

The millennium problem of computational intractability

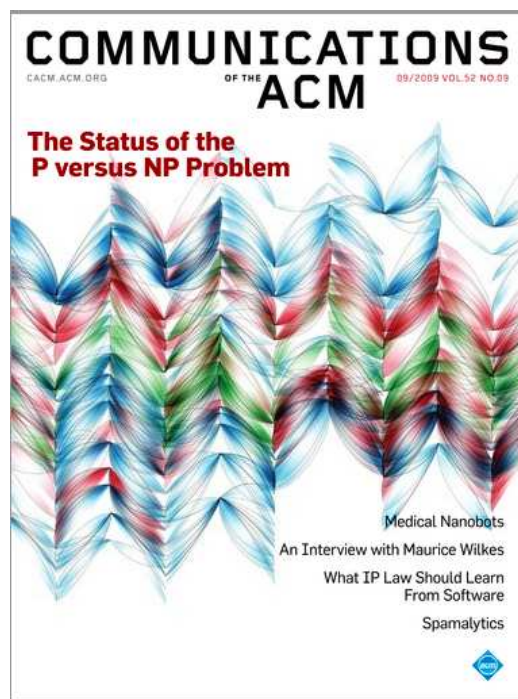
Celina Miraglia Herrera de Figueiredo



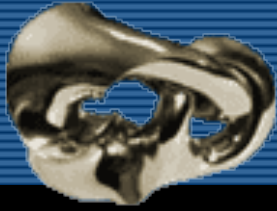
Overview

Central problem in theoretical computer science: the P vs. NP problem

Are there questions whose answer can be quickly checked, but which require an impossibly long time to solve by any direct procedure?



september 2009



Clay Mathematics Institute

Dedicated to increasing and disseminating mathematical knowledge

[HOME](#) | [ABOUT CMI](#) | [PROGRAMS](#) | [NEWS & EVENTS](#) | [AWARDS](#) | [SCHOLARS](#)

The Millennium Prize Problems

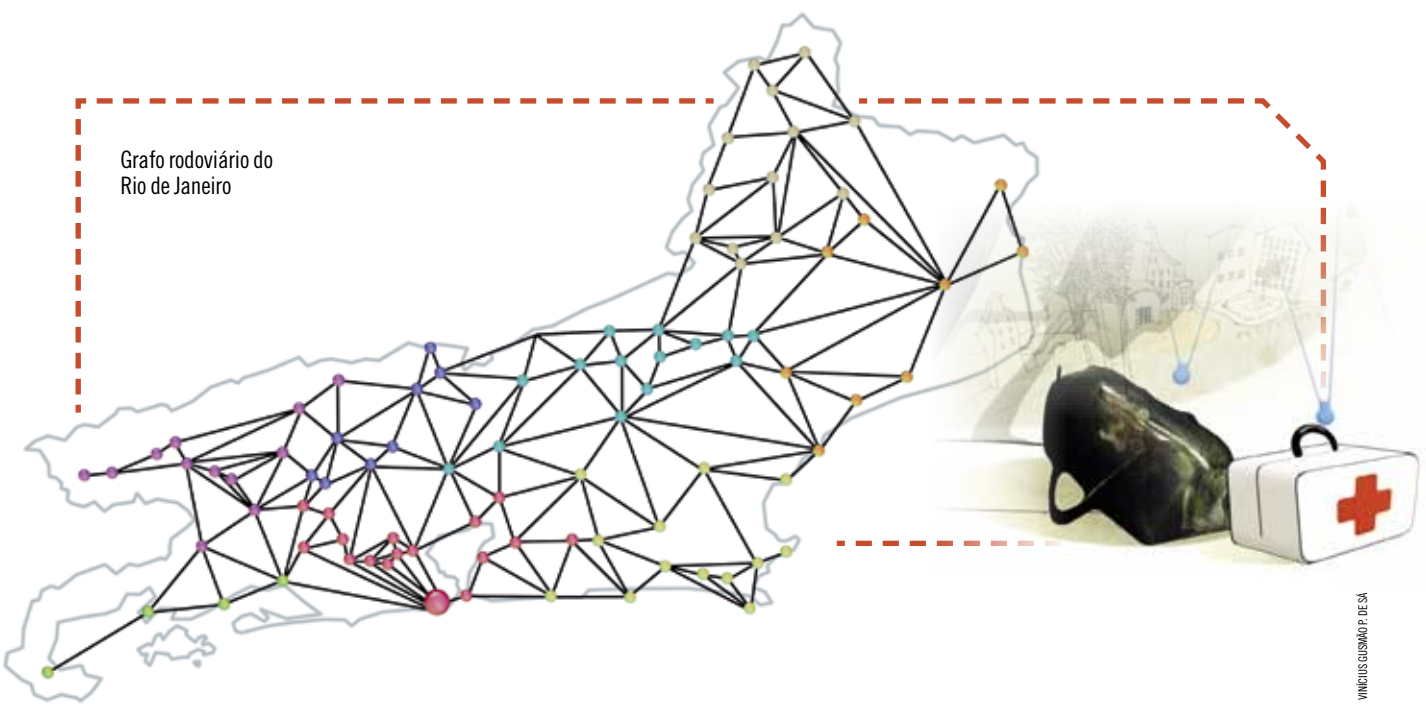
In order to celebrate mathematics in the new millennium, The Clay Mathematics Institute of Cambridge, Massachusetts (CMI) established seven *Prize Problems*. The Prizes were conceived to record some of the most difficult problems with which mathematicians were grappling at the turn of the second millennium; to elevate in the consciousness of the general public the fact that in mathematics, the frontier is still open and abounds in important unsolved problems; to emphasize the importance of working towards a solution of the deepest, most difficult problems; and to recognize achievement in mathematics of historical magnitude.

