

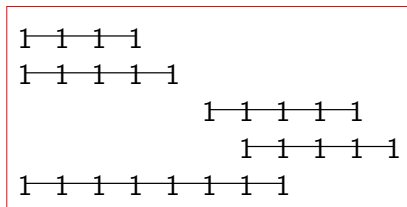
# The Search for Consecutive Ones Submatrices: Faster and More General

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Algorithms and Complexity in Durham 2007

# Consecutive Ones Property (C1P)



A 0/1-matrix has the C1P if its columns can be permuted such that in each row the 1's form a block.

# Consecutive Ones Property (C1P)

Example for a matrix having the C1P:

1	2	3	4	5
1	1			1
1		1		1
1		1	1	

# Consecutive Ones Property (C1P)

Example for a matrix having the C1P:

1 2 3 4 5

1 1            1

1            1        1

1            1 1

2 5 1 3 4

1—1—1

1—1—1

1—1—1

# Consecutive Ones Property (C1P)

Examples for matrices **not** having the C1P:

1	1	0
0	1	1
1	0	1

1	1	0	0
0	1	1	0
0	0	1	1
1	0	0	1

1	1	0	0	0
0	1	1	0	0
0	0	1	1	0
0	0	0	1	1
1	0	0	0	1

1	1	0	0
0	1	1	0
0	1	0	1

1	1	0	0	0	0
0	0	1	1	0	0
0	0	0	0	1	1
1	0	1	0	1	0

# Consecutive Ones Property (C1P)

The Consecutive Ones Property...

- ▶ ...expresses “locality” of the input data.
- ▶ ...appears in many applications, e.g.
  - ▶ in railway system optimization  
[Ruf, Schöbel, Discrete Optimization, 2004;  
Mecke, Wagner, ESA '04],
  - ▶ bioinformatics  
[Christof, Oswald, Reinelt, IPCO '98;  
Lu, Hsu, J. Comp. Biology, 2003].
- ▶ ...can be recognized in polynomial time  
[Booth, Lueker, J. Comput. System Sci., 1976;  
Meidanis, Porto, Telles, Discrete Appl. Math., 1998;  
Habib, McConnell, Paul, Viennot, Theor. Comput. Sci., 2000,  
Hsu, J. Algorithms, 2002; McConnell, SODA '04].
- ▶ ...is subject of current research  
[Hajiaghayi, Ganjali, Inf. Process. Lett., 2002;  
Tan, Zhang, Algorithmica, 2007].

# Problem Definition

## **Min-COS-C (Min-COS-R)**

*Given:* A matrix  $M$  and a positive integer  $k$ .

*Question:* Can we delete at most  $k$  columns (at most  $k$  rows) such that the resulting matrix has the C1P?

# Known and New Results

## Min-COS-C:

- ▶ NP-hard for  $(2, 3)$ - and  $(3, 2)$ -matrices<sup>1</sup>
- ▶ Approximation algorithms for maximization version on  $(2, 3)$ -,  $(3, 2)$ -, and  $(2, *)$ -matrices<sup>1</sup>
- ▶ FPT and approximation results for  $(*, 2)$ -,  $(2, *)$ - and  $(*, \Delta)$ -matrices<sup>2</sup>

## Min-COS-R:

- ▶ NP-hard for  $(3, 2)$ -matrices<sup>3</sup>

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<sup>1</sup>[Tan, Zhang, ISAAC '04]

<sup>2</sup>[Dom, Guo, Niedermeier, TAMC '07]

<sup>3</sup>[Garey, Johnson, 1979; Hajiaghayi, Ganjali, Inf. Process. Lett., 2002]



# Known and New Results

## Min-COS-C:

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- ▶ FPT and approximation results for  $(*, 2)$ -,  $(2, *)$ - and  $(*, \Delta)$ -matrices<sup>2</sup>
- ▶ Improved results for  $(*, \Delta)$ -matrices (FPT w.r.t  $(k, \Delta)$ )

## Min-COS-R:

- ▶ NP-hard for  $(3, 2)$ -matrices<sup>3</sup>
- ▶ FPT and approximation results for  $(*, \Delta)$ -matrices

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<sup>1</sup>[Tan, Zhang, ISAAC '04]

<sup>2</sup>[Dom, Guo, Niedermeier, TAMC '07]

<sup>3</sup>[Garey, Johnson, 1979; Hajiaghayi, Ganjali, Inf. Process. Lett., 2002]

