

# AN INTRODUCTION TO THE WEISFEILER-LEMAN ALGORITHM AND RECENT DEVELOPMENTS



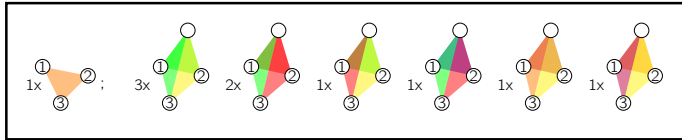
RHEIN-MAIN  
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21.11.2025 Vienna  
LOGALG 2025  
Pascal Schweitzer



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# The Graph Isomorphism Problem

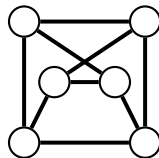
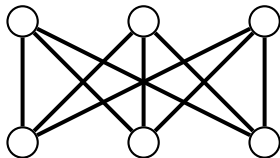
Two graphs are **isomorphic** if there is a bijection of vertices that preserves adjacency and non-adjacency.



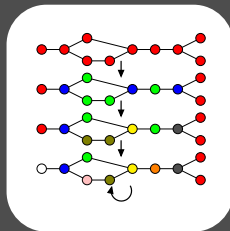
**The Graph Isomorphism Problem (GI):**  
Algorithmic task to decide whether two given graphs are isomorphic.

- ▶ One of the most important open problems in theoretical computer science
- ▶ GI is equivalent to computing graph automorphisms

isomorphic graphs



## 1. WL Algorithm



# Degrees and degrees in the neighborhood

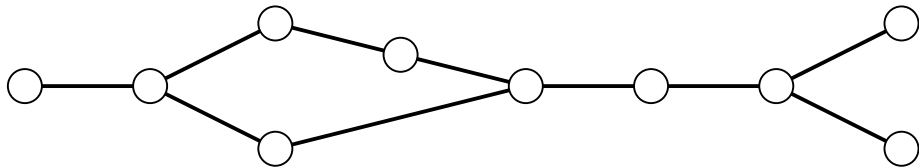
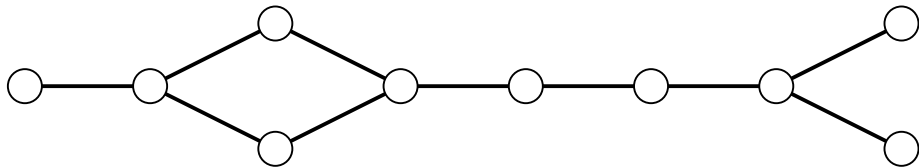
We want to explore the automorphisms of a graph combinatorially.

The **1-dimensional Weisfeiler Leman** algorithm is a procedure to distinguish graphs according to combinatorial properties.

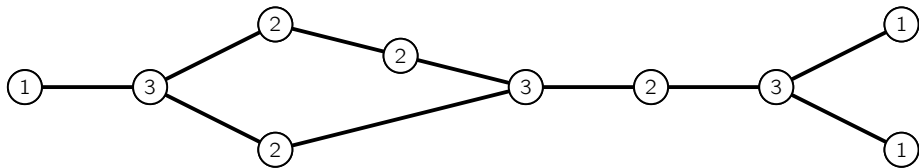
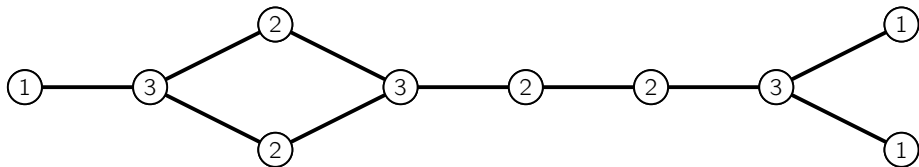
## **Observations:**

- ▶ Vertices must map to vertices of the same degree.
- ▶ The neighborhood of a vertex must map the neighborhood of its image.
- ▶ Thus, degrees that appear in the neighborhood must appear in the neighborhood of the image.
- ▶ This argument can be iterated.

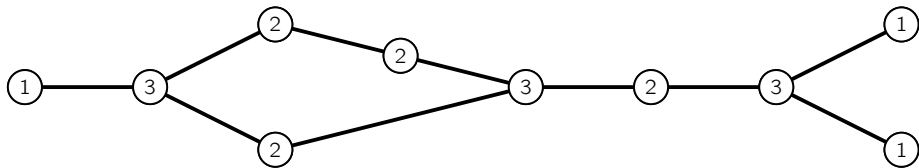
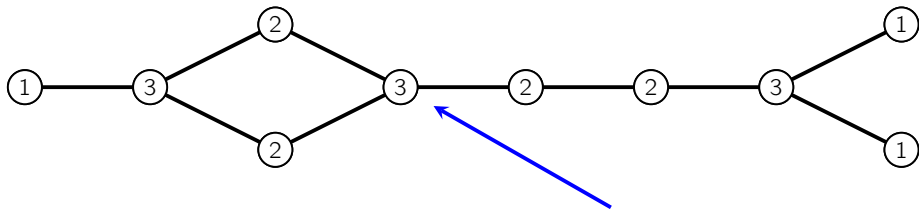
## Color refinement (aka. 1-WL)



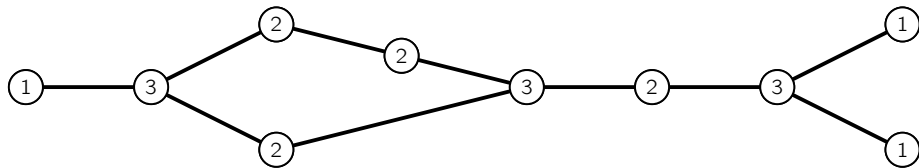
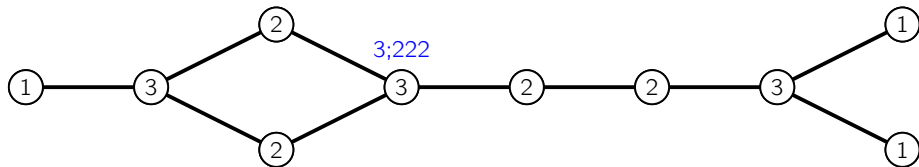
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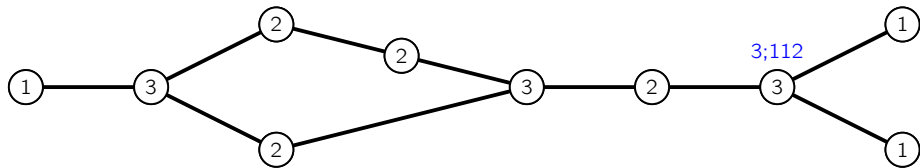
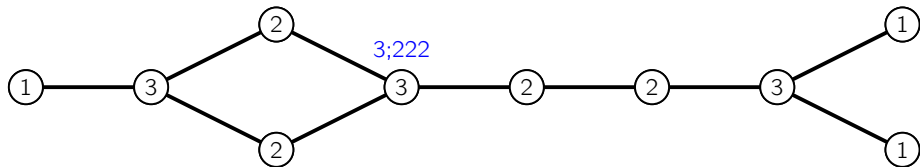


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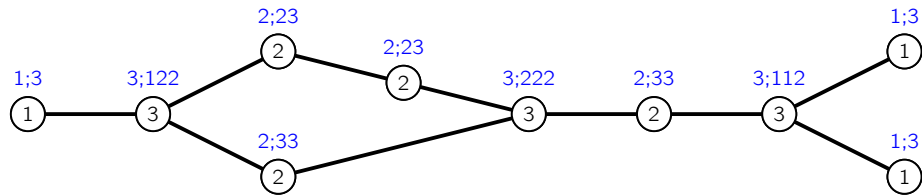
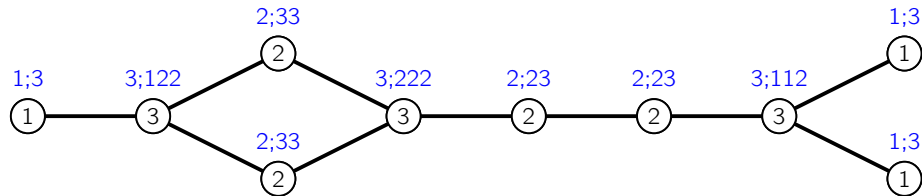




