



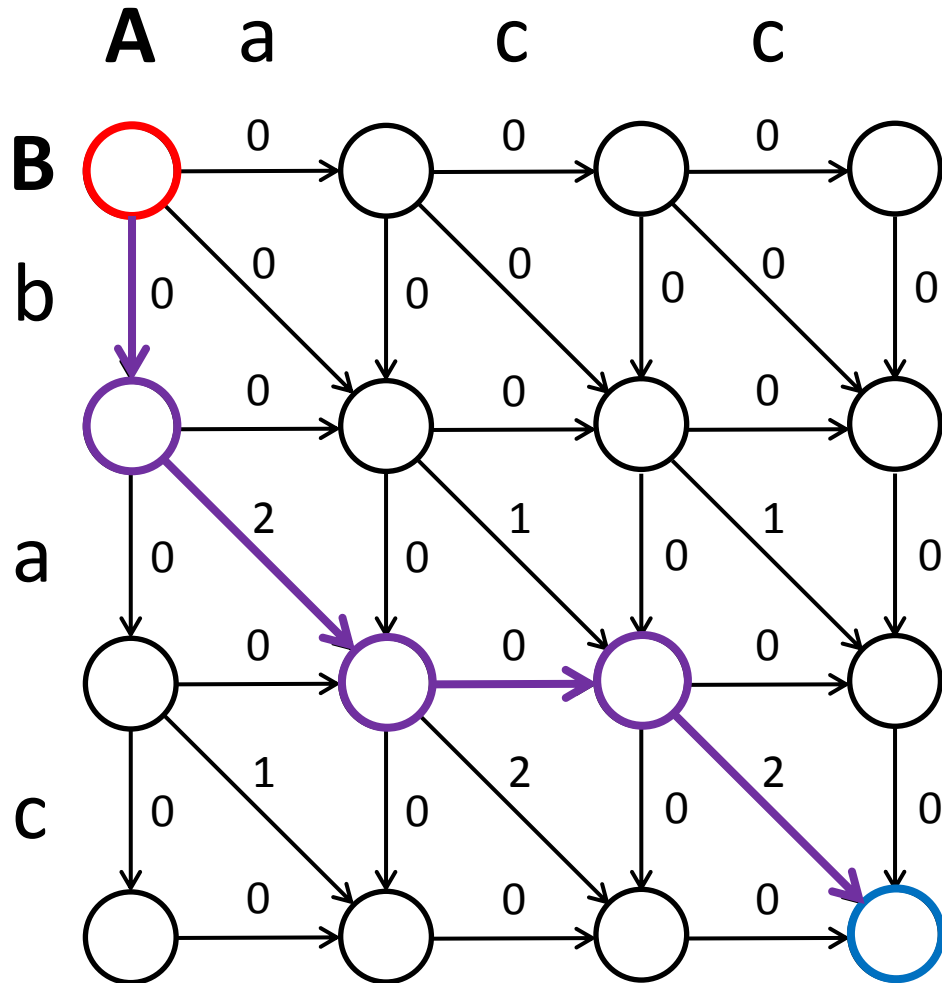
Efficient All Path Score Computations on Grid Graphs

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Dekel Tsur

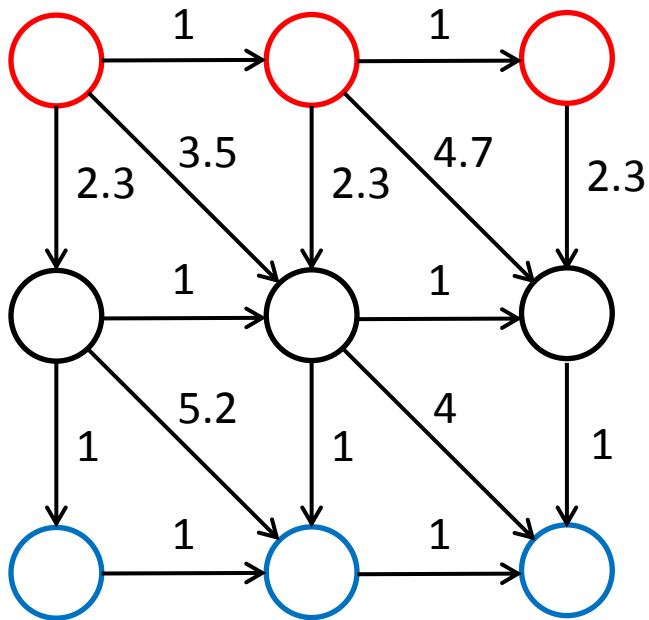
Michal Ziv-Ukelson

Grid graph from string alignment



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

Grid All Path Scores (GAPS)

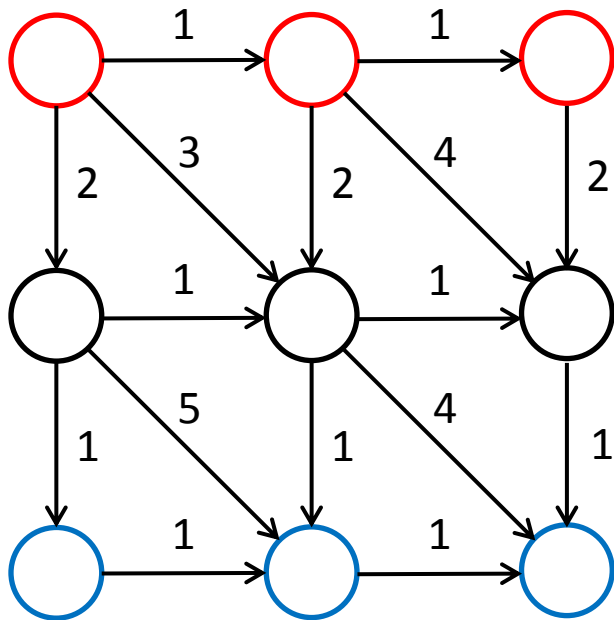


Goal

compute heaviest paths
from **every** vertex on first row
to **every** vertex on last row

Schmidt: $O(n^2 \cdot \log n)$

Integers Grid All Path Scores (IGAPS)

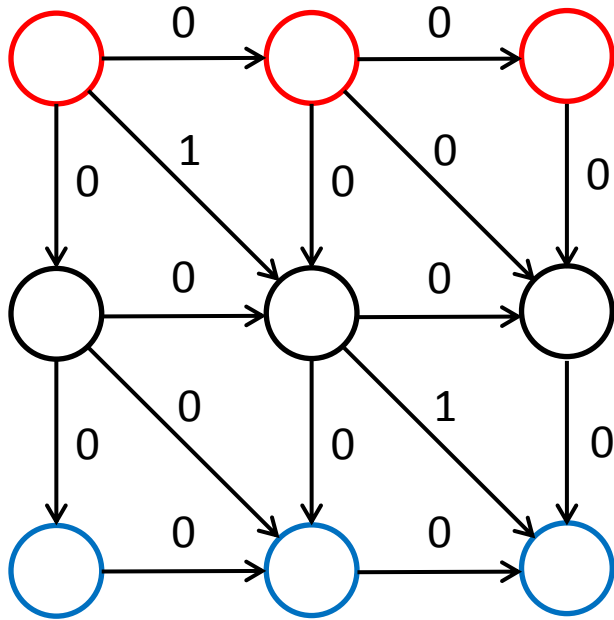


$$C = 5$$

Weights are integers from
the set $\{0, 1, \dots, C\}$

Schmidt: $O(C \cdot n^2)$

Binary Grid All Path Scores (BGAPS)



Weights are integers from
the set $\{0,1\}$

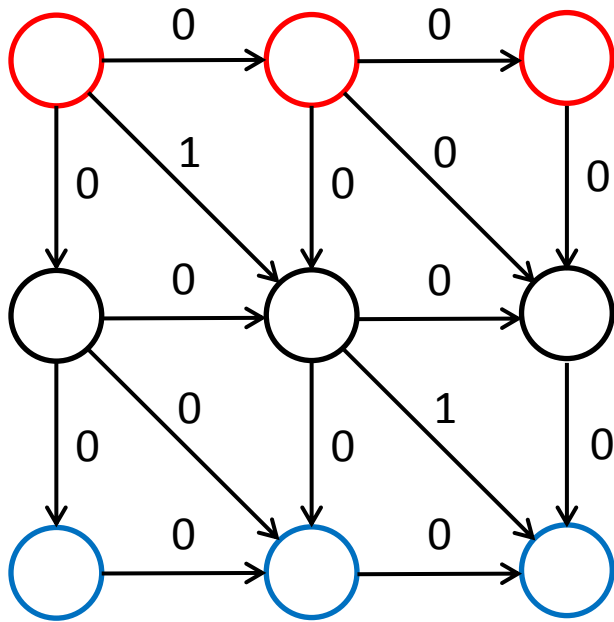
Schmidt: $O(n^2)$

Alves, Caceres, Song: $O(n^2)$

Tiskin: $O(n^2 \cdot (\log \log n / \log n)^2)$

For grid graph of LCS problem

Sparse Binary Grid All Path Scores (sparse BGAPS)



