

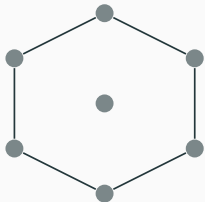
A vintage illustration of a bicycle race. In the foreground, several cyclists are hunched over their handlebars, competing on a dirt track. They are wearing colorful, form-fitting cycling suits. To the left, a large crowd of spectators, including men and women in early 20th-century attire, watches from behind a white picket fence. Some spectators are waving their hats. In the background, a large, ornate grandstand with multiple tiers is visible. On the right side of the image, a man in a grey suit and a brown bowler hat stands with his back to the viewer, looking down at a clipboard or a book. The overall style is that of a classic color illustration, possibly from a book or a magazine.

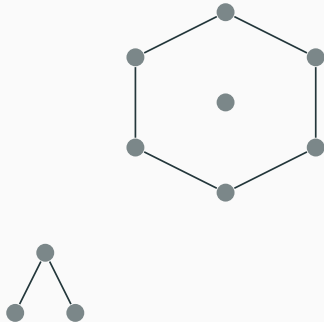
Homomorphism Indistinguishability

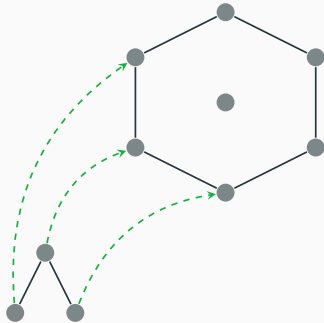
Simons Institute, 12 August 2025

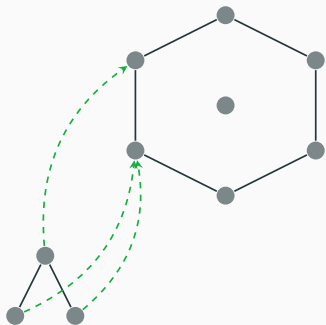
Tim Seppelt

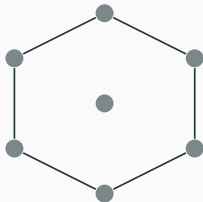
IT-UNIVERSITETET I KØBENHAVN



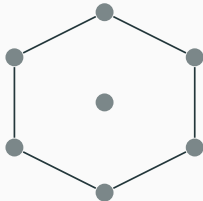








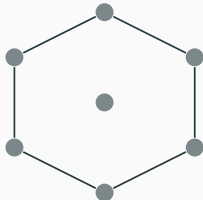
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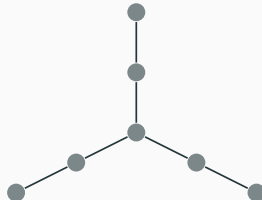
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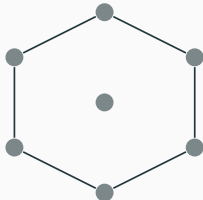


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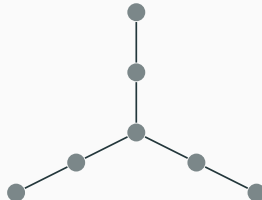
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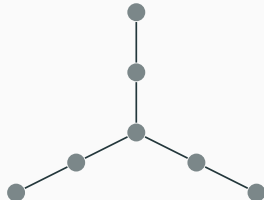
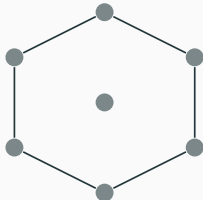
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
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The graphs  and  are homomorphism indistinguishable over $\left\{ \begin{array}{c} \bullet \\ \diagup \quad \diagdown \\ \bullet \quad \bullet \end{array} , \begin{array}{c} \bullet \quad \bullet \\ | \quad | \\ \bullet \quad \bullet \end{array} \right\}$.

graph class \mathcal{F} relation $\equiv_{\mathcal{F}}$
all graphs isomorphism

Lovász (1967)

graph class \mathcal{F}	relation $\equiv_{\mathcal{F}}$
all graphs	isomorphism
cycles	cospectrality

Lovász (1967)

Folklore

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C^{k+1} -equivalence

Lovász (1967)

Folklore

Mančinska & Roberson (2020)

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Dvořák (2010); Dell, Grohe, & Rattan (2018)

graph class \mathcal{F}	relation $\equiv_{\mathcal{F}}$	
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	\mathbb{P}_k -coKleisli isomorphism	Dawar, Jakl, & Reggio (2021)

Theorem (Xu, Hu, Leskovec, & Jegelka (2018); Dvořák (2010))

Two graphs are *not distinguished by any MPNN* if, and only if, they are homomorphism indistinguishable over all *trees*.

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- Generalisations to **MPNN variants** due to Morris, Ritzert, Fey, Hamilton, Lenssen, Rattan, & Grohe (2019); Zhang, Gai, Du, Ye, He, & Wang (2024); Gai, Du, Zhang, Maron, & Wang (2025).

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- Insights into distinguishing power of such architectures.

Weisfeiler–Leman



homomorphism
indistinguishability



$$XA_G = A_HX$$

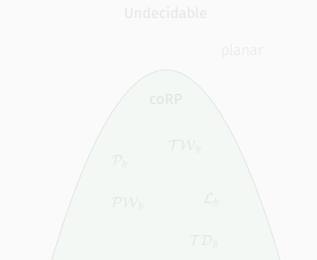
Characterisations

How to characterise $\equiv_{\mathcal{F}}$?



Distinguishing Power

What's the power of $\equiv_{\mathcal{F}}$?

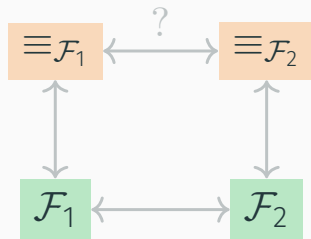


Complexity

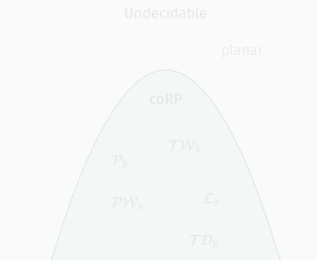
How to test $\equiv_{\mathcal{F}}$?



Characterisations
How to characterise $\equiv_{\mathcal{F}}$?



Distinguishing Power
What's the power of $\equiv_{\mathcal{F}}$?