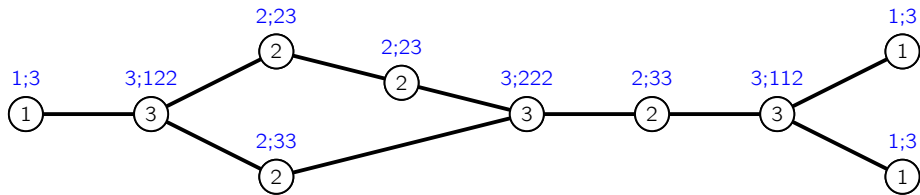
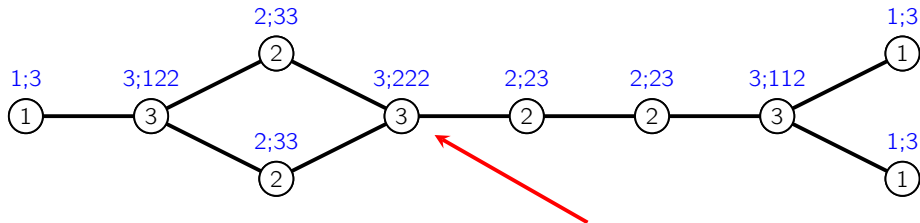
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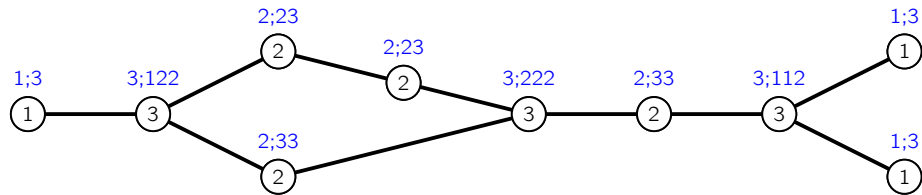
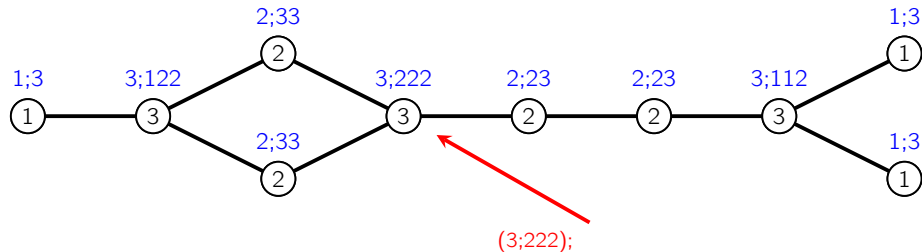
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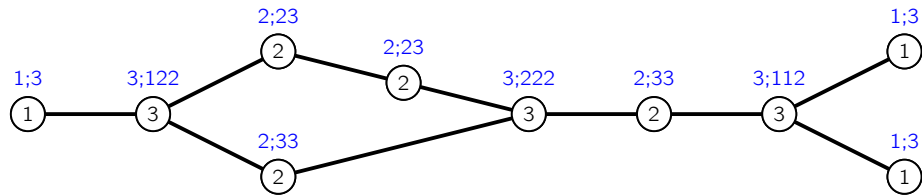
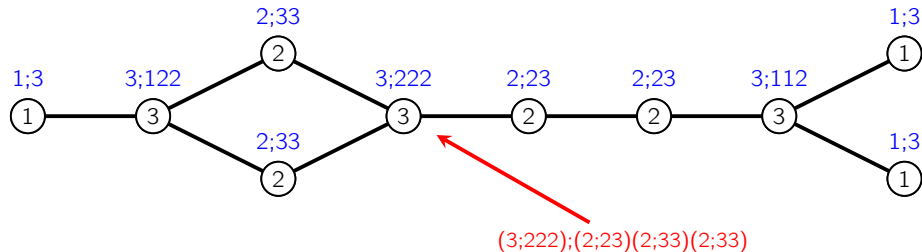
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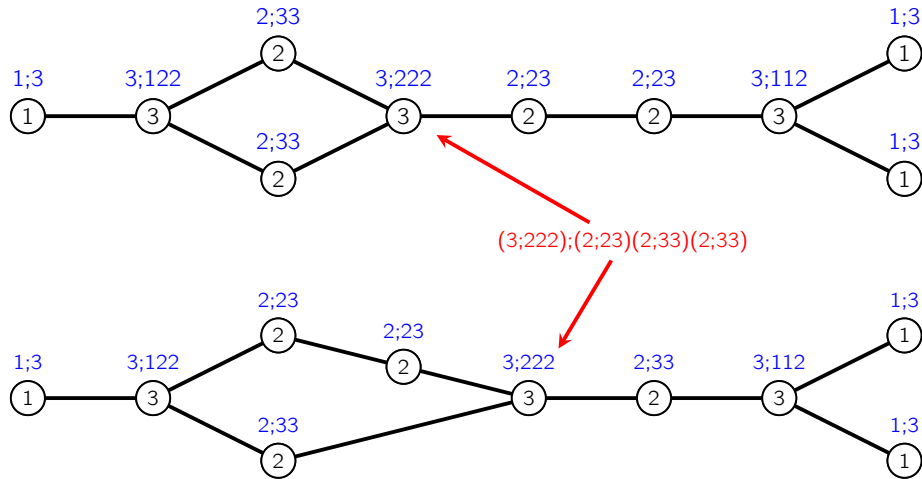
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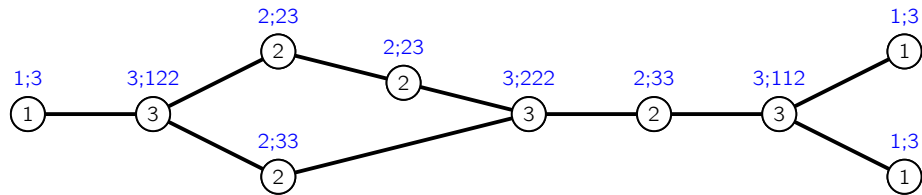
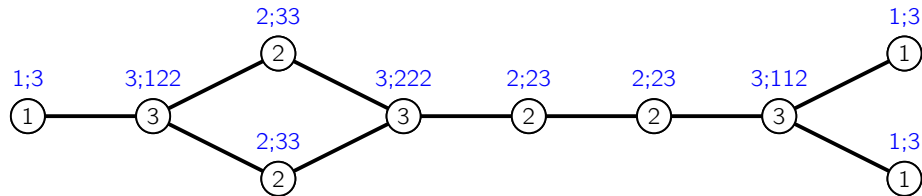
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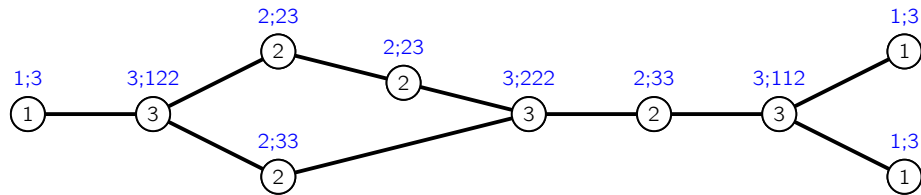
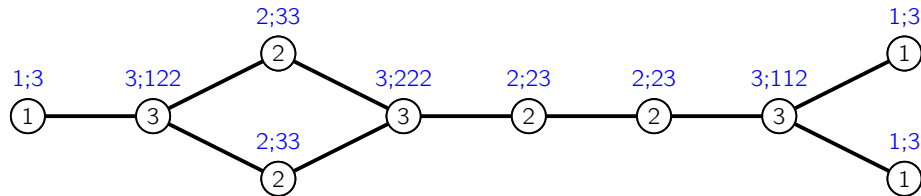
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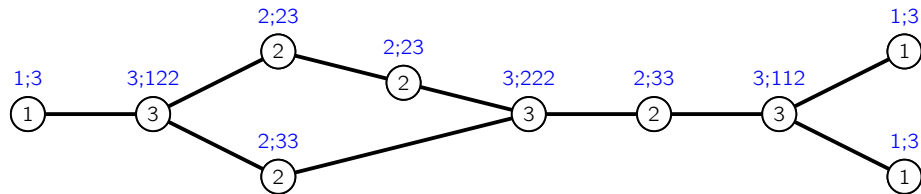
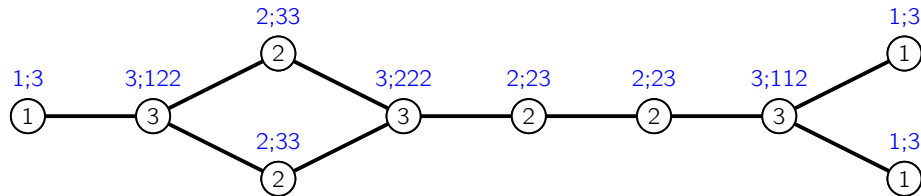
## Color refinement (aka. 1-WL)



1;3  
2;23  
2;33  
3;112  
3;122  
3;222

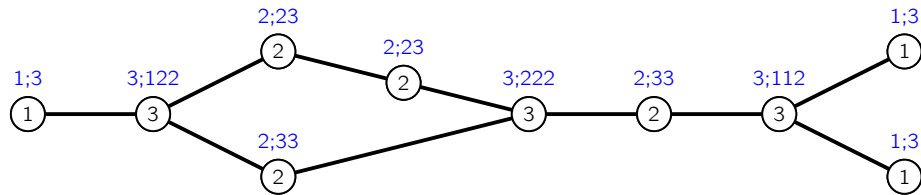
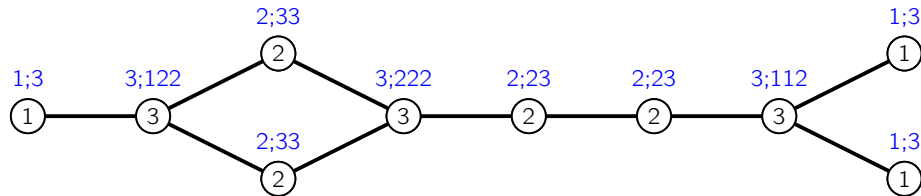


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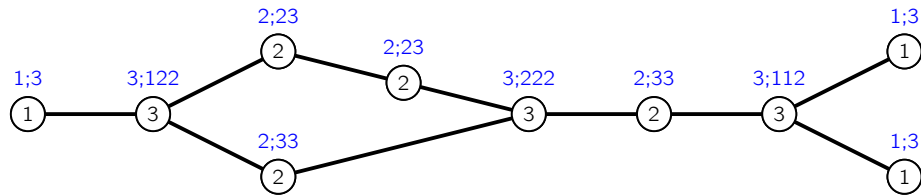
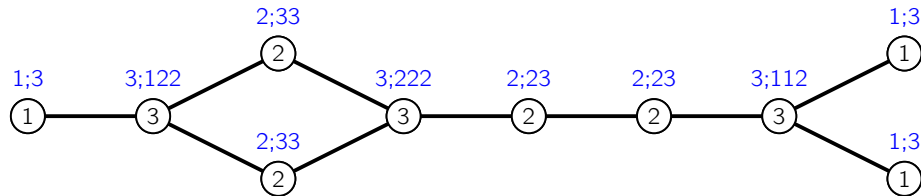
4 := 1;3  
2;23  
2;33  
3;112  
3;122  
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# Color refinement (aka. 1-WL)



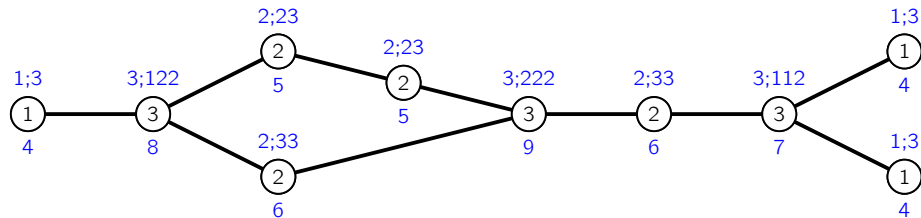
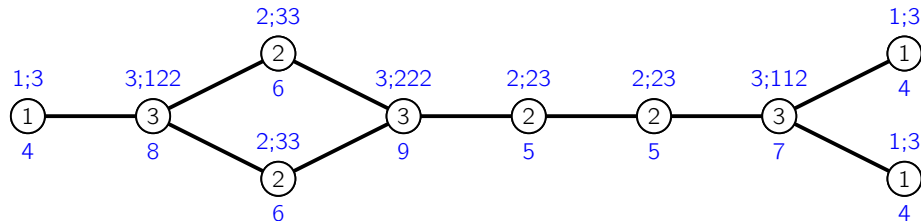
4 := 1;3  
5 := 2;23  
2;33  
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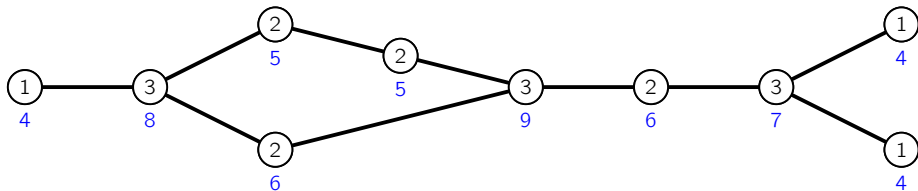
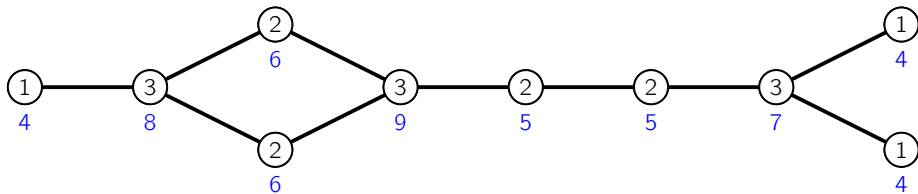
4 := 1;3  
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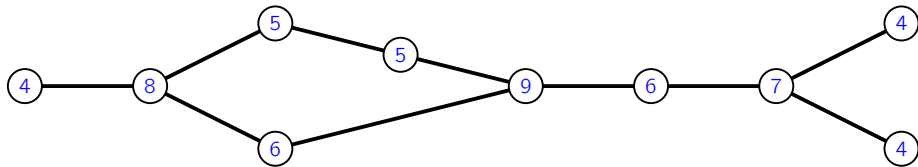
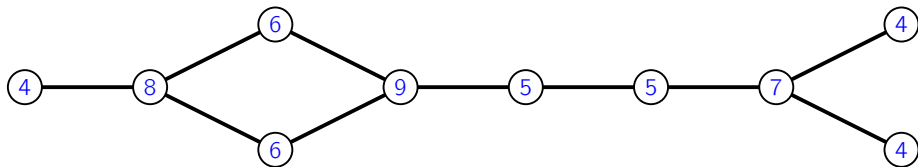


