# The complexity of hard graph problems forty years later

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### Intratabilidade e Otimização

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encontro de teoria da computação congresso da sbc · porto alegre · 2016

#### Bio – AT&T Labs – Down the Hall

 M.R. Garey, R. L. Graham, D.S. Johnson, and D.E. Knuth Complexity results for bandwidth minimization SIAM J. Appl. Math. 34 (1978), 477–495

M.R. Garey, D.S. Johnson, and R.E. Tarjan
The planar Hamiltonian circuit problem is NP-complete
SIAM J. Computing 5 (1976), 704–714

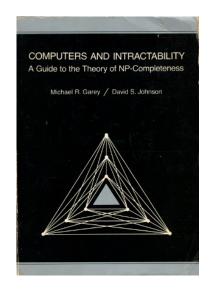
#### Knuth – Garey – Johnson



#### Tarjan – Garey – Johnson



#### 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"

#### The Guide Prefácio

NP-completo: simboliza o abismo da intratabilidade inerente para resolver problemas maiores e mais complexos

Variedade ampla de problemas frequentes: matemática, computação, pesquisa operacional

- ► Capítulos 1–5: teoria básica
- ► Capítulos 6–7: aproximação, hierarquia de classes de complexidade
- ▶ Apêndice: metade do livro! Lista bem organizada de problemas

#### The Guide

#### Capítulo 1: Computers, Complexity, and Intractability



"Bandersnatches are the subject of a difficult algorithm design project for an apparently NP-complete problem."

#### The Guide

#### Capítulo 1: Computers, Complexity, and Intractability





"I can't find an efficient algorithm, I guess I'm just too dumb."

#### The Guide

#### Capítulo 1: Computers, Complexity, and Intractability



"I can't find an efficient algorithm, because no such algorithm is possible!"

The Guide

Capítulo 1: Computers, Complexity, and Intractability



"I can't find an efficient algorithm, but neither can all these famous people."

#### The Lost Cartoon



WE MAY NOT BE ABLE TO SOLVE IT ... BUT WE SURE CAN GET CLOSE !

#### The Updated Cartoons



"I can't find an efficient algorithm, I guess I'm just too dumb."

#### The Updated Cartoons



"I can't find an efficient algorithm, because no such algorithm is possible!"

#### The Updated Cartoons



"I can't find an efficient algorithm, but neither can all these famous people."

- Graph isomorphism
- Subgraph homeomorphism (for a fixed graph H)
- Graph genus
- Chordal graph completion
- Chromatic index
- ► Spanning tree parity problem
- Partial order dimension
- Precedence constrained 3-processor scheduling
- Linear programming
- Total unimodularity
- ► Composite number
- ▶ Minimum length triangulation

#### Ongoing Guide - Os 12 problemas atualizados em 2005

Problem Name	Source	Status	Covered in
GRAPH ISOMORPHISM	[G&J]	Open	-
SUBGRAPH HOMEOMORPHISM (FOR A FIXED GRAPH H)	[G&J]	P	[Col 19, 1987]
GRAPH GENUS	[G&J]	NPC	[Col 21, 1988]
CHORDAL GRAPH COMPLETION	[G&J]	NPC	[Col 1, 1981]
CHROMATIC INDEX	[G&J]	NPC	[Col 1, 1981]
PARTIAL ORDER DIMENSION	[G&J]	NPC	[Col 1, 1981]
PRECEDENCE CONSTRAINED 3-PROCESSOR SCHEDULING	[G&J]	Open	-
LINEAR PROGRAMMING	[G&J]	P	[Col 1, 1981]
TOTAL UNIMODULARITY	[G&J]	P	[Col 1, 1981]
SPANNING TREE PARITY PROBLEM	[G&J]	P	[Col 1, 1981]
COMPOSITE NUMBER	[G&J]	P	This Column
MINIMUM LENGTH TRIANGULATION	[G&J]	Open	_
IMPERFECT GRAPH	[Col 1, 1981]	P	This Column
GRAPH THICKNESS	[Col 2, 1982]	NPC	[Col 5, 1982]
EVEN COVER (MINIMUM WEIGHT CODEWORD)	[Col 3, 1982]	NPC	This Column
"UNRESTRICTED" TWO-LAYER CHANNEL ROUTING	[Col 5, 1982]	Open	-
GRACEFUL GRAPH	[Col 6, 1983]	Open	-
ANDREEV'S PROBLEM	[Col 17, 1986]	Open	-
SHORTEST VECTOR IN A LATTICE	[Col 18, 1986]	"NPC"	This Column