$$r = 2$$

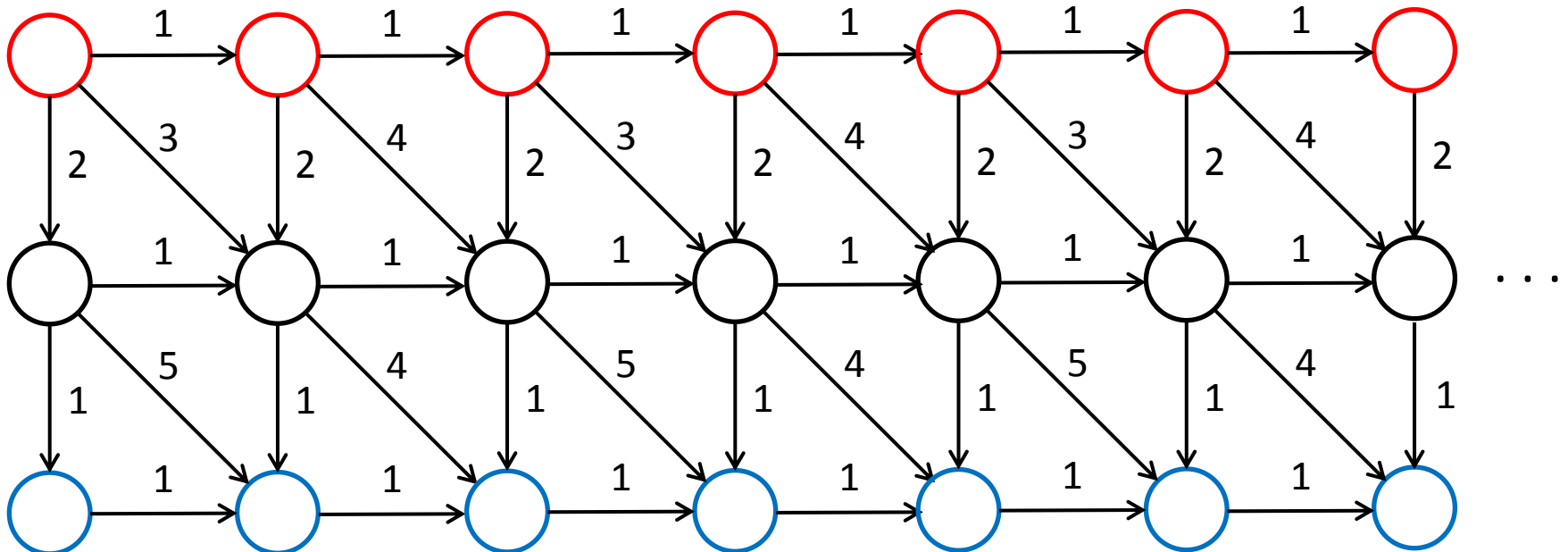
Horizontal and vertical weights are 0 and diagonal weights are 0 or 1. Number of diagonal edges of weights 1 is r .

Krusche, Tiskin: $O(n \cdot \sqrt{r})$

Periodic Integers Grid All Path Scores (periodic IGAPS)

Weights are integers from the set $\{0, 1, \dots, C\}$.
The graph is infinite and the weights values are periodic. The representation is finite.

Tiskin: $O(C^2 \cdot n^2)$



Contribution

- Integers Grid All Path Scores (IGAPS) - Weights are integers in $\{0, \dots, C\}$
- Binary Grid All Path Scores (BGAPS) - Weights are 0 or 1
- sparse BGAPS – r represents the amount of edges with weight 1
- periodic infinite – Graph is infinite and weights are periodic

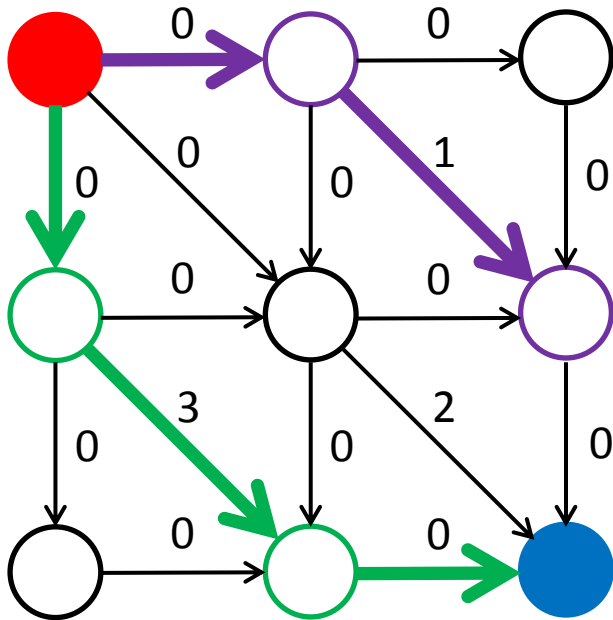
	Finite	Infinite periodic
IGAPS	S, 1998: $C \cdot n^2$	T, 2009: $C^2 \cdot n^2$ $C \cdot n^2$
IGAPS from alignment	T: $C^2 \cdot n^2 \cdot \left(\frac{\log \log n}{\log n}\right)^2$	$C^2 \cdot n^2 \cdot \left(\frac{\log \log n}{\log n}\right)^2$
Sparse BGAPS	K, T, 2008: $n \cdot \sqrt{r}$ $r \cdot \log^3(n^2/r)$	$r \cdot \log^3(n^2/r)$

Some definitions

$OPT_i(k, j)$ is the maximum weight of a path from $(0, k)$ to (i, j)

$$\text{DiffC}_{i,j}(k) = OPT_i(k, j + 1) - OPT_i(k, j)$$

$$\text{DiffR}_{i,j}(k) = OPT_{i+1}(k, j) - OPT_i(k, j)$$



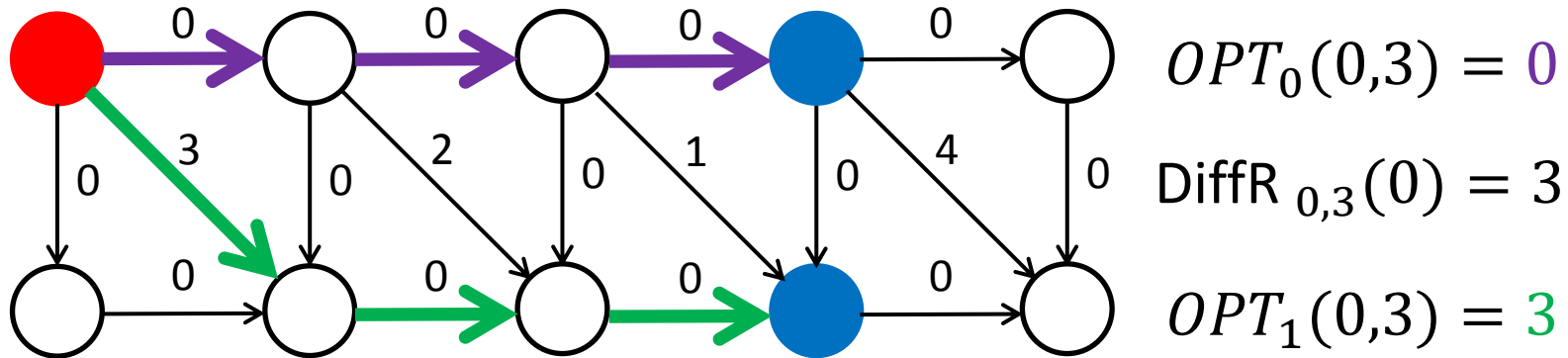
$$OPT_2(0, 2) = 3$$

$$OPT_1(0, 2) = 1$$

$$\text{DiffR}_{1,2}(0) = 3 - 1 = 2$$

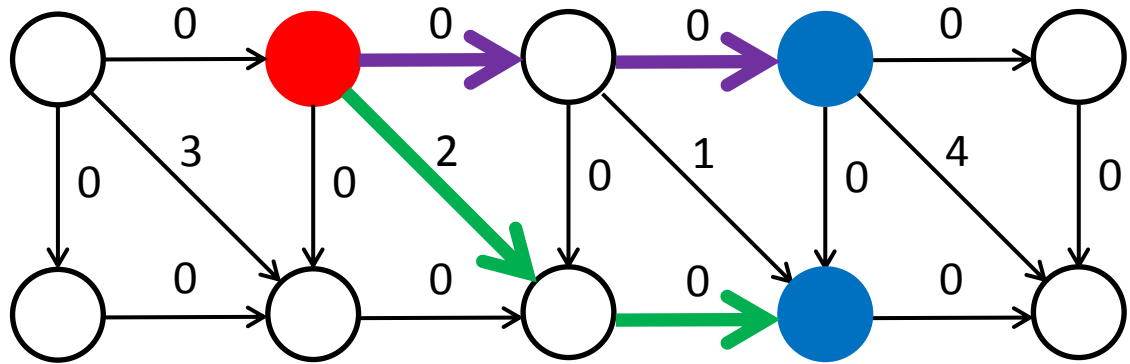
We will compute all DiffR and DiffC values which give us implicit representation of the all-scores matrix of G .

