Homomorphism Indistinguishability

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PhD Defense, 29 November 2024

Tim Seppelt



Research Training Group – Uncertainty and Randomness in Algorithms, Verification,







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However, graph isomorphism is

- theoretically elusive and
- practically often inconsequential.













Characterisations

How to characterise \approx ?



Characterisations How to characterise \approx ? **Distinguishing Power** What's the power of \approx ?



Characterisations How to characterise \approx ? **Distinguishing Power** What's the power of \approx ? $\begin{array}{l} \mbox{Complexity} \\ \mbox{How to test} \approx ? \end{array}$















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graph class \mathcal{F} relation $\equiv_{\mathcal{F}}$ all graphsisomorphism

Lovász (1967)

graph class \mathcal{F} relation $\equiv_{\mathcal{F}}$ all graphsisomorphismcyclesalgebraic graph theory

Lovász (1967) Folklore graph class \mathcal{F} relation $\equiv_{\mathcal{F}}$ all graphsisomorphismLovász (1967)cyclesalgebraic graph theoryFolkloreplanar graphsquantum information theoryMančinska & Roberson (2020)

graph class \mathcal{F} relation $\equiv_{\mathcal{F}}$ all graphsisomorphismcyclesalgebraic graph theoryplanar graphsquantum information theory \mathcal{TW}_k finite model theory

Lovász (1967) Folklore Mančinska & Roberson (2020) Dvořák (2010); Dell, Grohe, & Rattan (2018)

graph class ${\cal F}$	$relation \equiv_\mathcal{F}$	
all graphs	isomorphism	Lovász (1967)
cycles	algebraic graph theory	Folklore
planar graphs	quantum information theory	Mančinska & Roberson (2020)
\mathcal{TW}_k	finite model theory	Dvořák (2010); Dell, Grohe, & Rattan
		(2018)
	graph isomorphism testing	Cai, Fürer, & Immerman (1992)

graph class \mathcal{F} all graphs cycles planar graphs \mathcal{TW}_k **relation** $\equiv_{\mathcal{F}}$ isomorphism algebraic graph theory quantum information theory finite model theory

graph isomorphism testing optimisation

Lovász (1967) Folklore Mančinska & Roberson (2020) Dvořák (2010): Dell. Grohe. & Rattan (2018)Cai. Fürer. & Immerman (1992) Atserias & Maneva (2012): Malkin (2014): Grohe & Otto (2015)

graph class \mathcal{F} rall graphsicyclescplanar graphsc \mathcal{TW}_k f

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category theory machine learning

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Characterisations How to characterise $\equiv_{\mathcal{F}}$? **Distinguishing Power** What's the power of $\equiv_{\mathcal{F}}$? $\begin{array}{l} \mbox{Complexity} \\ \mbox{How to test} \equiv_{\mathcal{F}}? \end{array}$







 $\begin{array}{l} \mbox{Characterisations}\\ \mbox{How to characterise} \equiv_{\mathcal{F}}? \end{array}$

Distinguishing Power What's the power of $\equiv_{\mathcal{F}}$? **Complexity** How to decide $\equiv_{\mathcal{F}}$?

> positive semi-definite X s.t. $XA_G = A_H X$.

> positive semi-definite X s.t. $XA_G = A_H X$.



semidefinite prog.



semidefinite prog.



Roberson and S. (2023)

Equations homomorphism vectors algebraic operations Graph Class labelled graphs combinatorial operations


















labelled graphs \rightarrow

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























X s.t. $XA_G = A_H X$ positive semi-definite









X s.t.
$$XA_G = A_H X$$

positive semi-definite







spaces of homomorphism vectors closed under algebraic operations



spaces of homomorphism vectors closed under algebraic operations set of labelled graphs closed under combinatorial operations





matrix property orthogonal

graph class cycles

Specht (1940); Wiegmann (1961)



matrix property orthogonal pseudo-stochastic doubly stochastic **graph class** cycles paths trees