#### Ongoing Guide - Graph Restrictions and Their Effect

											_											
GRAPH CLASS	MEMBER		INI	SET	CLIC	QUE	CLI	Par	Сн	RNUM	Сня	IND	HAN	иCIR	Do	иSет	MAXCUT		STTREE		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]	0?		P	[3]	P	[3]	P?		P?		0?	
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]	0?		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]	0?		N	[GJ]	N	[GJ]	P	[5]	N	[GJ]	<b>O</b> ?	
Thickness-k	N	[60]	N	[GJ]	P	[T]	N	[10]	N	[GJ]	N	[49]	N	[GJ]	N	[GJ]	N	[7]	N	[GJ]	$\mathbf{O}$ ?	
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]	0?		N	[1]	N	[14]	0?		N	[GJ]	I	[GJ]
Chordal	P	[76]	P	[40]	P	[40]	P	[40]	P	[40]	0?		N	[22]	N	[14]	0?		N	[83]	I	[GJ]
Split	P	[40]	P	[40]	P	[40]	P	[40]	P	[40]	0?		N	[22]	N	[19]	0?		N	[83]	I	[15]
Strongly Chordal	P	[31]	P	[40]	P	[40]	P	[40]	P	[40]	O?		0?		P	[32]	0?		P	[83]	O?	
Comparability	P	[40]	P	[40]	P	[40]	P	[40]	P	[40]	O?		N	[1]	N	[28]	0?		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]	<b>O</b> ?		P	[23]	P	[25]
Undirected Path	P	[39]	P	[40]	P	[40]	P	[40]	P	[40]	0?		0?		N	[16]	0?		0?		I	[GJ]
Directed Path	P	[38]	P	[40]	P	[40]	P	[40]	P	[40]	0?		0?		P	[16]	0?		P	[83]	O?	
Interval	P	[17]	P	[44]	P	[44]	P	[44]	P	[44]	0?		P	[53]	P	[16]	0?		P	[83]	P	[57]
Circular Arc	P	[78]	P	[44]	P	[50]	P	[44]	N	[36]	0?		0?		P	[13]	0?		P	[83]	0?	
Circle	P	[71]	P	[GJ]	P	[50]	0?		N	[36]	0?		P	[12]	0?		0?		P	[70]	0?	
Proper Circ. Arc	P	[77]	P	[44]	P	[50]	P	[44]	P	[66]	0?		P	[12]	P	[13]	0?		P	[83]	0?	
Edge (or Line)	P	[47]	P	[GJ]	P	[T]	N	[GJ]	N	[49]	0?		N	[11]	N	[GJ]	0?		N	[70]	I	[15]
Claw-Free	P	[T]	P	[63]	O?		N	[GJ]	N	[49]	O?		N	[11]	N	[GJ]	<b>O</b> ?		N	[70]	I	[15]

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



Celina de Figueiredo



## Overview

Classification into P or NP-complete of challenging problems in graph theory

Full dichotomy: class of problems where each problem is classified into P or NP-complete