Computing Diff with compact representation



$DiffR_{0,3} = (3, 2, 1, 0)$

Computing Diff with compact representation



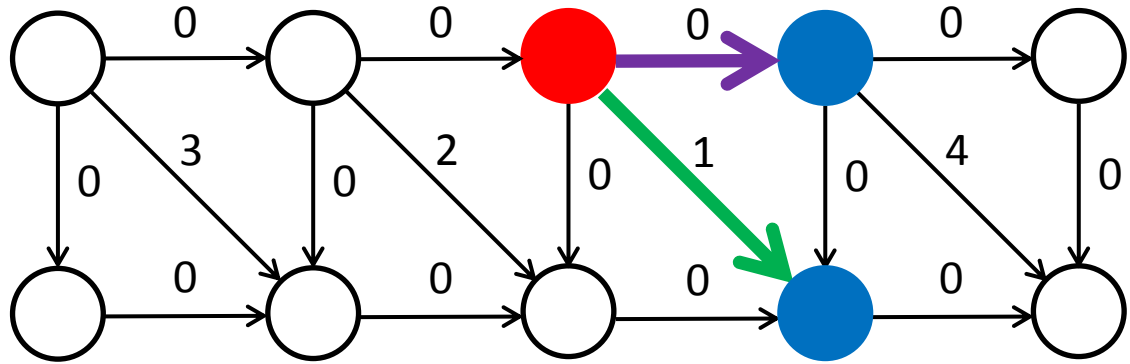
$$OPT_0(1,3) = 0$$

$$\text{DiffR}_{0,3}(1) = 2$$

$$OPT_1(1,3) = 2$$

$$\text{DiffR}_{0,3} = (3,2,1,0)$$

Computing Diff with compact representation



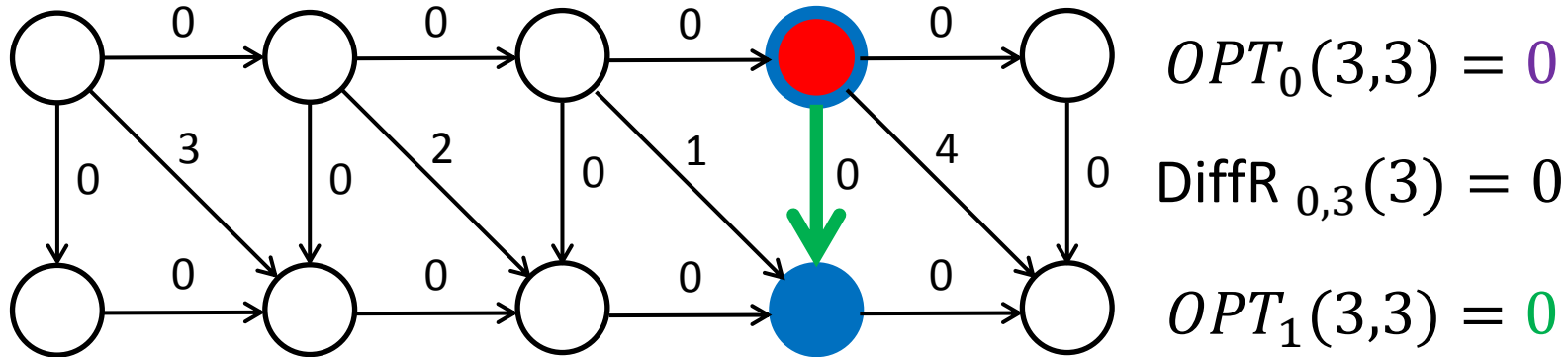
$$OPT_0(2,3) = 0$$

$$\text{DiffR}_{0,3}(2) = 1$$

$$OPT_1(2,3) = 1$$

$$\text{DiffR}_{0,3} = (3,2,1,0)$$

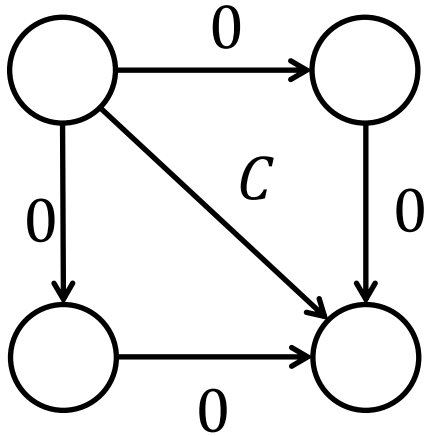
Computing Diff with compact representation



$$DiffR_{0,3} = (3,2,1,0)$$

Bounding DiffC and DiffR

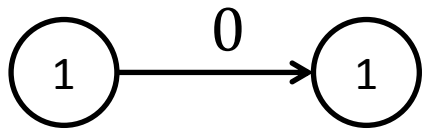
$$0 \leq \text{DiffC}_{i,j}(k) \leq C \text{ and } 0 \leq \text{DiffR}_{i,j}(k) \leq C$$

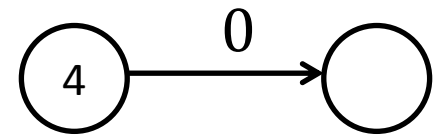


Compact representation of Diff

$SC_{i,j}$ ($SR_{i,j}$) is sequence that contains the indices in which DiffC $_{i,j}$ (DiffR $_{i,j}$) function changes.

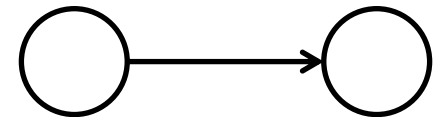
Example





⋮

⋮



$(-\infty, 6, 9, 9, \infty)$

$$C = 5$$

$$n = 9$$

$$k = (1, 2, 3, 4, 5, 6, 7, 8, 9)$$

DiffC $_{9,9} = (1, 1, 1, 1, 1, 2, 2, 2, 4)$ Diff function

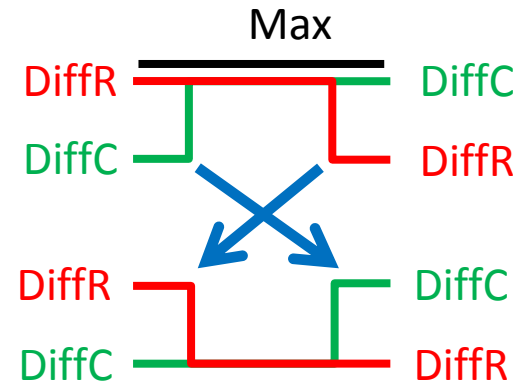
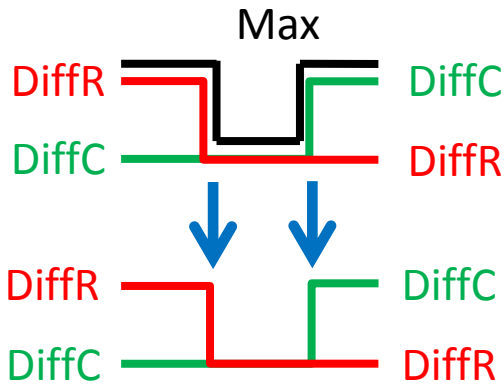
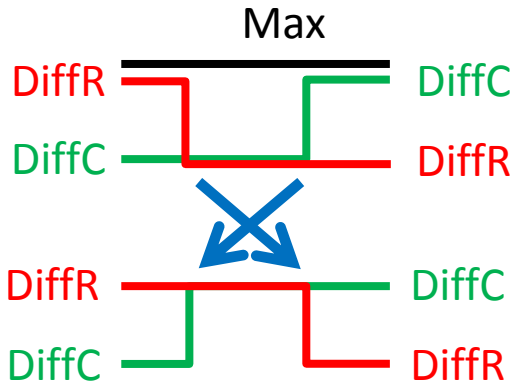
$SC_{i,j} = (-\infty, 6, 9, 9, \infty)$ Compact representation

Contribution

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- Binary Grid All Path Scores (BGAPS) - Weights are 0 or 1
- sparse BGAPS – r represents the amount of edges with weight 1
- periodic infinite – Graph is infinite and weights are periodic

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Algorithm for finite sparse BGAPS