$4 := 1;3$   
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 $6 := 2;33$   
 $7 := 3;112$   
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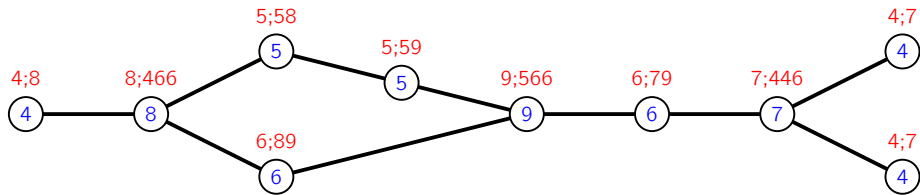
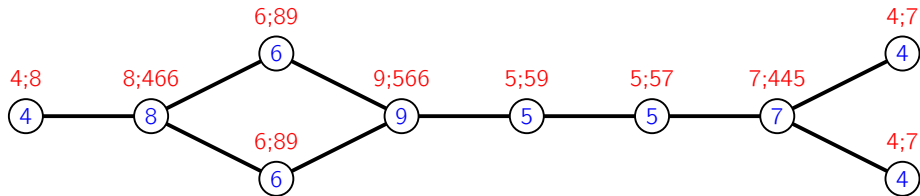
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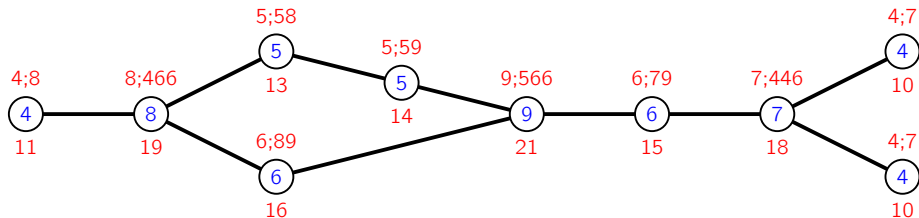
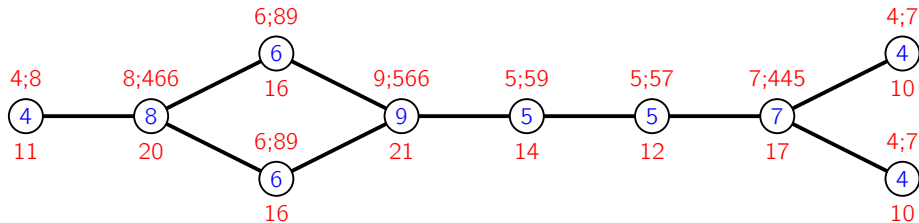
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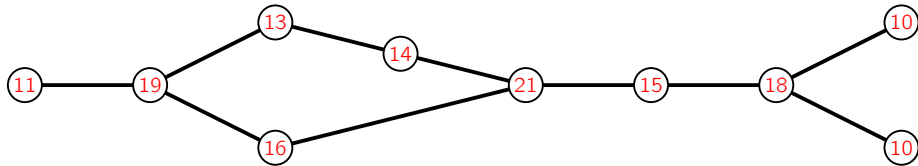
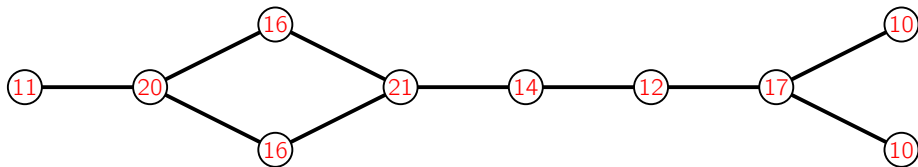


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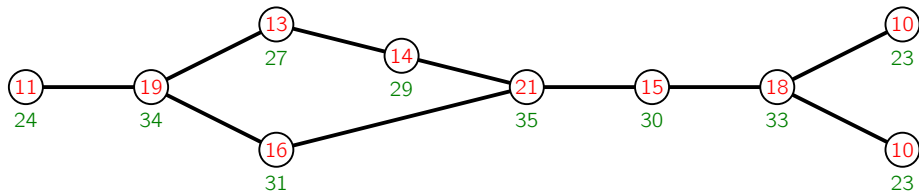
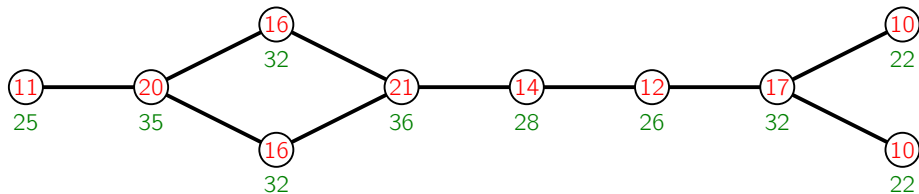




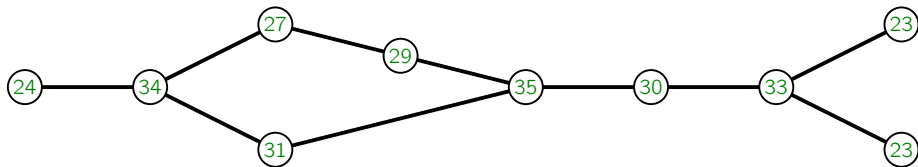
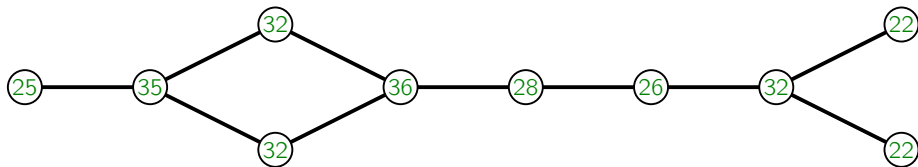
## Color refinement (aka. 1-WL)



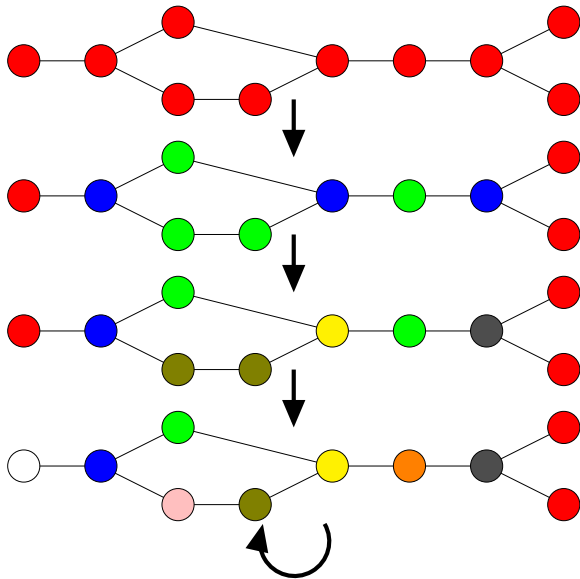
## Color refinement (aka. 1-WL)



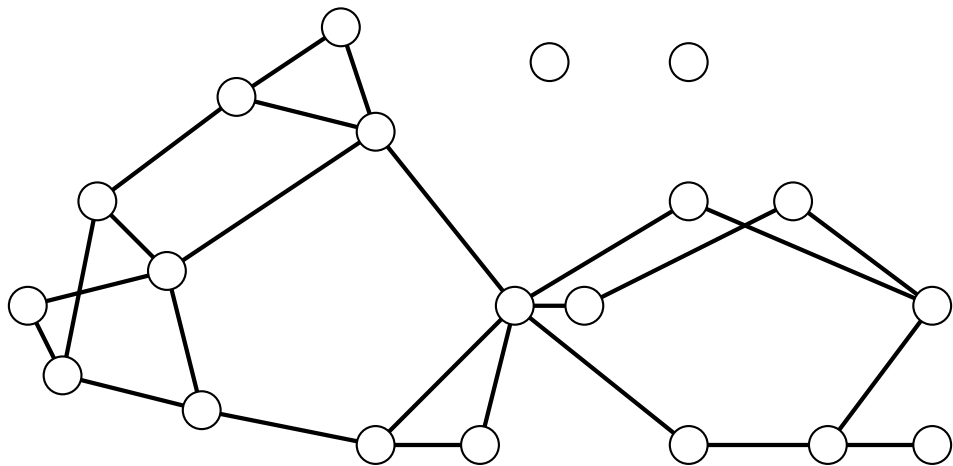
## Color refinement (aka. 1-WL)



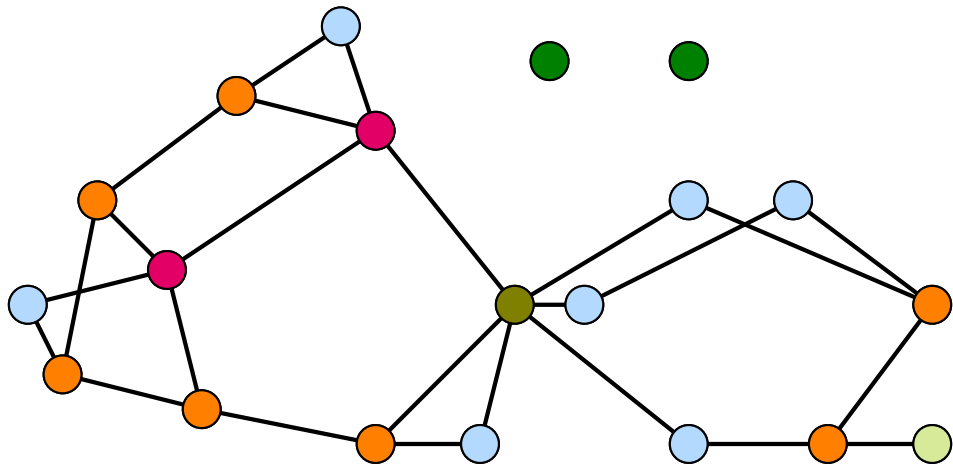
## Color refinement (illustration with colors)



