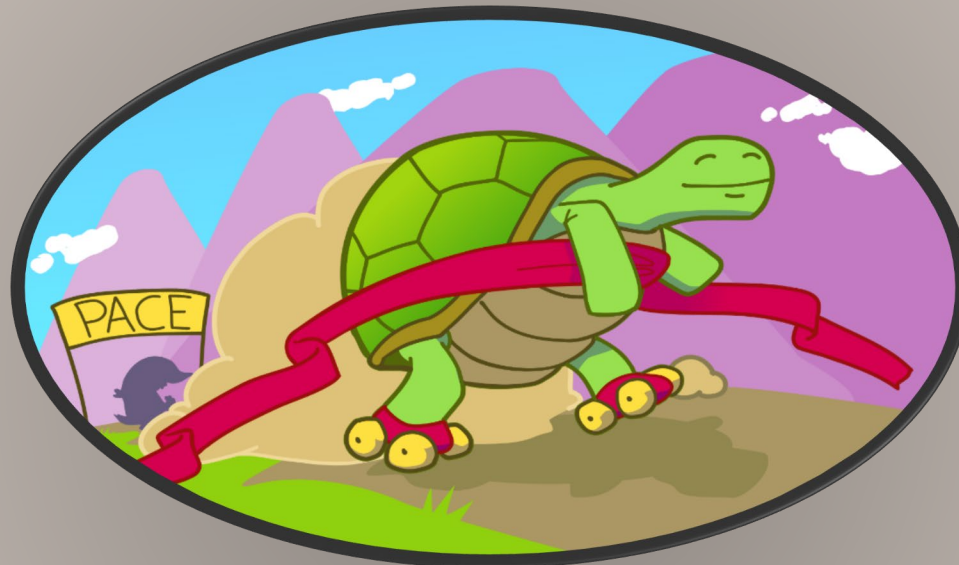


# *Parameterized Algorithms & Computational Experiments Challenge*

[www.pacechallenge.org](http://www.pacechallenge.org)



OPTIL.io

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# Goals

Investigate the applicability of algorithmic ideas from parameterized algorithmics

1. provide **bridge** between algorithm theory and algorithm engineering practice
2. inspire new **theoretical** developments
3. investigate the **competitiveness** of analytical and design frameworks
4. produce universally accessible **libraries** of implementations & benchmark inputs
5. encourage **dissemination** of the findings in scientific papers

# Impact of PACE

## Motivation: Explaining success

- PACE 2017: Top 4 solvers on min treewidth track based on solver on treewidth track based on
- Implementations based on


## Story behind PACE 2016

Developed a new algorithm to solve the LP!

⇒ Practical and theoretical improvements

- 1<sup>st</sup> place in the competition
- Linear-time kernelization of FVS (ICALP 2017)
- Linear-time FPT for various problems (FOCS 2018)

## An Algorithm for the Exact Treedepth Problem

James Trimble 

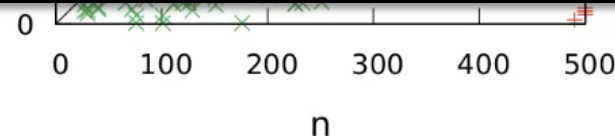
School of Computing Science, University of Glasgow, UK