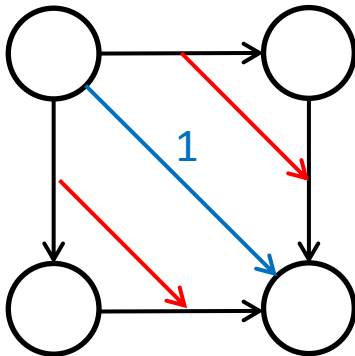
$SR < SC$

$SC < SR$

$$W_{i,j} = 1$$

$$SC_{i+1,j} = SR_{i,j}$$

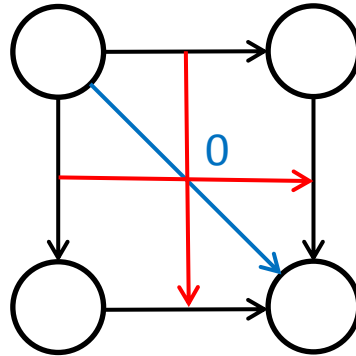
$$SR_{i,j+1} = SC_{i,j}$$



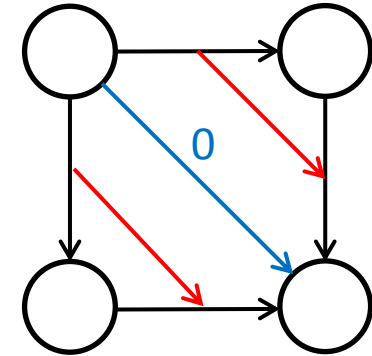
$$W_{i,j} = 0$$

$$SC_{i+1,j} = \max\{SC_{i,j}, SR_{i,j}\}$$

$$SR_{i,j+1} = \min\{SC_{i,j}, SR_{i,j}\}$$



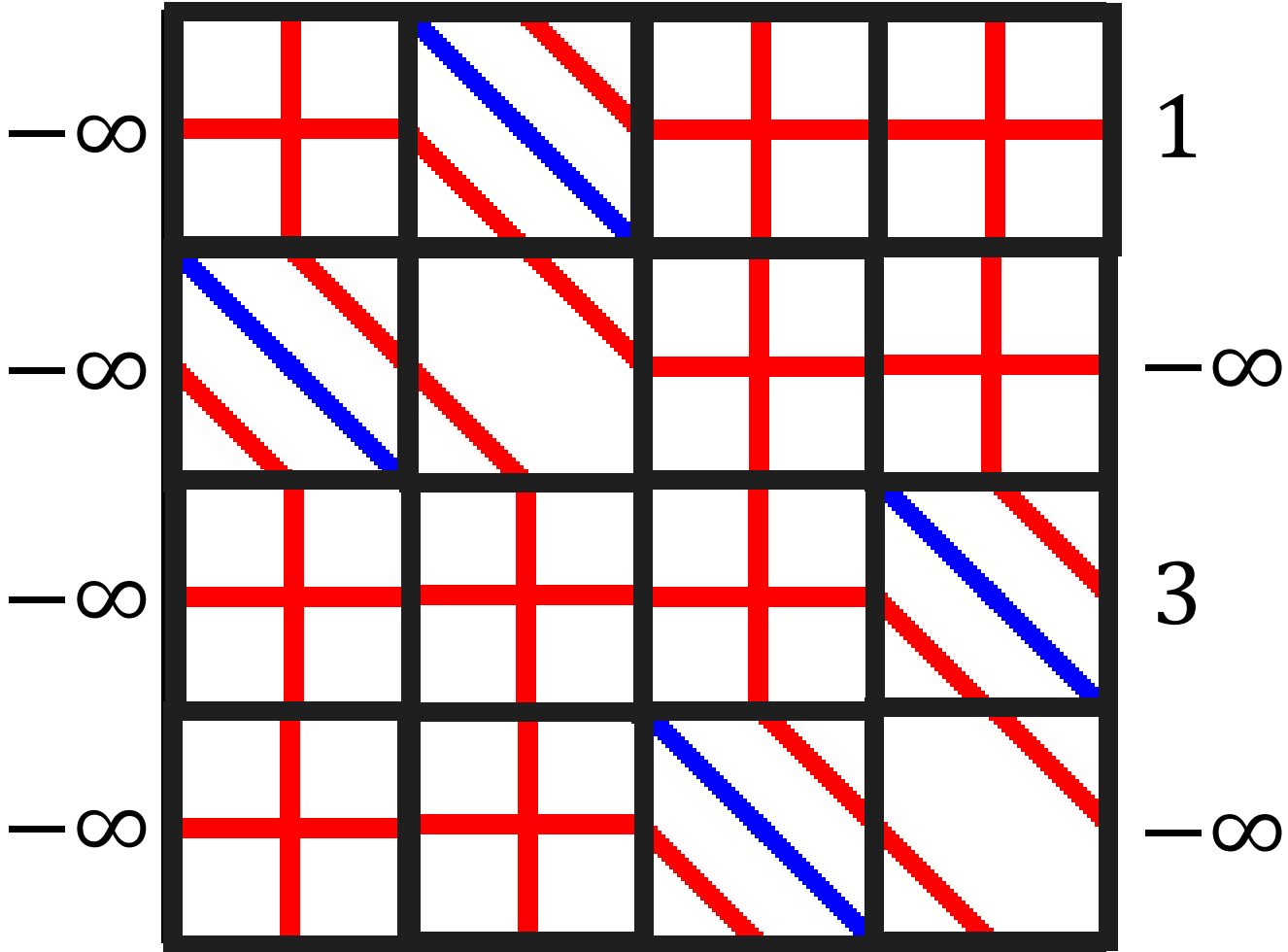
Indexes didn't cross:
They cross once



Indexes crossed:
don't cross again

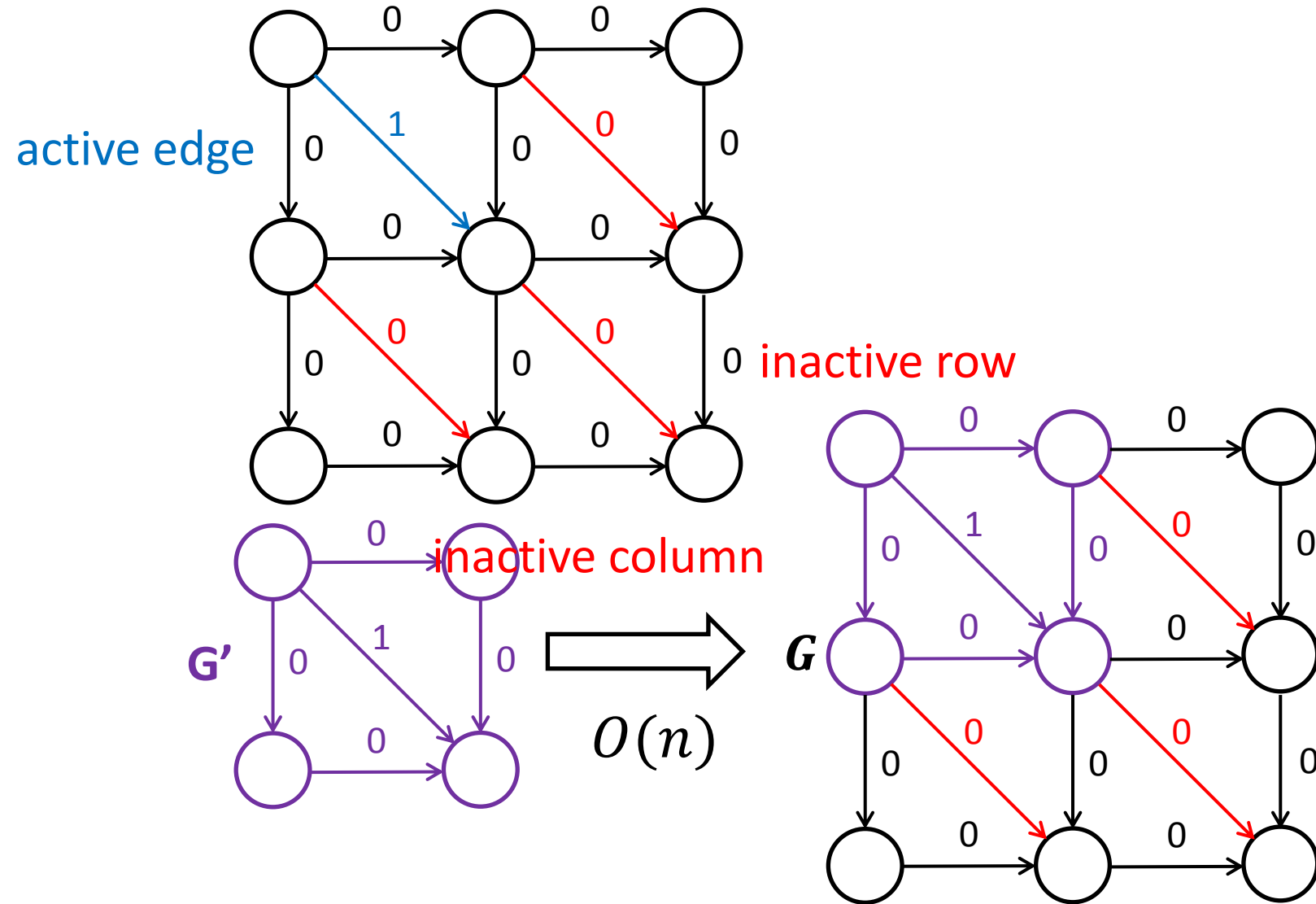
Algorithm for finite sparse BGAPS

0 1 2 3



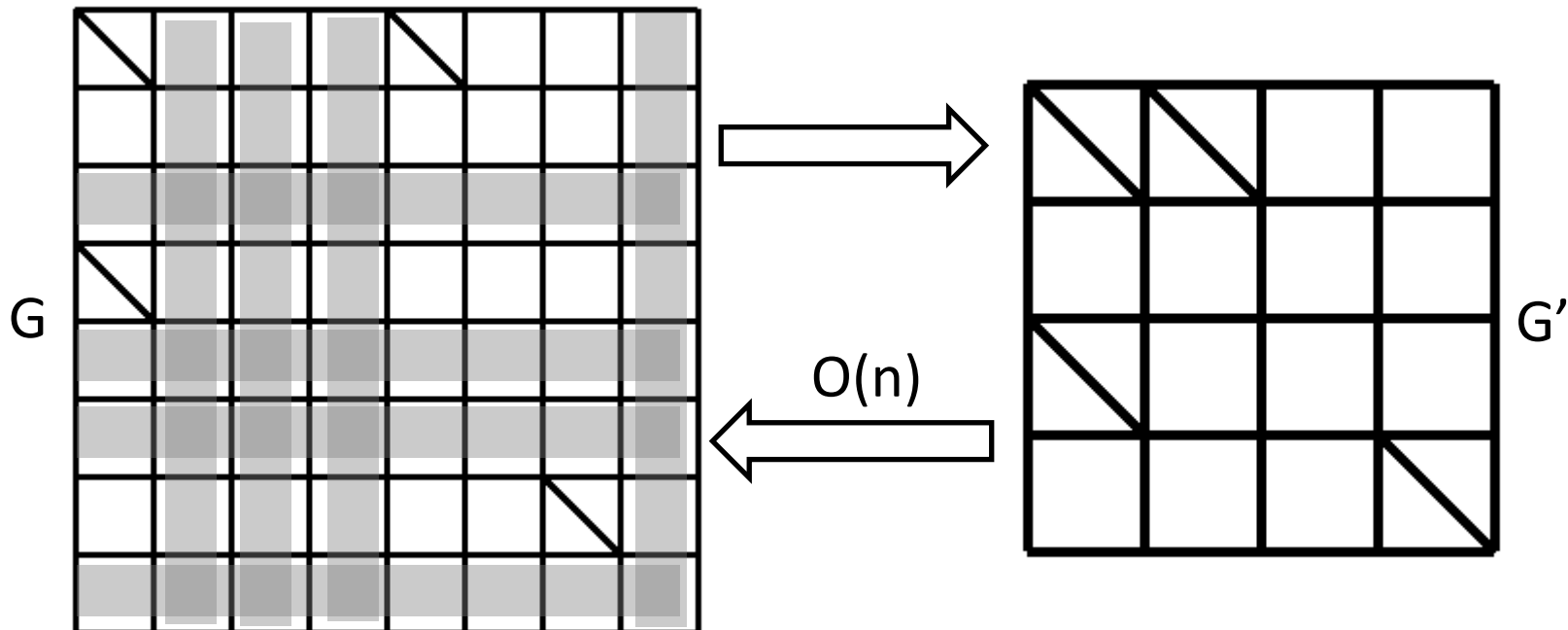
$-\infty$ 0 $-\infty$ 2

Algorithm for finite sparse BGAPS



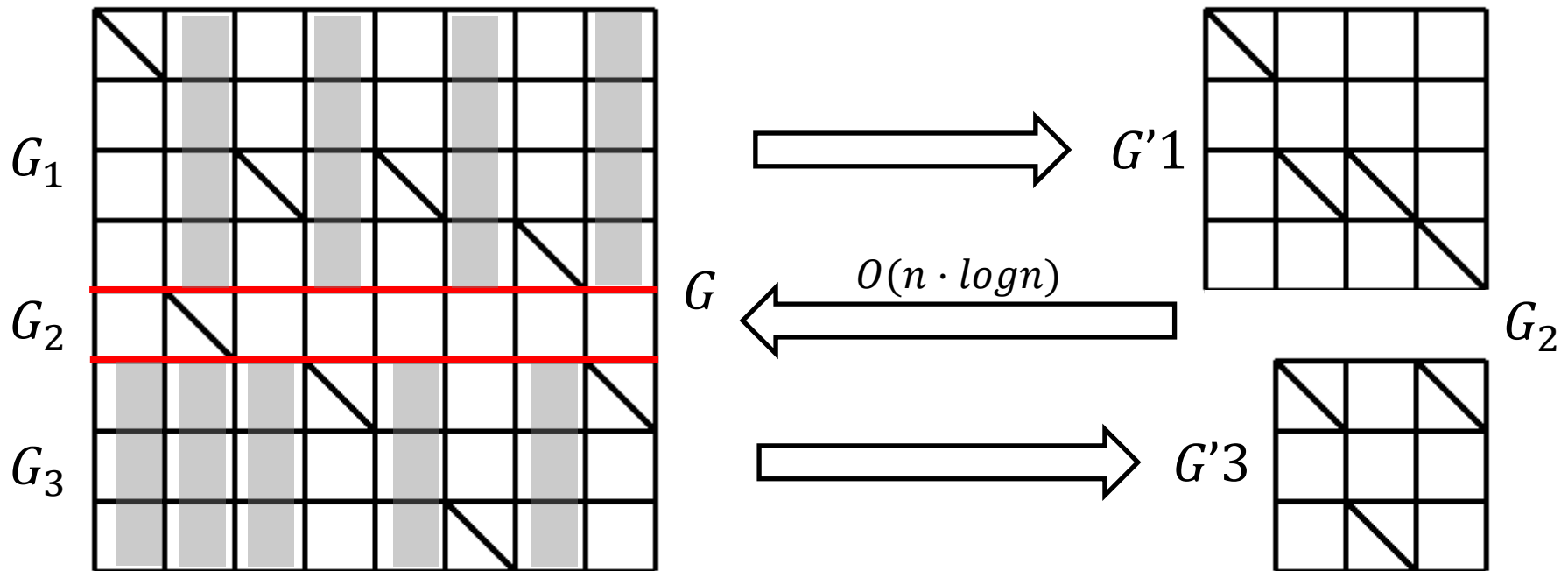
