

# The Graph Motif problem parameterized by the structure of its input graph

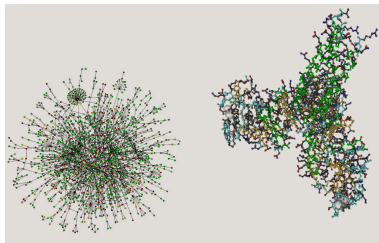
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Budapest, Hungary (MTA SZTAKI)

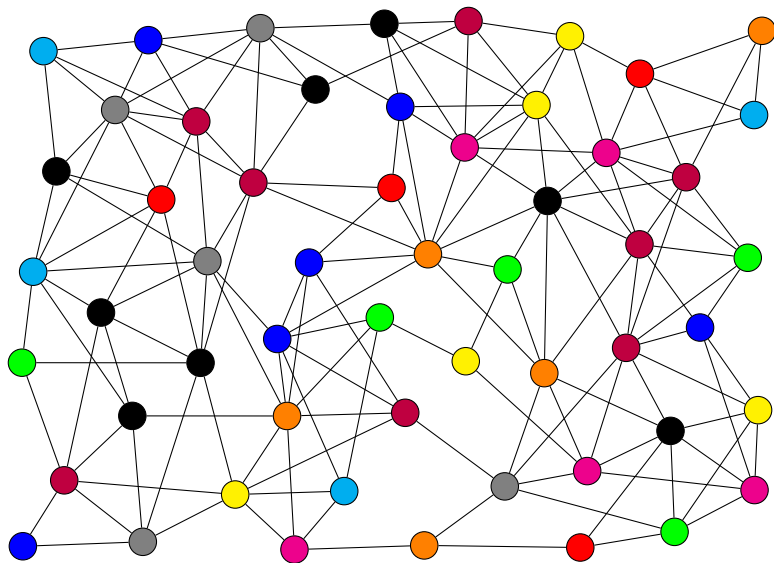
September 18, 2015

# Graph Motif - what is known?

# Graph Motif

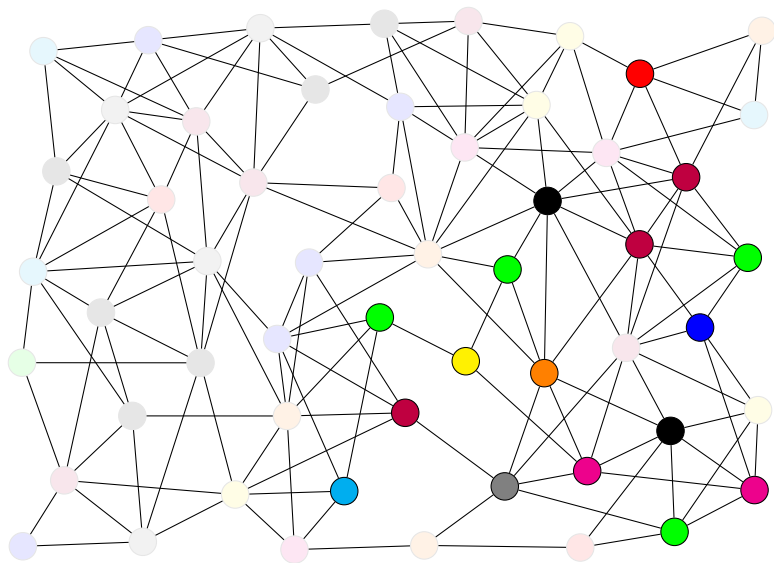


Given a graph  $G = (V, E)$  whose vertices are colored by a function  $c : V \rightarrow \mathcal{C}$  and a multiset  $M$  over  $\mathcal{C} \dots$