j.trimble.1@research.gla.ac.uk

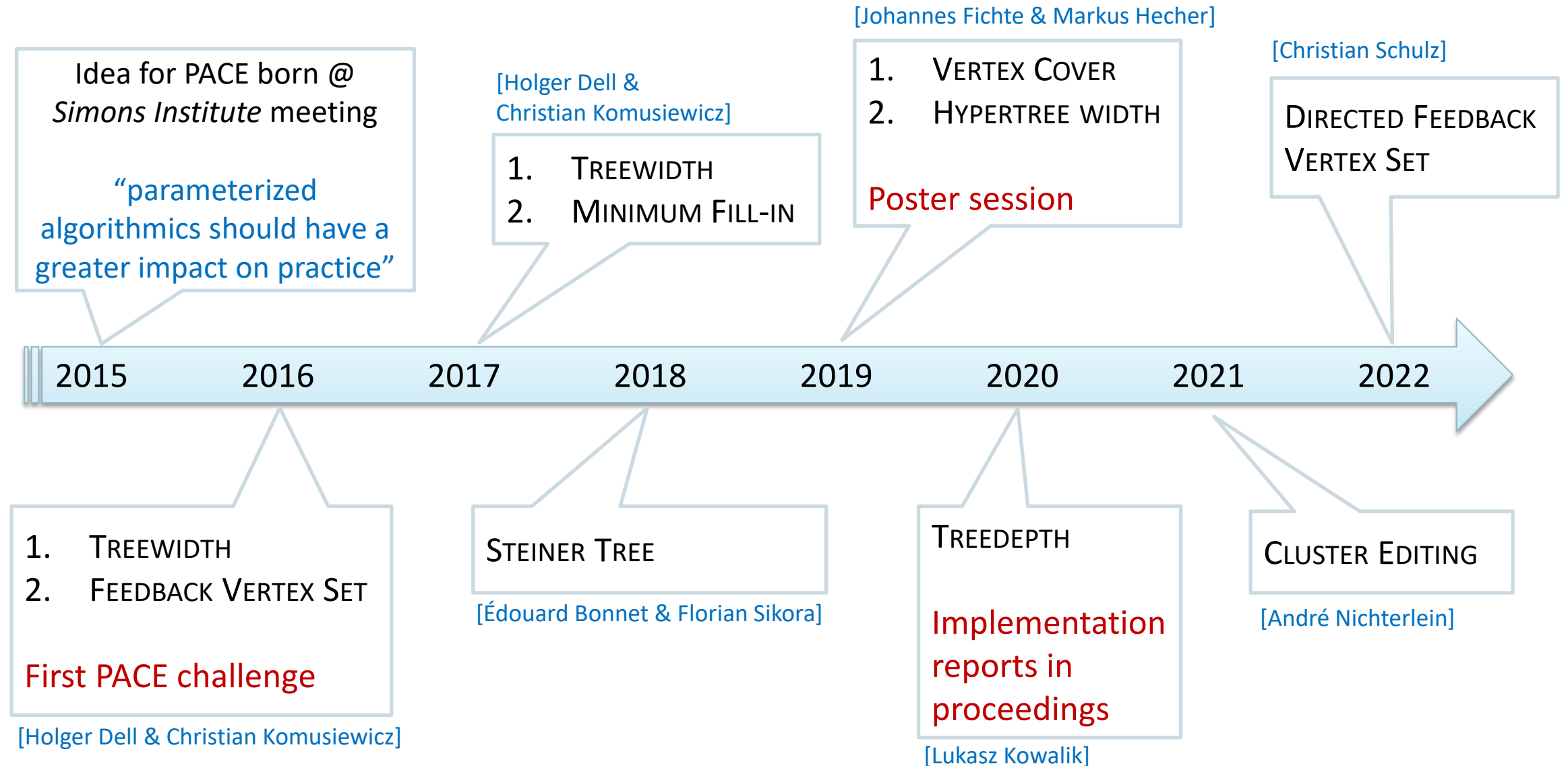
2018 (AAAI 2019).

triangulations

[Ravid, Medini, and Kimelfeld, 2019]



# The history of PACE



# PACE 2022: DIRECTED FEEDBACK VERTEX SET

## Challenge tracks:

1. Exact algorithms
2. Heuristic algorithms

<https://pacechallenge.org/2022/>

## Program Committee:

Christian Schulz\*

Darren Strash

Ernestine Großmann

Tobias Heuer

*Universität Heidelberg*

*Hamilton College*

*Universität Heidelberg*

*Karlsruher Institut für Technologie*

# PACE 2022: DIRECTED FEEDBACK VERTEX SET

## Timeline

September 2021:	Announcement of the challenge (problem) and tracks
November 2021:	Announcement of additional information and ranking methods
December 2021:	Public instances are available
March 2022:	Submission via optil.io is open (for testing and unofficial leaderboard)
June 1st, 2022 (AoE):	Submission deadline for solver
June 15th, 2022 (AoE):	Submission deadline for solver description
July, 2022:	Announcement of the results
September 2022:	Award ceremony at IPEC 2022