Algorithm for finite sparse BGAPS with $r \leq n$

- **Case 1:** G has at most $n / 2$ active edges:
- then there are at least $n / 2$ inactive rows and at least $n / 2$ inactive columns.
- Choose $n / 2$ inactive rows and $n / 2$ inactive columns and remove them from G to obtain a grid graph G' .
- Recursively compute $OUT(G')$ and then obtain $OUT(G)$.



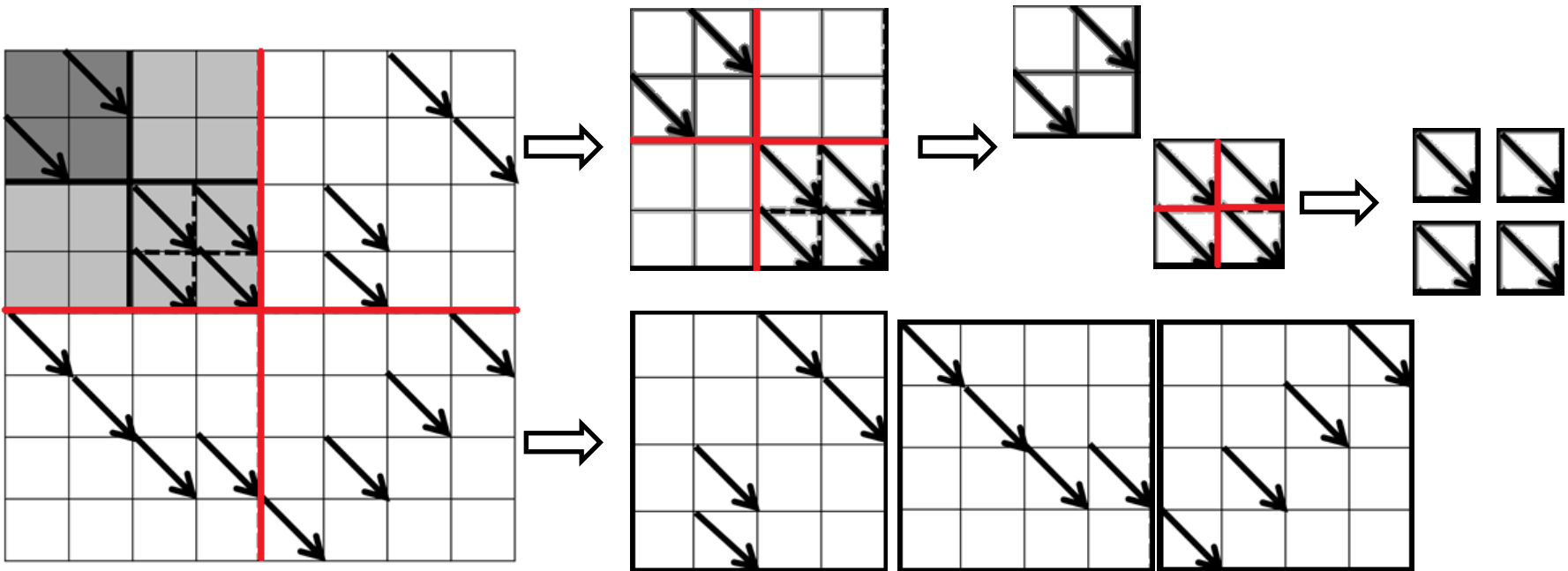
Algorithm for finite sparse BGAPS with $r \leq n$

- **Case 2:** G has more than $n / 2$ active edges:
- let i be the maximum index such that $G_1 = G[0..i, 0..n]$ has at most $n / 2$ active edges.
- Let $G_2 = G[i..i + 1, 0..n]$ and $G_3 = G[i + 1..n, 0..n]$.
- G_1, G_2, G_3 have at most $n / 2$ active edges.