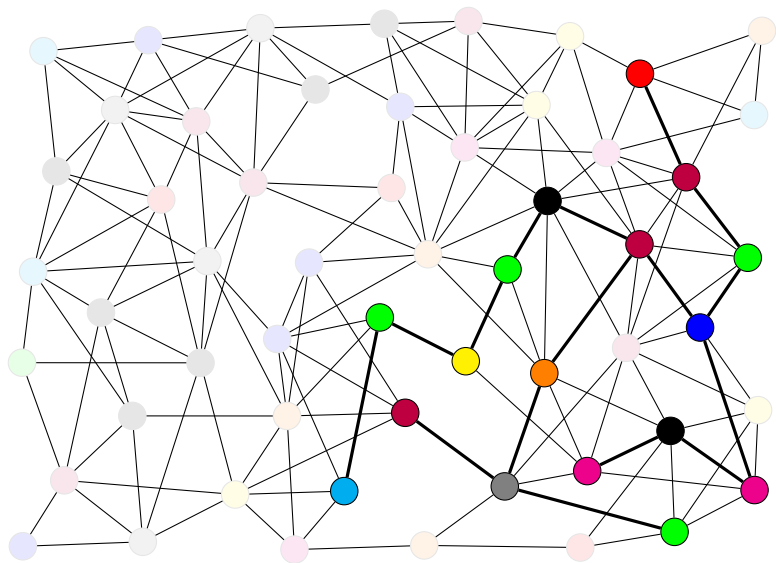
Find a connected subgraph colored by

$$M = \{\text{yellow, orange, red, pink, pink, pink, pink, pink, pink, green, green, green, green, cyan, blue, grey, black, black}\}.$$



Find a connected subgraph **colored by**

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Find a **connected** subgraph colored by

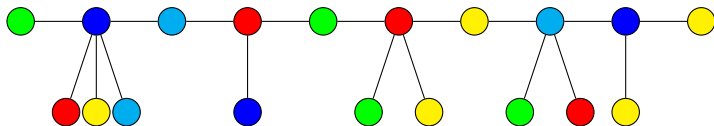
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## Motivations

- ▶ Lacroix et al. (2005): reaction networks.
- ▶ Social, technical networks, and mass spectrometry.
- ▶ Graph pattern matching with only connectivity constraint.

## Known results - algorithms

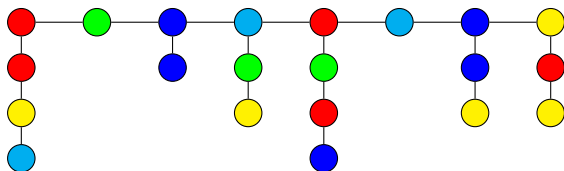
- ▶ FPT in the size of the motif:  $O^*(2^{|M|})$  [BKK '12,PZ '12].
- ▶ FPT in the neighborhood diversity:  $O^*(2^{\text{nd}})$  [G '12].
- ▶ XP in  $\text{tw}(G) + |\mathcal{C}|$  [FFHV '11].
- ▶ Polytime solvable in caterpillar trees [ABHKMPR '10].





## Known results - hardness

- ▶  $W[1]$ -hard on trees w.r.t the number of colors [FFHV '11].
- ▶ NP-hard on bipartite graphs of degree 4,  $|\mathcal{C}| = 2$  [FFHV '11].
- ▶ NP-hard on trees of diameter 4 [ABHKMPR '10].
- ▶ NP-hard on comb graphs [CPPW '12].



## Neighborhood diversity

- ▶ Least number of subsets in a partition into true or false twins.
- ▶  $\kappa$  has linear neighborhood diversity if  $\forall G, \text{nd}(G) \leq O(\kappa(G))$ .
- ▶  $\kappa$  has exponential n.d. if  $\forall G, \text{nd}(G) \leq 2^{O(\kappa(G))}$ .
- ▶  $\kappa$  has unbounded n.d. if  $\forall f, \exists G$  such that  $\text{nd}(G) > f(\kappa(G))$ .

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**Vertex cover number** has exponential n.d. since  $\text{nd}(G) \leq \text{vc} + 2^{\text{vc}}$ .

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Cluster editing number on connected graphs has linear n.d.:  
 $\text{nd}(G) \leq 3k + 1$ .

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Distance to co-cluster has unbounded n.d.

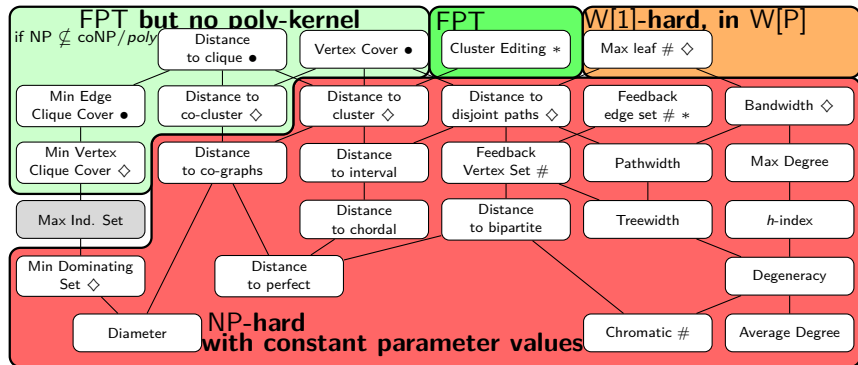
## Aim of the paper

Completing the picture for structural/secondary parameters.