# Steering committee

Holger Dell

Johannes Fichte

Markus Hecher

Bart M. P. Jansen\*

Łukasz Kowalik

Andre Nichterlein

Marcin Pilipczuk

Manuel Sorge

Goethe University Frankfurt and IT University of Copenhagen

Technische Universität Dresden

Technische Universität Wien

Eindhoven University of Technology

University of Warsaw

Technical University of Berlin

University of Warsaw

Technische Universität Wien

## Former members

Édouard Bonnet (2017-2021)

Thore Husfeldt (2016-2019)

Petteri Kaski (2016-2020)

Christian Komusiewicz (2016-2020)

Frances Rosamond (2016-2019)

Florian Sikora (2017-2020)

# PACE Award Ceremony

## Parameterized Algorithms and Computational Experiments Challenge 2021

André Nichterlein

TU Berlin, Algorithmics and Computational Complexity



<https://pacechallenge.org/>



# Table of contents

## ① Organization

## ② PACE 2021 Setup

- Cluster Editing

- Data Sets

## ③ Tracks

- Exact Track

- Heuristic Track

- Kernel Track

# Organization & Sponsors

## Program Committee:

Leon Kellerhals

Tomohiro Koana

André Nichterlein

Philipp Zschoche



## Thanks to sponsors:

### Networks

for sponsoring the prizes



**optil.io** (especially Artur Laskowski and Jan Badura)  
for their online judge system



# Participants

Country	Participants	Submissions
Germany	39	15
Czechia	6	3
France	5	3 (1.5)
Australia	4	1
India	4	4
United States	3	2
Japan	1	1
Mexico	1	1
Netherlands	1	1
Poland	1	3
United Kingdom	1	3 (1.5)

- 11 countries & 3 continents

- 21 “distinct” teams

- 11 student teams  
(7 BSc / 1 MSc / 3 PhD)

<https://paraalgo.informatik.uni-bremen.de/>

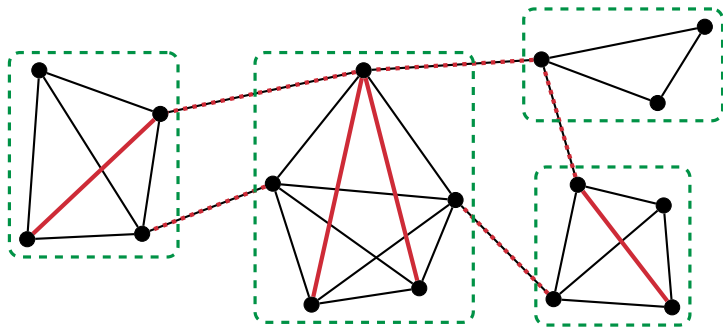
Language	Submissions
C++	21
Rust	4
Java	4
Python	3
C#	1

# Cluster Editing I

## Cluster Editing / Correlation Clustering

**Input:** An undirected graph  $G = (V, E)$ .

**Task:** Transform  $G$  into a cluster graph (each connected component is a clique) by a minimum number of edge insertions and deletions.



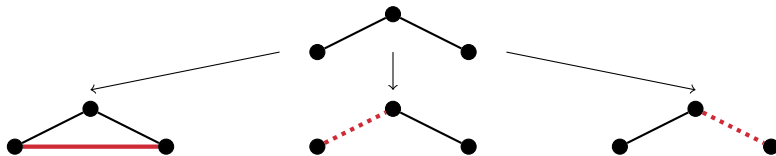
**Applications:** Bioinformatics, data mining, psychometrics, ...

# Cluster Editing II

## Observation

A graph  $G$  is a cluster graph  $\iff G$  does not contain a  $P_3$  as induced subgraph.

$\rightsquigarrow$  simple  $3^k$  search tree ( $k \hat{=}$  number of edge modifications):



**Cluster Editing** well-studied in parameterized algorithmics:

- solvable in  $O(1.62^k + n + m)$  time
- no  $2^{o(k)} \cdot n^{O(1)}$ -time algorithm
- problem kernel with  $2k$  vertices