# Structure of What Follows

- ▶ **Algorithmic Framework**
- ▶ From Circ1P to C1P

# Min-COS-C / Min-COS-R on $(*, \Delta)$ -Matrices

$$\begin{array}{ccc}
 \overbrace{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \mathbf{\quad \quad \quad \dots} \\ \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{1 \ 0 \ \dots \ 0 \ 1} \\ \hline \end{array}}^{p+2} & \left. \begin{array}{c} \overbrace{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \mathbf{\quad \quad \quad \dots} \\ \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{0 \ 1 \ \quad \quad \dots \ 1} \\ \mathbf{1 \ \dots \ 1 \ 0 \ 1} \\ \hline \end{array}}^{p+3} \\ \left. \right\}^{p+2} & \overbrace{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \mathbf{\quad \quad \quad \dots} \\ \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{0 \ 1 \ \dots \ 1 \ 0 \ 1} \\ \hline \end{array}}^{p+3} \left. \right\}^{p+2} \\
 M_{I_p}, p \geq 1 & M_{II_p}, p \geq 1 & M_{III_p}, p \geq 1
 \end{array}$$

$$\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ 0 \ 0 \ 0} \\ \mathbf{0 \ 0 \ 1 \ 1 \ 0 \ 0} \\ \mathbf{0 \ 0 \ 0 \ 0 \ 1 \ 1} \\ \mathbf{1 \ 0 \ 1 \ 0 \ 1 \ 0} \\ \hline \end{array}$$

$M_{IV}$

$$\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ 0 \ 0} \\ \mathbf{0 \ 0 \ 1 \ 1 \ 0} \\ \mathbf{1 \ 1 \ 1 \ 1 \ 0} \\ \mathbf{1 \ 0 \ 1 \ 0 \ 1} \\ \hline \end{array}$$

$M_V$

**Theorem:** A matrix has the C1P iff it contains none of the shown matrices.

[Tucker, Journal of Combinatorial Theory (B), 1972]

# Min-COS-C / Min-COS-R on $(*, \Delta)$ -Matrices

$$\begin{array}{c}
 \overbrace{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{\dots} \\ \hline \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{1 \ 0 \ \dots \ 0 \ 1} \\ \hline \end{array}}^{p+2} \left. \vphantom{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{\dots} \\ \hline \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{1 \ 0 \ \dots \ 0 \ 1} \\ \hline \end{array}} \right\} p+2 \\
 M_{I_p}, p \geq 1
 \end{array}
 \qquad
 \begin{array}{c}
 \overbrace{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{\dots} \\ \hline \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{0 \ 1 \ \dots \ \dots \ 1} \\ \hline \mathbf{1 \ \dots \ 1 \ 0 \ 1} \\ \hline \end{array}}^{p+3} \left. \vphantom{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{\dots} \\ \hline \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{0 \ 1 \ \dots \ \dots \ 1} \\ \hline \mathbf{1 \ \dots \ 1 \ 0 \ 1} \\ \hline \end{array}} \right\} p+3 \\
 M_{II_p}, p \geq 1
 \end{array}
 \qquad
 \begin{array}{c}
 \overbrace{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{\dots} \\ \hline \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{0 \ 1 \ \dots \ 1 \ 0 \ 1} \\ \hline \end{array}}^{p+3} \left. \vphantom{\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{0 \ 1 \ 1 \ 0 \ \dots \ 0} \\ \hline \mathbf{\dots} \\ \hline \mathbf{0 \ \dots \ 0 \ 1 \ 1} \\ \hline \mathbf{0 \ 1 \ \dots \ 1 \ 0 \ 1} \\ \hline \end{array}} \right\} p+2 \\
 M_{III_p}, p \geq 1
 \end{array}$$

$$\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ 0 \ 0 \ 0} \\ \hline \mathbf{0 \ 0 \ 1 \ 1 \ 0 \ 0} \\ \hline \mathbf{0 \ 0 \ 0 \ 0 \ 1 \ 1} \\ \hline \mathbf{1 \ 0 \ 1 \ 0 \ 1 \ 0} \\ \hline \end{array}$$

$M_{IV}$

$$\begin{array}{|c|} \hline \mathbf{1 \ 1 \ 0 \ 0 \ 0} \\ \hline \mathbf{0 \ 0 \ 1 \ 1 \ 0} \\ \hline \mathbf{1 \ 1 \ 1 \ 1 \ 0} \\ \hline \mathbf{1 \ 0 \ 1 \ 0 \ 1} \\ \hline \end{array}$$

