

# Multidimensional Binary Vector Assignment problem: standard, structural and above guarantee parameterizations

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joint work with Marin Bougeret<sup>2</sup>, Guillaume Duvillié<sup>2</sup>, Rodolphe Giroudeau<sup>2</sup>

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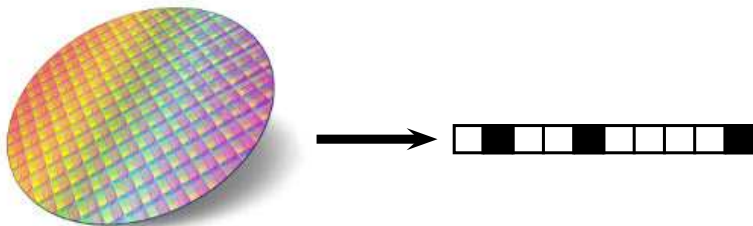
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- 3 Above guarantee parameterization
- 4 Lower bounds
- 5 Conclusion

# Applications

Yield maximization in wafer-to-wafer 3D chip integration.

## MULTIDIMENSIONAL BINARY VECTOR ASSIGNMENT

- a wafer = a binary vector of good/bad dies (1/0)

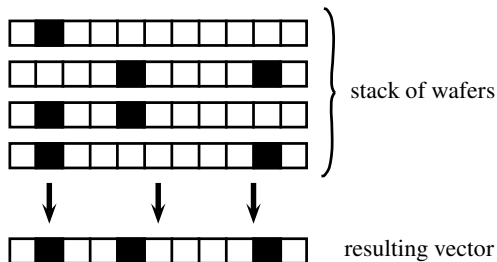


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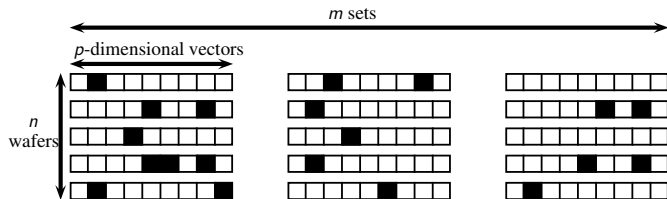


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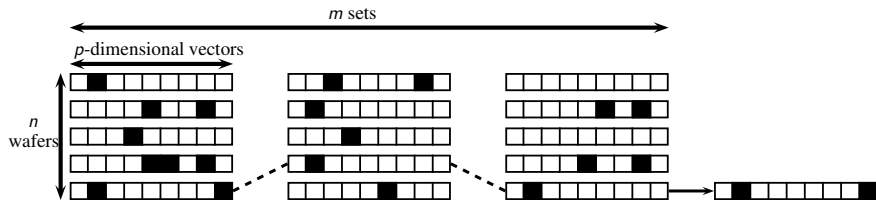


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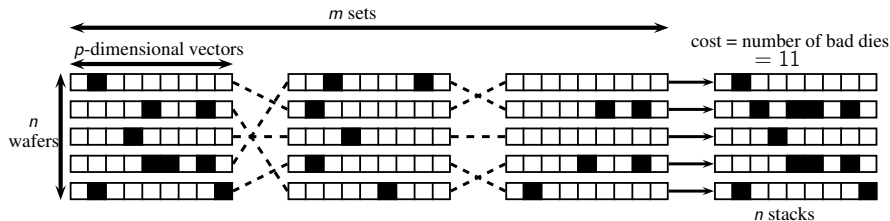


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  - ▶ W[1]-hard for standard parameter (maximization version)

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A problem is **FPT** if there is an algorithm solving any instance  $\mathcal{I}$  in time  $O( f(\kappa(\mathcal{I})) \text{ poly}(|\mathcal{I}|) )$

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Corresponding lower bounds:

- $W[1]$ ,  $W[2]$ -hardness: we suppose  $FPT \neq W[1], W[2]$
- Exponential Time Hypothesis: we suppose that 3-SAT cannot be solved in time  $O^*(2^{o(n)})$  ( $n$  = number of variables)

## First observations

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- Input:  $m$  sets of  $n$  wafers ( $p$ -dimensional binary vectors)
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Warmup: is it always safe to create "full-good stacks" ?