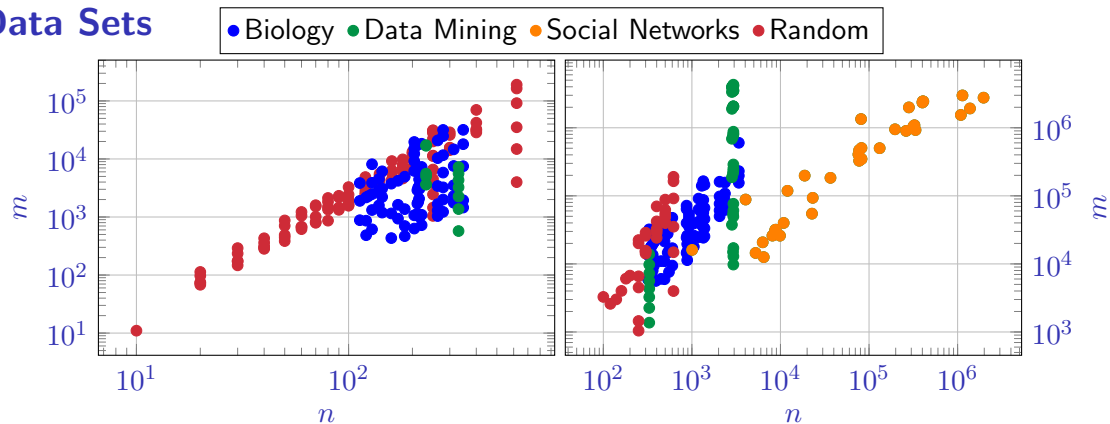
[Böcker, J. of Discrete Algorithms, 2012]

[Komusiewicz, Uhlmann, Discret. Appl. Math., 2012]

[Chen, Meng, J. of Computer and System Sciences, 2011]

( $n \hat{=}$  number of vertices;  $m \hat{=}$  number of edges)

# Data Sets



Description	$n_{\min}$	$n_{\max}$	$m_{\min}$	$m_{\max}$	instances
Left: Exact & Kernel Track	10	620	11	190,499	200
Right: Heuristic Track	10	1,965,206	31	4,295,123	200

<https://github.com/PACE-challenge/Cluster-Editing-PACE-2021-instances>

# Tracks

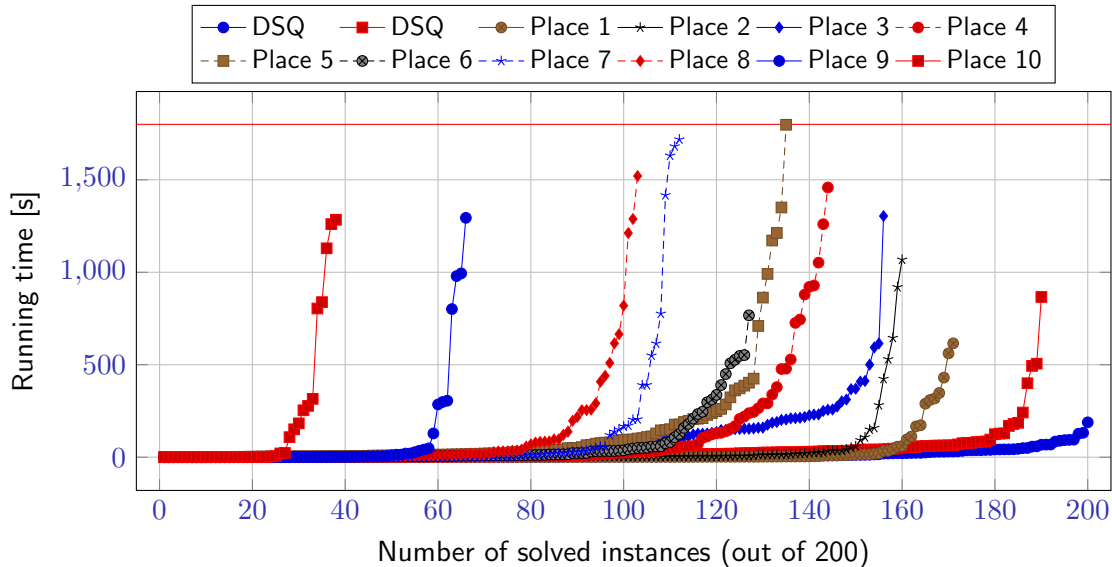
**Input** for all three tracks: graph  $G = (V, E)$

Track	time limit	result of submission	ranking
<b>Exact</b>	30 min	optimal solution (list of vertex pairs)	number of solved instances
<b>Heuristic</b>	10 min	good solution (list $S$ of vertex pairs)	size of $S$
<b>Kernel</b>	5 min	a small “kernel”	size of kernel

**Prizes** for:

- Best 3 submissions per track
- Best 3 student submissions per track
- At most one prize per submission (higher prize if applicable for top 3 and student prize)
- Tax may have to be paid if a single participant wins more than 450 euros.