- ▶ Does only boundedness of neighborhood diversity count?
- ▶ For exponential n.d.: from double to single-exponential time.



# Ecological Landscape

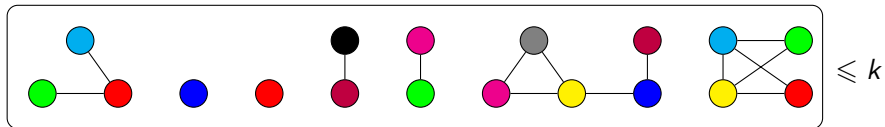
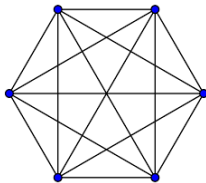


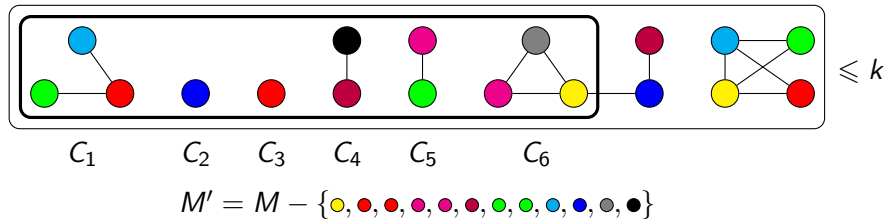
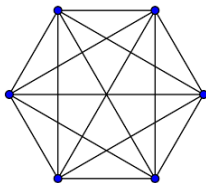
## Bounded neighborhood diversity

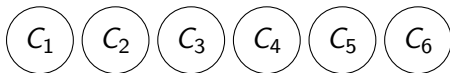
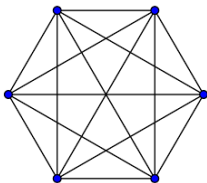
Parameter: distance to clique

### Theorem

GRAPH MOTIF *can be solved in*  $O^*(4^k)$ .







Set-colored SET COVER with threshold constraints imposed by  $M'$ .  
Solvable in  $O^*(m2^n)$  for  $m$  sets and  $n$  elements.

Time  $O^*(4^k)$  should be improvable to  $O^*(2^k)$  but not further:

### Observation

*Under SCH, GRAPH MOTIF cannot be solved in  $O^*((2 - \epsilon)^k)$ .*

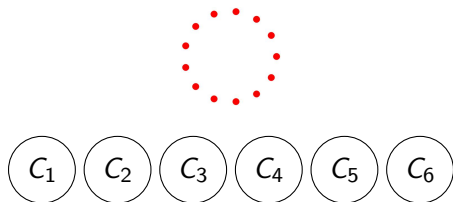
SCH: For any  $\epsilon > 0$ , Set Cover cannot be solved in  $O((2 - \epsilon)^n)$ .

## Parameter: vertex cover number

### Theorem

GRAPH MOTIF *can be solved in*  $O^*(2^{2k \log k})$ .

- ▶ Let's start as the previous algorithm.



Set-colored SET COVER with threshold constraints **and connected intersection graph of the solution.**



## Parameter: vertex cover number

### Theorem

GRAPH MOTIF *can be solved in*  $O^*(2^{2k \log k})$ .

- ▶ Let's start as the previous algorithm.
- ▶ Guess an ordered partition of the connected components  $C_i$ s
- ▶ which says how the  $C_i$ s connect with each other via the IS.

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- ▶ Let's start as the previous algorithm.
- ▶ Guess an ordered partition of the connected components  $C_i$ s
- ▶ which says how the  $C_i$ s connect with each other via the IS.
- ▶ Maximum matching in an auxiliary bipartite graph.

Again, you may expect to go down to  $O^*(2^k)$  but not lower:

### Observation

*Under SETH, GRAPH MOTIF cannot be solved in  $O^*((2 - \varepsilon)^k)$ .*

SETH: For any  $\varepsilon > 0$ , SAT cannot be solved in  $O((2 - \varepsilon)^n)$ .