set 1



set 2



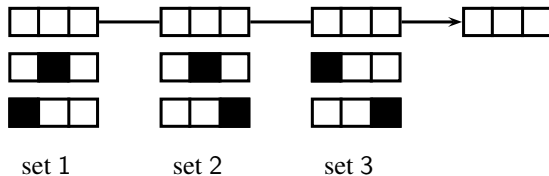
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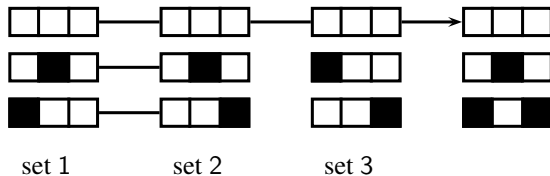


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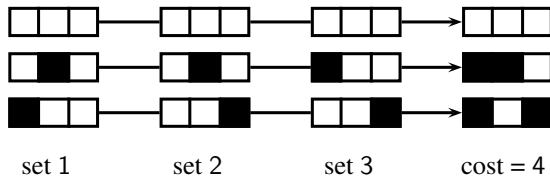


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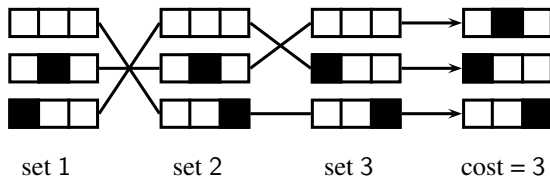


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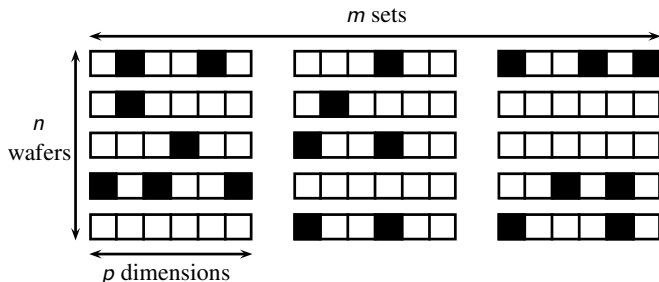
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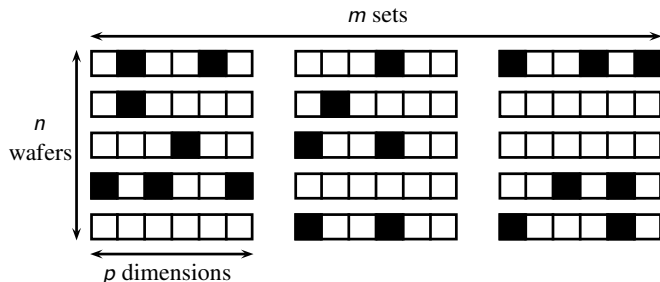
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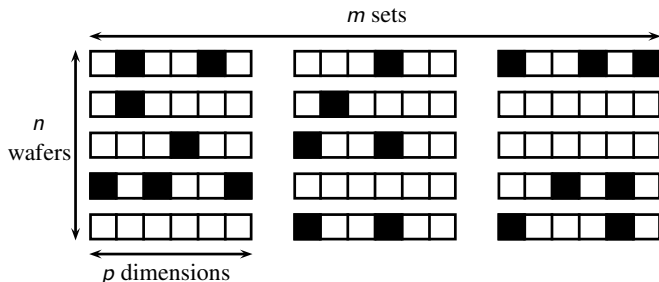
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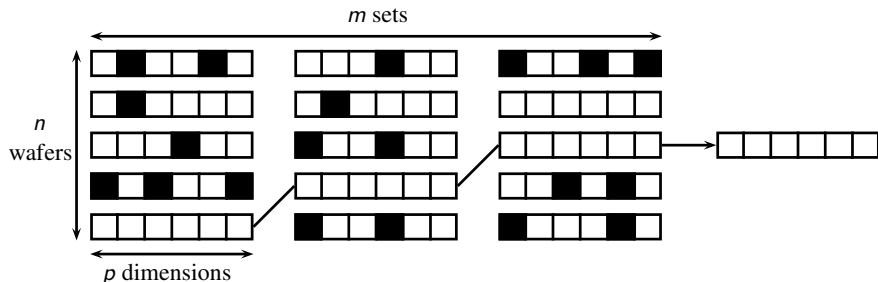
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- each set must have a full-good wafer (otherwise cost  $\geq n > k$ )
  - any solution must have a full-good stack (same argument)
- $\Rightarrow$  we can arbitrarily form a full-good stack  
remove it, and continue until  $n \leq k$