# Exact Track — Cactus Plot





## Exact Track — Employed Techniques

Approach	number of teams
Branch & Bound	6
ILP	1
Combination of B&B and ILP	3
Data reduction and ILP	1

**Test** with standard ILP formulation, solved with Gurobi:

- 30 min time limit: **141** of the 200 instances solved
- 180 min time limit: **156** of the 200 instances solved

# Exact Track — Results

	Team (Institute)	Points	Status
1	Lars Gottesbüren, Tobias Heuer, Thomas Bläsius, Philipp Fischbeck, Michael Hamann, Jonas Spinner, Christopher Weyand, Marcus Wilhelm (Karlsruhe Institute of Technology, Hasso Plattner Institut)	<b>87</b> (171)	—
2	Alexander Bille, Dominik Brandenstein, Emanuel Herrendorf (Philipps University of Marburg)	<b>81</b> (160)	MSc
3	Valentin Bartier, Gabriel Bathie, Nicolas Bousquet, Marc Heinrich, Théo Pierron, Ulysse Prieto (Grenoble INP, École Normale Supérieure de Lyon, Université de Lyon, University of Leeds)	<b>77</b> (156)	—
4	Jona Dirks, Mario Grobler, Tobias Meis, Roman Rabinovich, Yannik Schnaubelt, Sebastian Siebertz, Maximilian Sonneborn (University of Bremen, Technische Universität Berlin)	<b>71</b> (144)	BSc
5	Thorben Freese, Jakob Gahde, Mario Grobler, Roman Rabinovich, Fynn Sczuka, Sebastian Siebertz (University of Bremen, Technische Universität Berlin)	<b>67</b> (135)	BSc
6	Yosuke Mizutani (University of Utah)	<b>63</b> (127)	PhD
7	Václav Blažej, Radovan Červený, Dušan Knop, Jan Pokorný, Šimon Schierreich, Ondřej Suchý (Czech Technical University in Prague)	<b>59</b> (112)	PhD
8	Sachin Agarwal, Sahil Bajaj, Ojasv Singh, Srinibas Swain (IIIT Guwahati)	<b>52</b> (103)	BSc
9	Sebastian Paarmann (Technische Universität Hamburg)	<b>36</b> (66)	BSc
10	Tomoki Takayama (Osaka Prefecture University)	<b>17</b> (38)	—

# 6th Parameterized Algorithms and Computational Experiments Challenge

## PACE

Uniting FPT and practice

ALGO/IPEC 2021, September 06 – 10 Lisbon, Portugal

This is to certify that the 2021 PACE Program Committee has selected

**Yosuke Mizutani**

University of Utah

as the

**Third Student Prize Winner in the Exact Track of the Cluster Editing Challenge**

**175 €**



---

André Nichterlein, TU Berlin  
2021 PACE Program Committee Chair

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# 6th Parameterized Algorithms and Computational Experiments Challenge PACE

Uniting FPT and practice

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**Thorben Freese<sup>1</sup>, Jakob Gahde<sup>1</sup>, Mario Grobler<sup>1</sup>, Roman Rabinovich<sup>2</sup>, Fynn Sczuka<sup>1</sup>,  
Sebastian Siebertz<sup>1</sup>**

<sup>1</sup>University of Bremen, <sup>2</sup>TU Berlin

as the

**Second Student Prize Winners in the Exact Track of the Cluster Editing Challenge**

**225 €**



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André Nichterlein, TU Berlin  
2021 PACE Program Committee Chair

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Sebastian Siebertz<sup>1</sup>, Maximilian Sonneborn<sup>1</sup>**

<sup>1</sup>University of Bremen, <sup>2</sup>TU Berlin

as the

**First Student Prize Winners in the Exact Track of the Cluster Editing Challenge**

**300 €**



---

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2021 PACE Program Committee Chair