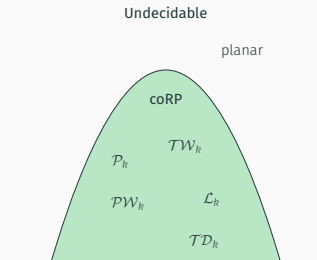
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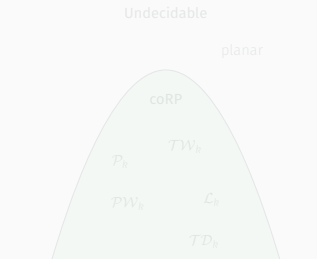
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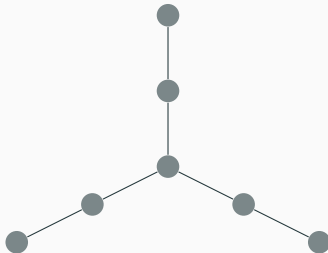
Observation

Two graphs *if, and only if, they are*
homomorphism indistinguishable over $\{\bullet\}$.

Observation

Two graphs
homomorphism indistinguishable over $\{\bullet\}$.

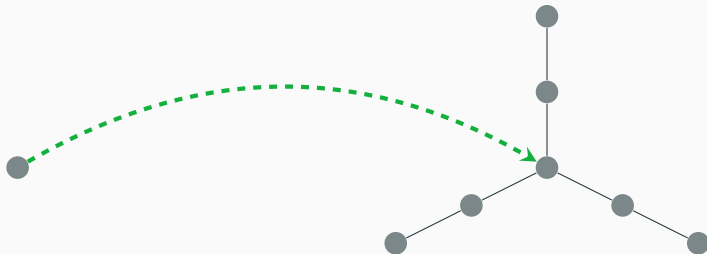
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Observation

Two graphs
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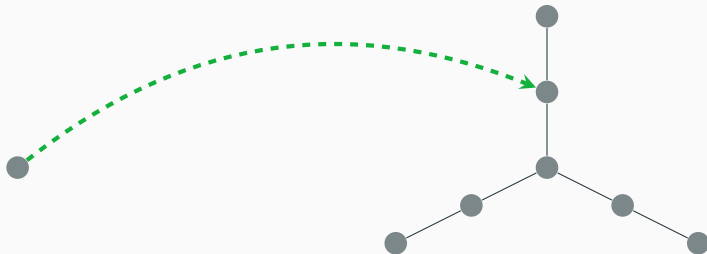
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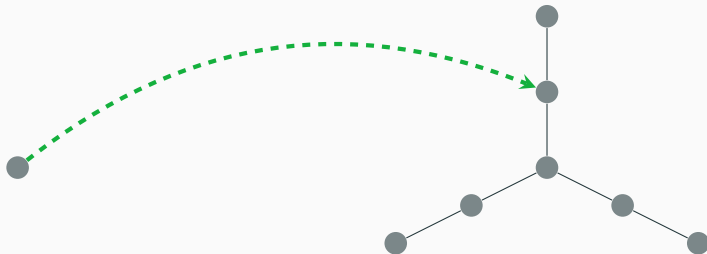
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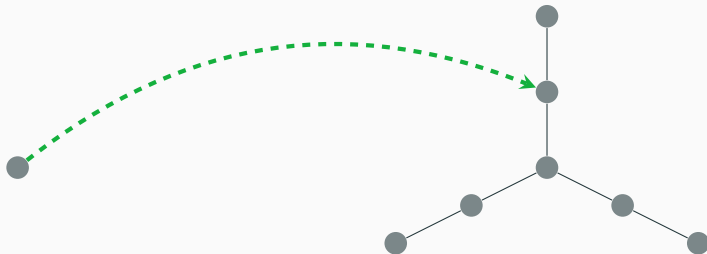
if, and only if, they are



$$\text{hom}(\bullet, G) = |V(G)|.$$

Observation

Two graphs *have the same number of vertices* if, and only if, they are homomorphism indistinguishable over $\{\bullet\}$.



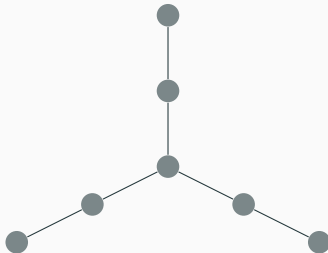
$$\text{hom}(\bullet, G) = |V(G)|.$$

Observation

Two graphs *if, and only if, they are*
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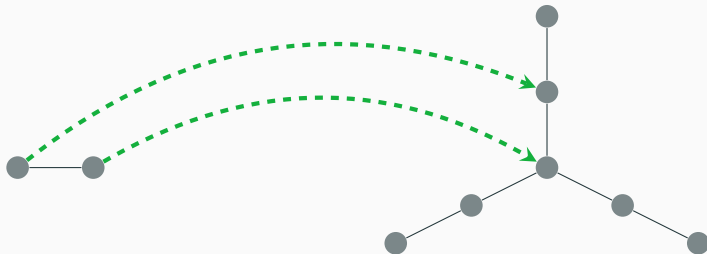
Observation

Two graphs *if, and only if, they are*
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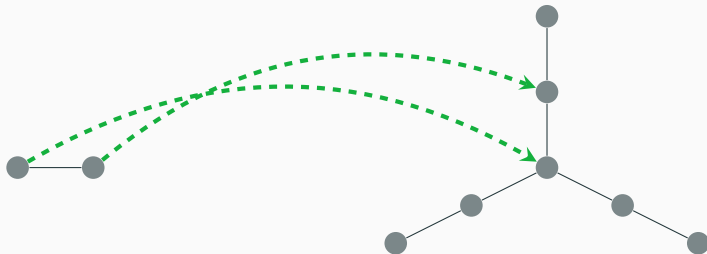
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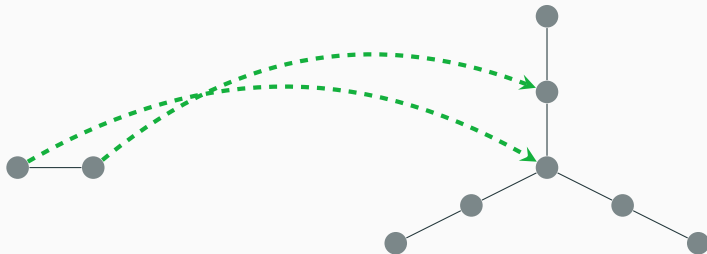
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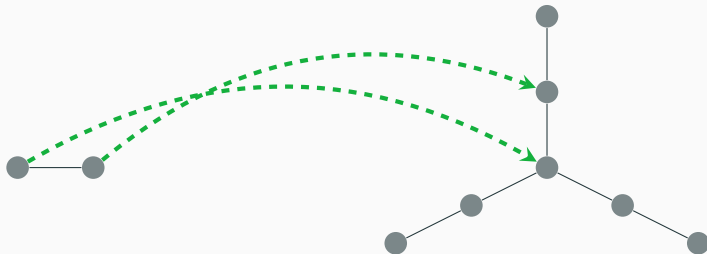
Two graphs G and H are homomorphic if, and only if, they are indistinguishable over $\{\bullet-\bullet\}$.