P vs NP Problem

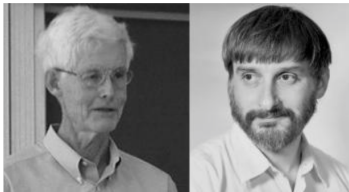


If it is easy to check that a solution to a problem is correct, is it also easy to solve the problem? This is the essence of the P vs NP question. Typical of the NP problems is that of the Hamiltonian Path Problem: given N cities to visit (by car), how can one do this without visiting a city twice? If you give me a solution, I can easily check that it is correct. But I cannot so easily (given the methods I know) find a solution.

Grafo rodoviário do Rio de Janeiro

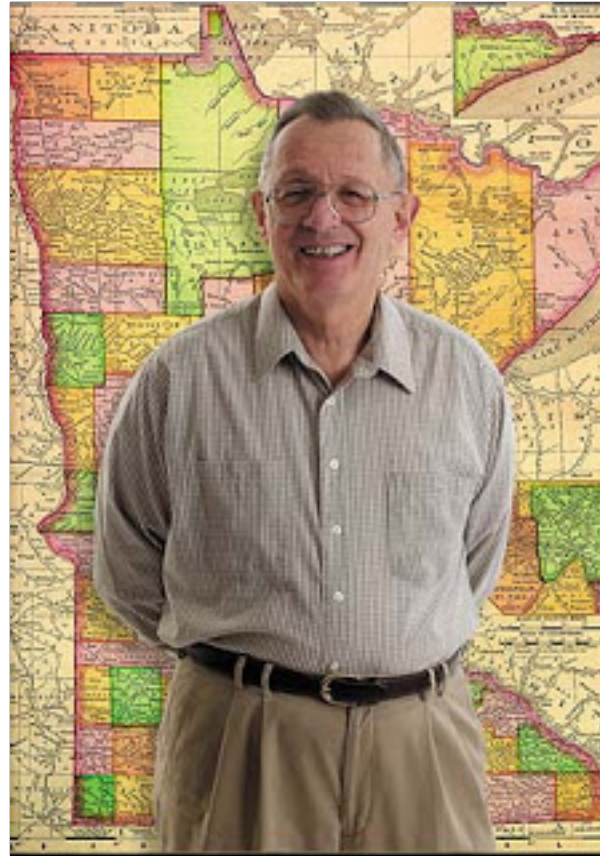


P vs NP Problem



Suppose that you are organizing housing accommodations for a group of four hundred university students. Space is limited and only one hundred of the students will receive places in the dormitory. To complicate matters, the Dean has provided you with a list of pairs of incompatible students, and requested that no pair from this list appear in your final choice. This is an example of what computer scientists call an NP-problem, since