# Unbounded neighborhood diversity

Parameter: distance to co-cluster

### Theorem

GRAPH MOTIF *can be solved in*  $O^*(2^{2k \log k})$ .

$H = V - S = I_1 \cup \dots \cup I_q$  is a co-cluster.

Fix a solution  $R$ .

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- ▶ case b)  $R$  intersects two  $I_j$ s, cliquify  $H \rightsquigarrow$  distance to clique  $k$ .

# Hardness



## Theorem

GRAPH MOTIF is  $W[1]$ -hard for parameter max leaf number.

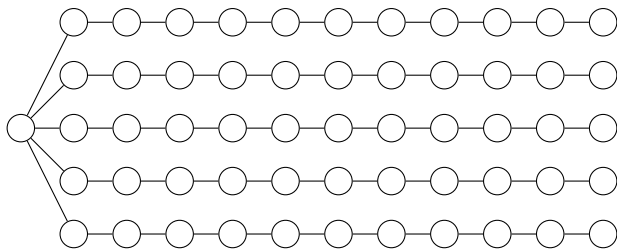
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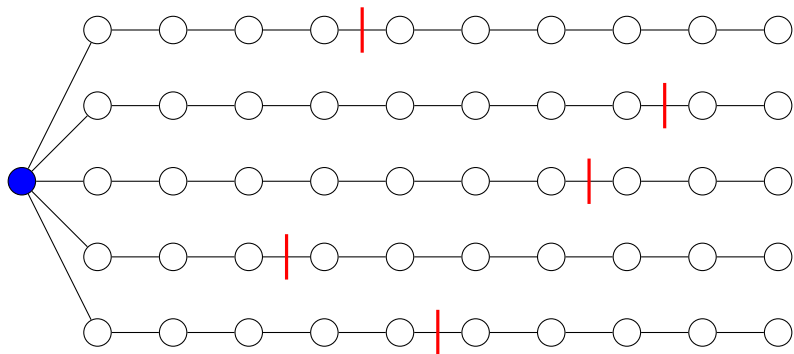
GRAPH MOTIF is  $W[1]$ -hard for parameter *max leaf number*.

In fact,

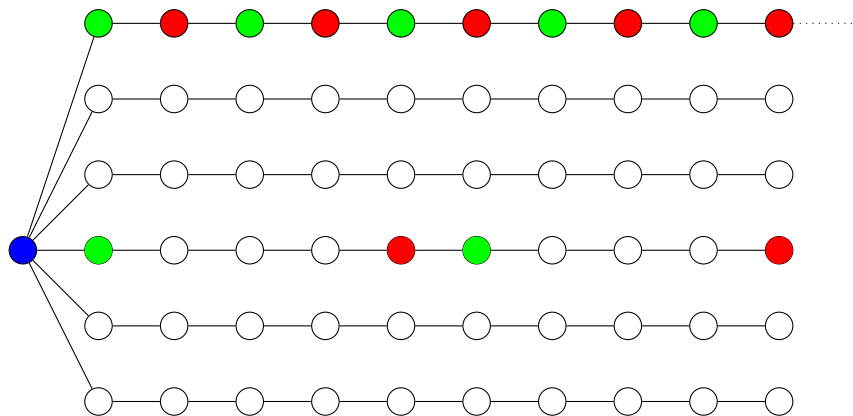
## Theorem

GRAPH MOTIF is  $W[1]$ -hard for parameter *number of leaves of the graph + number of colors in subdivisions of stars*.



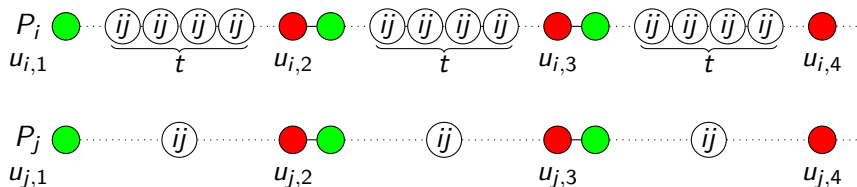


$$M = \{\bullet, \text{---}\}$$

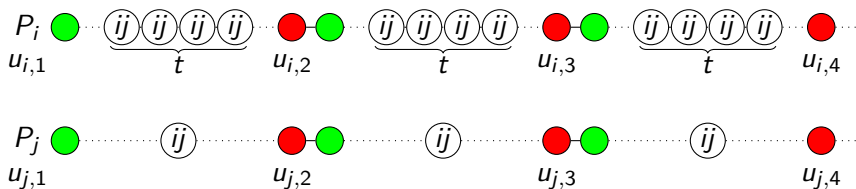


$$M = \{\bullet, \bullet \times \text{blah}, \bullet \times \text{blah},$$

Reduction from  $k$ -MULTICOLORED CLIQUE on  $(\cup_{1 \leq i \leq k} H_i, E)$   
 where  $H_i = \{u_{i,1}, \dots, u_{i,t}\}$ .

