k, i + 1) + w(k + 1, i + 1)$$

(where $w(x, y) := 0$ for $x > n$ or $y > n$)

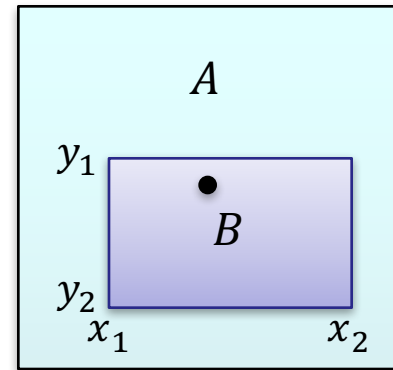


NegTriangle to MaxCentSubmatrix

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MaxCenteredSubmatrix:
 $2n \times 2n$ -matrix A
entries in $\{-n^{O(c)}, \dots, n^{O(c)}\}$



$$M := 2n^{c+3}$$

With this definition of A , for any $1 \leq k, i \leq n$:

$$\sum_{y=k}^n \sum_{x=i}^n A_{y,x} = \sum_{y=k}^n \sum_{x=i}^n w(y, x) - w(y+1, x) - w(y, x+1) + w(y+1, x+1)$$

In quadrant II we want for any k, i :

$$\sum_{y=k}^n \sum_{x=i}^n A_{y,x} = w(k, i)$$

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(where $w(x, y) := 0$ for $x > n$ or $y > n$)

where any $w(y, x)$ with $k < y \leq n$ and $i < x \leq n$ appears with factors $+1 - 1 - 1 + 1 = 0$

and any $w(y, x)$, s.t. exactly one of $y = k$ or $y = n+1$ or $x = i$ or $x = n+1$ holds, appears with factors $+1 - 1 = 0$

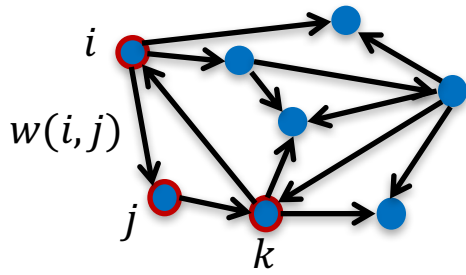
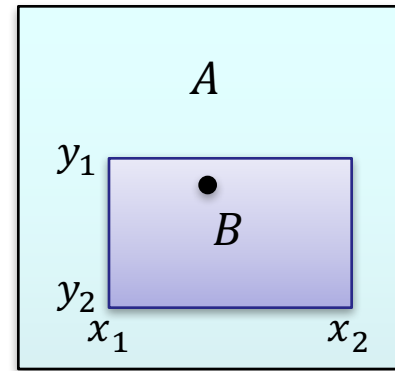
and since $w(y, n+1) = w(n+1, x) = 0$, the only remaining summand is $w(k, i)$



NegTriangle to MaxCentSubmatrix

Positive Triangle instance:
graph G with n nodes,
edge-weights in $\{-n^c, \dots, n^c\}$

MaxCenteredSubmatrix:
 $2n \times 2n$ -matrix A
entries in $\{-n^{O(c)}, \dots, n^{O(c)}\}$



Claim: MaxCentSubmatrix of A is $> M$
iff G has a **positive** triangle

$$M := 2n^{c+3}$$

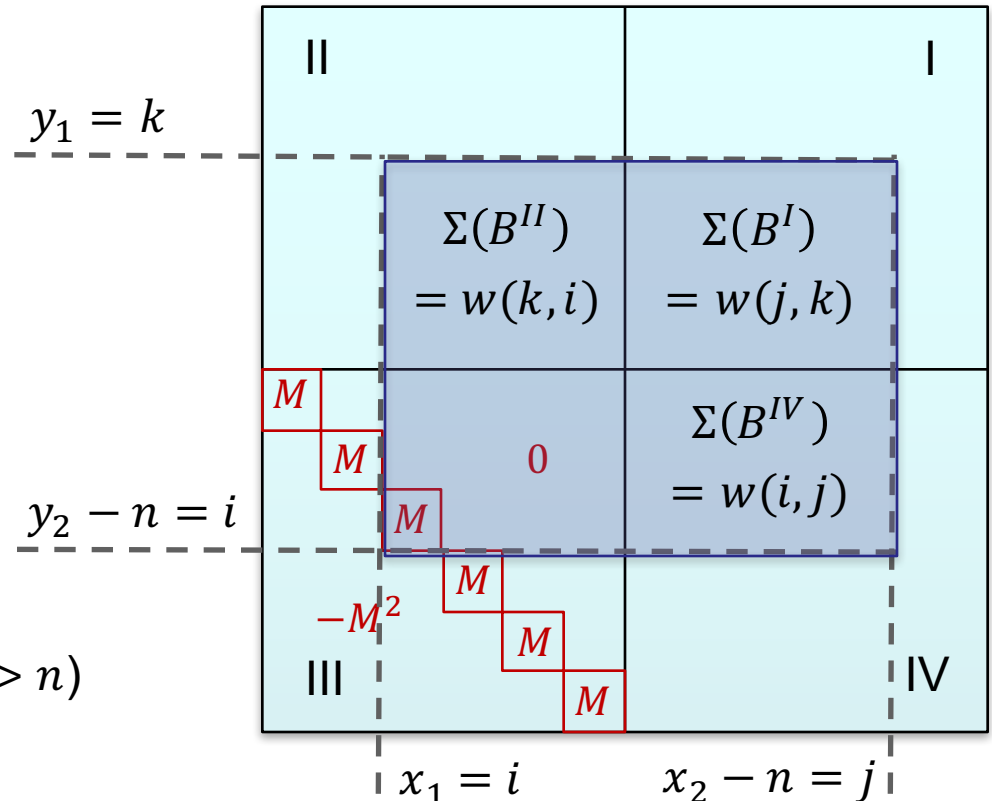
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Summary