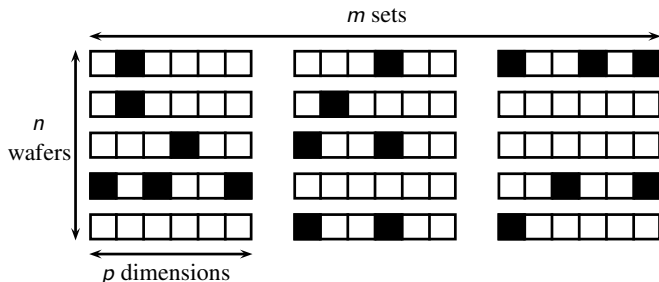
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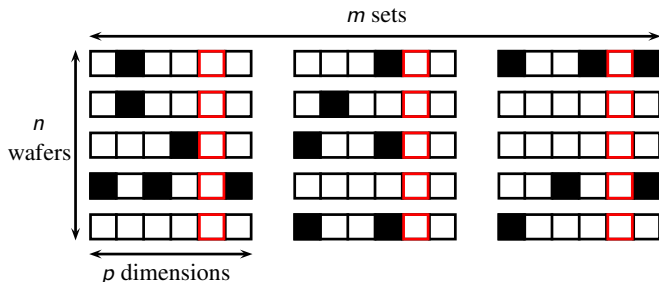
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- if there is a component with good dies everywhere

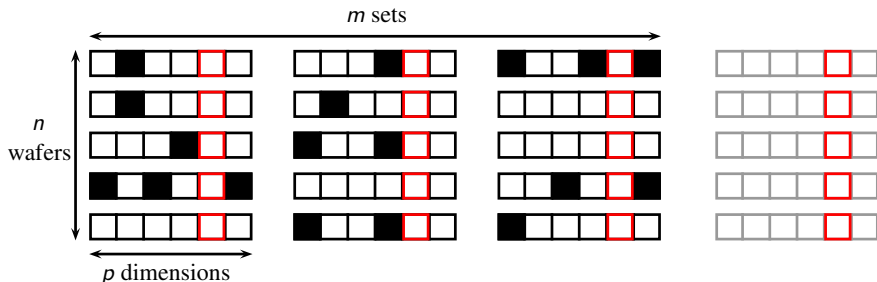
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- if there is a component with good dies everywhere  
⇒ any solution will also have this good die

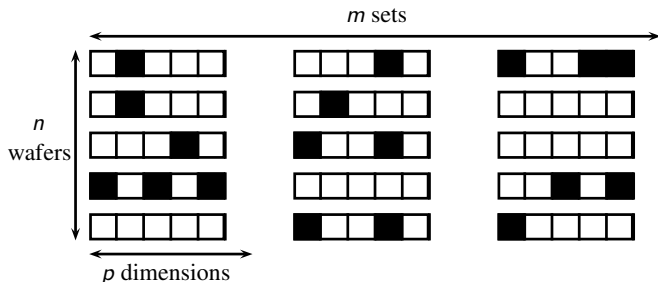
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- we can remove the component from the instance

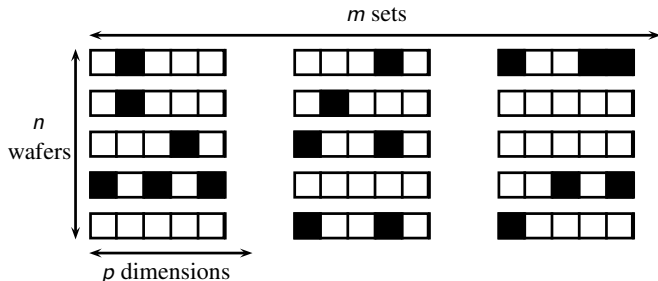
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- if there is a component with good dies everywhere  
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- we can remove the component from the instance  
⇒ the cost of any solution will be at least  $p$



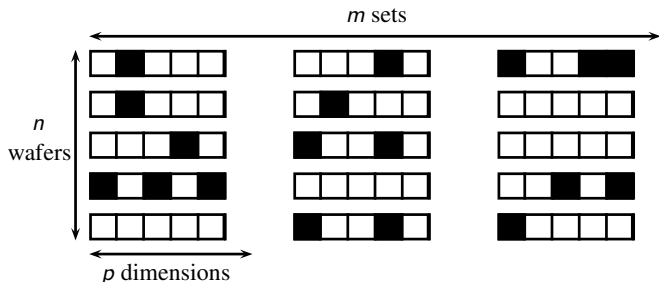
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- From any instance, we can produce in polynomial time an equivalent one of size at most  $O(k^2 m)$   $\Rightarrow$  kernel of size  $O(k^2 m)$