Specht (1940); Wiegmann (1961) Grohe, Rattan, S. (2022) Grohe, Rattan, S. (2022)



matrix property orthogonal pseudo-stochastic doubly stochastic positive semi-definite graph class cycles paths trees \mathcal{L}_k

Specht (1940); Wiegmann (1961) Grohe, Rattan, S. (2022) Grohe, Rattan, S. (2022) Mančinska, Roberson, & Varvitsiotis (2023)



matrix property orthogonal pseudo-stochastic doubly stochastic positive semi-definite quantum permutation easy quantum orthog. graph class cycles paths trees \mathcal{L}_k planar

Specht (1940); Wiegmann (1961) Grohe, Rattan, S. (2022) Grohe, Rattan, S. (2022) Mančinska, Roberson, & Varvitsiotis (2023) Mančinska & Roberson (2020) S. and Spitzer (2024+)

Graph Class labelled graphs combinatorial operations

Graph Class labelled graphs combinatorial operations



Lasserre semidefinite prog.

Graph Class labelled graphs combinatorial operations



Lasserre semidefinite prog.



Homomorphism Indistinguishability



Lasserre semidefinite prog.

Homomorphism Indistinguishability







Characterisations How to characterise $\equiv_{\mathcal{F}}$? **Distinguishing Power** What's the power of $\equiv_{\mathcal{F}}$? **Complexity** How to test $\equiv_{\mathcal{F}}$?










Lasserre semidefinite prog.

6	
5	
4	
3	
2	
1	

:

Sherali–Adams linear prog.



Roberson and S. (2023); Atserias & Maneva (2012); Malkin (2014); Dvořák (2010); Dell, Grohe, & Rattan (2018)

$\mathcal{L}_k \subseteq \mathcal{TW}_{3k-1}$



Roberson and S. (2023); Atserias & Maneva (2012); Malkin (2014); Dvořák (2010); Dell, Grohe, & Rattan (2018)

$\mathcal{L}_k \subseteq \mathcal{TW}_{3k-1}$ \mathcal{L}_k contains a graph of treewidth 3k-1



Roberson and S. (2023); Atserias & Maneva (2012); Malkin (2014); Dvořák (2010); Dell, Grohe, & Rattan (2018)





Definition (Roberson (2022))

A graph class ${\mathcal F}$ is homomorphism distinguishing closed if for all graph classes ${\mathcal K}$

 \mathcal{K} is contained in $\mathcal{F} \iff \equiv_{\mathcal{F}} \text{refines} \equiv_{\mathcal{K}}$.



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• compared distinguishing power of Lasserre and Sherali–Adams by comparing TW_k and L_k



- compared distinguishing power of Lasserre and Sherali-Adams by comparing TW_k and L_k
- distinguishing power of $\equiv_{\mathcal{TW}_k}$ is described by fact that \mathcal{TW}_k is homomorphism distinguishing closed



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- distinguishing power of $\equiv_{\mathcal{TW}_k}$ is described by fact that \mathcal{TW}_k is homomorphism distinguishing closed

Theory of Homomorphism Indistinguishability When is a graph class *F* homomorphism distinguishing closed?

Conjecture (Roberson (2022))

Every minor-closed union-closed graph class is homomorphism distinguishing closed.

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Every minor-closed union-closed graph class is homomorphism distinguishing closed.

planar graphs
bounded treewidth
bounded treedepth
bounded pathwidth
essentially finite graph classes
outerplanar graphs
Roberson (2022)

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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- Towards a **theory of homomorphism indistinguishability**, we can focus on minor-closed graph classes.

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

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







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

Distinguishing Power What's the power of $\equiv_{\mathcal{F}}$? $\begin{array}{l} \text{Complexity} \\ \text{How to test} \equiv_{\mathcal{F}}? \end{array}$

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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Input Graphs G and H.