$$\text{hom}(\bullet-\bullet, G) = 2|E(G)|.$$

Observation

Two graphs *have the same number of edges* if, and only if, they are homomorphism indistinguishable over $\{\bullet-\bullet\}$.



$$\text{hom}(\bullet-\bullet, G) = 2|E(G)|.$$

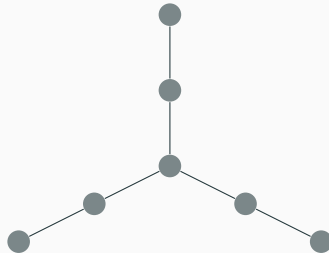
Observation

Two graphs if, and only if, they are homomorphism indistinguishable over stars.

Observation

Two graphs
homomorphism indistinguishable over *stars*.

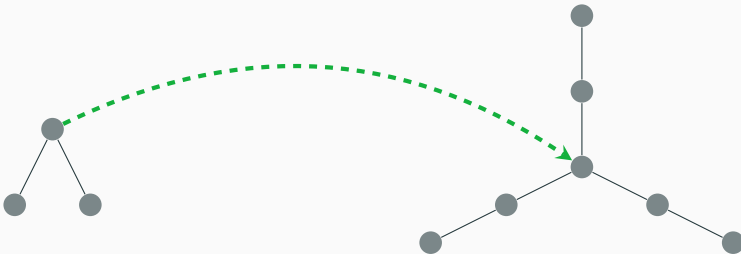
if, and only if, they are



Observation

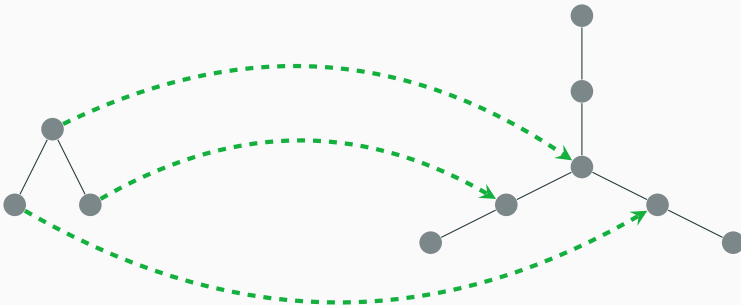
Two graphs
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Observation

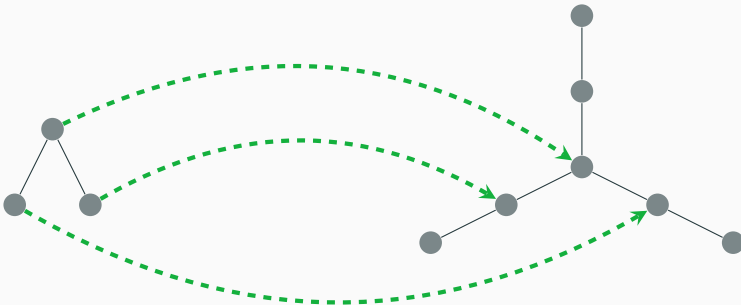
Two graphs *if, and only if, they are*
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Observation

Two graphs
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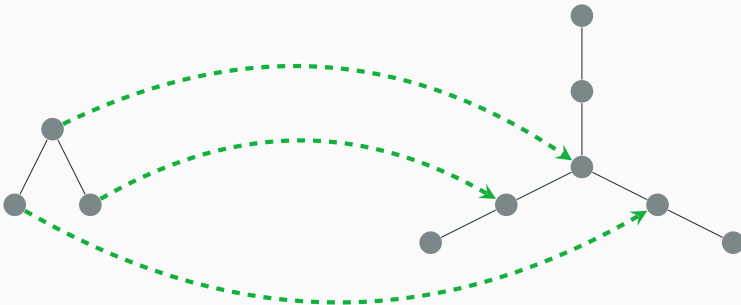
if, and only if, they are



$$\text{hom}(S_\ell, G) = \sum_{v \in V(G)} (\deg(v))^\ell$$

Observation

Two graphs *have the same degree sequence* if, and only if, they are homomorphism indistinguishable over *stars*.



$$\text{hom}(S_\ell, G) = \sum_{v \in V(G)} (\deg(v))^\ell$$

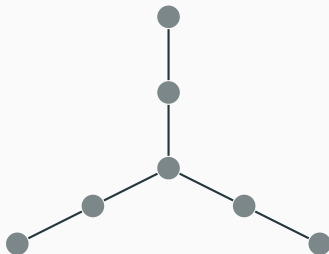
Theorem (Dvořák (2010); Dell, Grohe, & Rattan (2018))

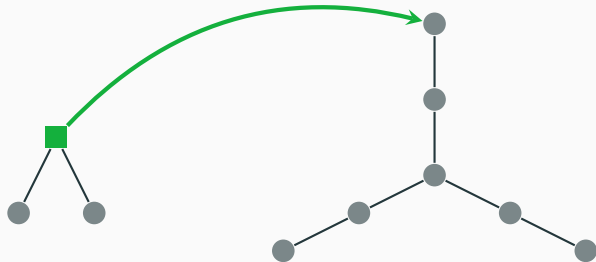
Two graphs are *not distinguished by Colour Refinement* if, and only if, they are homomorphism indistinguishable over *trees*.

