Et si SAT était vraiment difficile? Quelques conséquences des hypothèses ETH et SETH

Bruno Escoffier, LIP6, Sorbonne Université

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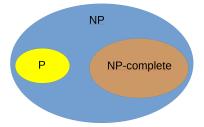
But interesting (at least to me) and somehow fundamental questions



Bruno Escoffier ALEA 2023



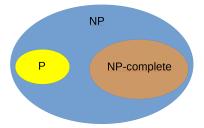
"There are two kinds of people in this world, my friend. Those who have guns and those who do not."



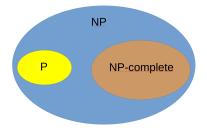
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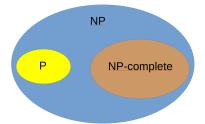


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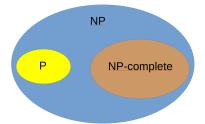
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• An $O(n^5)$ algorithm is *not* the same as a linear one!

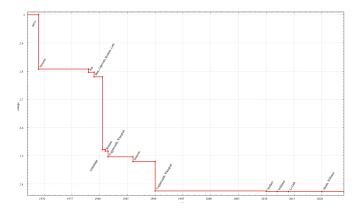


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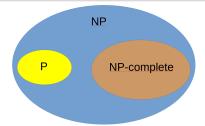
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An O(n⁵) algorithm is not the same as a linear one! → Algorithm design: try to reduce the complexity.

Matrix multiplication: from $O(n^3)$ to $O(n^{2.3728596})$



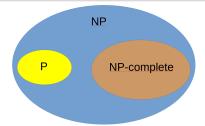
(source wikipedia)



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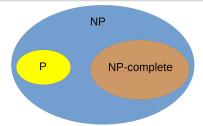
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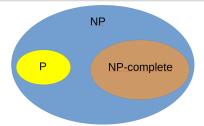
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- ► NP-complete problems: typically solvable in O(cⁿ). → Can't we do better?



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► NP-complete problems: typically solvable in O(cⁿ). → Can't we do better?

Find lower bounds, using a stronger hypothesison Sat! $(P \neq NP \Leftrightarrow Sat \notin P)$

Sat • t boolean variables $(x_1, ..., x_t)$ • m clauses $C_1, ..., C_m$ $(C_1 = (x_2 \lor \overline{x_4} \lor x_5), ...)$ • Is there a truth value which satisfies all clauses? k-Sat: every clause has (exactly/at most) k literals.

Sat

- ► t boolean variables (x₁,...,x_t)
- *m* clauses C_1, \ldots, C_m ($C_1 = (x_2 \lor \overline{x_4} \lor x_5), \ldots$)
- Is there a truth value which satisfies all clauses?
- k-Sat: every clause has (exactly/at most) k literals.

What can we say about Sat/k-Sat?

- \rightarrow Solvable in $2^t poly(t, m) = O^*(2^t)$.
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- \rightarrow Can we do better? yes and no . . .

3-Sat

$$C = (x_1 \lor x_2 \lor \overline{x_3}) \quad \rightarrow \quad \text{only 7 possibilities} \\ (all but x_1 = x_2 = F, x_3 = T) \\ \rightarrow \quad \text{test all of them} \\ \rightarrow \quad T(t) = 7T(t-3)$$

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k-Sat

$$\begin{array}{rcl} C \text{ of size } k & \to & \text{only } 2^k - 1 \text{ possibilities} \\ & \to & \text{test all of them} \\ & \to & T(t) = (2^k - 1)T(t - k) \\ & & (\text{instead of } T(t) = 2^kT(t - k) \\ & & \text{for exhaustive search}) \\ k\text{-Sat solvable in } O^*(c_k^t), \text{ with } c_k = (2^k - 1)^{1/k} < 2. \end{array}$$

Sat, k-Sat, ETH and SETH

Sat

• t boolean variables (x_1, \ldots, x_t)

• *m* clauses
$$C_1, \ldots, C_m$$
 ($C_1 = (x_2 \lor \overline{x_4} \lor x_5), \ldots$)

Is there a truth value which satisfies all clauses?

k-Sat: every clause has (exactly/at most) k literals.

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```
→ Solvable in 2^t poly(t, m) = O^*(2^t).

→ Can we do better? yes and no ...

"Yes" for-k Sat.

Significantly better? Subexponential (in t) time?

