# Et si SAT était vraiment difficile? <br> Quelques conséquences des hypothèses ETH et SETH 

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

## Classical dichotomy

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

(source wikipedia)

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$\rightarrow$ Can't we do better?


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- NP-complete problems: typically solvable in $O\left(c^{n}\right)$. $\rightarrow$ Can't we do better?

Find lower bounds, using a stronger hypothesis ...
... on Sat! $(P \neq N P \Leftrightarrow$ Sat $\notin P)$

## Sat, $k$-Sat, ETH and SETH

## Sat

- $t$ boolean variables $\left(x_{1}, \ldots, x_{t}\right)$
- $m$ clauses $C_{1}, \ldots, C_{m}\left(C_{1}=\left(x_{2} \vee \overline{x_{4}} \vee x_{5}\right), \ldots\right)$
- Is there a truth value which satisfies all clauses?
$k$-Sat: every clause has (exactly/at most) $k$ literals.


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## What can we say about Sat/k-Sat?

$\rightarrow$ Solvable in $2^{t} p o l y(t, m)=O^{*}\left(2^{t}\right)$.
$\rightarrow$ Can we do better?

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$\rightarrow$ Can we do better? yes and no ...

## 3-Sat

$$
\begin{aligned}
C=\left(x_{1} \vee x_{2} \vee \overline{x_{3}}\right) & \rightarrow \\
& \left.\left.\begin{array}{l}
\text { only } 7 \text { possibilities } \\
\\
\left(\text { all but } x_{1}=x_{2}\right.
\end{array}\right) F, x_{3}=T\right) \\
& \rightarrow \text { test all of them } \\
& \rightarrow T(t)=7 T(t-3)
\end{aligned}
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$\rightarrow$ test all of them
$\rightarrow \quad T(t)=7 T(t-3)$
(instead of $T(t)=8 T(t-3)$
for exhaustive search)
3-Sat solvable in $O^{*}\left(c_{3}^{t}\right)$, with $c_{3}=7^{1 / 3}=1.9 \ldots<2$.

## $k$-Sat

$C$ of size $k \rightarrow$ only $2^{k}-1$ possibilities
$\rightarrow$ test all of them
$\rightarrow \quad T(t)=\left(2^{k}-1\right) T(t-k)$
(instead of $T(t)=2^{k} T(t-k)$
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$k$-Sat solvable in $O^{*}\left(c_{k}^{t}\right)$, with $c_{k}=\left(2^{k}-1\right)^{1 / k}<2$.

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## What can we say about Sat/k-Sat?

$\rightarrow$ Solvable in $2^{t} p o l y(t, m)=O^{*}\left(2^{t}\right)$.
$\rightarrow$ Can we do better? yes and no ...
"Yes" for- $k$ Sat.
Significantly better? Subexponential (in $t$ ) time?
And for Sat?

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

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## Definition

Let $\mu_{k}=\inf \left\{c \geq 0: k\right.$-Sat solvable in $\left.O^{*}\left(2^{c t}\right)\right\}$.
$\mu_{k}>0 \rightarrow$ exponential time is needed.
ETH - Exponential Time Hypothesis (Impagliazzo, Paturi, Ramamohan (1999))
$\mu_{3}>0$.

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ETH - Exponential Time Hypothesis (Impagliazzo, Paturi, Ramamohan (1999))
$\mu_{3}>0$.
And for Sat? No $O^{*}\left(2^{c t}\right)$ algorithm with $c<1$ is known!
SETH - Strong Exponential Time Hypothesis
$\mu_{k} \rightarrow_{k \rightarrow \infty} 1$.
(1) Introduction, ETH and SETH
(2) Lower bounds for NP-hard problems
(1) Subexponential time
(2) Parameterized complexity
(3) Lower bounds for polynomial problems
(0) Concluding remarks

## Lower bounds for hard problems: subexponential time

ETH $\rightarrow$ 3-Sat non solvable in subexponential time (wrt $t=\#$ variables).

## Question

Can we show exponential lower bounds under ETH?

## Independent set



Figure: Indep. set: set of pairwise non adjacent vertices

- Input: $(G, k)$

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

## Lower bounds for hard problems: subexponential time

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- Solvable in $O^{*}\left(2^{n}\right)$ ( $n=$ \# vertices)
$\rightarrow$ Not in subexponential time, under ETH?


## Lower bounds for hard problems: subexponential time

## Reduction 3-Sat $\leq$ Independent Set

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\begin{aligned}
& c_{1}=\left(x_{1} \vee \bar{x}_{2} \vee \bar{x}_{4}\right) \\
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I satisfiable iff $\alpha(G(I)) \geq m$
$\rightarrow$ lower bound $2^{\epsilon n}$ for Independent Set (under ETH)?