it is easy to check if a given choice of one hundred students proposed by a coworker is satisfactory (i.e., no pair taken from your coworker's list also appears on the list from the Dean's office), however the task of generating such a list from scratch seems to be so hard as to be completely impractical. Indeed, the total number of ways of choosing one hundred students from the four hundred applicants is greater than the number of atoms in the known universe! Thus no future civilization could ever hope to build a supercomputer capable of solving the problem by brute force; that is, by checking every possible combination of 100 students. However, this apparent difficulty may only reflect the lack of ingenuity of your programmer. In fact, one of the outstanding problems in computer science is determining whether questions exist whose answer can be quickly checked, but which require an impossibly long time to solve by any direct procedure. Problems like the one listed above certainly seem to be of this kind, but so far no one has managed to prove that any of them really are so hard as they appear, i.e., that there really is no feasible way to generate an answer with the help of a computer. Stephen Cook and Leonid Levin formulated the P (i.e., easy to find) versus NP (i.e., easy to check) problem independently in 1971.



Kenneth Appel

1932–2013

A Perfect Path from Computational Biology to Quantum Computing

Celina Miraglia Herrera de Figueiredo





Celina, 1991



Luerbio, 1998



Simone, 2002



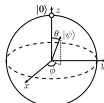
Vânia, 2004



Cláudia, 2005



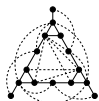
Vinicius, 2006



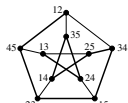
Luis Kowada, 2006



Rodrigo, 2007



Rafael Bernardo, 2008



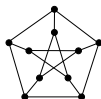
Leticia, 2009



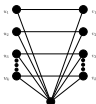
Raphael Machado, 2010



André, 2013



Diana, 2013



Hélio, 2014



Luis Felipe, 2017



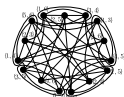
Ana Luísa, 2017



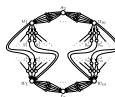
Alexandre, 2020



Edineço, 2021

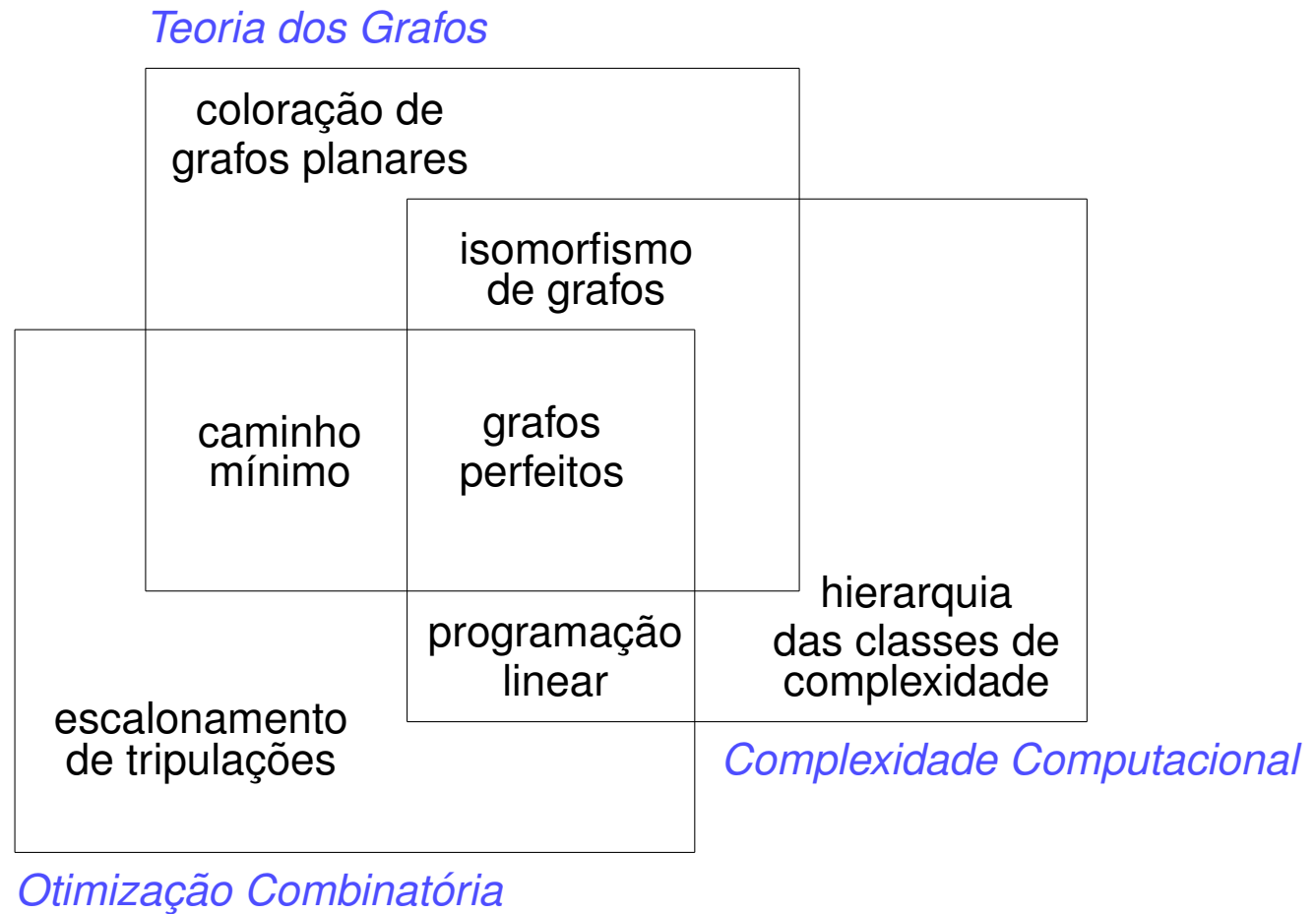


Caroline, 2021

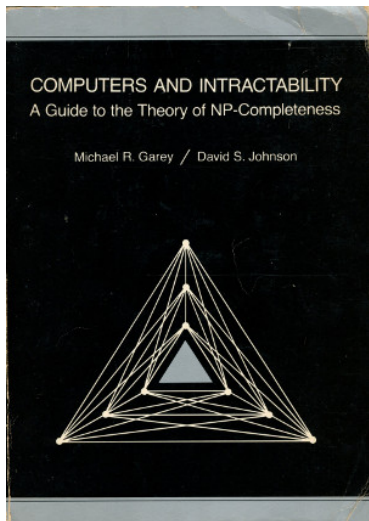


Alexander, 2022

Origem e desenvolvimento da área de pesquisa



The Guide – Computers and Intractability



“Despite that 23 years have passed since its publication, I consider Garey and Johnson the single most important book on my office bookshelf. Every computer scientist should have this book on their shelves as well. NP-completeness is the single most important concept to come out of theoretical computer science and no book covers it as well as Garey and Johnson.”

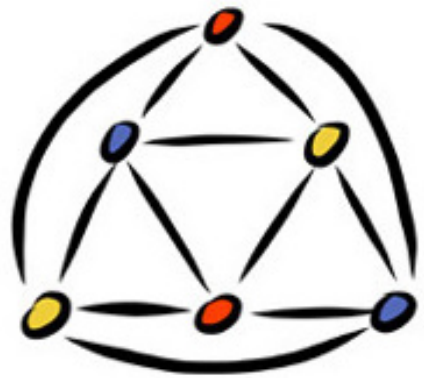
Lance Fortnow, “Great Books: Computers and Intractability: A Guide to the Theory of NP-Completeness”