And for Sat?
```

Sat, k-Sat, ETH and SETH

Subexponential time? Seems very hard to get, even for 3-Sat \rightarrow ETH.

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Definition

Let $\mu_k = \inf\{c \ge 0 : k \text{-Sat solvable in } O^*(2^{ct})\}.$

 $\mu_k > 0 \rightarrow$ exponential time is needed.

ETH - Exponential Time Hypothesis (Impagliazzo, Paturi, Ramamohan (1999))

 $\mu_3 > 0.$

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And for Sat? No $O^*(2^{ct})$ algorithm with c < 1 is known!

SETH - Strong Exponential Time Hypothesis

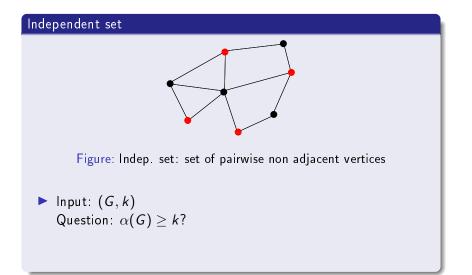
 $\mu_k \to_{k\to\infty} 1.$

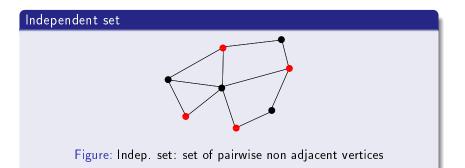
- Introduction, ETH and SETH
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$\mathsf{ETH} o 3\text{-Sat}$ non solvable in subexponential time (wrt $t{=}\#$ variables).

Question

Can we show exponential lower bounds under ETH?



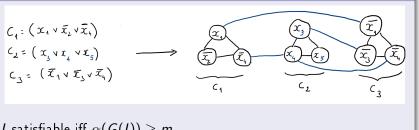


lnput:
$$(G, k)$$

Question: $\alpha(G) \ge k$?

2

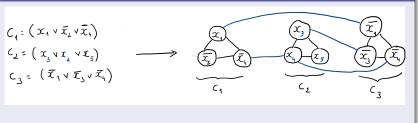
Reduction 3-Sat \leq Independent Set



I satisfiable iff $lpha(G(I)) \geq m$

 \rightarrow lower bound $2^{\epsilon n}$ for Independent Set (under ETH)?

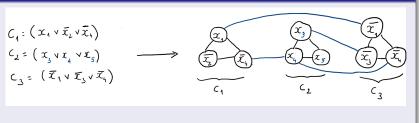
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We need a reduction where $n = O(t) \dots$ or to work with 3-Sat instances with m = O(t) clauses.

Sparsification lemma (Impagliazzo et al. (2001))

Let 3-Sat(*B*) be the restriction of 3-Sat to instances where $m \le Bt$. ETH holds iff $\exists B$ such that "it holds for 3-Sat(*B*)" Sparsification lemma (Impagliazzo et al. (2001))

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Hardness of Independent Set

Under ETH, there exists $\epsilon > 0$ such that Independent is not solvable in $2^{\epsilon n}$ (with n = # vertices).

And the same for many other problems (3-colorability, Hamiltonian path, \dots)

Question

Can we show exponential lower bounds under ETH?

Answer

Yes we can

... well, this was expected, but it was not that direct

By the way: shall we buy (S)ETH?

Reminder

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Is the reverse true? Also for other problems?

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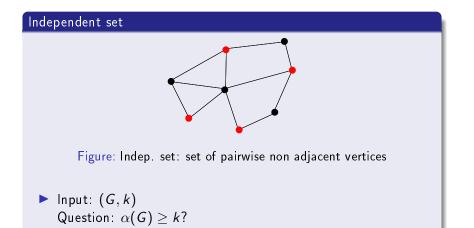
Shall we buy SETH? (\Rightarrow no c^t algo for Sat with c < 2) Well...



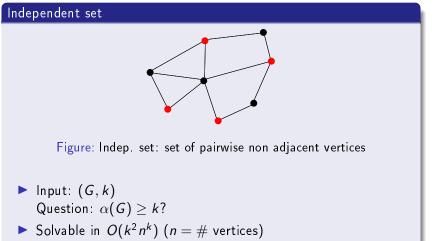
... but at least you should compete for the Godel prize if you disprove it!

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Lower bounds for hard problems: paramaterized complexity

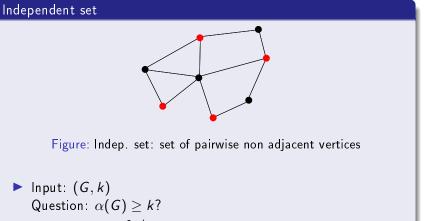


Lower bounds for hard problems: paramaterized complexity



 \rightarrow Can we improve the degree of the polynomial? Get rid of it?

Lower bounds for hard problems: paramaterized complexity



Solvable in O(k² n^k) (n = # vertices)
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 Parameterized complexity.