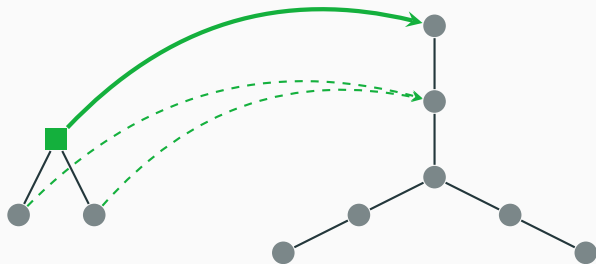
Theorem (Mančinska & Roberson (2020))

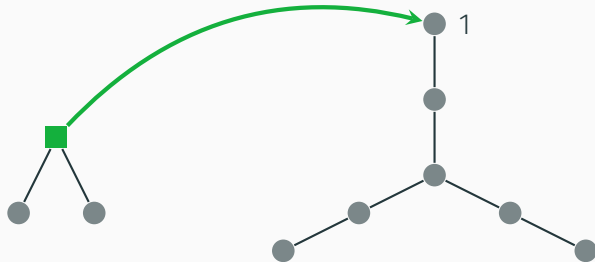
Two graphs are *quantum isomorphic* if, and only if, they are homomorphism indistinguishable over all *planar graphs*.

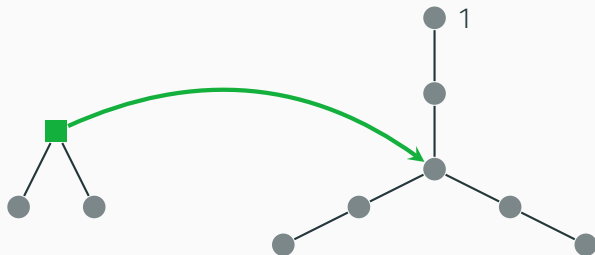


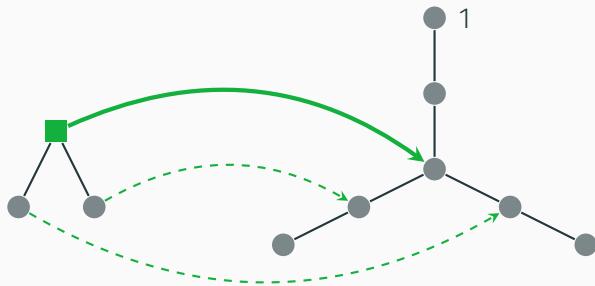


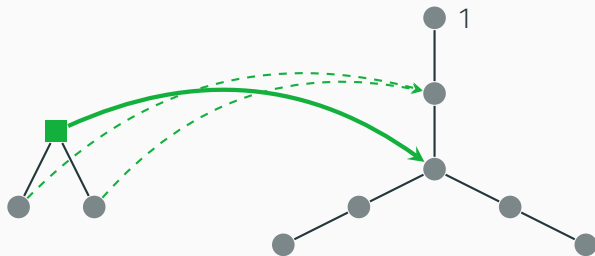


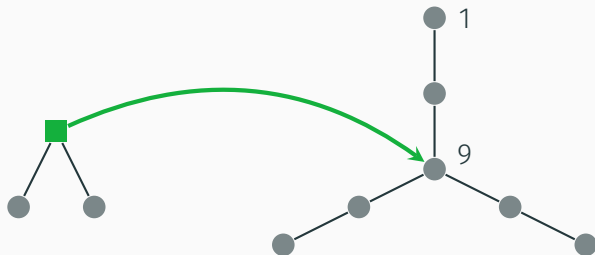












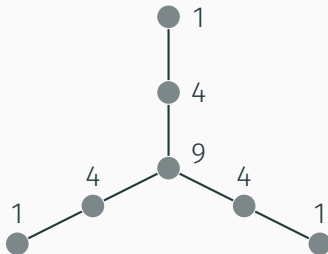
labelled graphs

→

homomorphism
vectors $\subseteq \mathbb{R}^{V(G)}$

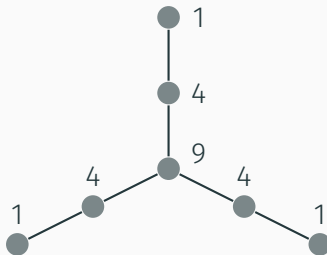


\mapsto



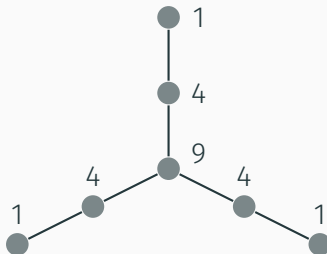


\mapsto





\mapsto

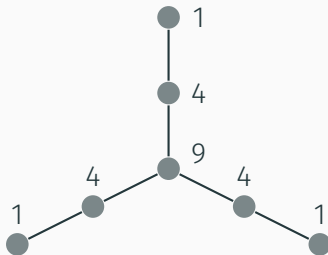


unlabelling \Downarrow





\mapsto



unlabelling \Downarrow

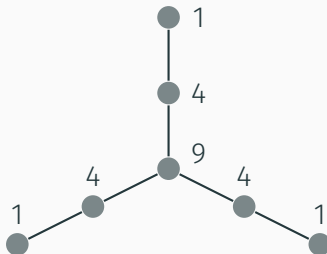


\mapsto

24



\mapsto



unlabelling \Downarrow



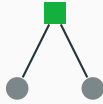
\mapsto

\Downarrow sum of entries

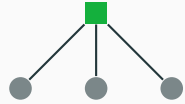
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gluing
 \odot

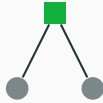


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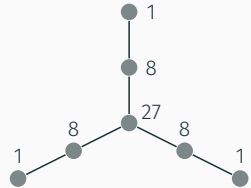
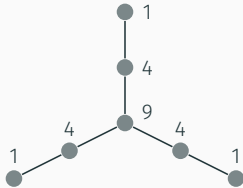
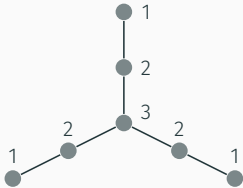
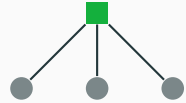




gluing

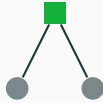


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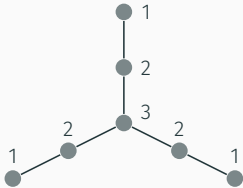
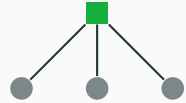




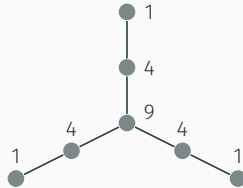
gluing



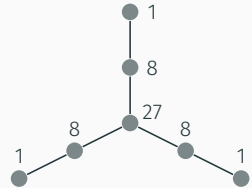
=



Schur
product



=



Theorem (Dvořák (2010); Dell, Grohe, & Rattan (2018))

Two graphs are *not distinguished by Colour Refinement* if, and only if, they are homomorphism indistinguishable over *trees*.