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Ulysse Prieto**

<sup>1</sup>Grenoble INP, <sup>2</sup>École Normale Supérieure de Lyon, <sup>3</sup>Université de Lyon, <sup>4</sup>University of Leeds

as the

**Third Place Winners in the Exact Track of the Cluster Editing Challenge**

**200 €**



---

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2021 PACE Program Committee Chair

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**Alexander Bille, Dominik Brandenstein, Emanuel Herrendorf**

Philipps University of Marburg

as the

**Second Place Winners in the Exact Track of the Cluster Editing Challenge**

**350 €**



---

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<sup>1</sup>Karlsruhe Institute of Technology, <sup>2</sup>Hasso Plattner Institut

as the

**First Place Winners in the Exact Track of the Cluster Editing Challenge**

**500 €**



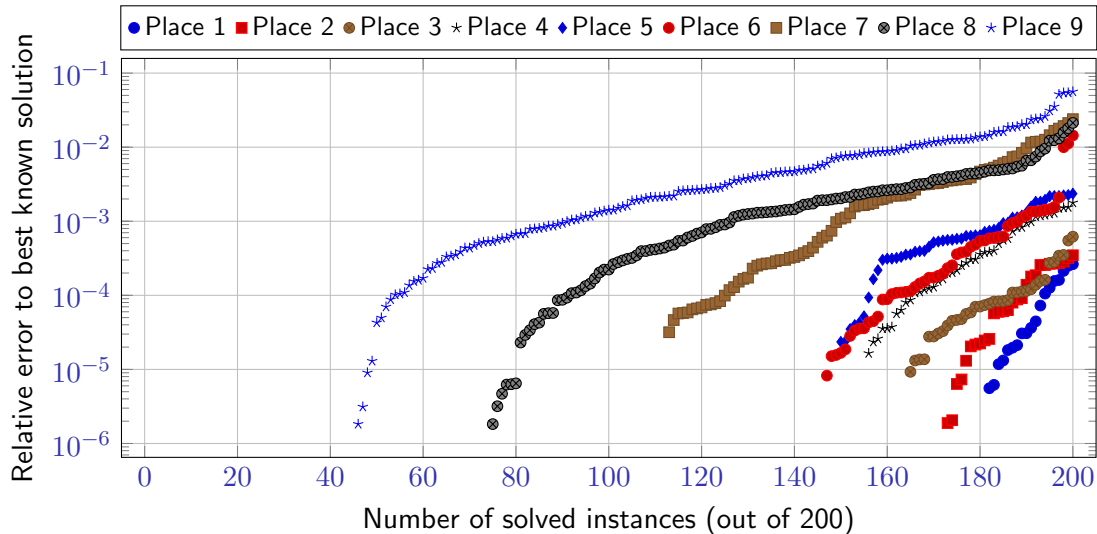
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2021 PACE Program Committee Chair

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# Heuristic Track — Cactus Plot



# Heuristic Track — Results

Points:  $\sum_{\text{instances}} 100 \cdot (\text{best known solution size}) / (\text{submission solution size})$

	Team (Institute)	Points	Status
1	Lars Gottesbüren, Tobias Heuer, Thomas Bläsius, Philipp Fischbeck, Michael Hamann, Jonas Spinner, Christopher Weyand, Marcus Wilhelm (Karlsruhe Institute of Technology, Hasso Plattner Institut)	<b>9999.89</b>	—
2	Sylwester Swat (Poznań University of Technology)	<b>9999.85</b>	PhD
3	Valentin Bartier, Gabriel Bathie, Nicolas Bousquet, Marc Heinrich, Théo Pierron, Ulysse Prieto (Grenoble INP, École Normale Supérieure de Lyon, Université de Lyon, University of Leeds)	<b>9999.75</b>	—
4	Martin Josef Geiger (University of the Federal Armed Forces Hamburg)	<b>9998.76</b>	—
5	Emir Demirović (Delft University of Technology)	<b>9997.86</b>	—
6	Ben Strasser	<b>9997.23</b>	—
7	Angus Ritossa, Paula Tennent, Tiana Tsang Ung, Akshay Valluru (UNSW Sydney)	<b>9986.56</b>	BSc
8	Sachin Agarwal, Sahil Bajaj, Ojasv Singh, Srinibas Swain (IIIT Guwahati)	<b>9967.39</b>	BSc
9	Václav Blažej, Radovan Červený, Dušan Knop, Jan Pokorný, Šimon Schierreich, Ondřej Suchý (Czech Technical University in Prague)	<b>9949.46</b>	PhD
10	Jona Dirks, Mario Grobler, Tobias Meis, Roman Rabinovich, Yannik Schnaubelt, Sebastian Siebertz, Maximilian Sonneborn (University of Bremen, Technische Universität Berlin)	<b>8900.09</b>	BSc