Ongoing Guide – Graph Restrictions and Their Effect

| GRAPH CLASS | MEMBER | INDSET | CLIQUE | CLIPAR | CHRNUM | CHRIND | HAMCIR | DOMSET | MAXCUT | STREE | GRAISO |
|----------------------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| Trees/Forests | P [T] | P [GJ] | P [T] | P [GJ] | P [T] | P [GJ] | P [T] | P [GJ] | P [GJ] | P [T] | P [GJ] |
| Almost Trees (k) | P | P [24] | P [T] | P? | P? | P? | P? | P [45] | P? | P? | P? |
| Partial k -Trees | P [2] | P [1] | P [T] | P? | P [1] | O? | P [3] | P [3] | P? | P? | O? |
| Bandwidth- k | P [68] | P [64] | P [T] | P? | P [64] | P? | P? | P [64] | P [64] | P? | P [58] |
| Degree- k | P [T] | N [GJ] | P [T] | N [GJ] | N [GJ] | N [49] | N [GJ] | N [GJ] | N [GJ] | N [GJ] | P [58] |
| Planar | P [GJ] | N [GJ] | P [T] | N [10] | N [GJ] | O | N [GJ] | N [GJ] | P [GJ] | N [35] | P [GJ] |
| Series Parallel | P [79] | P [75] | P [T] | P? | P [74] | P [74] | P [74] | P [54] | P [GJ] | P [82] | P [GJ] |
| Outerplanar | P | P [6] | P [T] | P [6] | P [67] | P [67] | P [T] | P [6] | P [GJ] | P [81] | P [GJ] |
| Halin | P | P [6] | P [T] | P [6] | P [74] | P [74] | P [T] | P [6] | P [GJ] | P? | P [GJ] |
| k -Outerplanar | P | P [6] | P [T] | P [6] | P [6] | O? | P [6] | P [6] | P [GJ] | P? | P [GJ] |
| Grid | P | P [GJ] | P [T] | P [GJ] | P [T] | P [GJ] | N [51] | N [55] | P [T] | N [35] | P [GJ] |
| $K_{3,3}$ -Free | P [4] | N [GJ] | P [T] | N [10] | N [GJ] | O? | N [GJ] | N [GJ] | P [5] | N [GJ] | O? |
| Thickness- k | N [60] | N [GJ] | P [T] | N [10] | N [GJ] | N [49] | N [GJ] | N [GJ] | N [7] | N [GJ] | O? |
| Genus- k | P [34] | N [GJ] | P [T] | N [10] | N [GJ] | O? | N [GJ] | N [GJ] | O? | N [GJ] | P [61] |
| Perfect | O! | P [42] | P [42] | P [42] | P [42] | O? | N [1] | N [14] | O? | N [GJ] | I [GJ] |
| Chordal | P [76] | P [40] | P [40] | P [40] | P [40] | O? | N [22] | N [14] | O? | N [83] | I [GJ] |
| Split | P [40] | P [40] | P [40] | P [40] | P [40] | O? | N [22] | N [19] | O? | N [83] | I [15] |
| Strongly Chordal | P [31] | P [40] | P [40] | P [40] | P [40] | O? | O? | P [32] | O? | P [83] | O? |
| Comparability | P [40] | P [40] | P [40] | P [40] | P [40] | O? | N [1] | N [28] | O? | N [GJ] | I [GJ] |
| Bipartite | P [T] | P [GJ] | P [T] | P [GJ] | P [T] | P [GJ] | N [1] | N [28] | P [T] | N [GJ] | I [GJ] |
| Permutation | P [40] | P [40] | P [40] | P [40] | P [40] | O? | O | P [33] | O? | P [23] | P [21] |
| Cographs | P [T] | P [40] | P [40] | P [40] | P [40] | O? | P [25] | P [33] | O? | P [23] | P [25] |
| Undirected Path | P [39] | P [40] | P [40] | P [40] | P [40] | O? | O? | N [16] | O? | O? | I [GJ] |
| Directed Path | P [38] | P [40] | P [40] | P [40] | P [40] | O? | O? | P [16] | O? | P [83] | O? |
| Interval | P [17] | P [44] | P [44] | P [44] | P [44] | O? | P [53] | P [16] | O? | P [83] | P [57] |
| Circular Arc | P [78] | P [44] | P [50] | P [44] | N [36] | O? | O? | P [13] | O? | P [83] | O? |
| Circle | P [71] | P [GJ] | P [50] | O? | N [36] | O? | P [12] | O? | O? | P [70] | O? |
| Proper Circ. Arc | P [77] | P [44] | P [50] | P [44] | P [66] | O? | P [12] | P [13] | O? | P [83] | O? |
| Edge (or Line) | P [47] | P [GJ] | P [T] | N [GJ] | N [49] | O? | N [11] | N [GJ] | O? | N [70] | I [15] |
| Claw-Free | P [T] | P [63] | O? | N [GJ] | N [49] | O? | N [11] | N [GJ] | O? | N [70] | I [15] |