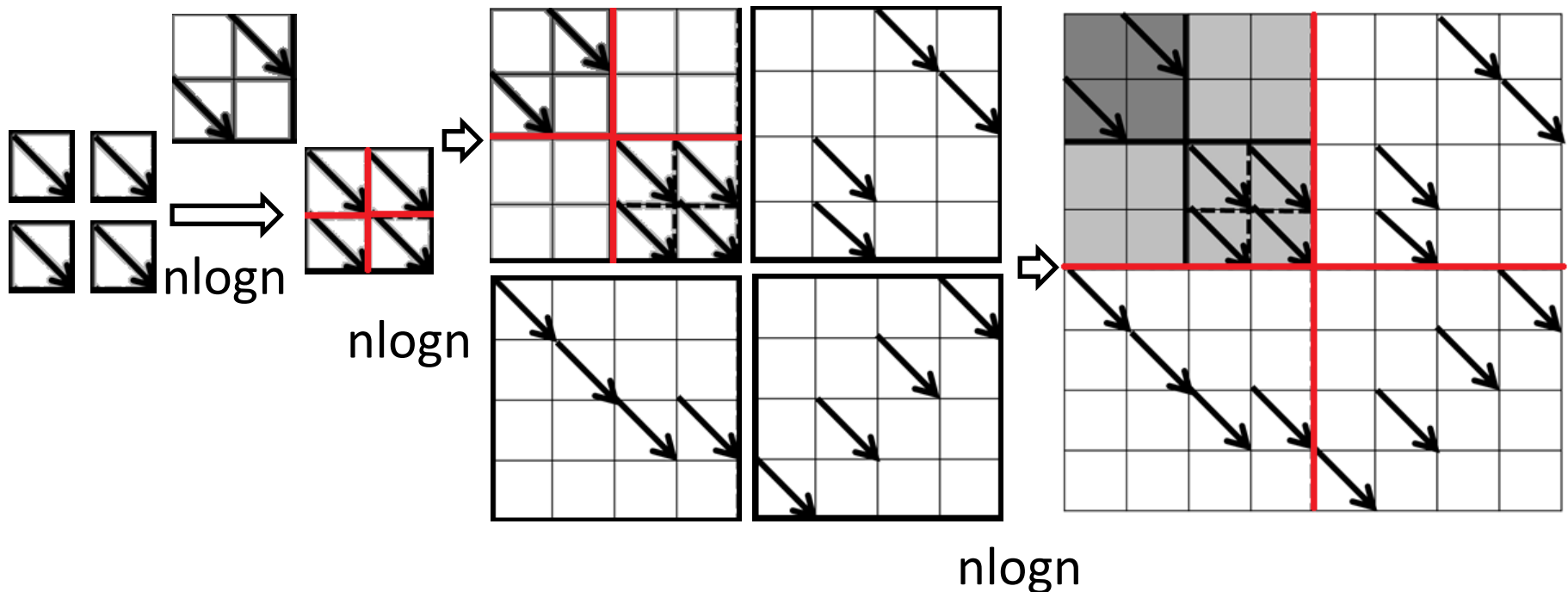
Algorithm for finite sparse BGAPS

- If the number of active edges is at most n , compute $OUT(G)$, Stop
- Partition G into four subgraphs:
 $G_1 = G[0..n/2, 0..n/2]$, $G_2 = G[0..n/2, n/2..n]$,
 $G_3 = G[n/2..n, 0..n/2]$, and $G_4 = G[n/2..n, n/2..n]$.
- Recursively compute $OUT(G_i)$ for each of the subgraphs.
- Compute $OUT(G)$ by application of Theorem 3 three times.



Algorithm for finite sparse BGAPS

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- Compute $OUT(G)$ by application of Theorem 3 three times.



Time complexity

- number of graphs handled in level j is at most 4^j
- number of subgraphs in level $j - 1$ with high r is at most $\frac{r}{n/2^{j-1}}$
- number of graphs handled in level j is at most $4 \times \frac{r}{n/2^{j-1}}$
- The time complexity of handling one subgraph in level j is either $O(n' \cdot \log^2 n')$ if amount of active edges is smaller than n' , and $O(n' \cdot \log n')$ otherwise.
- Therefore, the total time of the algorithm is

$$O\left(\sum_{j=0}^{\log n} \min\left(4^j, \frac{r \cdot 2^j}{n}\right) \cdot \frac{n}{2^j} \log^2 \frac{n}{2^j}\right) = O\left(r \cdot \log^3 \frac{n^2}{r}\right)$$

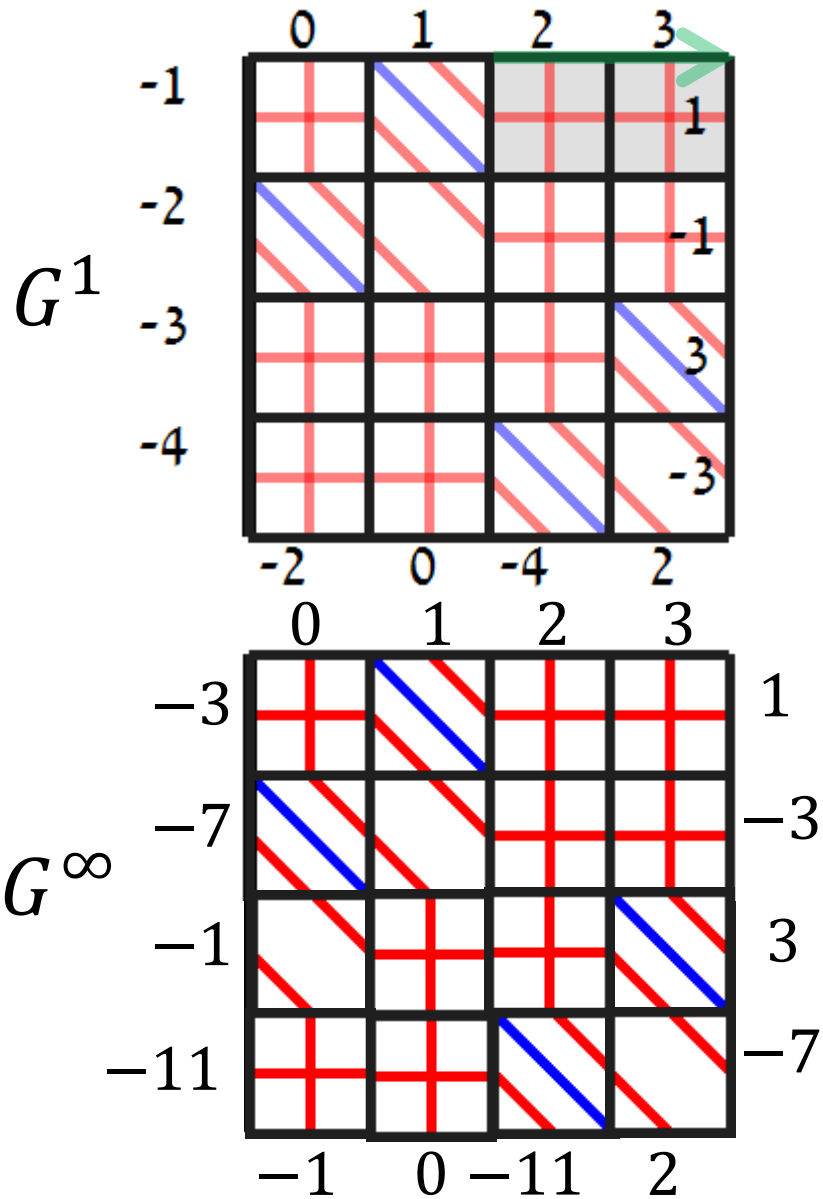
Where r is the number of edges whose weight is 1.