$M_V$

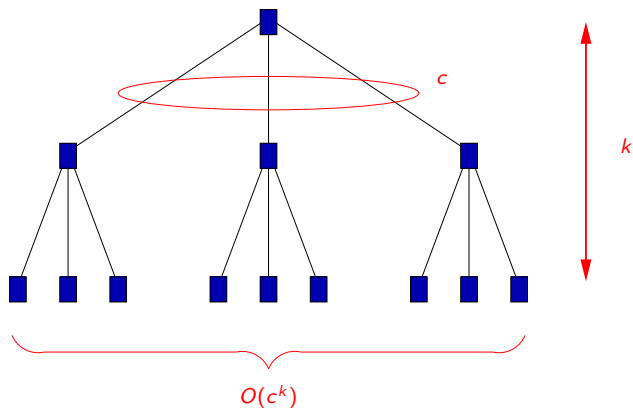
Approach: Use a search tree algorithm.

Repeat:

1. Search for a “forbidden submatrix”.
2. Branch on which of its columns has to be deleted.

# Min-COS-C / Min-COS-R on $(*, \Delta)$ -Matrices

Search Tree Algorithm:



Finite size  $c$  of forbidden matrices  $\Rightarrow$  search tree of size  $O(c^k)$ .  
(Alternatively: Factor- $c$  approximation algorithm.)

# Min-COS-C / Min-COS-R on $(*, \Delta)$ -Matrices

$$\begin{array}{c}
 \overbrace{\quad\quad\quad}^{p+2} \\
 \left[ \begin{array}{cccc}
 1 & 1 & 0 & \cdots & 0 \\
 0 & 1 & 1 & 0 & \cdots & 0 \\
 & & \cdots & & & \\
 0 & \cdots & 0 & 1 & 1 & \\
 1 & 0 & \cdots & 0 & 1 & 
 \end{array} \right] \left. \vphantom{\begin{array}{c} \overbrace{\quad\quad\quad}^{p+2} } \right\} p+2 \\
 M_{I_p}, p \geq 1
 \end{array}$$

$$\begin{array}{c}
 \overbrace{\quad\quad\quad}^{p+3} \\
 \left[ \begin{array}{cccc}
 1 & 1 & 0 & \cdots & 0 \\
 0 & 1 & 1 & 0 & \cdots & 0 \\
 & & \cdots & & & \\
 0 & \cdots & 0 & 1 & 1 & 0 \\
 0 & 1 & \cdots & & & 1 \\
 1 & \cdots & & 1 & 0 & 1 
 \end{array} \right] \left. \vphantom{\begin{array}{c} \overbrace{\quad\quad\quad}^{p+3} } \right\} p+3 \\
 M_{II_p}, p \geq 1
 \end{array}$$

$$\begin{array}{c}
 \overbrace{\quad\quad\quad}^{p+3} \\
 \left[ \begin{array}{cccc}
 1 & 1 & 0 & \cdots & 0 \\
 0 & 1 & 1 & 0 & \cdots & 0 \\
 & & \cdots & & & \\
 0 & \cdots & 0 & 1 & 1 & 0 \\
 0 & 1 & \cdots & 1 & 0 & 1 
 \end{array} \right] \left. \vphantom{\begin{array}{c} \overbrace{\quad\quad\quad}^{p+3} } \right\} p+2 \\
 M_{III_p}, p \geq 1
 \end{array}$$

$$\begin{bmatrix}
 1 & 1 & 0 & 0 & 0 & 0 \\
 0 & 0 & 1 & 1 & 0 & 0 \\
 0 & 0 & 0 & 0 & 1 & 1 \\
 1 & 0 & 1 & 0 & 1 & 0
 \end{bmatrix}$$

$M_{IV}$

$$\begin{bmatrix}
 1 & 1 & 0 & 0 & 0 \\
 0 & 0 & 1 & 1 & 0 \\
 1 & 1 & 1 & 1 & 0 \\
 1 & 0 & 1 & 0 & 1
 \end{bmatrix}$$

$M_V$

A  $(*, \Delta)$ -matrix can contain

- ▶  $M_{I_p}$  with unbounded size,
- ▶  $M_{II_p}$  with  $1 \leq p \leq \Delta - 2$ ,
- ▶  $M_{III_p}$  with  $1 \leq p \leq \Delta - 1$ ,
- ▶  $M_{IV}$ , and  $M_V$ .