The updated NP-Completeness Column: An Ongoing Guide table 35 years later

| GRAPH CLASS | MEMBER | INDSET | CLIQUE | CLIPAR | CHRNUM | CHRIND | HAMCIR | DOMSET | MAXCUT | STTREE | GRAPHISO |
|-------------------------|--------|--------|---------|---------|--------|--------|---------|--------|---------|---------|----------|
| TREES/FORESTS | P [T] | P [GJ] | P [T] | P [GJ] | P [T] | P [GJ] | P [T] | P [GJ] | P [GJ] | P [T] | P [GJ] |
| ALMOST TREES (K) | P [OG] | P [OG] | P [T] | P [105] | P [5] | P [17] | P [5] | P [5] | P [20] | P [76] | P [17] |
| PARTIAL K-TREES | P [OG] | P [5] | P [T] | P [105] | P [5] | P [17] | P [5] | P [5] | P [20] | P [76] | P [17] |
| BANDWIDTH-K | P [OG] | P [OG] | P [T] | P [105] | P [5] | P [17] | P [5] | P [5] | P [OG] | P [76] | P [OG] |
| DEGREE-K | P [T] | N [GJ] | P [T] | N [29] | N [GJ] | N [OG] | N [GJ] | N [GJ] | N [GJ] | N [GJ] | P [OG] |
| PLANAR | P [GJ] | N [GJ] | P [T] | N [78] | N [GJ] | O | N [GJ] | N [GJ] | P [GJ] | N [OG] | P [GJ] |
| SERIES PARALLEL | P [OG] | P [OG] | P [T] | P [105] | P [5] | P [17] | P [5] | P [OG] | P [GJ] | P [OG] | P [GJ] |
| OUTERPLANAR | P [OG] | P [OG] | P [T] | P [OG] | P [OG] | P [OG] | P [T] | P [OG] | P [GJ] | P [OG] | P [GJ] |
| HALIN | P [OG] | P [OG] | P [T] | P [OG] | P [5] | P [17] | P [T] | P [OG] | P [GJ] | P [118] | P [GJ] |
| K-OUTERPLANAR | P [OG] | P [OG] | P [T] | P [OG] | P [5] | P [17] | P [OG] | P [OG] | P [GJ] | P [76] | P [GJ] |
| GRID | P [OG] | P [GJ] | P [T] | P [GJ] | P [T] | P [GJ] | N [OG] | N [32] | P [T] | N [OG] | P [GJ] |
| K _{3,3} -FREE* | P [OG] | N [GJ] | P [T] | N [78] | N [GJ] | O? | N [GJ] | N [GJ] | P [OG] | N [GJ] | P [40] |
| THICKNESS-K | N [OG] | N [GJ] | P [T] | N [78] | N [GJ] | N [OG] | N [GJ] | N [GJ] | N [119] | N [GJ] | I [RJ] |
| GENUS-K | P [OG] | N [GJ] | P [T] | N [78] | N [GJ] | O? | N [GJ] | N [GJ] | O? | N [GJ] | P [OG] |
| PERFECT | P [34] | P [OG] | P [OG] | P [OG] | P [OG] | N [28] | N [OG] | N [OG] | N [20] | N [GJ] | I [84] |
| CHORDAL | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | O? | N [93] | N [OG] | N [20] | N [OG] | I [84] |
| SPLIT | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | O? | N [93] | N [OG] | N [20] | N [OG] | I [108] |
| STRONGLY CHORDAL | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | O? | N [93] | P [OG] | N [109] | P [OG] | I [111] |
| COMPARABILITY | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | N [28] | N [OG] | N [94] | N [102] | N [GJ] | I [22] |
| BIPARTITE | P [T] | P [GJ] | P [T] | P [GJ] | P [T] | P [GJ] | N [OG] | N [94] | P [T] | N [GJ] | I [22] |
| PERMUTATION | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | O? | P [44] | P [OG] | N [120] | P [OG] | P [OG] |
| COGRAPHS | P [T] | P [OG] | P [OG] | P [OG] | P [OG] | O? | P [OG] | P [OG] | P [20] | P [OG] | P [OG] |
| UNDIRECTED Path | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | O? | N [13] | N [OG] | N [20] | N [RJ] | I [22] |
| DIRECTED PATH | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | O? | N [99] | P [OG] | N [11] | P [OG] | P [7] |
| INTERVAL | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | O? | P [OG] | P [OG] | N [11] | P [OG] | P [OG] |
| CIRCULAR ARC | P [OG] | P [OG] | P [OG] | P [OG] | N [OG] | O? | P [106] | P [OG] | N [11] | P [11] | P [80] |
| CIRCLE | P [OG] | P [GJ] | P [OG] | N [73] | N [OG] | O? | N [39] | N [71] | N [26] | P [OG] | P [68] |
| PROPER CIRC. ARC | P [OG] | P [OG] | P [OG] | P [OG] | P [OG] | O? | P [OG] | P [OG] | O? | P [11] | P [82] |
| EDGE (OR LINE) | P [OG] | P [GJ] | P [T] | N [95] | N [OG] | N [28] | N [OG] | N [GJ] | P [59] | N [19] | I [OG] |
| CLAW-FREE | P [T] | P [OG] | N [103] | N [85] | N [OG] | N [28] | N [OG] | N [GJ] | N [20] | N [19] | I [OG] |