Theorem (Dvořák (2010); Dell, Grohe, & Rattan (2018))

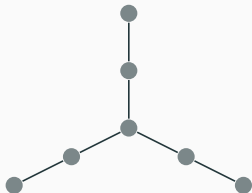
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Colour Refinement colours encode and are encoded by homomorphism vectors of labelled trees.

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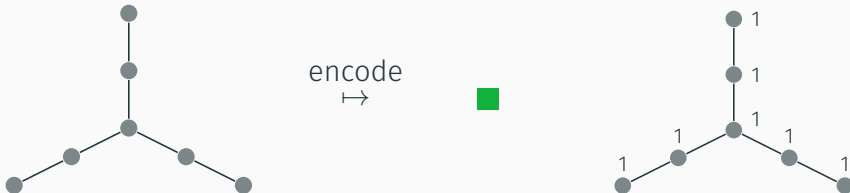
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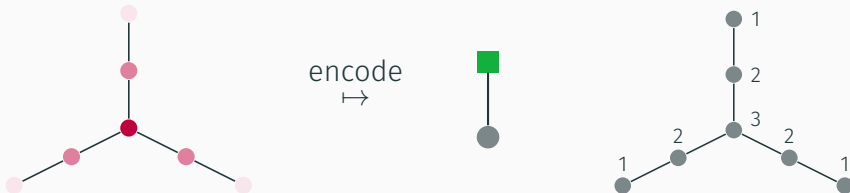
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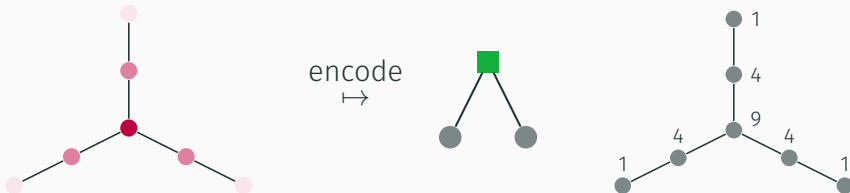
Colour Refinement colours encode and are encoded by homomorphism vectors of labelled trees.



Theorem (Dvořák (2010); Dell, Grohe, & Rattan (2018))

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Weisfeiler–Leman



homomorphism
indistinguishability



$$XA_G = A_HX$$

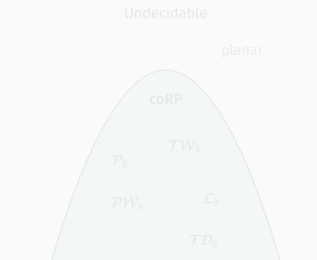
Characterisations

How to characterise $\equiv_{\mathcal{F}}$?



Distinguishing Power

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Theorem (Mančinska & Roberson (2020))

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A matrix $X = (x_{ij})$ over some C^* -algebra is a *quantum permutation matrix* if

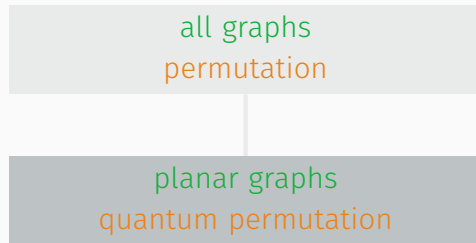
$$x_{ij}^2 = x_{ij} = x_{ij}^*, \quad \sum_k x_{ik} = 1 = \sum_k x_{kj}.$$

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planar graphs
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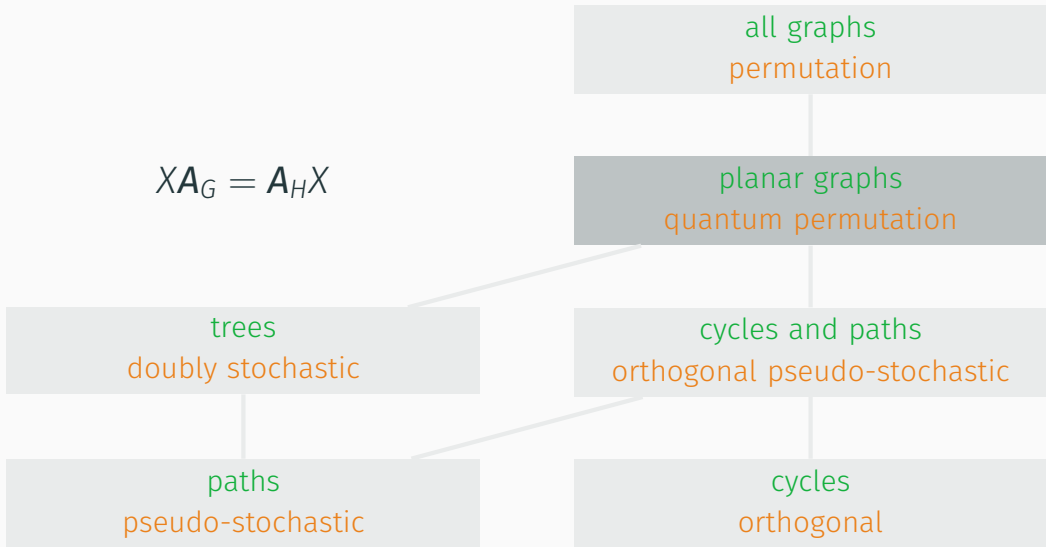
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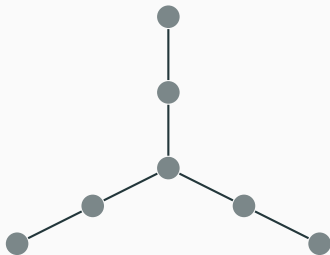
 \mapsto

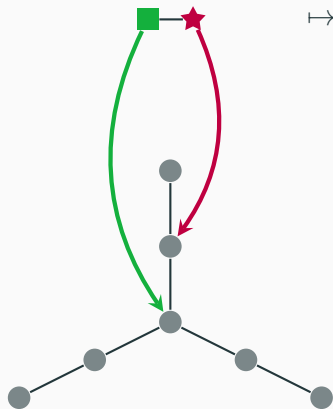
}							
0	1	0	1	0	1	0	
1	0	1	0	0	0	0	
0	1	0	0	0	0	0	
1	0	0	0	1	0	0	
0	0	0	1	0	0	0	
1	0	0	0	0	0	0	1
0	0	0	0	0	1	0	