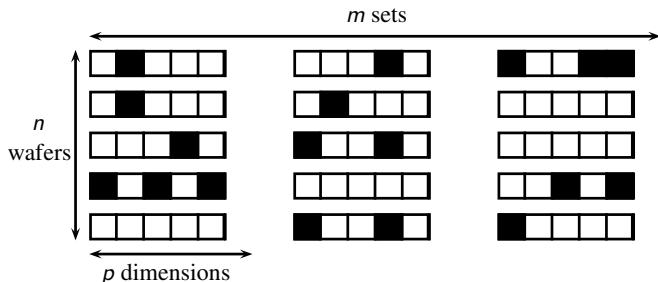
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- No kernel polynomial in  $p$  even for  $m = 3$  (unless  $NP \subseteq coNP/poly$ )

## Above guarantee parameterization

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We just proved that we can suppose  $n, p \leq k \Rightarrow k$  is a too large parameter

Idea: subtracting a lower bound to the objective function

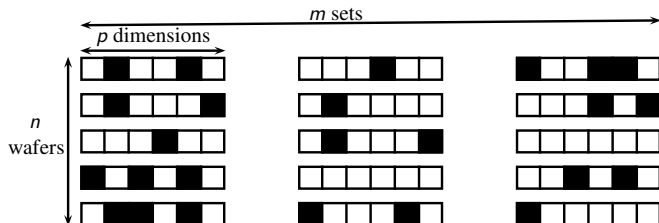
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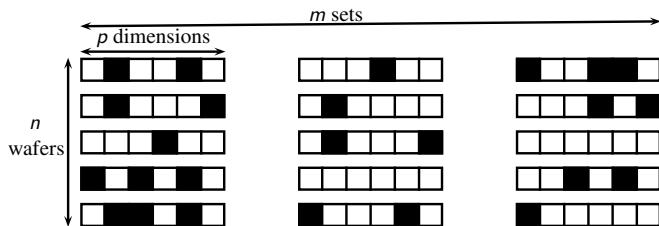
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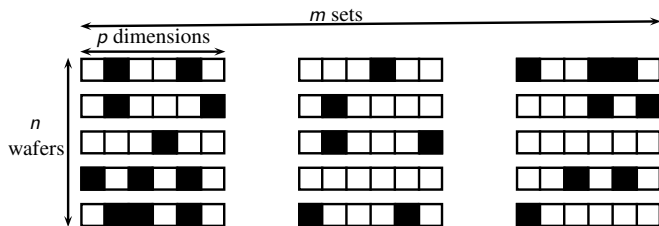
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Let  $\mathcal{B}$  be the maximum number of bad dies in a set

$\Rightarrow$  parameter  $\zeta_{\mathcal{B}} = k - \mathcal{B}$



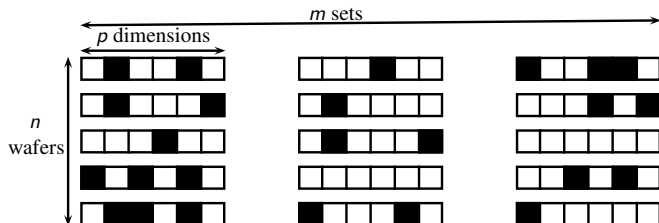
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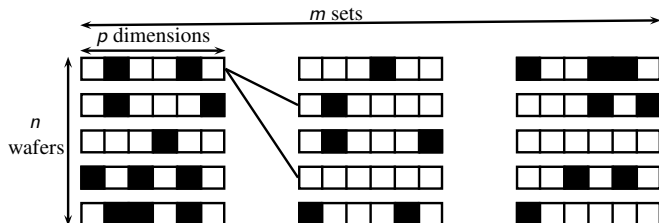


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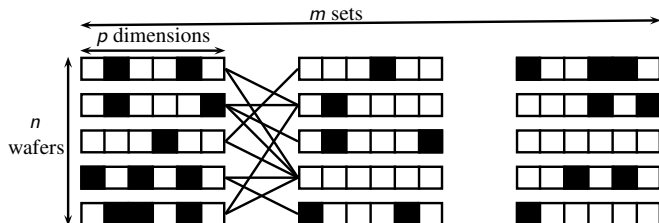