Coloring problems: vertex, edge, total

## NP-completeness ongoing guide

Identification of an interesting problem, of an interesting graph class

Categorization of the problem according to its complexity status

Problems and complexity-separating graph classes

Graph classes and complexity-separating problems

Johnson's NP-completeness column 1985 Spinrad's book 2003

# Ongoing Guide – graph restrictions and their effect

GRAPH CLASS	MEMBER		TEMBER IND		INDSET		CLIQUE		CLIPAR		CHRNUM		CHRIND		HAMCIR		Do	мSет	MAXCUT		STTREE		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	[1]	P	[24]	P	[T]	P?	[OJ]	P?	[1]	P?	[UJ]	P?	[1]	P	[45]	P?	[UJ]	P?	[1]	P?	[OJ]		
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?	[2]	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]	0		N	[GJ]	N	[GJ]	P	[GJ]	N	[35]	P	[GJ]		
Series Parallel	P	[79]	P	[75]	P	[T]	<b>P</b> ?		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]	<b>P</b> ?		P	[GJ]		
k-Outerplanar	P		P	[6]	P	[T]	P	[6]	P	[6]	0?		P	[6]	P	[6]	P	[GJ]	<b>P</b> ?		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]	0?		N	[GJ]	N	[GJ]	P	[5]	N	[GJ]	0?			
Thickness-k	N	[60]	N	[GJ]	P	[T]	N	[10]	N	[GJ]	N	[49]	N	[GJ]	N	[GJ]	N	[7]	N	[GJ]	0?			
Genus-k	P	[34]	N	[GJ]	P	[T]	N	[10]	N	[GJ]	<b>O</b> ?		N	[GJ]	N	[GJ]	<b>O</b> ?		N	[GJ]	P	[61]		
Perfect	O!		P	[42]	P	[42]	P	[42]	P	[42]	O?		N	[1]	N	[14]	Ο?		N	[GJ]	I	[GJ]		
Chordal	P	[76]	P	[40]	P	[40]	P	[40]	P	[40]	O?		N	[22]	N	[14]	$\mathbf{O}$ ?		N	[83]	Ι	[GJ]		
Split	P	[40]	P	[40]	P	[40]	P	[40]	P	[40]	<b>O</b> ?		N	[22]	N	[19]	$\mathbf{O}$ ?		N	[83]	Ι	[15]		
Strongly Chordal	P	[31]	P	[40]	P	[40]	P	[40]	P	[40]	<b>O</b> ?		<b>O</b> ?		P	[32]	<b>O</b> ?		P	[83]	0?			
Comparability	P	[40]	P	[40]	P	[40]	P	[40]	P	[40]	<b>O</b> ?		N	[1]	N	[28]	<b>O</b> ?		N	[GJ]	Ι	[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]	<b>O</b> ?		O		P	[33]	<b>O</b> ?		P	[23]	P	[21]		
Cographs	P	[T]	P	[40]	P	[40]	P	[40]	P	[40]	<b>O</b> ?		P	[25]	P	[33]	<b>O</b> ?		P	[23]	P	[25]		
Undirected Path	P	[39]	P	[40]	P	[40]	P	[40]	P	[40]	O?		Ο?		N	[16]	O?		Ο?		I	[GJ]		
Directed Path	P	[38]	P	[40]	P	[40]	P	[40]	P	[40]	$\mathbf{O}$ ?		0?		P	[16]	$\mathbf{O}$ ?		P	[83]	$\mathbf{O}$ ?			
Interval	P	[17]	P	[44]	P	[44]	P	[44]	P	[44]	<b>O</b> ?		P	[53]	P	[16]	<b>O</b> ?		P	[83]	P	[57]		
Circular Arc	P	[78]	P	[44]	P	[50]	P	[44]	N	[36]	O?		<b>O</b> ?		P	[13]	<b>O</b> ?		P	[83]	<b>O</b> ?			
Circle	P	[71]	P	[GJ]	P	[50]	$\mathbf{O}$ ?		N	[36]	$\mathbf{O}$ ?		P	[12]	<b>O</b> ?		$\mathbf{O}$ ?		P	[70]	$\mathbf{O}$ ?			
Proper Circ. Arc	P	[77]	P	[44]	P	[50]	P	[44]	P	[66]	<b>O</b> ?		P	[12]	P	[13]	<b>O</b> ?		P	[83]	<b>O</b> ?			
Edge (or Line)	P	[47]	P	[GJ]	P	[T]	N	[GJ]	N	[49]	<b>O</b> ?		N	[11]	N	[GJ]	<b>O</b> ?		N	[70]	Ι	[15]		
Claw-Free	P	[T]	P	[63]	O?		N	[GJ]	N	[49]	<b>O</b> ?		N	[11]	N	[GJ]	Ο?		N	[70]	I	[15]		