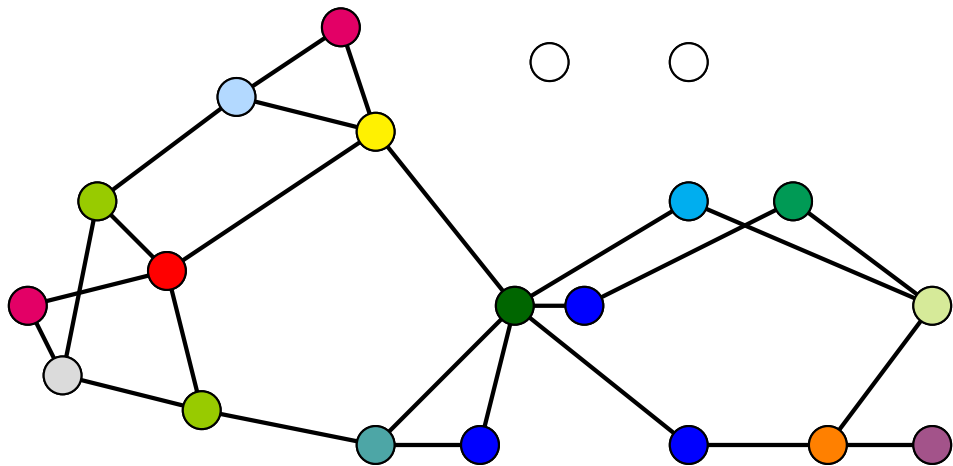
## Color refinement on a random graph



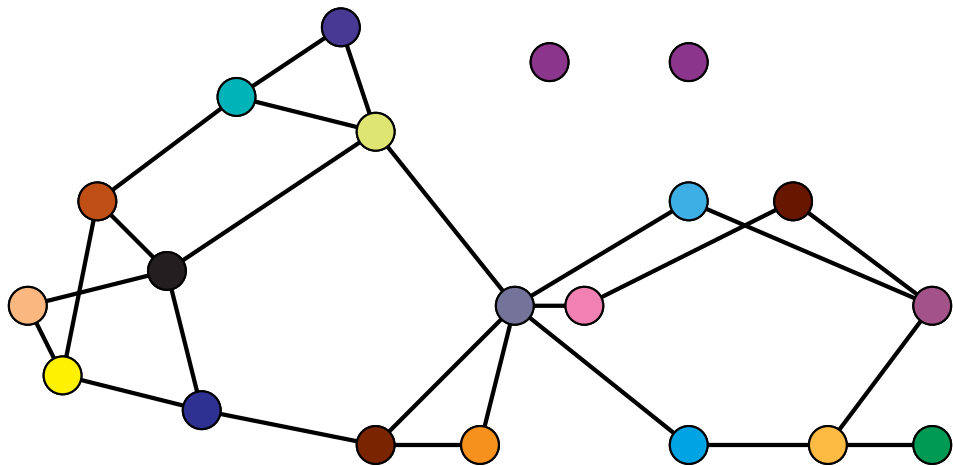
## Color refinement on a random graph



## Color refinement on a random graph

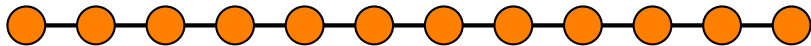


## Color refinement on a random graph

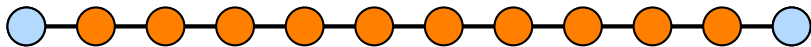




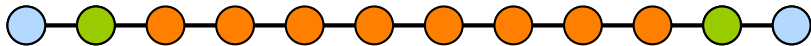
## Color refinement on a path



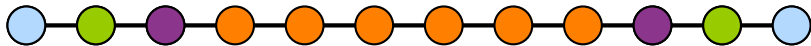
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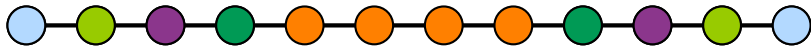
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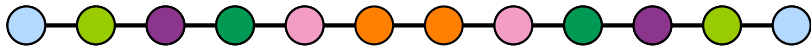
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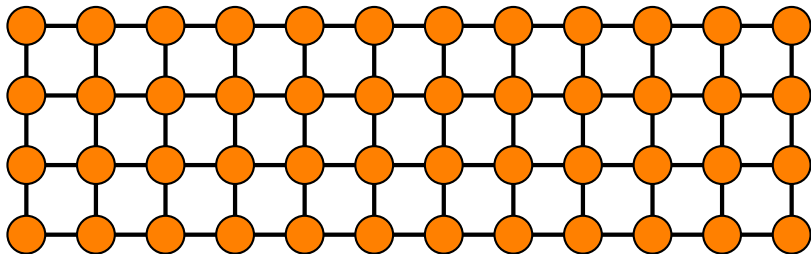
## Color refinement on a path



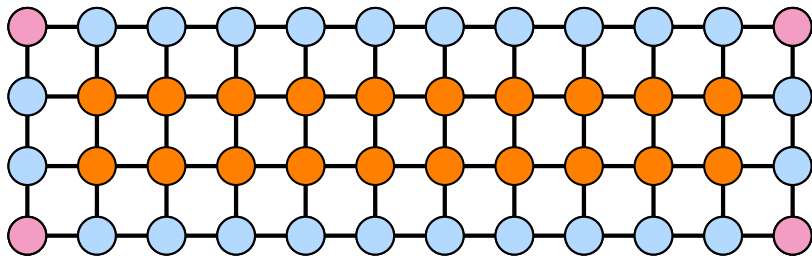
## Color refinement on a path



## Color refinement on a grid

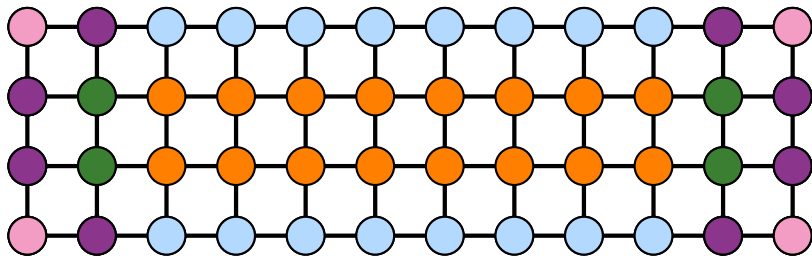


## Color refinement on a grid

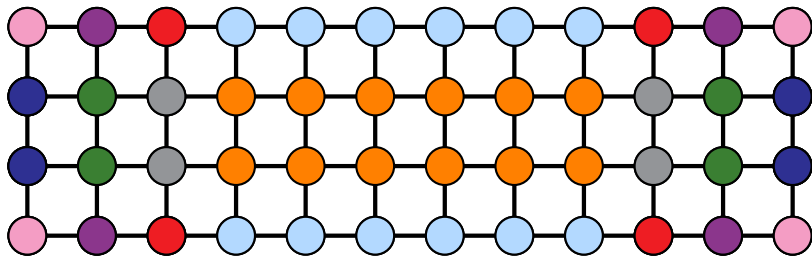




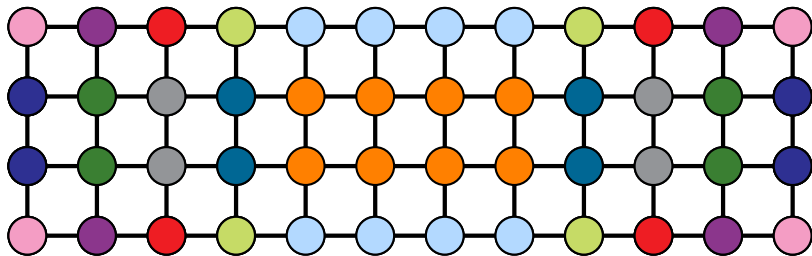
## Color refinement on a grid



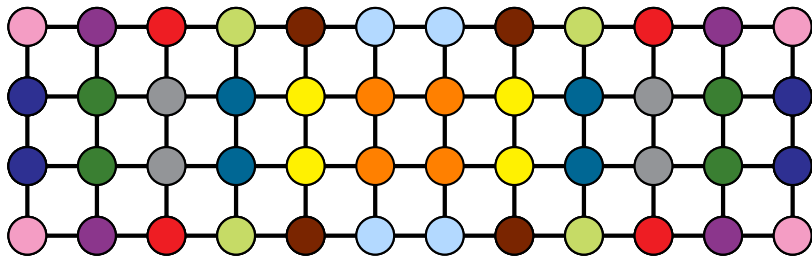
## Color refinement on a grid



## Color refinement on a grid



## Color refinement on a grid



# Some facts about 1-WL

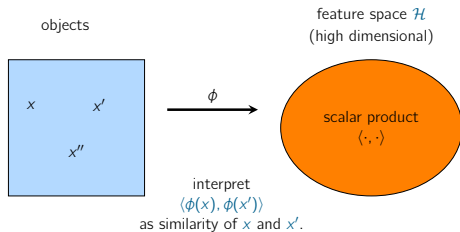
## **Facts** about 1-WL:

- ▶ distinguishes almost all pairs of non-isomorphic graphs [Babai, Erdős, Selkow] (1980)
- ▶ cannot distinguish non-isomorphic regular graphs of same degree
- ▶ a precise characterization for which graphs it always works is known  
[Arvind, Köbler, Rattan, Verbitsky] [Kiefer, S., Selman] (2015)
- ▶ result computable in  $O((m + n) \log n)$  [Cardon and Crochemore] (1982)
- ▶ used heavily in practice

# Applications of 1-WL in machine learning on graphs

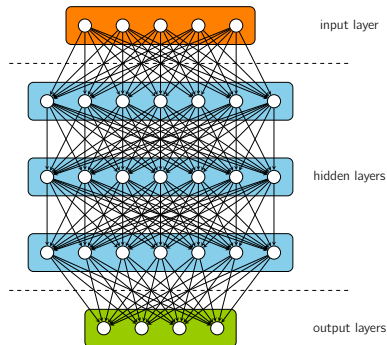
Two general graph isomorphism techniques for machine learning on graphs:

## WL-kernels



[Shervashidze, S., van Leeuwen, Mehlhorn, Borgwardt] (2011)

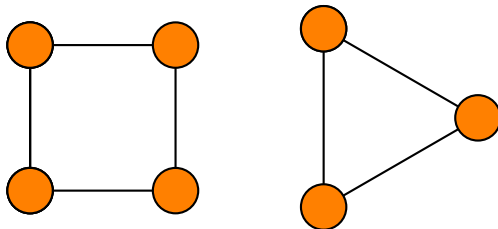
## Universal graph neural networks



message passing neural networks  $\Leftrightarrow$  1-WL  
[XHLJ] (2019) [MRFHLRG] (2019)  
see also [Franks, Anders, Kloft, S.] (2023)