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No! (well, not yet)
$G(I)$ has $n=3 m$ vertices. $2^{o(n)}$ for IS does not give a $2^{o(t)}$ for 3-Sat (contradicting ETH), but a $2^{o(m)}$ (NOT contradicting ETH (yet)).

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

## Lower bounds for hard problems: subexponential time

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

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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,...)

## Lower bounds for hard problems: subexponential time

## Question

Can we show exponential lower bounds under ETH?

## Answer

Yes we can
... well, this was expected, but it was not that direct

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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

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In $2^{k} n^{\sqrt{k}}$ ? Or at least $f(k) n^{o(k)}$ ?

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$\square$


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G 3-colorable iff $\alpha(H)=k$.
$-\left|C_{i}\right| \leq 3^{n / k} \rightarrow H$ has $N \leq k 3^{n / k}$ vertices.
$\alpha(H)=k$ ? Time $N^{o(k)} \leq k^{o(k)} 3^{n . o(k) / k}=2^{o(n)}(k=\log n)$.

## 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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In time $n^{c k}$ for some $c<1$ ?


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$\ln 2^{k} n^{\sqrt{k}}$ ? Or at least $f(k) n^{o(k)}$ ?
$\rightarrow$ No under ETH
In time $n^{c k}$ for some $c<1$ ?
$\rightarrow$ Well, doable for IS ... but not for other problems under SETH (even no $n^{k-\epsilon}$ ).


## We can

$\rightarrow$ Find lower bounds beyond polytime:

- under ETH (no $2^{\circ(n)}$, no $n^{o(k)}, \ldots$ ),
- under SETH, sharp bounds,
both in classical and parameterized complexity frameworks.
(1) Introduction, ETH and SETH
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## Lower bounds for polynomial problems

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- $k$-DS: does $G$ has a D.S. of size $k$ ?

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

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No, under SETH! No $n^{3-\epsilon}$ for $3-D S$; $\forall k$, no $n^{k-\epsilon}$ for $k$-DS!!
$\forall k \geq 3, \epsilon>0$ : if $k$-DS is solvable in $O\left(n^{k-\epsilon}\right)$ then SETH is false.

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$G$ has a D.S. of size $k$ iff the formula is satisfiable.
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$G$ has a D.S. of size $k$ iff the formula is satisfiable.
$G$ has $n \leq k 2^{t / k}+m$ vertices $\rightarrow G$ has a D.S. of size $k$ ?
Time $n^{k-\epsilon} \leq 2^{t(1-\epsilon / k)}$ poly $(m, t) \rightarrow$ SETH is false.

## Lower bounds for polynomial problems

Lower bound for DS, also for other classical problems.
LCS (longest common subsequence)


Solvable in $O\left(n^{2}\right)(n=|U|=|W|)$ using DP

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## LCS (longest common subsequence)



Solvable in $O\left(n^{2}\right)(n=|U|=|W|)$ using DP
Theorem ((Abboud et al. 2015))
Under SETH, $\forall \epsilon>0, L C S$ is not solvable in $O\left(n^{2-\epsilon}\right)$.

We can
$\rightarrow$ Find lower bounds for polytime problems, under SETH: fine-grained complexity.
(1) Introduction, ETH and SETH
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## Concluding 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 $\left\lfloor\log _{2}(n) / 2\right\rfloor$, or a clique of size $\left\lfloor\log _{2}(n) / 2\right\rfloor$.

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


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- A graph G
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$\rightarrow$ solvable in $O\left(n^{O(\log n)}\right)=2^{\text {polylog } n}$
Not NP-complete (unless NP $\subseteq$ QP)... but seems hard to solve in polytime!


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## Theorem

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

## Lower bounds for other problems?

## We can

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

## Concluding remarks

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

Concluding remarks


Concluding remarks


## Hardness of polynomial problems

## Complexity Inside P



From a lecture of Karl Bringmann, https://www.cs.sbg.ac.at/~forster/ courses/polycomp/slides/polycomp11.pdf.

## Some tight results under SETH

## Under SETH

- I.S. is not solvable in $(2-\epsilon)^{t w} n^{c}$ with $t w=$ treewidth (Lokshtanov, Marx, and Saurabh 2010). For D.S.: no $(3-\epsilon)^{t w} n^{c}$.
- 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.


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- $\sqrt{n}$-approximation: easy to get in $O^{*}\left(2^{\sqrt{n}}\right) \rightarrow$ subexponential time. But no better! (The same for other ratios) (Chalermsook, Laekhanukit, Nanongkai, 2013)


## Randomized ETH

## 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 $2^{c t}$ with error probability at most $1 / 3$.

Negative results under r-ETH:

- Computing the permanent of a 0-1 matrix of size $n \times n$ cannot be done in $2^{\circ(n)}$, and not even in time $2^{\circ(m)}$ 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: $\exists c$ s.t. counting the number of sat. assignments for 3-SAT cannot be done in $2^{c t}$.