# Min-COS-C / Min-COS-R on $(*, \Delta)$ -Matrices

Problem: Matrices  $M_{I_p}$  of unbounded size can occur.

# Min-COS-C / Min-COS-R on $(*, \Delta)$ -Matrices

Problem: Matrices  $M_{I_p}$  of unbounded size can occur.

Idea: First destroy all “small” forbidden submatrices (search tree algorithm), and then see what happens. . .



# Min-COS-C / Min-COS-R on $(*, \Delta)$ -Matrices

Algorithmic framework for Min-COS-C / Min-COS-R:

1. Destroy the submatrices from

$$X := \{M_{I_p} \mid 1 \leq p \leq \Delta - 1\} \cup \{M_{II_p} \mid 1 \leq p \leq \Delta - 2\} \\ \cup \{M_{III_p} \mid 1 \leq p \leq \Delta - 1\} \cup \{M_{IV}, M_V\}.$$

2. Destroy the remaining  $M_{I_p}$  ( $p \geq \Delta$ ).

*Theorem:* If a  $(*, \Delta)$ -matrix  $M$  contains none of the matrices in  $X$  as a submatrix, then  $M$  can be partitioned into “independent” submatrices that have the “*circular ones property (Circ1P)*”.

[Dom, Guo, Niedermeier, TAMC '07]

# Min-COS-C / Min-COS-R on $(*, \Delta)$ -Matrices

## FPT algorithm:

Running time:

$$\frac{(|\text{submatrix}|)^k \cdot (\text{search} + \text{"Circ1P} \rightarrow \text{C1P"} \text{ time})}{\text{Old}^4: (\Delta + 2)^k \cdot (n^{O(\Delta)} + n^{O(\Delta)}) \quad (\text{only Min-COS-C})}$$
$$\text{New: } (\Delta + 2)^k \cdot (n^{O(1)} + O(\Delta mn))$$

## Approximation algorithm:

Approximation factor:  $|\text{submatrix}|$

Running time:  $k \cdot (\text{search} + \text{"Circ1P} \rightarrow \text{C1P"} \text{ time})$

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<sup>4</sup>[Dom, Guo, Niedermeier, TAMC '07]

# Structure of the Talk

- ▶ Algorithmic Framework
- ▶ **From Circ1P to C1P**

# From Circ1P to C1P

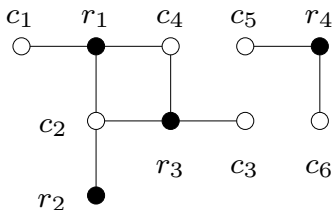
Again:

*Theorem:* If a  $(*, \Delta)$ -matrix  $M$  contains none of the matrices in  $X$  as a submatrix, then  $M$  can be partitioned into “independent” submatrices that have the “*circular ones property (Circ1P)*”.

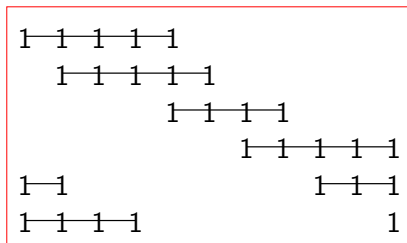
[Dom, Guo, Niedermeier, TAMC '07]

# "Independent" Submatrices

	$c_1$	$c_2$	$c_3$	$c_4$	$c_5$	$c_6$
$r_1$	<b>1</b>	<b>1</b>	0	<b>1</b>	0	0
$r_2$	0	<b>1</b>	0	0	0	0
$r_3$	0	<b>1</b>	<b>1</b>	<b>1</b>	0	0
$r_4$	0	0	0	0	<b>1</b>	<b>1</b>



# The Circular Ones Property (Circ1P)



A 0/1-matrix  $M$  has the Circ1P if its columns can be permuted such that in each row the 1's form a block *when  $M$  is wrapped around a vertical cylinder*.

## From Circ1P to C1P

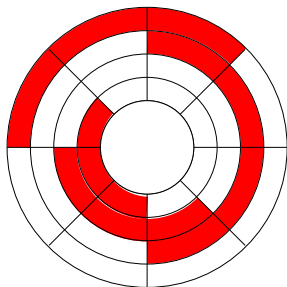
- C1P: 1's blockwise after column permutations
- Circ1P: 1's blockwise on a cylinder  
after column permutations
- strong C1P: 1's blockwise *without* column permutations
- strong Circ1P: 1's blockwise on a cylinder  
*without* column permutations

(Circ1P/C1P means: Strong Circ1P/strong C1P can be obtained by column permutations.)