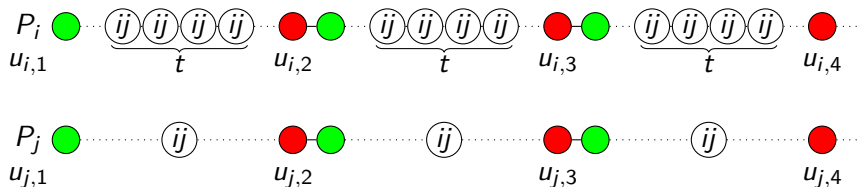


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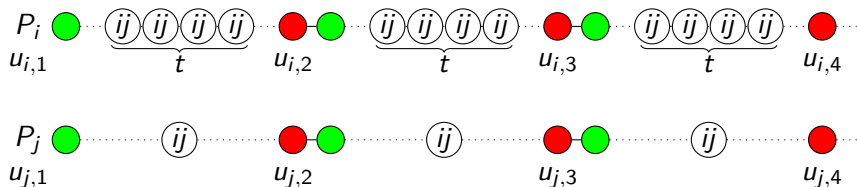
Pairs  $(u_{i,a}, u_{j,b})$  and  $[t^2 - 1]$  are in one-to-one correspondence.

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List of edges:  $\{13, 15, 20, 29, \dots, 80, 81, 92, 97\}$  ( $t = 10$ ).

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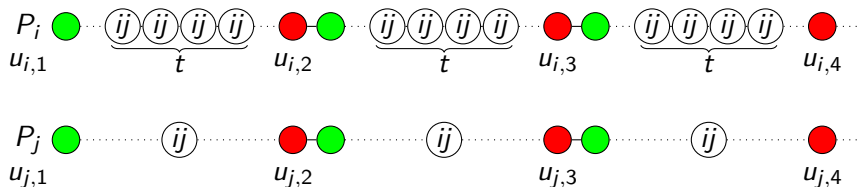


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Complements to  $t^2$ :  $\{3, 8, 19, 20, \dots, 71, 80, 85, 87\}$ .



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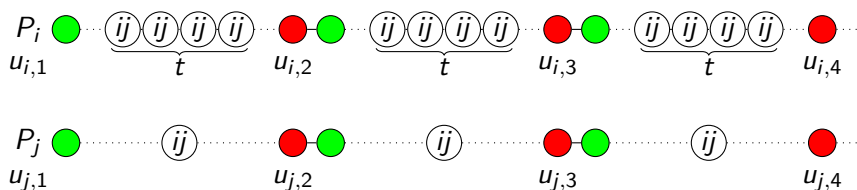


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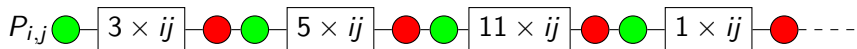
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## Theorem

GRAPH MOTIF is solvable in  $O^*(16^{ml}n^{10ml}) = n^{O(ml)}$ .

## Observation

*There is less than  $4ml$  vertices of degree at least 3 and removing those vertices leaves a disjoint union of at most  $5ml$  paths.*

The previous reduction was only ruling out  $n^{o(\sqrt{ml})}$  assuming ETH.

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PARTITIONED SUBGRAPH ISOMORPHISM  $\rightarrow$  GRAPH MOTIF  
 $\rightsquigarrow n^{o((ml(G)+|C|)/\log(ml(G)+|C|))}$  ETH-based lower bound.

## Perspectives

- ▶ Settle the  $2^{O(vc)}$  vs no  $2^{o(vc \log vc)}$  under ETH.
- ▶ A  $2^{O(vc)}$  algorithm would immediately give a single-exponential for parameter distance to co-cluster and edge clique cover number (where the edge clique cover is given with the input).
- ▶ Extend the FPT algorithms to the list-colored variant.