GRAPH CLASS	Mı	EMBER	In	DSET	CL	IQUE	CL	Par	CHRNUM		Сні	RIND	HA	мСіr	Do	OMSET	Ma	хСит	STTREE		Gr.	APHISO
Trees/Forests	Р		Р	[GJ]	Р	[T]	Р	[GJ]	Р		Р	[GJ]	Р	 [T]	Р	[GJ]	Р	[GJ]	Р	[T]	Р	 [GJ]
Almost Trees $(k)$	Р		Р	[OG]	Р	[T]	P?		P?		P?		P?		Р	[OG]	P?		P?		P?	
Partial $k$ -trees	Р	[OG]	Р	[OG]	Р	[T]	P	[S]	Р	[OG]	P	[S]	Р	[OG]	Р	[OG]	P	[S]	P	[S]	P	[S]
Bandwidth-k	Р	[OG]	Р	[OG]	Р	[T]	P?		Р	[OG]	P?		P?		Р	[OG]	Р	[OG]	P?		Р	[OG]
Degree-k	Р	[T]	N	[GJ]	Р	[T]	N	[GJ]	N	[GJ]	N	[OG]	N	[GJ]	N	[GJ]	N	[GJ]	N	[GJ]	Р	[OG]
Planar	Р	[GJ]	N	[GJ]	Р	[T]	N	[OG]	N	[GJ]	0		N	[GJ]	N	[GJ]	Р	[GJ]	N	[OG]	Р	 [GJ]
Series Parallel	Р	[OG]	Р	[OG]	Р	[T]	P	[S]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[GJ]	Р	[OG]	Р	[GJ]
Outerplanar	Р		Р	[OG]	Р	[T]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[T]	Р	[OG]	Р	[GJ]	Р	[OG]	Р	[GJ]
Halin	Р		Р	[OG]	Р	[T]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[T]	Р	[OG]	Р	[GJ]	P	[S]	Р	[GJ]
$k ext{-}Outerplanar$	Р		Р	[OG]	Р	[T]	Р	[OG]	Р	[OG]	0?		Р	[OG]	Р	[OG]	Р	[GJ]	P?		Р	[GJ]
Grid	Р		Р	[GJ]	Р	[T]	Р	[T]	Р	[T]	Р	[GJ]	N	[OG]	N	[OG]	Р	[T]	N	[OG]	Р	[GJ]
$K_{3,3} ext{-}Free$	Р	[OG]	N	[GJ]	Р	[T]	N	[GJ]	N	[GJ]	0?		N	[GJ]	N	[GJ]	Р	[OG]	N	[GJ]	I	[S]
Thickness- $k$	N	[OG]	Р	[GJ]	Р	[T]	N	[GJ]	N	[GJ]	N	[OG]	N	[GJ]	N	[GJ]	N	[OG]	N	[GJ]	0?	
Genus-k	Р	[OG]	Р	[GJ]	Р	[T]	N	[GJ]	N	[GJ]	0?		N	[GJ]	N	[GJ]	0?		N	[GJ]	Р	[OG]
Perfect	P	[S]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	N	[S]	N	[OG]	N	[OG]	N	[S]	N	[GJ]	1	[GJ]
Chordal	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	P	[OG]	0?		N	[OG]	N	[OG]	N	[S]	N	[OG]	1	[GJ]
Split	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	0?		N	[OG]	N	[OG]	N	[S]	N	[OG]	1	[OG]
Strongly Chordal	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	P	[OG]	0?		N	[S]	Р	[OG]	N	[S]	Р	[OG]	1	[S]
Comparability	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	N	[S]	N	[OG]	N	[OG]	N	[S]	N	[GJ]	1	[GJ]
Bipartite	Р	[T]	Р	[GJ]	Р	[T]	Р	[GJ]	Р	[T]	Р	[GJ]	N	[OG]	N	[OG]	Р	[T]	N	[GJ]	I	[GJ]
Permutation	Р	[OG]	Р	[OG]	Р	[OG]	P	[OG]	Р	[OG]	0?		P	[S]	Р	[OG]	0?		Р	[OG]	Р	[OG]
Cographs	Р	[T]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	0?		Р	[OG]	Р	[OG]	P	[S]	Р	[OG]	Р	[OG]
Undirected Path	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	0?		N	[S]	N	[OG]	N	[S]	0?		1	[GJ]
Directed Path	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	0?		N	[S]	Р	[OG]	0?		Р	[OG]	0?	
Interval	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	0?		Р	[OG]	Р	[OG]	0?		Р	[OG]	Р	[OG]
Circular Arc	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	N	[OG]	0?		P	[S]	Р	[OG]	0?		Р	[OG]	0?	
Circle	Р	[OG]	Р	[GJ]	Р	[OG]	N	[S]	N	[OG]	0?		Р	[OG]	N	[S]	N	[S]	Р	[OG]	0?	
Proper Circ. Arc	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	Р	[OG]	0?		Р	[OG]	Р	[OG]	0?		P	[OG]	P	[S]
Edge (or Line)	Р	[OG]	Р	[GJ]	Р	[T]	N	[GJ]	N	[OG]	N	[S]	N	[OG]	N	[GJ]	P	[S]	N	[OG]	1	[OG]
Claw-Free	Р	[T]	Р	[OG]	N	[S]	N	[GJ]	N	[OG]	N	[S]	N	[OG]	N	[GJ]	N	[S]	N	[OG]	1	[OG]

## Dániel Marx plenary talk at ICGT 2014

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

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> ICGT 2014 Grenoble, France July 3, 2014

## Dániel Marx plenary talk at ICGT 2014

### Dichotomy theorems

- Dichotomy theorems give good research programs: easy to formulate, but can be hard to complete.
- The search for dichotomy theorems may uncover algorithmic results that no one has thought of.
- Proving dichotomy theorems may require good command of both algorithmic and hardness proof techniques.