# Limits of color refinement

## Example

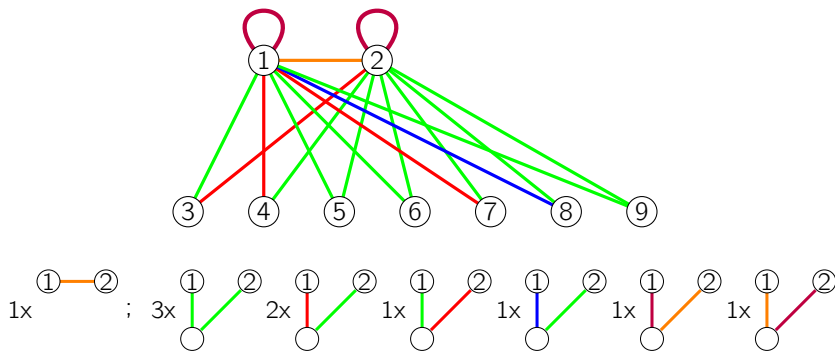


$$C_4 \dot{\cup} C_3$$

**Consequence:** To explore automorphisms we need to consider more than one vertex at a time.

# The classical (2-dim) WL-algorithm

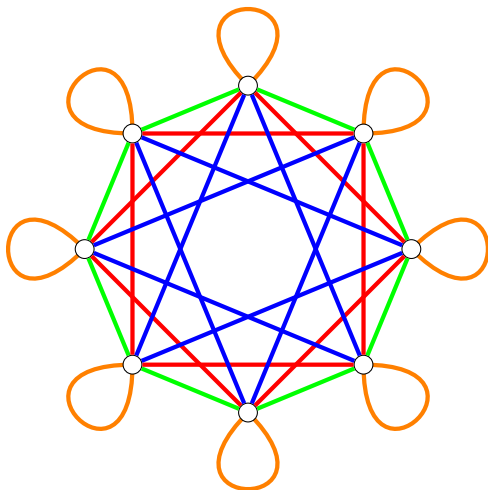
- ▶ The 2-dimensional WL-algorithm colors pairs of vertices.
- ▶ The initial coloring is into edges, non-edges and loops.
- ▶ Each iteration recolors each pair  $(u, v)$  according to colored triangles containing  $(u, v)$ .



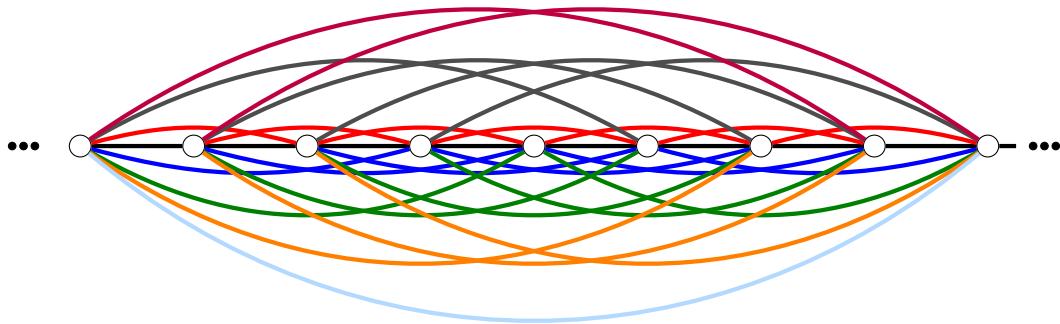


## 2-dim WL and distances (Illustration)

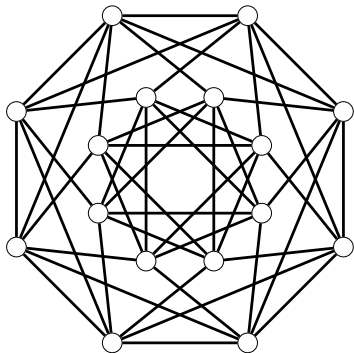
The 2-dim WL can “measure” distances in a graph.



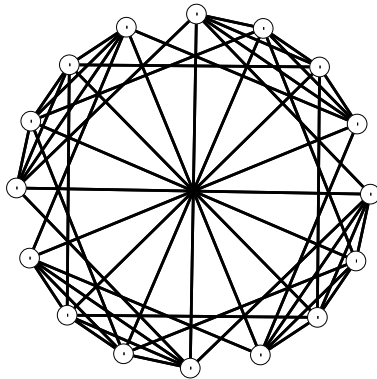
## 2-dim WL on paths



## Non-isomorphic strongly regular graphs



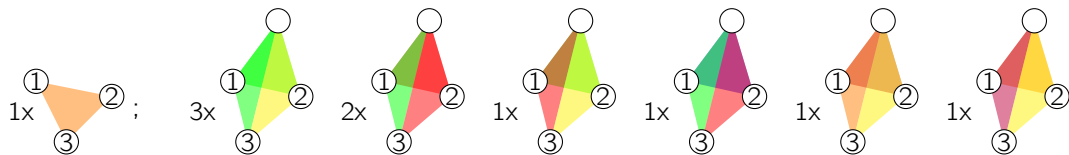
Shrikhande graph



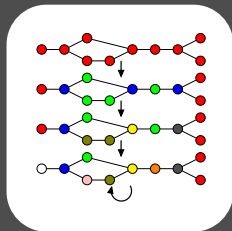
Line graph  $L(K_{4,4})$

The smallest pair of non-isomorphic graphs not distinguished by 2-WL (16 vertices).

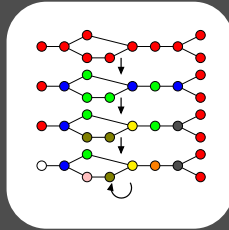
## 3-dim WL (Illustration)



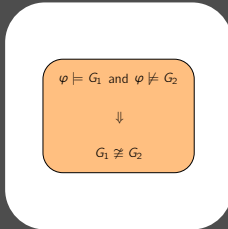
## 1. WL Algorithm



## 1. WL Algorithm



## 2. Logics & Games



# Correspondence

There are three views with a well established **close correspondence** between parameters.  
[Cai,Fürer,Immerman] (1992)

**WL-refinement**



**logic**



**pebble game**

dimension



variables



no. of pebbles

iterations



quantifier depth



length of optimal plays

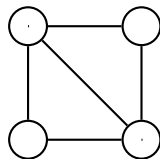
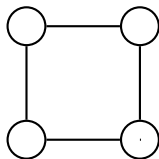
# Logics and Sentences

## Example

$$\exists x \quad (\forall y \quad x = y \vee x \sim y) \vee (\forall y \quad x = y \vee x \not\sim y)$$

### In words:

There is a vertex  $x$  that is adjacent to every other vertex or that is adjacent to no other vertex.



### Observation

It is “somewhat easy” to decide whether a given graph satisfies the sentence.



# Logic for isomorphism

**Question:** How can we use logic formulas for isomorphism tests?

**Answer:**

## **Fact**

- ▶ If  $G_1$  and  $G_2$  are non-isomorphic graphs, there is a logical formula  $\varphi$  which is true for  $G_1$  but false for  $G_2$ .
- ▶ We can use  $\varphi$  to observe  $G_1$  and  $G_2$  are not isomorphic.

$$\varphi \models G_1 \text{ and } \varphi \not\models G_2$$



$$G_1 \not\cong G_2$$

# Weisfeiler-Leman in terms of logic

The  $k$ -dimensional Weisfeiler-Leman algorithm is an algorithm that

- ▶ given graphs  $G_1$  and  $G_2$
- ▶ checks simultaneously for certain formulas  $\varphi$  whether
- ▶  $\varphi$  distinguishes  $G_1$  and  $G_2$ .

## Running time:

- ▶ It runs in polynomial time  $O(n^k \log(n))$ .

# The counting logic

$k$ -variable **counting logic** for graphs uses

- ▶  $k$  variables
- ▶ counting quantifiers

**Example:**  $\exists^{\geq 1}x. \exists^{\geq 3}y. x \sim y \wedge \exists^{\geq 5}x. x \sim y.$

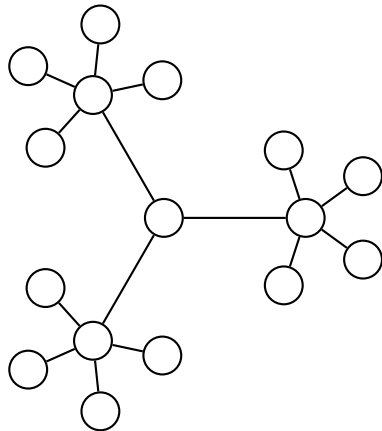
**Read:** there is a vertex with at least 3 neighbors of degree at least 5.

**Fact:**

$k$ -WL checks all invariants expressible in the logic using only  $k + 1$ -variables simultaneously.

**Conclusion:**

$k$ -WL is thus a complete check for invariants in a natural, large class



# Homomorphism counts

graph homomorphism: map between graphs preserving adjacency

$\text{hom}(G, H)$ : the set of homomorphisms from  $G$  to  $H$ .

Theorem ([Lovász] (1967))

*Two finite graphs  $G_1, G_2$  are isomorphic if and only if their homomorphism counts from all finite graphs agree, i.e.,  $|\text{hom}(H, G_1)| = |\text{hom}(H, G_2)|$  for all finite graphs  $H$ .*

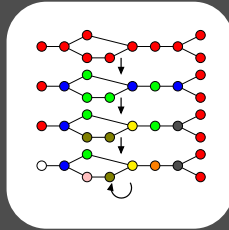
# Similarity measures through homomorphism counts

**Question:** What happens if  $H$  comes from a restricted graph class?

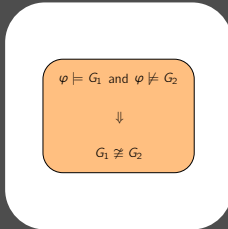
count homs from	equivalence measure	
all graphs	isomorphism	[Lovász] (1967)
trees	fractional isom./1-WL equiv.	
tree width $\leq k$	k-WL equivalence	[Dvořák] (2010)
		[Dell,Grohe,Rattan] (2018)
cycles	cospectrality	
planar graphs	quantum isomorphism	[Manžinská,Roberson] (2020)
tree depth	FO+C bounded qr	[Grohe] (2020)
width/depth restr. tree dec.	res. requant./conj.	[Schindling] (2025)

Many related recent results: [Seppelt] [Neuen] [Dawar,Jakl,Reggio] [Böker] [Atserias] ...

## 1. WL Algorithm



## 2. Logics & Games



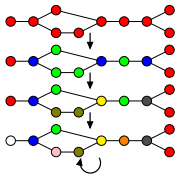
## 2. Logics & Games

$\varphi \models G_1$  and  $\varphi \not\models G_2$

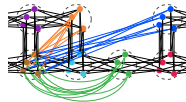
$\Downarrow$

$G_1 \not\cong G_2$

## 1. WL Algorithm



## 3. Recent developments



# Research questions

## General question:

- ▶ How complicated does the logical formula have to be to distinguish graphs?