Contribution

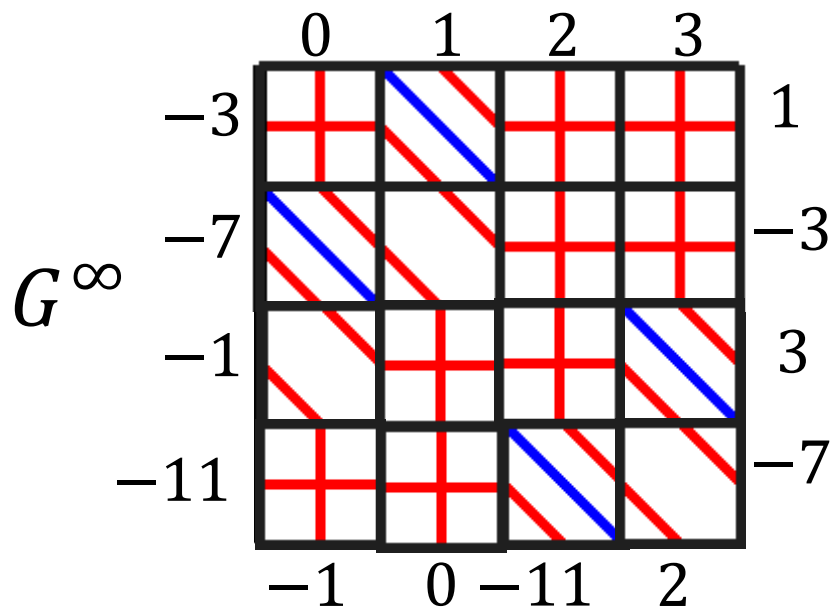
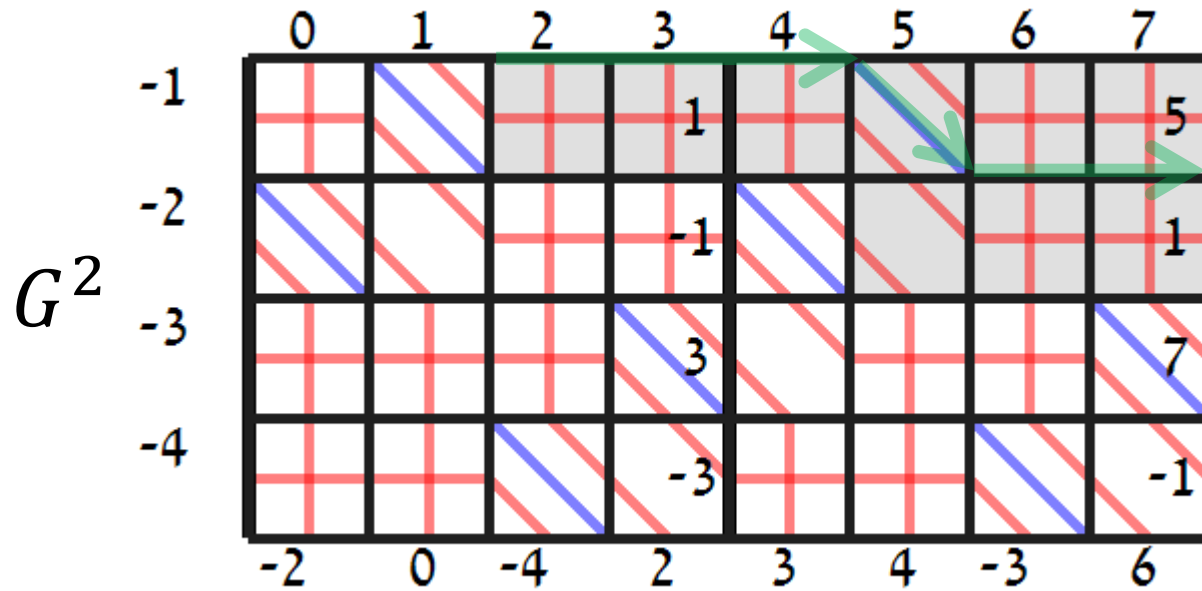
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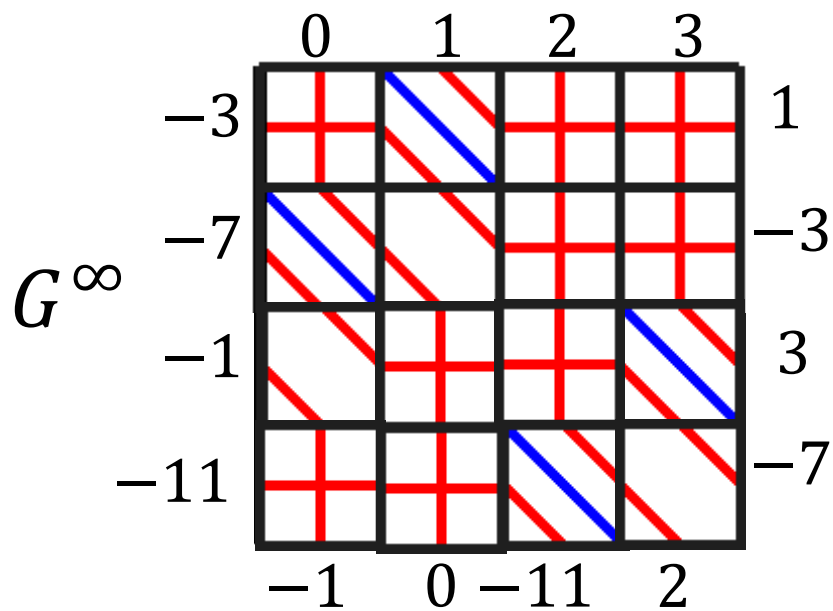
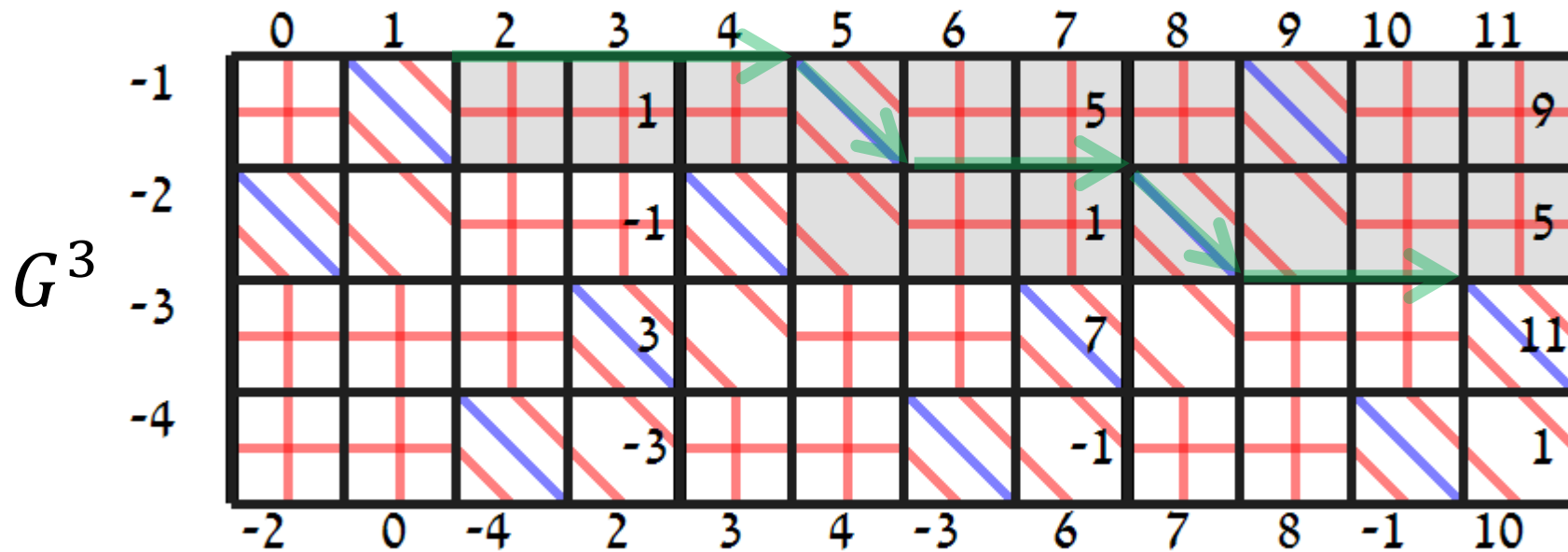
Algorithm for periodic BGAPS



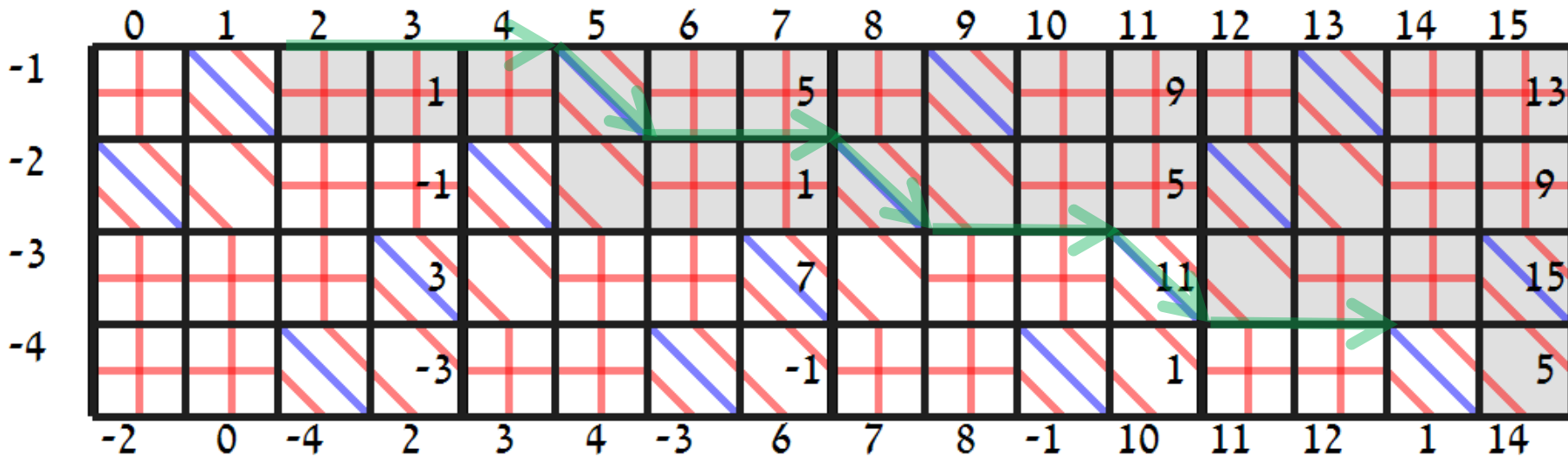
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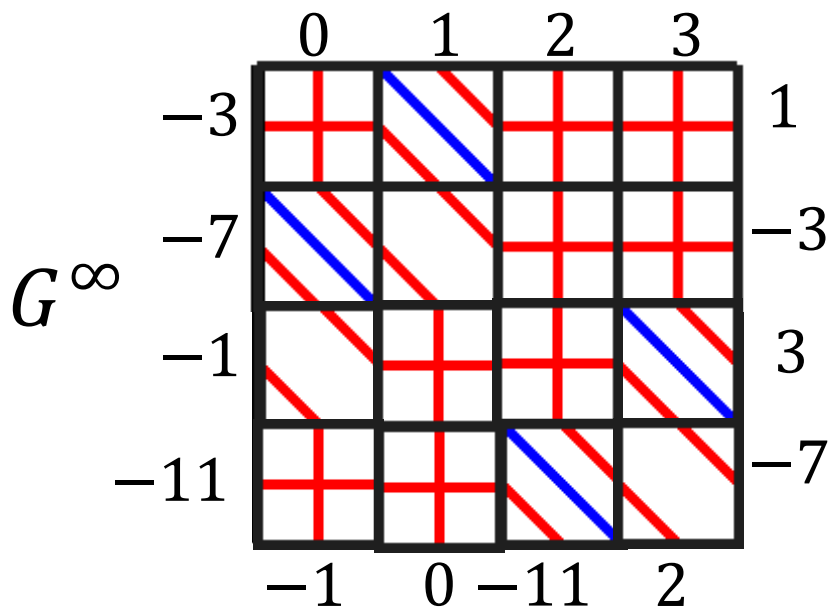
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Algorithm for periodic BGAPS