LAGOS 2017

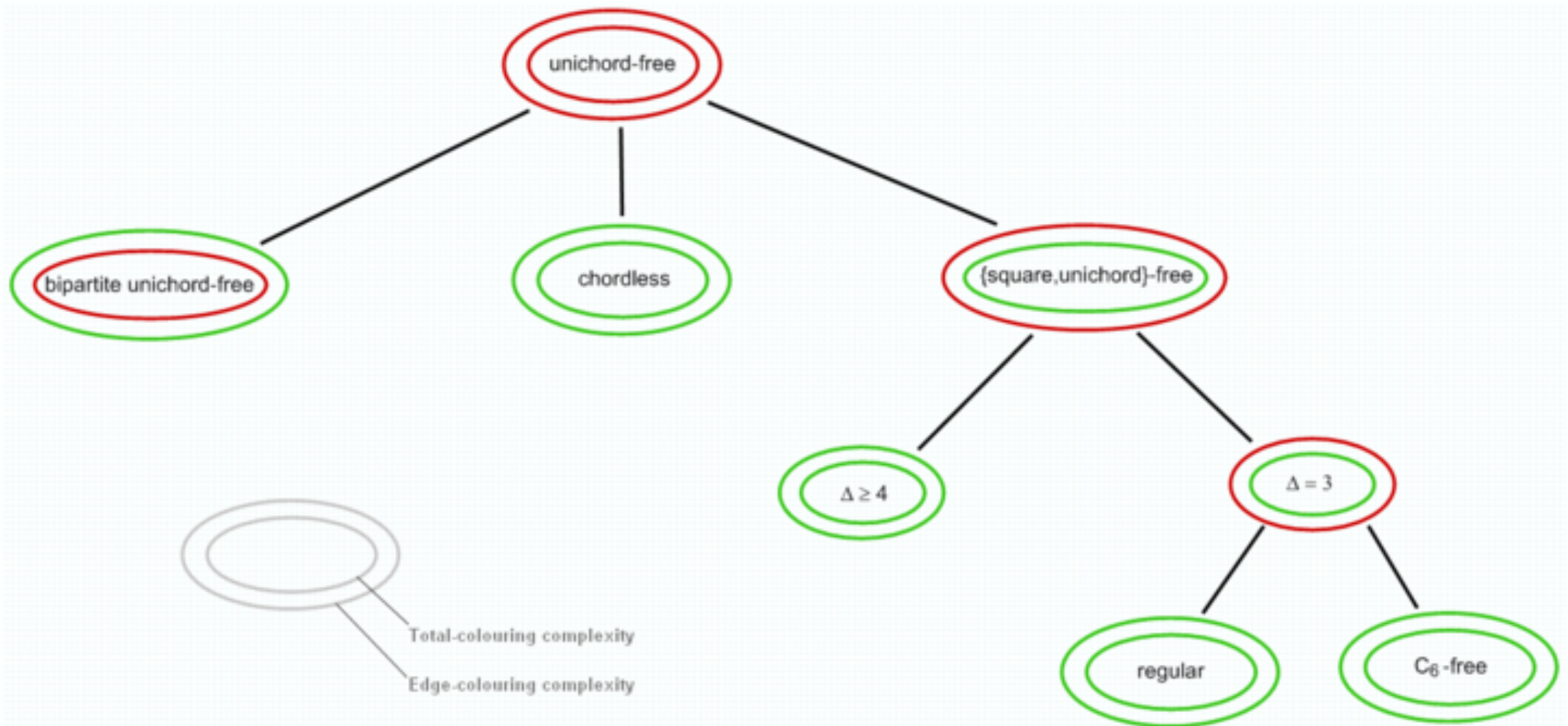
Complexity-separating graph classes for vertex, edge and total coloring

Celina de Figueiredo



COPPE
UFRJ

Edge and total coloring complexity-separating classes



When restricted to $\{\text{square, unichord}\}$ -free graphs, edge coloring is **NP-complete** whereas total coloring is **polynomial**

Every graph is easy or hard: dichotomy theorems for graph problems

Dániel Marx¹

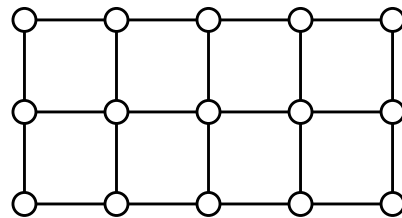
¹Institute for Computer Science and Control,
Hungarian Academy of Sciences (MTA SZTAKI)
Budapest, Hungary

ICGT 2014
Grenoble, France
July 3, 2014

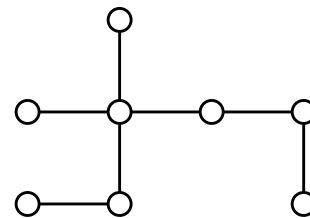
Grid embedding

Graph theory: The recognition of partial grids is often stated as an open problem.