## Specifications:

- ▶ How many variables do we need?
- ▶ How many iterations (requantifications) do we need? (quantifier depth)
- ▶ Can we restrict requantification?
- ▶ What are the computational complexities that arise?
- ▶ What if we consider structures other than graphs?



# The Weisfeiler-Leman Dimension

## Definition

The **Weisfeiler-Leman dimension** of a graph  $G$  is the smallest  $k$  such that  $k$ -dimensional WL “always works” for  $G$ .

Isomorphism for graphs of bounded WL-dimension can be checked in polynomial time.

- ▶ Graphs with an excluded minor have bounded WL-dimension. [Grohe] (2012)
- ▶ For all orders  $n$ , there are graphs of WL-dimension  $\Omega(n)$ . [Cai,Fürer,Immerman] (1992)

**Side remark:**  $O(\log(n))$ -dimensional WL used in Babai’s quasipolynomial time algorithm.

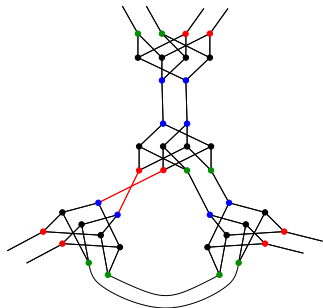
# Upper bounds on the WL dimension for graph classes

graph class	dimension bound	reference	date
$K_t$ -minor-free	$f(t)$	[Grohe]	(2012)
planar	3	[Kiefer, Ponomarekno, S.]	(2017)
genus $g$	$4g + 3$	[Kiefer, Grohe]	(2019)
tree width $k$	$k$	[Kiefer, Neuen]	(2019)
rank width $k$	$3k+4$	[Grohe, Neuen]	(2019)
permutation graphs	18	[Guo, Gavriluk, Ponomarenko]	(2023)
circulant graph	$\#\text{prime-div}( G ) + 3$	[Wu, Ponomarenko]	(2024)

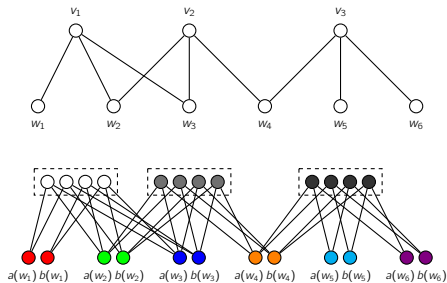
# Unbounded WL-dimension

Theorem ([Cai, Fürer, Immerman] (1992))

*There are graphs of arbitrarily large Weisfeiler-Leman dimension.*



CFI Graphs



Multipedes

# Bounds for WL iteration Number (i.e., quantifier depth)

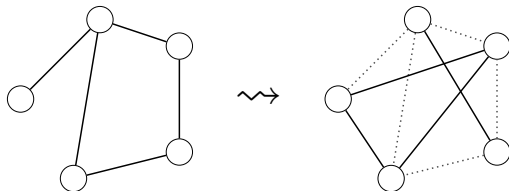
dimension		bound	reference	year	
1-dim	{	upper bound	$n - 1$	(by def.)	
		-----			
		lower bound	$n - o(n)$	[VK]	(2014)
		$n - 1$	[KM]	(2020)	
-----					
2-dim	{	upper bound	$O(n^2 / \log(n))$	[KS]	(2016)
			$O(n \log n)$	[LPS]	(2019)
		-----			
		lower bound	$\Omega(n)$	[F]	(2001)
-----					
$k$ -dim	{	upper bound	$O(n^{k-1} \log n)$	[GLN]	(2023)
		-----			
		lower bound	$\Omega(n)$	[F]	(2001)
		$\Omega(n^{k/2})$	[GLNS]	(2023)	

# Iterated neighborhood graphs

## Definition

The **neighborhood graph**  $N(G)$  of  $G$

- ▶ has the same vertex set as  $G$  and
- ▶ two vertices are adjacent if they have a common neighbor in  $G$ .



## Observations:

- ▶ Bipartite graphs become disconnected.
- ▶ Odd cycles become an isomorphic non-identical graph.

**Iterated neighborhood graphs:**  $N^i(G) = N(N^{i-1}(G))$  [Sonntag, Teichert] (KolKom09)

## Theorem ([S.] (2013))

For every finite connected non-bipartite graph  $G$  that is not an odd cycle we have tight bounds

$$\lceil \log 2(\text{Diam}(G)) \rceil \leq \text{Stab}(G) \leq \lceil \log 2(\text{Diam}(G)) \rceil + 2.$$

# Generalized neighborhood graph

$H$  a graph with two distinguished vertices.

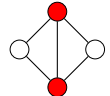
## Definition

The **generalized neighborhood graph**  $N_H(G)$

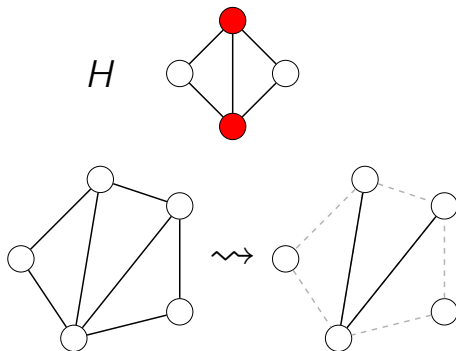
- ▶ has the same vertex set as  $G$  and
- ▶ two vertices are adjacent if they are the distinguished vertices in a copy of  $H$  in  $G$ .

**Observation and Results:** (see [S.] (2013))

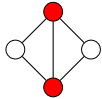
- ▶  $H =$   recovers neighborhood graphs.

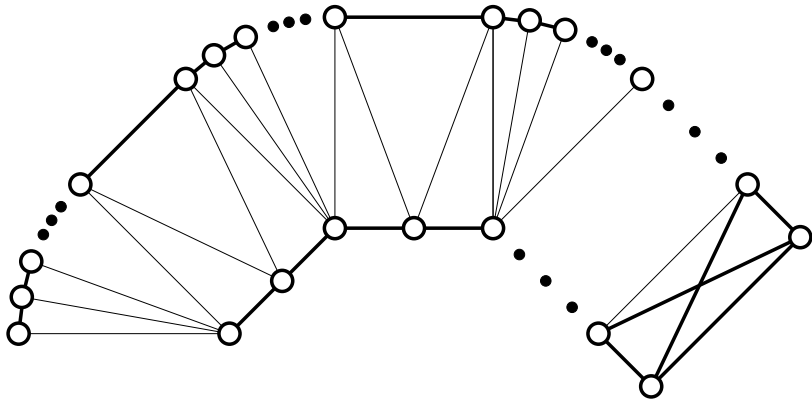
- ▶ For  $H =$   (diamond) the process is monotone but stabilization can take  $\Omega(n^2)$ .

- ▶ We can construct  $H$  to simulate the game of life (and get almost anything we like).

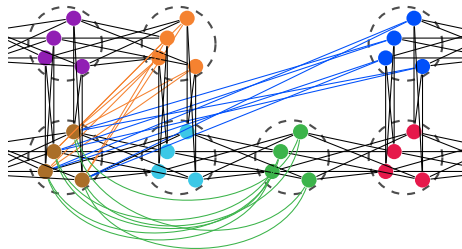
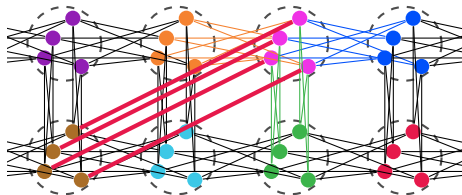


# The lower bound construction

A figure explaining the  $\Omega(n^2)$  lower bound for  $H =$   (diamond).



# The compressed CFI-construction



- ▶ The lower bound for  $k$ -WL is obtained using a compressed CFI-construction.  
[Grohe, Lichter, Neuen, S.]
- ▶ used for supercritical, robust trade-offs (e.g., depth vs width) for proof systems  
[de Rezende, Fleming, Janett, Nordström, Pang]  
[Berkholz, Lichter, Vinnall-Smeeth]



# Complexity

## Theorem (Lichter, Raßmann, S. (paraphrased) (2025))

*For determining the WL-dimension of a graph we have the following results:*

- ▶ *It is NP-hard even on graphs of color class size 4.*
- ▶ *For fixed  $k$  and color class size at most 5 it is solvable in polynomial time.*
- ▶ *It is P-hard for fixed  $k$ .*
- ▶ *For Abelian color classes and fixed  $k$ , we can solve the problem in polynomial time.*

## Open Problem:

Can we decide for each fixed  $k$  in polynomial time whether the WL-dimension is at most  $k$ ?

# Requantification

## Question

What happens if we disallow certain variables to be nested within themselves (i.e., requantified)?

This question is related to **individualization-refinement** algorithms used in practice to compute isomorphism and automorphism.

## Theorem (Raßmann, Schindling, S. (paraphrased) (2025))

- ▶ *We know how the expressiveness changes if we restrict requantification.*
- ▶ *We have a corresponding restricted logic and bijective pebble game.*
- ▶ *There are no succinct normal forms for restricted requantification.*
- ▶ *We know how the space consumptions changes when requantification is restricted.*

# WL for groups

- ▶ There are several natural ways to define WL for groups, they all agree up to constants.
- ▶ There are “very similar” groups distinguished by 3-WL.

[Brachter, S.] (2020)

Beyond that there are

- ▶ other ways of incorporating WL into group isomorphism algorithms and
- ▶ various complexity results

[Brooksbank, Grochow, Li, Qiao, Wilson]

**Open Problem:** It is unknown whether the WL-dimension of groups is unbounded.

# WL and isomorphism invariants of groups

## Theorem

*If groups are not distinguished by  $k$ -WL then  $k$ -WL does not distinguish their*

- ▶ *centers ( $k \geq 2$ ),*
- ▶ *inner automorphism groups ( $k \geq 4$ )*
- ▶ *derived series ( $k \geq 3$ ),*
- ▶ *Abelian radicals ( $k \geq 3$ ),*
- ▶ *solvable radicals ( $k \geq 2$ ),*
- ▶ *Fitting groups ( $k \geq 3$ ), and*
- ▶  *$\pi$ -radicals ( $k \geq 3$ )*

*They also have isomorphic socles ( $k \geq 5$ ), stepwise isomorphic factors in the derived series ( $k \geq 4$ ), upper central series ( $k \geq 4$ ), and lower central series ( $k \geq 4$ ).*

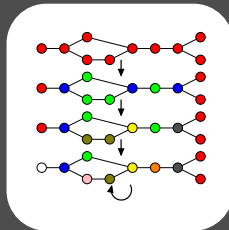
## Theorem

*If two groups are not distinguished by  $k$ -WL then*

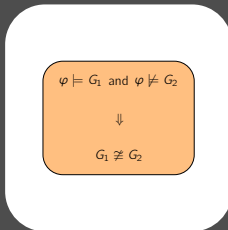
- ▶ *they have the same composition factors (as a multiset,  $k \geq 5$ ) and*
- ▶ *their indecomposable direct factors are not distinguished by  $(k - 1)$ -WL ( $k \geq 5$ ).*