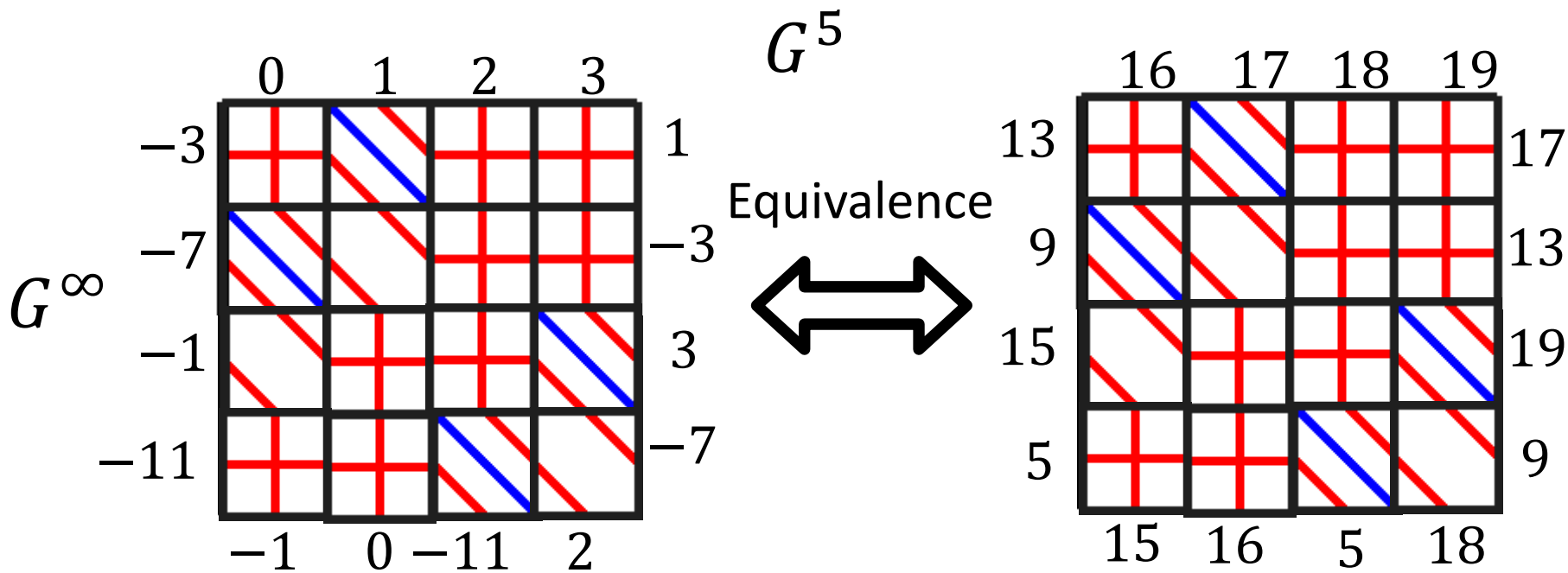
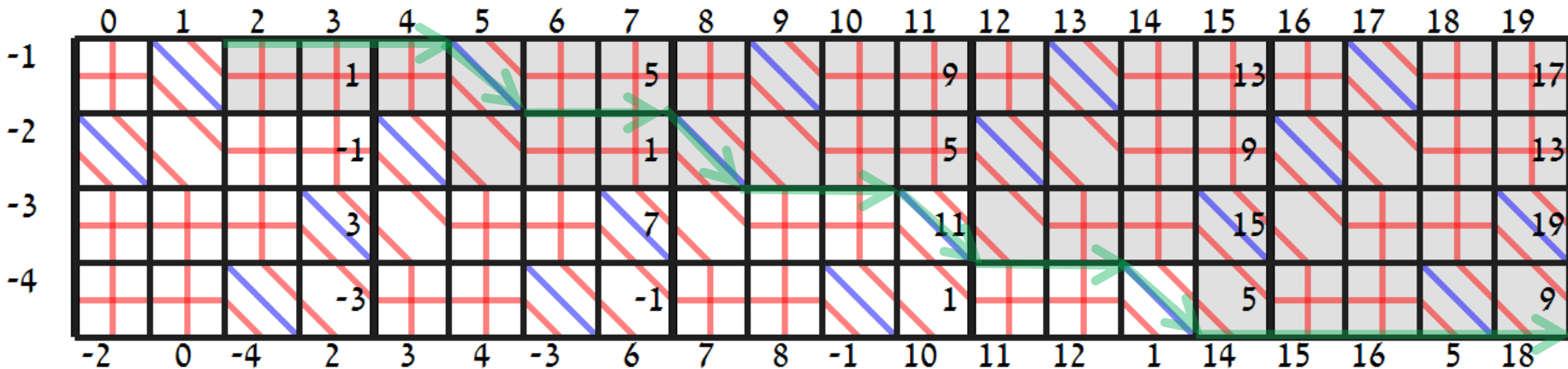


G^4



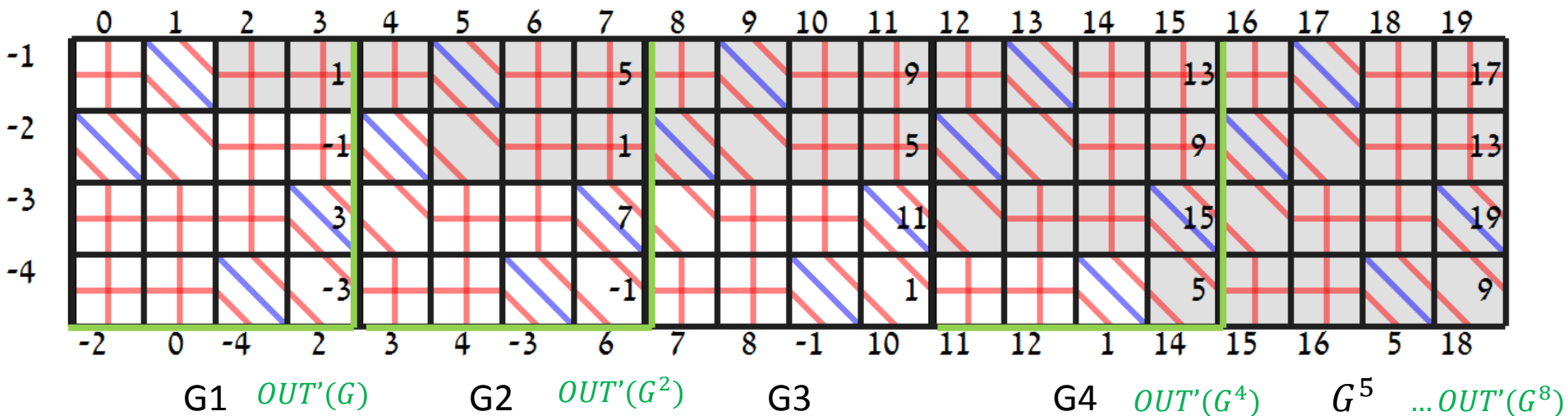
G^∞

Algorithm for periodic BGAPS



Algorithm for periodic BGAPS

- (1) Compute $OUT'(G)$.
- (2) Let n' be the smallest power of 2 which is greater than or equal to n
- (3) For $k = 1, 2, 4, \dots, n' / 2$ do
- (4) Compute $OUT'(G^{2k})$ from $OUT'(G^k)$
- (5) Output $(OUT'(G^{n'})[1] - (n' - 1)n, \dots, OUT'(G^{n'})[n] - (n' - 1)n)$



- Runtime: $T(G) + O(n \cdot \log^2 n)$, where
- $T(G)$ is the time complexity of solving BGAPS on G .

Summary

- sparse BGAPS – r represents the amount of edges with weight 1
- periodic sparse BGAPS – Graph is infinite and weights are periodic

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Thank you