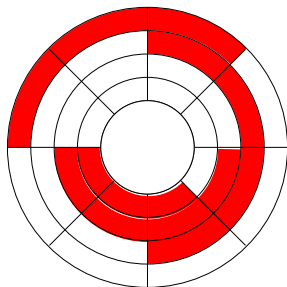
## From Circ1P to C1P

We imagine the matrices as wrapped around a vertical cylinder.

Strong Circ1P:



Strong C1P:

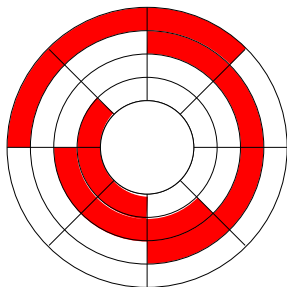




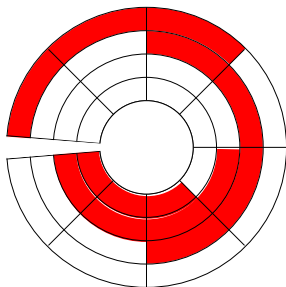
## From Circ1P to C1P

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Strong Circ1P:



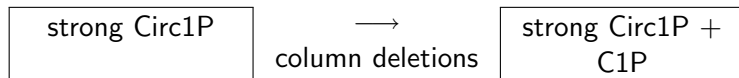
Strong C1P:



Strong C1P =  
Strong Circ1P + “cut”

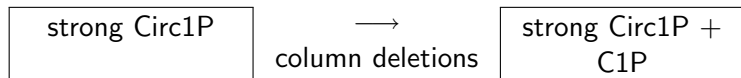
# From Circ1P to C1P

Our task:

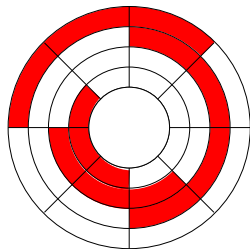
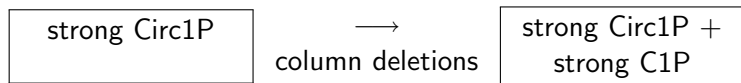


# From Circ1P to C1P

Our task:

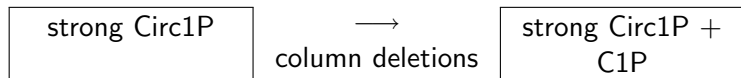


First consider this task:

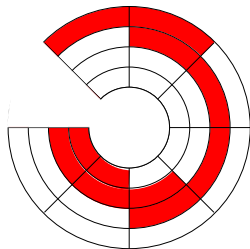
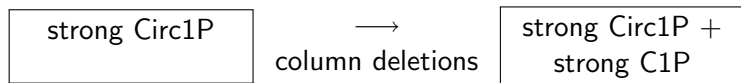


# From Circ1P to C1P

Our task:



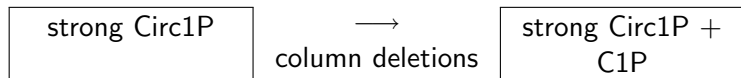
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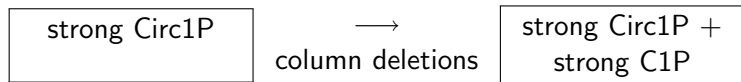
*Obs.:* Deleting a consecutive set of columns is always optimal.

# From Circ1P to C1P

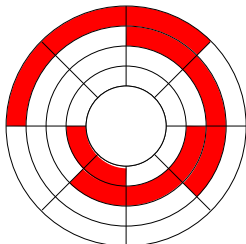
Our task:



Easy task:



We hope: Does “strong Circ1P + C1P” imply “strong C1P”?



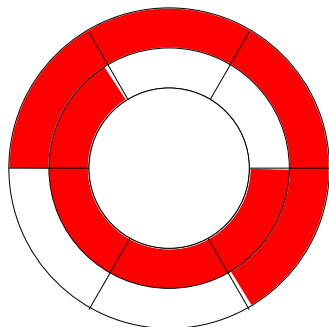
## From Circ1P to C1P

*Conjecture:* If a matrix has the strong Circ1P and the C1P, then it has also the strong C1P.