*[Brachter, S.] (2022)*

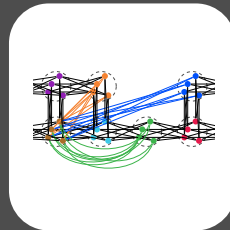
## 1. WL Algorithm



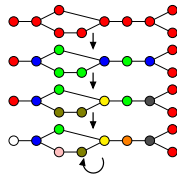
## 2. Logics & Games



## 3. Recent developments



## 1. WL Algorithm



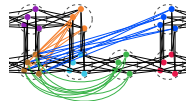
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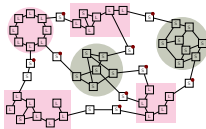
$\Downarrow$

$G_1 \not\cong G_2$

## 3. Recent developments



## 4. Dimension bound



# Bounds for the dimension

## Theorem (Schneider, S. (2025))

*The maximum Weisfeiler-Leman dimension among all graphs on  $n$  nodes is*

- ▶ *at most  $\frac{3}{20}n + o(n)$ ,*
- ▶ *at least  $0.0105n$ .*

## Related work

- ▶  $\leq \frac{n+3}{2}$  [Pikhurko, Veith, Verbitsky] (2006)
- ▶  $\leq \frac{n}{3}$  [Lutz] (2020)
- ▶  $\leq \frac{n}{4} + o(n)$  and  $\geq \frac{1}{96}n - o(n)$ . independently [Kiefer & Neuen] (2024)

# Proof outline:

In a nutshell:

1. reduction to coherent configurations (i.e., objects stable under 2WL)
2. bounds for configurations with small fibers (size at most 7)
3. classification of small interspaces
4. new concept of restorability
5. local reductions
6. a global structure analysis

## Theorem (Schneider, S. (2025))

*The maximum Weisfeiler-Leman dimension among all graphs on  $n$  nodes and color class size at most 7 is at most  $\frac{1}{20}n + o(n)$ .*

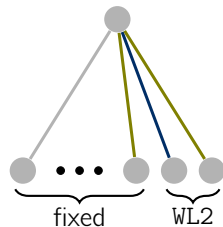


# Local Reductions

**Goal:** avoid certain substructures

**Approach:**

- ▶ individualize  $x$  vertices and apply 2-WL
- ▶ charge cost of individualization to “progress” measured as splits of vertex color classes



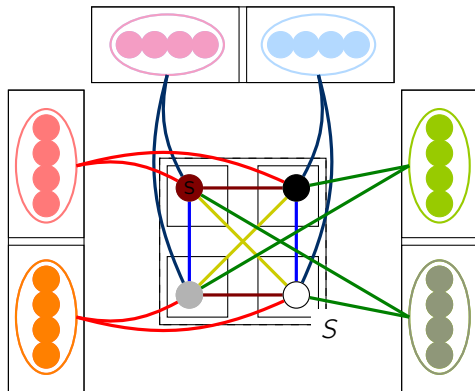
**Potential function:**  $\tau(G) := \frac{3n_L - 8k_L + n_S}{20}$  where

- ▶  $n_L$  number of vertices in large color classes
- ▶  $k_L$  number of large color classes
- ▶  $n_S$  number of vertices in small color classes

**Local reductions blueprint:**

If  $G$  has [certain substructure], then  $\dim_{\text{WL}} G \leq x + \tilde{f}(\tau(G) - \hat{x})$  where  $\hat{x} \geq x$ .

# Local Reductions: Example

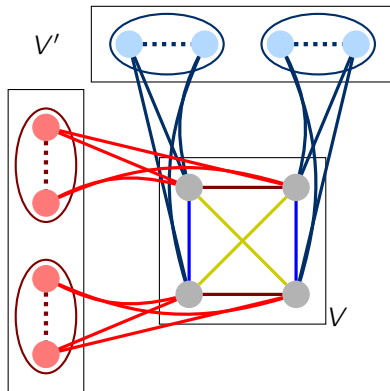


For arbitrary  $s \in S$ , progress in  $G_s$

$$\begin{aligned}
 & \tau(G_s) - \tau(G) \\
 & \leq \frac{3\Delta n_L - 8\Delta k_L + \Delta n_S}{20} \\
 & \leq \frac{(3 \cdot -24) - (8 \cdot -3) + (24 - 4)}{20} \\
 & \leq -1.4
 \end{aligned}$$

$$\dim_{\text{WL}} G \leq 1 + \tilde{f}(\tau(G) - 1.4).$$

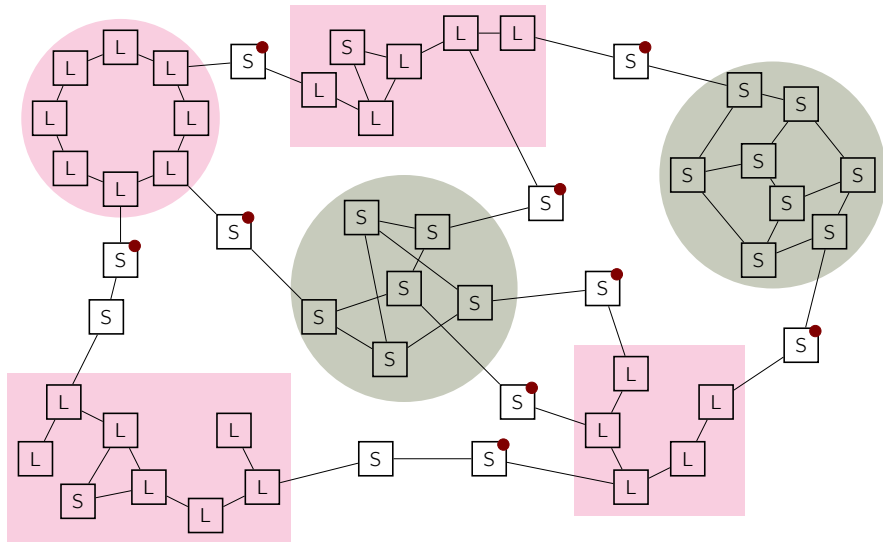
# Restorability



We call a color class  $C$  **restorable** if every automorphism of  $G[N(C)]$  that extends to an automorphism of  $G[V - C]$  also extends to an automorphism of  $G[C \cup N(C)]$ .

**Insight:** Removing a restorable class does not change the WL-dimension.

# Global Argument

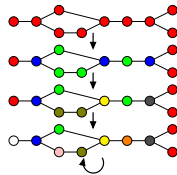




## Interspace between small fibers

$ R $	$ B $	$T(\mathfrak{X}[R, B])$
4	4	$(C_8, C_8), (2K_{2,2}, 2K_{2,2})$
4	6	$(Sp_{4,6}, Sp_{4,6}), (2K_{2,3}, 2K_{2,3})$
6	6	$(C_{12}, C_{12}, 3K_{2,2}), (2K_{3,3}, 2K_{3,3}), (3K_{2,2}, 3K_{2,2}, 3K_{2,2}), (3K_{2,2}, R \times B - 3K_{2,2})$
7	7	$(L(FP), R \times B - L(FP))$

## 1. WL Algorithm



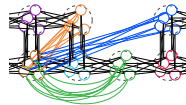
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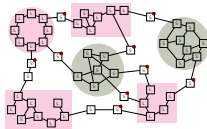
$\Downarrow$

$G_1 \not\cong G_2$

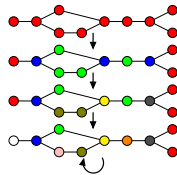
## 3. Recent developments



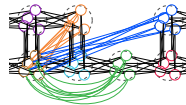
## 4. Dimension bound



## 1. WL Algorithm



## 3. Recent developments



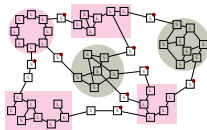
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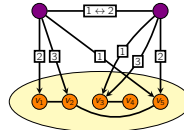
$\Downarrow$

$G_1 \not\cong G_2$

## 4. Dimension bound

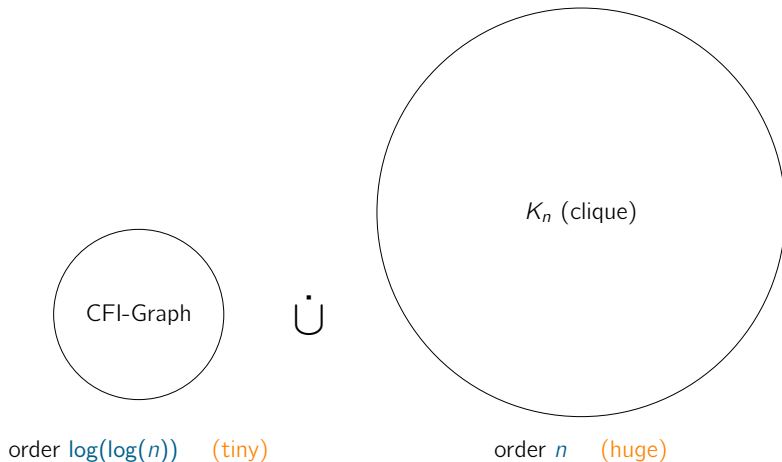


## 5. Deep WL





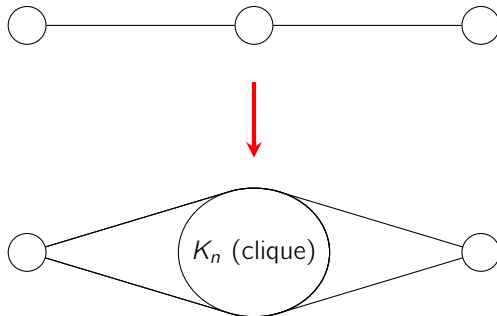
## Locally difficult graphs



**Idea:** We should run  $k$ -WL for high  $k$  only on the small CFI-Graph.

# Globally difficult graphs

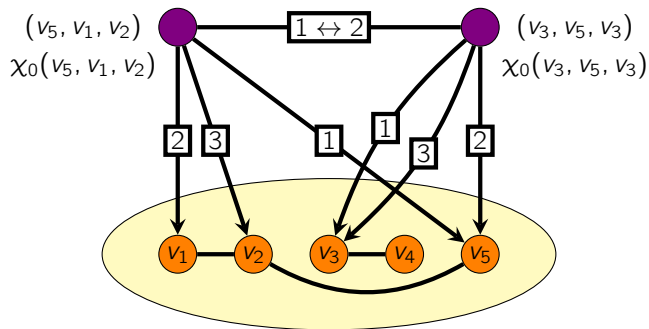
Consider CFI-Graph in which every vertex is blown up:



**Idea:** Treat the clique vertices like one object

## $k$ -dim WL (alternative View)

**Alternative view for  $k$ -WL:** We extend the structure by points representing  $k$ -tuples.



### Facts:

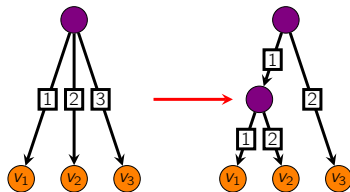
$(k-1)\text{-WL} \preceq (1\text{-WL on } k\text{-tuple extended structure}) \preceq k\text{-WL}$  (see [Otto] (1997))

We can omit vertical connections and vertex colors by always using 2-dim WL.