# 6th Parameterized Algorithms and Computational Experiments Challenge PACE

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**Václav Blažej, Radovan Červený, Dušan Knop, Jan Pokorný, Šimon Schierreich,  
Ondřej Suchý**

Czech Technical University in Prague

as the

**Third Student Prize Winners in the Heuristic Track of the Cluster Editing Challenge**

**175 €**



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2021 PACE Program Committee Chair

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IIIT Guwahati

as the

**Second Student Prize Winners in the Heuristic Track of the Cluster Editing Challenge**

**225 €**



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2021 PACE Program Committee Chair

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## PACE

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**Angus Ritossa, Paula Tennent, Tiana Tsang Ung, Akshay Valluru**

UNSW Sydney

as the

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**300 €**



---

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Ulysse Prieto**

<sup>1</sup>Grenoble INP, <sup>2</sup>École Normale Supérieure de Lyon, <sup>3</sup>Université de Lyon, <sup>4</sup>University of Leeds

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---

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<sup>1</sup>Karlsruhe Institute of Technology, <sup>2</sup>Hasso Plattner Institut

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**First Place Winners in the Heuristic Track of the Cluster Editing Challenge**

# 500 €



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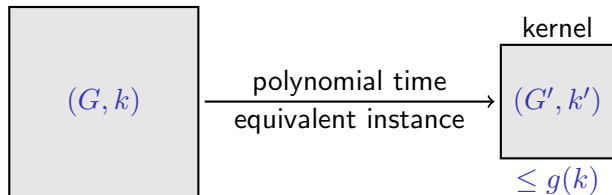


# Kernel Track — Setup

**Goal:** Track for kernelization results

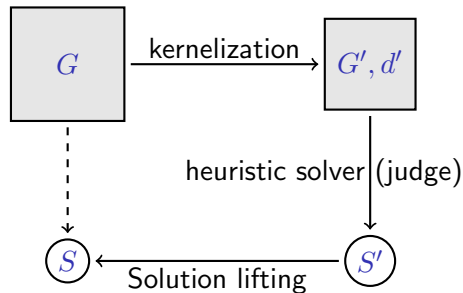
**Issues:**

- Solution size  $k$  unknown
- Kernel itself not useful in practice
- Correctness hard to check
- Best exact solver is best kernel?



**Track requirements:** (input: graph  $G = (V, E)$ ;  
 $\text{opt}(G)$ : size of optimal solution of  $G$ )

- 1 Kernelization algorithm: return  $d \in \mathbb{N}$   
and  $G' = (V', E')$  so that  $\text{opt}(G) = \text{opt}(G') + d$
- 2 Solution lifting algorithm: given heuristic  
solution  $S'$  for  $G'$ , compute solution  $S$  for  $G$   
with  $|S| \leq |S'| + d$



↪ Practice orientated kernel track

# Kernel Track — Results

Points:  $\sum_{\text{instances}} 100 \cdot (\text{best score}) / (\text{submission score})$   
score = (kernel size)/(parameter reduction)

Team (Institute)	Points	Status
1 Sylwester Swat (Poznań University of Technology)	<b>6567.61</b>	PhD

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2021 PACE Program Committee Chair

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# Conclusion

**Students prizes:** Announce them for next iterations?

**Exact & heuristic track:** works well!

**Issues with kernel track:**

Happy for any comments and feedback!

- 2-Phase setup suitable for practice but
  - not testable in optil.io
  - might exclude kernelizations (requiring optimal solutions for kernel)?
- Most frequently returned kernel: empty graph  $\rightsquigarrow$  harder instances / shorter time limit for kernel track?
- Data reduction rules might insert edges  $\rightsquigarrow$  kernel might be larger than input graph

# Thank You!