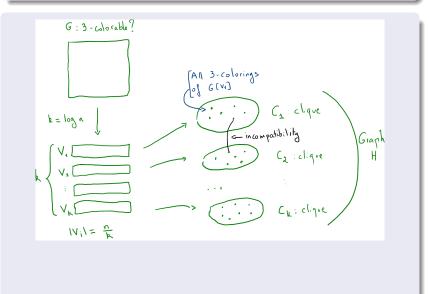
Input: (G, k)
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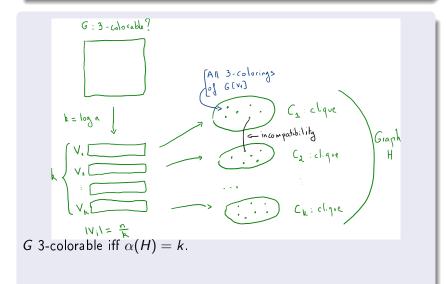
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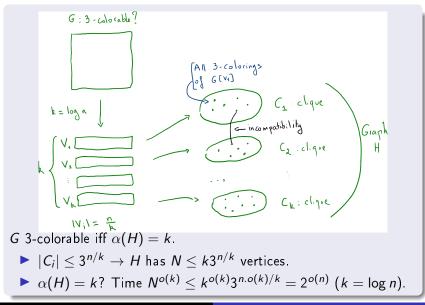
If I.S. solvable in $O(n^{o(k)})$ then 3-coloring solvable in $O(2^{o(n)})$.



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Lower bounds for hard problems: parameterized complexity

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The same occurs for other problems (e.g., dominating set).

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The same occurs for other problems (e.g., dominating set). \rightarrow Remark: use of non-polytime reduction.

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 \rightarrow No under ETH

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We can

 \rightarrow Find lower bounds beyond polytime:

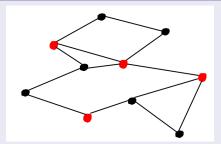
under SETH, sharp bounds,

both in classical and parameterized complexity frameworks.

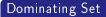
Introduction, ETH and SETH

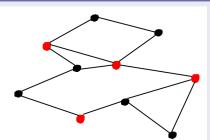
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Dominating Set



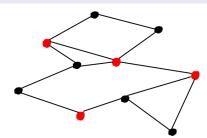






Dominating Set: S such that every vertex not in S has a neighbor in S.

Dominating Set

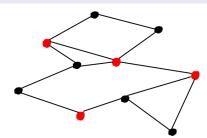


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▶ k-DS: does G has a D.S. of size k?

Enumerating all subsets of size $k \to n^k$. Can I avoid this? Can I solve 3-DS in $n^{3-\epsilon}$? k-DS in $n^{k-\epsilon}$ for some/any k?

Dominating Set

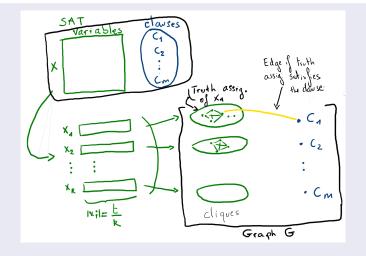


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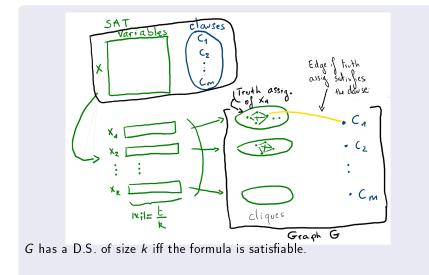
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Enumerating all subsets of size $k \to n^k$. Can I avoid this? Can I solve 3-DS in $n^{3-\epsilon}$? k-DS in $n^{k-\epsilon}$ for some/any k? No, under SETH! No $n^{3-\epsilon}$ for 3-DS; $\forall k$, no $n^{k-\epsilon}$ for k-DS!!

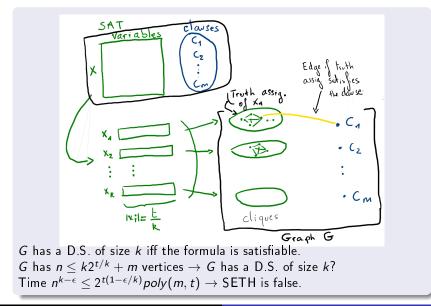
$\forall k \geq 3, \epsilon > 0$: if k-DS is solvable in $O(n^{k-\epsilon})$ then SETH is false.



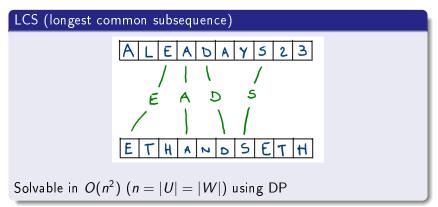
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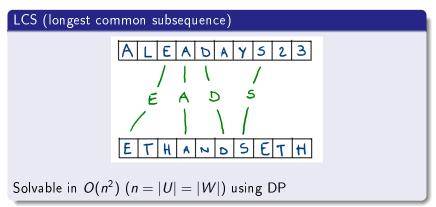
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Lower bound for DS, also for other classical problems.



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Theorem ((Abboud et al. 2015))

Under SETH, $\forall \epsilon > 0$, LCS is not solvable in $O(n^{2-\epsilon})$.

We can

 \rightarrow Find lower bounds for polytime problems, under SETH: fine-grained complexity.

Introduction, ETH and SETH

- 2 Lower bounds for NP-hard problems
 - Subexponential time
 - Parameterized complexity
- 3 Lower bounds for polynomial problems
- Oncluding remarks

Other topics:

- Lower bounds for other problems
- Lower bounds for approximation algorithms
- Randomized ETH

Lower bounds for other problems?

Back to independent set

Theorem

A graph has either an independent set of size $\lfloor \log_2(n)/2 \rfloor$, or a clique of size $\lfloor \log_2(n)/2 \rfloor$.

Lower bounds for other problems?

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- Does $\alpha(G) \ge \log(n)$?

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Theorem

It is not in P, and even not solvable in $n^{o(\log n)}$, under ETH!

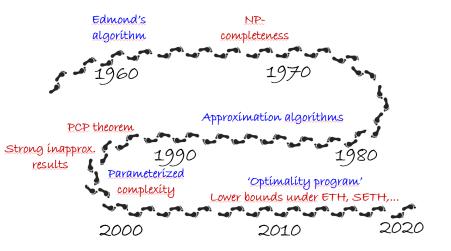
We can

 \rightarrow Get hardness results for problems "hard but not NP-complete", under ETH.

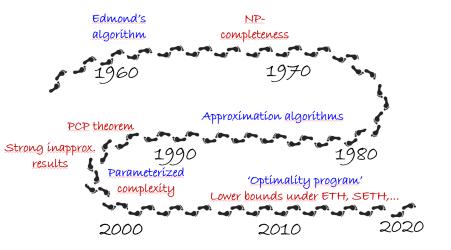
- Lower bounds for other problems
- Lower bounds for approximation algorithms
- Randomized ETH



Concluding remarks



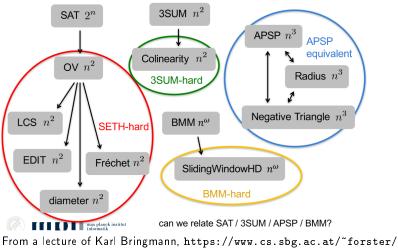
Concluding remarks



Merci de votre attention!

Hardness of polynomial problems

Complexity Inside P



courses/polycomp/slides/polycomp11.pdf.

Under SETH

- ▶ I.S. is not solvable in $(2 \epsilon)^{tw} n^c$ with tw=treewidth (Lokshtanov, Marx, and Saurabh 2010). For D.S.: no $(3 \epsilon)^{tw} n^c$.
- Many tight bounds for other parameters (pathwidth, cliquewidth,...) in parameterized complexity.
- No $(2 \epsilon)^n$ algorithm for hitting set.
- ▶ Diameter of a graph, under SETH: no $m^{2-\epsilon}$ (exact) algorithm (Roditty and Williams 2013), no $(2-\epsilon)$ -approximation in $m^{1+o(1)}$ (even in sparse graphs), (Li'21, Dalirrooyfard Wei'20)

Subexponential time lower bounds under ETH: There is no $2^{o(\sqrt{n})}$ algorithm for Vertex Cover, 3-Colorability, and Hamiltonian Path for planar graphs.

- ▶ $\forall c > 0$: no *c*-approximation algorithm
- (and even) for all $\epsilon > 0$: no $n^{\epsilon-1}$ -approximation algorithm.

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∀c > 0: no 2^{n^{1-ϵ}}-time c-approximation algorithm. (Bonnet, Escoffier, Kim, Paschos, 2013)

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- ∀c > 0: no 2^{n1-ϵ}-time c-approximation algorithm. (Bonnet, Escoffier, Kim, Paschos, 2013)
- ▶ \sqrt{n} -approximation: easy to get in $O^*(2^{\sqrt{n}}) \rightarrow$ subexponential time. But no better! (The same for other ratios) (Chalermsook, Laekhanukit, Nanongkai, 2013)

Definition r-ETH (from Dell et al. 2012)

There is a constant c > 0 such that no randomized algorithm can decide 3-Sat in time 2^{ct} with error probability at most 1/3.

Negative results under r-ETH:

- Computing the permanent of a 0-1 matrix of size n × n cannot be done in 2^{o(n)}, and not even in time 2^{o(m)} where m is the number of non-zero elements.
- Some (tight) lower bounds for approximation ratios in subexponential time, e.g. in Katsikarelis, Lampis, Paschos 2019.

Also #-ETH: $\exists c \text{ s.t. counting the number of sat. assignments for 3-SAT cannot be done in <math>2^{ct}$.