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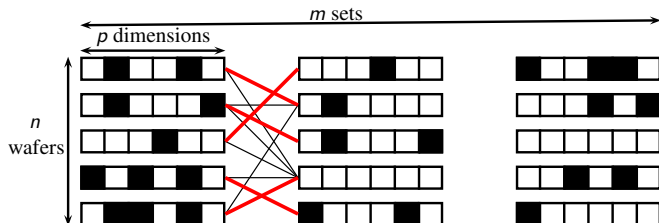


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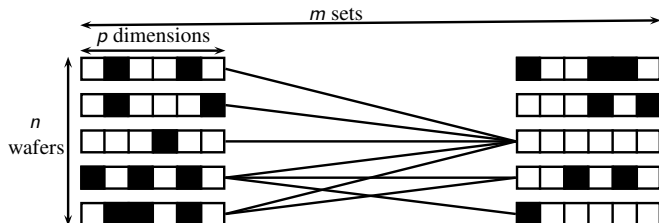


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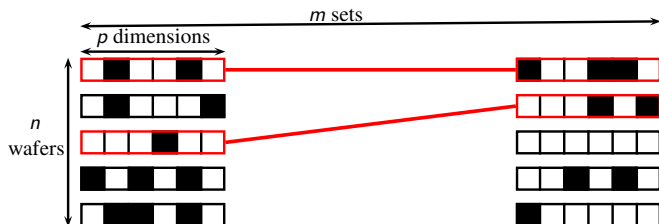


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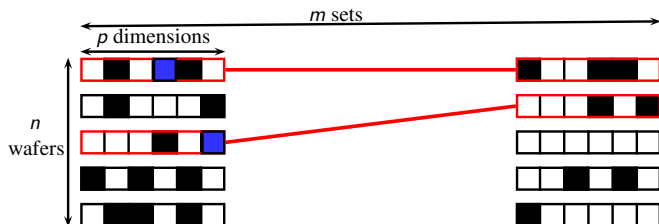


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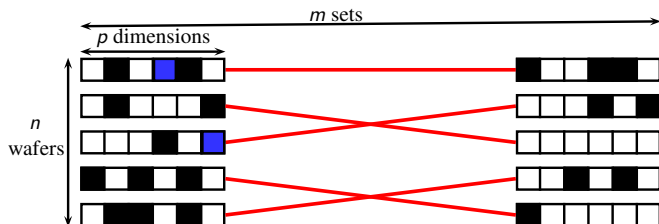


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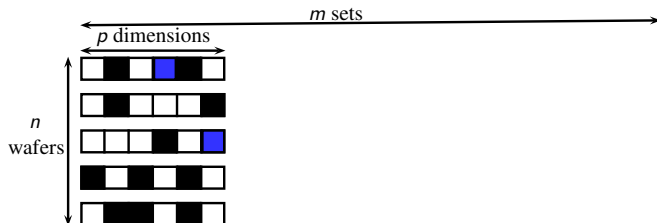