Graph drawing: Deciding whether a graph admits a VLSI layout with unit-length edges is NP-complete.



the grid $G_{3,5}$



embedding for $\{1, 2, 4\}$ -tree

A. Brandstädt, V.B. Le, et al. – Information system on graph class inclusions.

<http://www.teo.informatik.uni-rostock.de/isgci/>, 2002

S. N. Bhatt, S. S. Cosmadakis – *Inform. Process. Lett.* 1987

P vs. N dichotomy for degree-constrained partial grids

| D | D-graphs | D-trees |
|-------|----------|---------|
| {1} | P | P |
| {2} | P | — |
| {3} | P | — |
| {4} | P | — |
| {1,2} | P | P |
| {1,3} | N | O |
| {1,4} | P | P |
| {2,3} | N | — |

| D | D-graphs | D-trees |
|-----------|----------|----------|
| {2,4} | N | — |
| {3,4} | P | — |
| {1,2,3} | N [G89] | N [G89] |
| {1,2,4} | N [BC87] | N [BC87] |
| {1,3,4} | N | N |
| {2,3,4} | N | — |
| {1,2,3,4} | N [BC87] | N [BC87] |

Is {1, 3}-partial-grid recognition a complexity-separating problem?

S. N. Bhatt, S. S. Cosmadakis – *Inform. Process. Lett.* 1987

A. Gregori – *Inform. Process. Lett.* 1989

“Complexity dichotomy on degree-constrained VLSI layouts with unit-length edges”
submitted to *LATIN 2010* (with Vinícius Sá, Guilherme Fonseca, Raphael Machado)

Most significant publications

- FIGUEIREDO, C. M. H. · KLEIN, S. · KOHAYAKAWA, Y. · REED, B.
Finding skew partitions efficiently
Journal of Algorithms (2000)
- FIGUEIREDO, C. M. H. · MAFFRAY, F.
Optimizing bull-free perfect graphs
SIAM Journal on Discrete Mathematics (2004)
- FARIA, L. · FIGUEIREDO, C. M. H. · SYKORA, O. · VRTO, I.
An improved upper bound on the crossing number of the hypercube
Journal of Graph Theory (2008)
- ALCON, L. · FARIA, L. · FIGUEIREDO, C. M. H. · GUTIERREZ, M.
The complexity of clique graph recognition
Theoretical Computer Science (2009)
- FIGUEIREDO, C. M. H.
The P vs. NP-complete dichotomy of some challenging problems in graph theory
Discrete Applied Mathematics (2012)

Most significant publications

- CUNHA, L. F. I. · KOWADA, L. A. B. · HAUSEN, R. A. · FIGUEIREDO, C. M. H.
A faster 1.375-approximation algorithm for sorting by transpositions
Journal of Computational Biology (2015)
- MACÊDO, H. B. · MACHADO, R. C. S. · FIGUEIREDO, C. M. H.
Hierarchical complexity of 2-clique-colouring weakly chordal graphs and perfect graphs having cliques of size at least 3
Theoretical Computer Science (2016)
- CHUDNOVSKY, M. · FIGUEIREDO, C. M. H. · SPIRKL, S.
The sandwich problem for decompositions and almost monotone properties
Algorithmica (2018)
- MELO, A. A. · FIGUEIREDO, C. M. H. · SOUZA, U. S.
A multivariate analysis of the strict terminal connection problem
Journal of Computer and System Sciences (2020)
- ABREU, A. · CUNHA, L. · FIGUEIREDO, C. · KOWADA, L. · MARQUEZINO, F. · POSNER, D. · PORTUGAL, R.
The graph tessellation cover number: Chromatic bounds, efficient algorithms and hardness
Theoretical Computer Science (2020)

Advances in algorithms, machine learning, and hardware can help tackle many NP-hard problems once thought impossible.

BY LANCE FORTNOW

COMMUNICATIONS OF THE ACM | JANUARY 2022

Fifty Years of P vs. NP and the Possibility of the Impossible