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



Dell, Grohe, & Rattan (2018); Dvořák (2010); Grohe (2020); Grohe, Rattan, S. (2022)

Let \mathcal{F} be minor-closed and proper. planar HOMIND(\mathcal{F}) **Input** Graphs *G* and *H*. PTIME **Decide** $G \equiv_{\mathcal{F}} H$. \mathcal{TW}_{k} \mathcal{PW}_k \mathcal{TD}_k

Let \mathcal{F} be minor-closed and proper. planar Where is \mathcal{L}_{k} ? HOMIND(\mathcal{F}) **Input** Graphs *G* and *H*. PTIME **Decide** $G \equiv_{\mathcal{F}} H$. \mathcal{TW}_k \mathcal{PW}_{h} \mathcal{TD}_k





For every minor-closed graph class \mathcal{F} of bounded treewidth, HOMIND(\mathcal{F}) is in coRP.

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Space of homomorphism vectors of labelled trees








Theorem (S. (2024))

For every minor-closed graph class \mathcal{F} of bounded treewidth, HOMIND(\mathcal{F}) is in coRP.

 $\mathcal{F} = \mathsf{trees}$

Theorem (S. (2024))

For every minor-closed graph class \mathcal{F} of bounded treewidth, HOMIND(\mathcal{F}) is in coRP.











Theorem (Courcelle (1990); Robertson & Seymour (2004)) Every minor-closed graph class *F* induces finitely many classes.















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

Theorem (S. (2024))

If \mathcal{F} has bounded treewidth, then HOMIND(\mathcal{F}) is in coRP. Undecidable

planar



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

Theorem (S. (2024))

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

Conjecture (S. (2024))

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

Undecidable planar CORP \mathcal{TW}_{k} \mathcal{L}_{k} \mathcal{PW}_{b} TD_b

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

Theorem (S. (2024))

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

Conjecture (S. (2024))

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

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









Distinguishing Power What's the power of $\equiv_{\mathcal{F}}$? $\begin{array}{l} \text{Complexity} \\ \text{How to test} \equiv_{\mathcal{F}}? \end{array}$





• **Tools:** labelled graphs and homomorphism vectors



- Tools: labelled graphs and homomorphism vectors
- Results: variants of Specht–Wiegmann Theorem



- Tools: labelled graphs and homomorphism vectors
- **Results:** variants of Specht–Wiegmann Theorem
- **Lasserre** is a homomorphism indistinguishability relation.





• Comparing graph isomorphism relaxations by comparing graph classes



- Comparing graph isomorphism relaxations by comparing graph classes
- Determined power of **Lasserre** vis-à-vis Sherali–Adams



- Comparing graph isomorphism relaxations by comparing graph classes
- Determined power of **Lasserre** vis-à-vis Sherali–Adams



- Comparing graph isomorphism relaxations by comparing graph classes
- Determined power of **Lasserre** vis-à-vis Sherali–Adams

Theory of Homomorphism Indistinguishability



• Comparing graph isomorphism relaxations by comparing graph classes

• Determined power of **Lasserre** vis-à-vis Sherali–Adams

Theory of Homomorphism Indistinguishability

• **Result:** minor-closed graph classes play a central role.



- Comparing graph isomorphism relaxations by comparing graph classes
- Determined power of **Lasserre** vis-à-vis Sherali–Adams

Theory of Homomorphism Indistinguishability

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






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



- **Result:** HOMIND(\mathcal{F}) is in coRP for minor-closed graph classes \mathcal{F} of bounded treewidth.
- **Open:** dichotomy for proper minor-closed graph classes



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- **Result:** HOMIND(\mathcal{F}) is in coRP for minor-closed graph classes \mathcal{F} of bounded treewidth.
- **Open:** dichotomy for proper minor-closed graph classes

 $\begin{array}{l} \mbox{Complexity} \\ \mbox{How to decide} \equiv_{\mathcal{F}}? \end{array}$

• Lasserre is in coRP.







Characterisations How to characterise $\equiv_{\mathcal{F}}$? **Distinguishing Power** What's the power of $\equiv_{\mathcal{F}}$? $\begin{array}{l} \text{Complexity} \\ \text{How to test} \equiv_{\mathcal{F}}? \end{array}$

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