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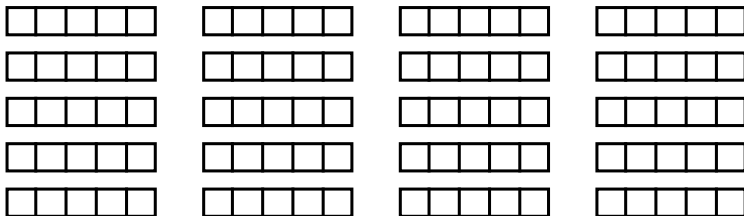
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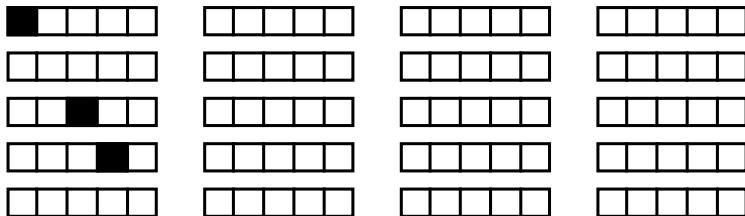
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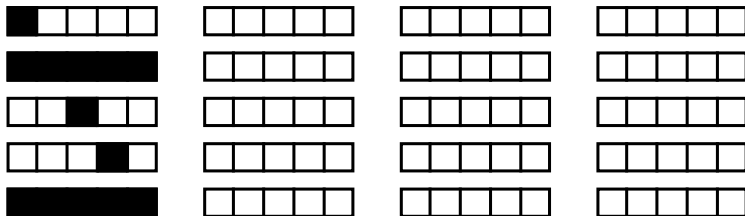
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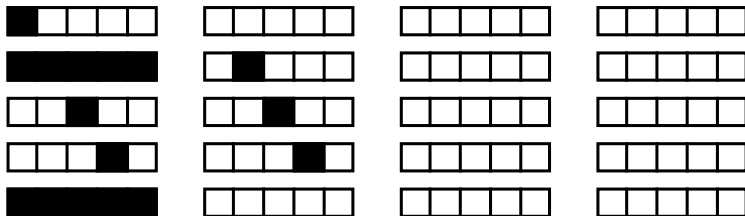
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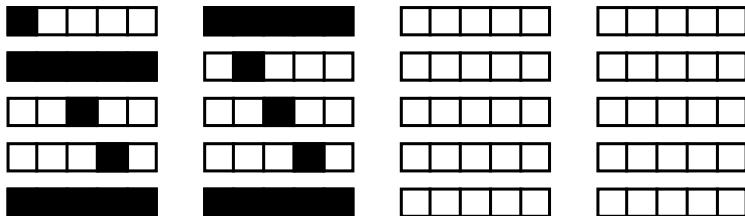
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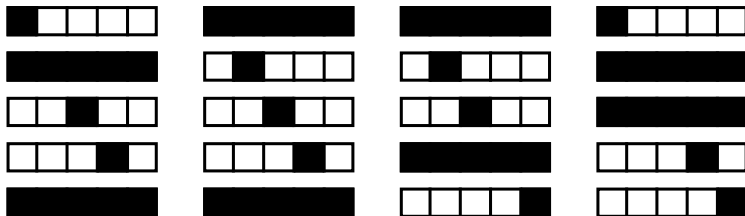
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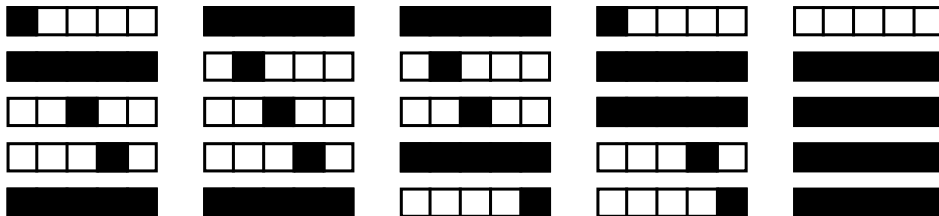
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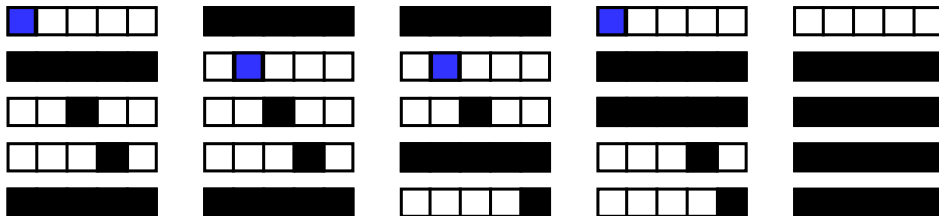
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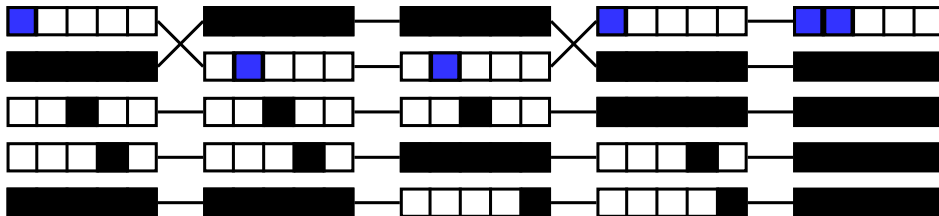
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# Summary of the results

Positive results	Negative results
$O(k^2 m)$ kernel	no $p^{O(1)}$ kernel unless $NP \subseteq coNP/poly$
$O^*(4^{\zeta_B \log(n)})$ algorithm	$W[2]$ -hard for $\zeta_B$ only no $2^{o(\zeta_B \log(n))}$ nor $2^{\zeta_B o(\log(n))}$ under $ETH$ no $2^{o(k)}$ for fixed $n$ under $ETH$
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### Open questions:

- algorithm in  $O^*(2^k)$  ? ( $n$  part of the input)
- polynomial kernel parameterized by  $k$  only ?

Thank you for your attention !