\mapsto

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





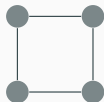
\mapsto

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





glue and
unlabel

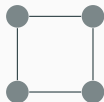




\mapsto

$$\left\{ \begin{array}{ccccccc} 12 & 0 & 4 & 0 & 4 & 0 & 4 \\ 0 & 6 & 0 & 5 & 0 & 5 & 0 \\ 4 & 0 & 2 & 0 & 1 & 0 & 1 \\ 0 & 5 & 0 & 6 & 0 & 5 & 0 \\ 4 & 0 & 1 & 0 & 2 & 0 & 1 \\ 0 & 5 & 0 & 5 & 0 & 6 & 0 \\ 4 & 0 & 1 & 0 & 1 & 0 & 2 \end{array} \right.$$

glue and
unlabel \Downarrow

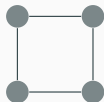



 \mapsto

12	0	4	0	4	0	4
0	6	0	5	0	5	0
4	0	2	0	1	0	1
0	5	0	6	0	5	0
4	0	1	0	2	0	1
0	5	0	5	0	6	0
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glue and
unlabel
↓

↓ trace


 \mapsto

36

Theorem

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Theorem (Specht (1940))

For symmetric matrices A and B , there is an *orthogonal* matrix X such that $XA = BX$ if, and only if, $\text{tr}(A^n) = \text{tr}(B^n)$ for all $n \in \mathbb{N}$.

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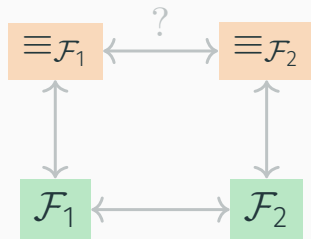
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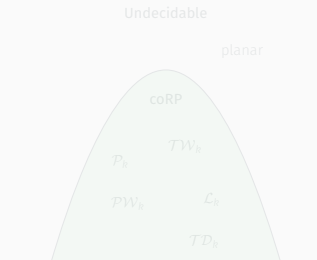
Check out Kar, Roberson, S., & Zeman (2025) for an elementary proof!



Characterisations
How to characterise $\equiv_{\mathcal{F}}$?



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Are all **cospectral** graphs isomorphic?

Günthard & Primas (1956)

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Can $\equiv_{\mathcal{F}}$ be isomorphism for a proper graph class \mathcal{F} ?

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Definition (Roberson (2022))

A graph class \mathcal{F} is *homomorphism distinguishing closed* if, for all $F' \notin \mathcal{F}$,
there exist G and H such that $G \equiv_{\mathcal{F}} H$ and $\text{hom}(F', G) \neq \text{hom}(F', H)$.

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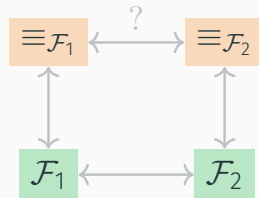
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Which graph classes are homomorphism distinguishing closed?

Observation

If \mathcal{F}_1 is homomorphism distinguishing closed, then

$$\equiv_{\mathcal{F}_1} \text{refines } \equiv_{\mathcal{F}_2} \iff \mathcal{F}_1 \text{ is a superclass of } \mathcal{F}_2.$$

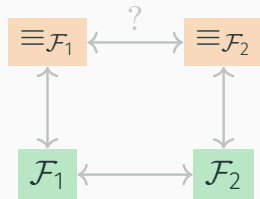


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- optimisation
- Graph Neural Networks
- finite model theory



Roberson & S. (2023)

Zhang, Gai, Du, Ye, He, & Wang (2024)

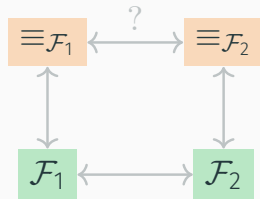
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Conjecture (Roberson (2022))

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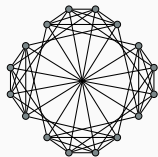
- planar graphs Roberson (2022)
- treewidth $\leq k$ Neuen (2024)
- treedepth $\leq q$ Fluck, S., & Spitzer (2024)
- k -pebble forest cover of depth $\leq q$ Adler & Fluck (2024)
- pathwidth $\leq k$ S. (2024)
- essentially finite graph classes S. (2023)
- outerplanar graphs Neuen & S. (2024)



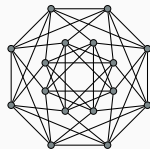
$$G \notin \mathcal{F}$$



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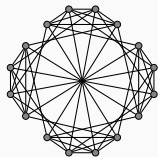
even CFI graph of G



odd CFI graph of G

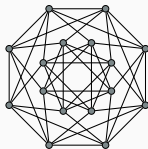


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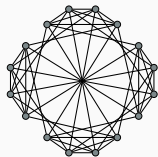
$G_0 \equiv_{\mathcal{F}} G_1$
 $\text{hom}(G, G_0) \neq \text{hom}(G, G_1)$



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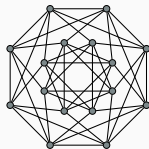


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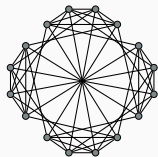
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Graph search-
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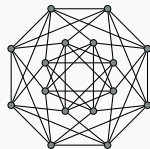


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Duplicator

Theorem (Roberson (2022))

For a connected graph G and any graph F , the following are equivalent:

1. $\text{hom}(F, G_0) \neq \text{hom}(F, G_1)$,
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If $F \rightarrow G$ is a **weak oddomorphism**, then

- $\text{tw}(F) \geq \text{tw}(G)$, Neuen (2024)
- $\text{td}(F) \geq \text{td}(G)$, Fluck, S., & Spitzer (2024)
- $\text{pw}(F) \geq \text{pw}(G)$, S. (2024)
- F planar $\implies G$ planar, Roberson (2022)
- $\Delta(F) \geq \Delta(G)$, Roberson (2022)
- F outerplanar $\implies G$ outerplanar. Neuen & S. (2024)

Theorem (S. (2023))

For every homomorphism distinguishing closed graph class \mathcal{F} ,

\mathcal{F} is minor-closed $\iff \equiv_{\mathcal{F}}$ is preserved under complements.

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- Typical graph isomorphism relaxations are preserved under complements.

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For every homomorphism distinguishing closed graph class \mathcal{F} ,

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- Typical graph isomorphism relaxations are preserved under complements.
- Towards a **theory of homomorphism indistinguishability**, we can focus on minor-closed graph classes.