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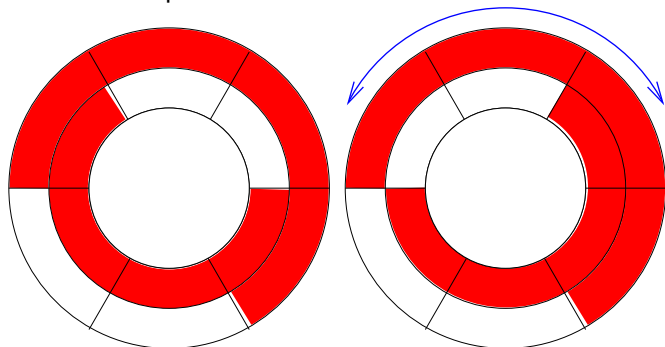
Counterexample:



## From Circ1P to C1P

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Counterexample:

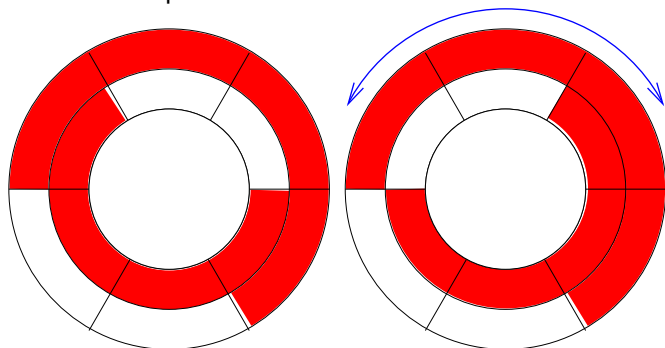




## From Circ1P to C1P

*Conjecture:* If a matrix has the strong Circ1P and the C1P, then it has also the strong C1P.

Counterexample:



*New conjecture:* If a matrix with  $\geq 2\Delta - 1$  columns has the strong Circ1P and the C1P, then it has also the strong C1P.

## From Circ1P to C1P

*To be proven:* If a matrix with  $\geq 2\Delta - 1$  columns has the strong Circ1P and the C1P, then it has also the strong C1P.

Very helpful:

*Theorem:* Let  $M$  have the strong Circ1P. Then every column permutation that also yields the strong Circ1P can be obtained by a series of circular module reversals.

[Hsu, McConnell, Theor. Comput. Sci., 2003]

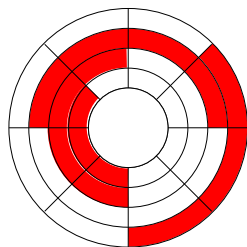
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strong Circ1P + C1P

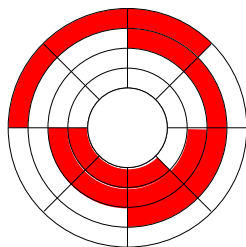
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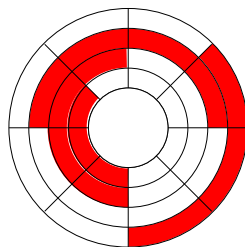
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strong Circ1P + strong C1P



strong Circ1P + C1P

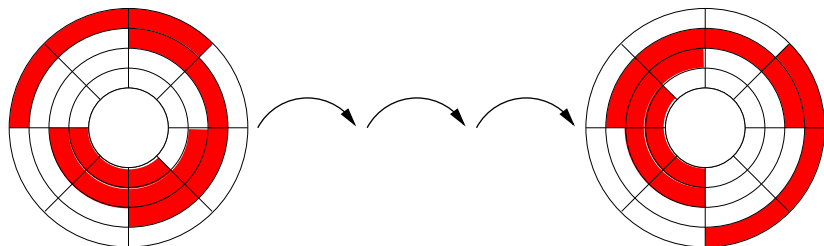
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strong Circ1P + strong C1P

strong Circ1P + C1P

## From Circ1P to C1P

*Now to be proven:* Let  $M$  be a matrix with  $\geq 2\Delta - 1$  columns that has the strong Circ1P and the strong C1P. Reversing an arbitrary circular module of  $M$  does not affect these properties.

# From Circ1P to C1P

Algorithm for Min-COS-C on matrices with Circ1P:

1. Permute the columns to get the strong Circ1P.
2. Search for a set of *consecutive* consecutive columns whose deletion yields the strong C1P.

# Main Open Question

How can a matrix that has the (strong) Circ1P be modified by deleting a minimum number of 1-entries such that the resulting matrix has the C1P?