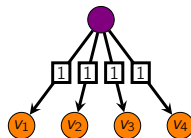
# Essential operations

2-tuples sufficient to simulate  $k$ -tuples:

$$(v_1, v_2, v_3) \rightsquigarrow (v_1, (v_2, v_3))$$



To handle blow ups, we can contract several vertices to one.

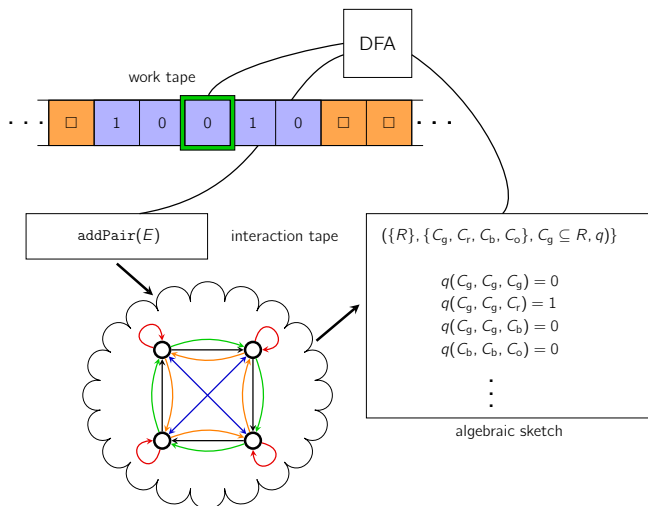


We need to make sure everything is **isomorphism invariant**.

- ▶ 2-tuples are inserted for entire color classes at a time.
- ▶ Contractions are only applied to strongly connected components (of constituent graphs).

# Deep Weisfeiler Leman

- ▶ **addPair( $X$ )**: add vertices for all pairs  $(u, v)$  of color  $X$ .
- ▶ **contract( $X$ )**: add a vertex for each strongly connected component of  $X$ .
- ▶ **create( $\pi$ )**: create new relation that is union of all colors in  $\pi$ .
- ▶ **forget( $X$ )**: delete relation  $X$ .



# Deep-WL and canonization

## Theorem ([Grohe, S., Wiebking] (2020))

*Let  $\mathcal{G}$  be a graph class with polynomial-time Deep-WL-algorithm isomorphism algorithm. Then there is a polynomial-time Deep-WL-algorithm that computes a complete invariant for  $\mathcal{G}$ .*

## Corollary

*Let  $\mathcal{G}$  be a class of colored graphs closed under recoloring and with polynomial time Deep-WL isomorphism test. Then there is a polynomial time canonization algorithm for  $\mathcal{G}$ .*

# The power of Deep-WL

## Theorem ([Grohe, S., Wiebking] (2020))

*A property of graphs is decidable by a polynomial time Deep-WL-algorithm if and only if it is expressible in Choiceless Polynomial Time.*

**Fact:** Isomorphism of CFI-graphs is expressible in Choiceless Polynomial Time.

[Dawar, Richerby, Rossman] (2008)

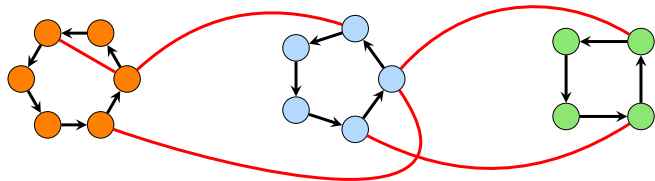
## Corollary

*There is a polynomial time Deep-WL-algorithm that decides isomorphism of the CFI graphs.*

# Abelian and Dihedral color classes

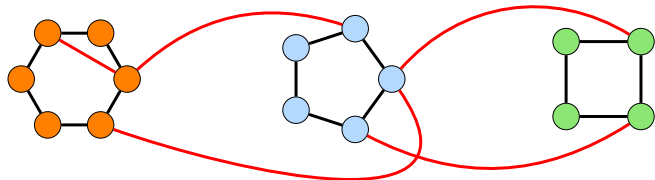
Theorem ([Abu Zaid, Grädel, Grohe, Pakusa] (2014))

*Deep-WL decides isomorphism for structures with abelian color classes of bounded size.*



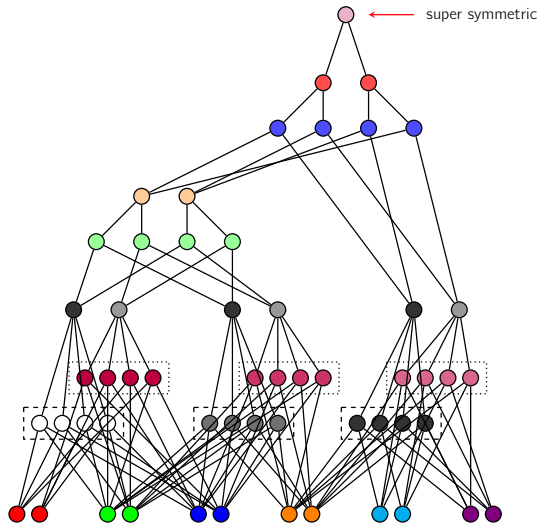
Theorem ([Lichter, S.] (2021))

*Deep-WL decides isomorphism for graphs with dihedral color classes of bounded size.*

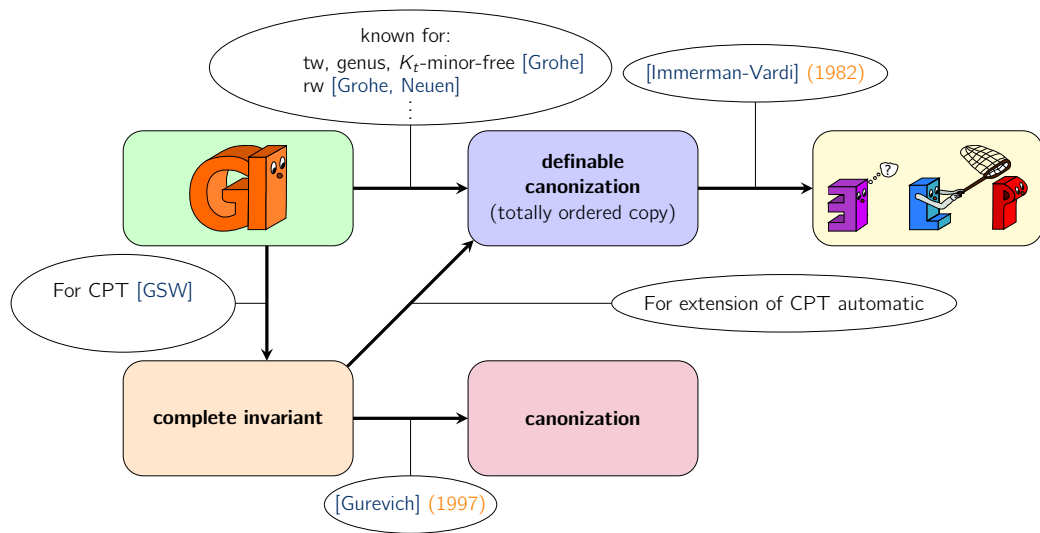




## CFI with DeepWL (an intuition)



# Capturing by canonization



# Isomorphism to P-time logic

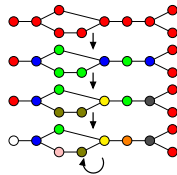
Theorem (Lichter, S. (2022))

Let  $\mathcal{C}$  be a class of structures (closed under individualization).

If isomorphism in  $\mathcal{C}$  is definable in  $CPT+WSC$  then  $CPT+WSC$  captures  $P$ -time on  $\mathcal{C}$ .

(We also have some CFI-query decidable in  $CPT+WSC$  not known to be decidable in  $CPT$ ).

## 1. WL Algorithm



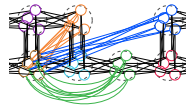
## 2. Logics & Games

$\varphi \models G_1$  and  $\varphi \not\models G_2$

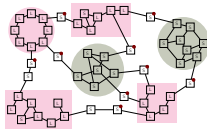
$\Downarrow$

$G_1 \not\cong G_2$

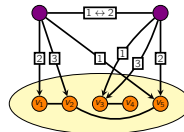
## 3. Recent developments



## 4. Dimension bound

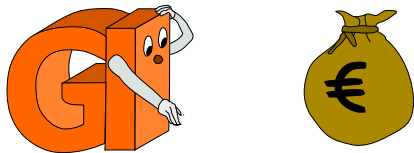


## 5. Deep WL



# Cumulative prize money

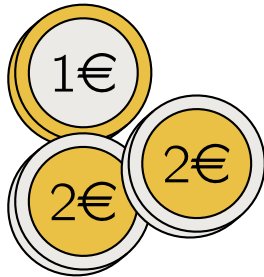
Prize for a proof that  $GI \in P$  or that  $GI \notin P$ !



805Euro

# Cumulative prize money

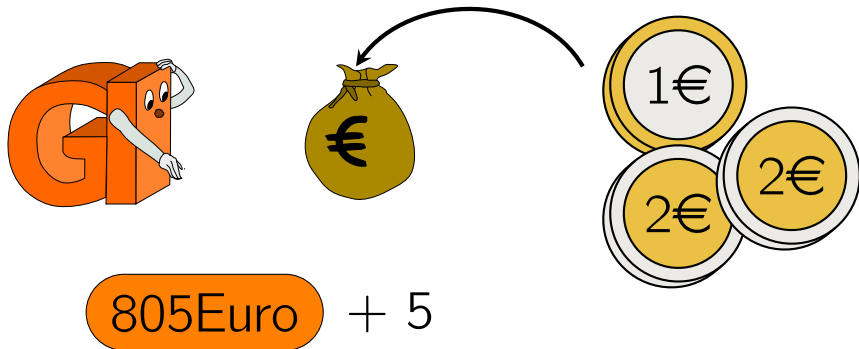
Prize for a proof that  $GI \in P$  or that  $GI \notin P$ !



805Euro + 5

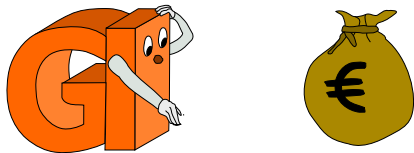
# Cumulative prize money

Prize for a proof that  $GI \in P$  or that  $GI \notin P$ !



# Cumulative prize money

Prize for a proof that  $GI \in P$  or that  $GI \notin P$ !



810Euro



# Cumulative prize money

Prize for a proof that  $GI \in P$  or that  $GI \notin P$ !



810Euro

Questions?

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