Theorem (Roberson (2022))

There are uncountably many homomorphism distinguishing closed graph classes.

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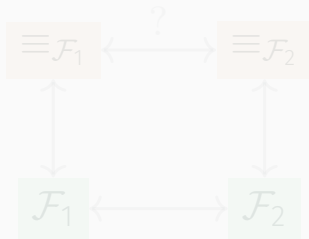
*There are uncountably many **homomorphism distinguishing closed** graph classes.*

Theorem (van Dobben de Bruyn, Marquès, Roberson, S., Zeman (2025+))

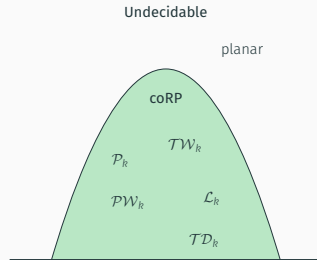
*There is a topology whose closed sets are precisely the **homomorphism distinguishing closed** sets.*



Characterisations
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Let \mathcal{F} be **minor-closed** and **proper**.

HOMIND(\mathcal{F})

Input Graphs G and H .

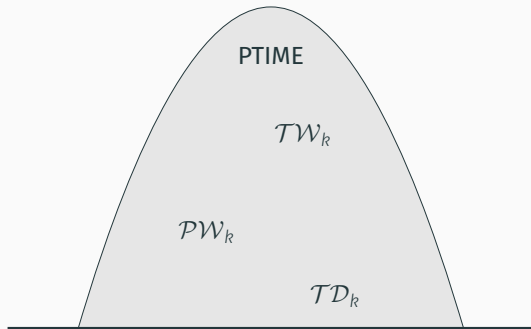
Decide $G \equiv_{\mathcal{F}} H$.

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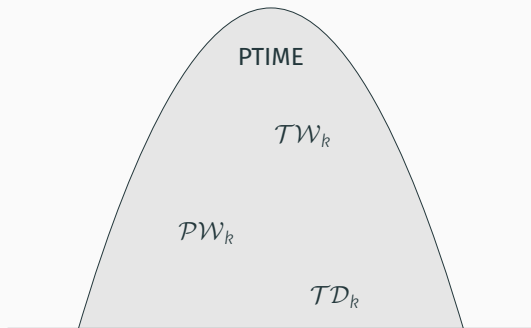
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Undecidable

planar



Dell, Grohe, & Rattan (2018); Dvořák (2010); Grohe (2020); Grohe, Rattan, S. (2022); Mančinska & Roberson (2020); Atserias, Mančinska, Roberson, Šámal, Severini, & Varvitsiotis (2019); Slofstra (2019)

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Reduction to equivalence testing for \mathbb{Q} -weighted tree automata, which is LOGSPACE interreducible with arithmetic circuit identity testing.

Marušić & Worrell (2015)

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Tzeng (1996)

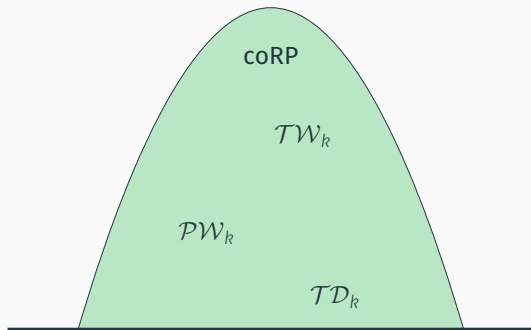
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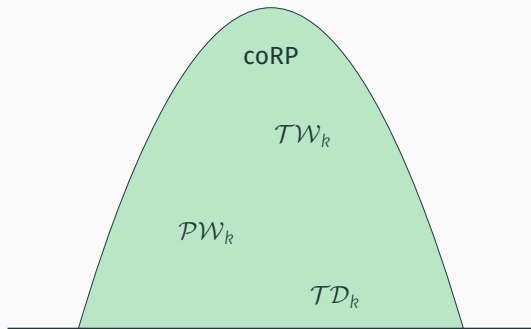
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Conjecture (S. (2024))

If \mathcal{F} has bounded treewidth, then $\text{HOMIND}(\mathcal{F})$ is in PTIME .

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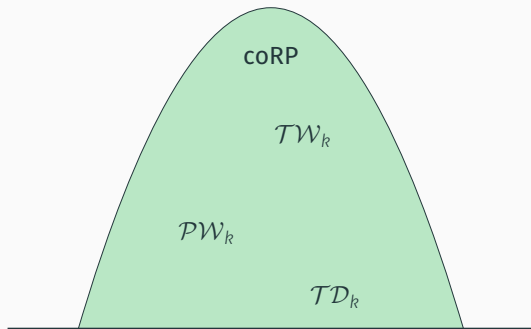
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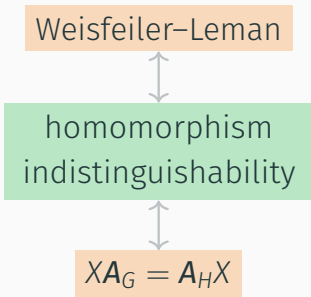
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Otherwise, $\text{HOMIND}(\mathcal{F})$ is undecidable.

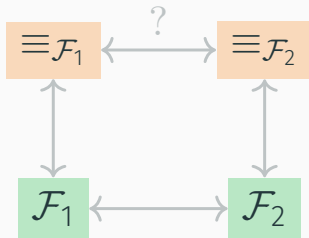
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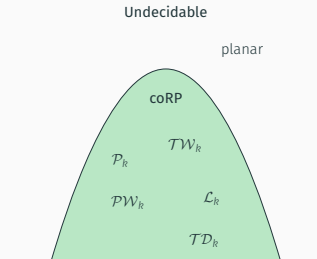




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Weisfeiler–Leman



homomorphism
indistinguishability



$$XA_G = A_HX$$

- Results by Lovász (1967); Dvořák (2010); Mančinska & Roberson (2020)

Characterisations

How to characterise $\equiv_{\mathcal{F}}$?

Weisfeiler–Leman



homomorphism
indistinguishability

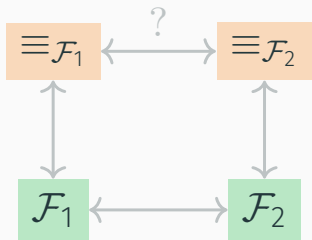


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Characterisations

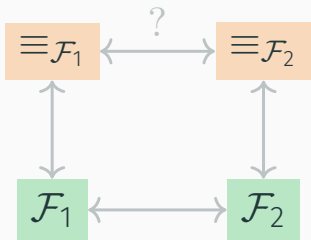
How to characterise $\equiv_{\mathcal{F}}$?

- Results by Lovász (1967); Dvořák (2010); Mančinska & Roberson (2020)
- **Tools:** labelled graphs and homomorphism vectors



Distinguishing Power

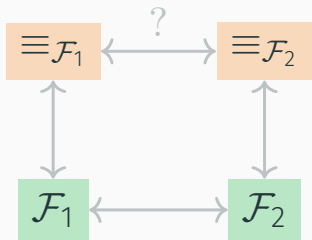
What's the power of $\equiv_{\mathcal{F}}$?



- Comparing **graph isomorphism relaxations** by comparing **graph classes**

Distinguishing Power

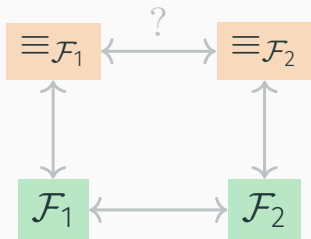
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Theory of Homomorphism Indistinguishability

Distinguishing Power
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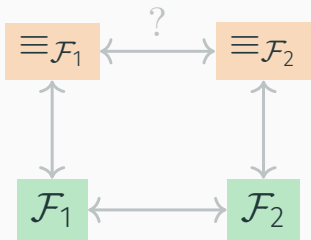
Distinguishing Power

What's the power of $\equiv_{\mathcal{F}}$?

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Theory of Homomorphism Indistinguishability

- **minor-closed** graph classes play a central role.



Distinguishing Power

What's the power of $\equiv_{\mathcal{F}}$?

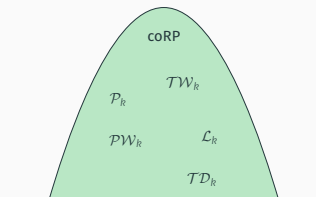
- Comparing **graph isomorphism relaxations** by comparing **graph classes**

Theory of Homomorphism Indistinguishability

- **minor-closed** graph classes play a central role.
- **Open:** Roberson's conjecture

Undecidable

planar

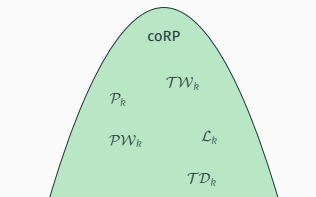


Complexity

How to test $\equiv_{\mathcal{F}}$?

Undecidable

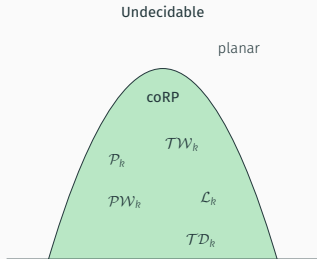
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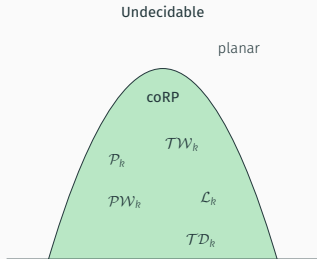


Complexity

How to test $\equiv_{\mathcal{F}}$?

Theory of Homomorphism Indistinguishability

- $\text{HOMIND}(\mathcal{F})$ is in **coRP** for **minor-closed** graph classes \mathcal{F} of **bounded treewidth**.



Complexity

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Theory of Homomorphism Indistinguishability

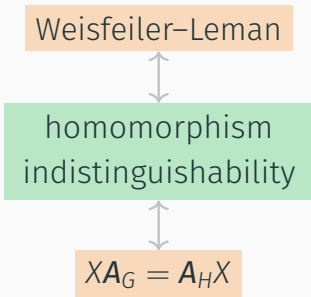
- $\text{HOMIND}(\mathcal{F})$ is in **coRP** for **minor-closed** graph classes \mathcal{F} of **bounded treewidth**.
- **Open:** **(un)decidable** for **proper minor-closed** graph classes of **unbounded treewidth**.



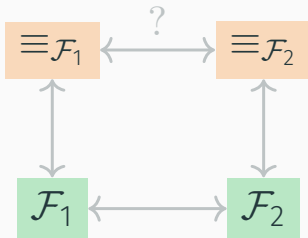
Homomorphism Indistinguishability Zoo

`tseppelt.github.io/homind-database`

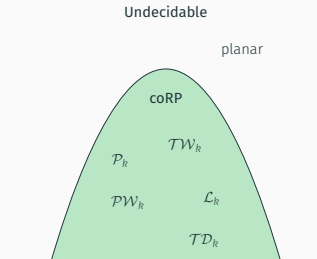
Graph classes and their homomorphism indistinguishability properties.



Characterisations
How to characterise $\equiv_{\mathcal{F}}$?

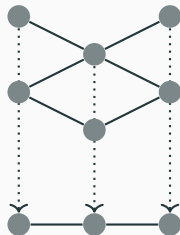


Distinguishing Power
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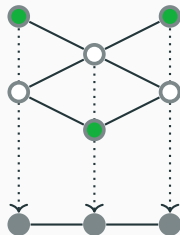
Complexity
How to test $\equiv_{\mathcal{F}}$?

Let $\varphi: F \rightarrow G$ be a homomorphism.



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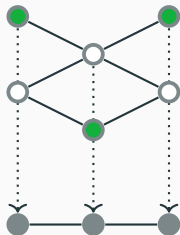


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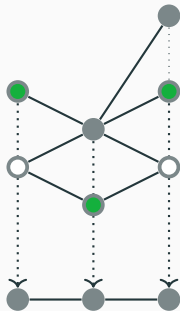
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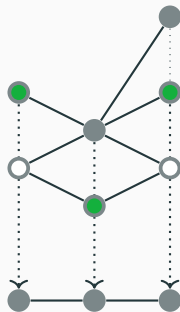
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Hypothesis

If $F \rightarrow G$ is a **weak oddomorphism**, then G is a **minor** of F .




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Title Picture: ‘Bicycle race scene. A peloton of six cyclists crosses the finish line in front of a crowded grandstand, observed by a referee.’ (1895) by Calvert Lithographic Co., Detroit, Michigan, Public Domain, via Wikimedia Commons. https://commons.wikimedia.org/wiki/File:Bicycle_race_scene,_1895.jpg