## Fine-Grained Complexity in P

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## Reductions



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Two interpretations

Positive: we can solve  $\Pi$  in t(n) + f(r(n)) with f is the time for  $\Pi'$ 

Negative:  $\Pi'$  cannot be solved in f(n)since we know/assume that  $\Pi$  is not solvable in t(n) + f(r(n)) Reductions and fine-grained complexity

Complexity with the classes TIME(f(n)) and reference problems



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Strong Exponential Time Hypothesis (SETH):  $\forall \varepsilon > 0, \exists k \text{ s.t.} k$ -SAT is not in time  $2^{(1-\varepsilon)n}$ .

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**3-SUM Hypothesis:** Finding x, y, z such that x + y + z = 0 in a list of *n* integers of  $[-n^4, n^4]$  is not in time  $O(n^{2-\varepsilon})$  for any  $\varepsilon > 0$ .

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All-Pairs Shortest-Path (APSP) Hypothesis:  $\exists c$ , APSP with edge weights in  $[-n^c, n^c]$  is not solvable in time  $O(n^{3-\varepsilon})$  for  $\varepsilon > 0$ .

**SETH:** SAT is not solvable in  $1.99^n$ .

- k-SAT is solvable in  $2^{(1-\Theta(\frac{1}{k}))n}$
- SAT is solvable  $2^{(1-\Theta(\frac{1}{\log m/n}))n}$

- **3-SUM Hypothesis:** 3-SUM is not solvable in  $n^{1.99}$ 
  - ► Solvable in  $n^2 \frac{(\log \log n)^{O(1)}}{\log^2 n}$  even with real inputs
  - Linear decision tree with depth  $O(n \log^2 n)$

**APSP Hypothesis:** APSP is not solvable in  $n^{2.99}$ 

- solvable in cubic time by Floyd-Warshall algorithm
- improved to  $n^3/2^{O(\sqrt{\log n})}$



In 1999, Impagliazzo and Paturi introduce  $\text{ETH}^1$  and mention a stronger version of it in their conclusion

#### $\mathsf{SETH} \Rightarrow \mathsf{ETH} \Rightarrow \mathsf{P} \neq \mathsf{NP}$

ETH and SETH are then mainly used for NP-hard problems

 $<sup>{}^{1}\</sup>exists \delta > 0$ , 3-SAT cannot be solved in  $2^{\delta n}$ 



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## SETH

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#### $\mathsf{SETH} \Rightarrow \mathsf{ETH} \Rightarrow \mathsf{P} \neq \mathsf{NP}$

- ETH and SETH are then mainly used for NP-hard problems
- ▶ In 2005, SETH is used for the first time for a problem in P
- > 2014-, dozens of papers show SETH-hardness of problems in P

ORTHOGONAL VECTORS, DIAMETER, FRÉCHET DISTANCE, EDIT DISTANCE, LONGEST COMMON SUBSEQUENCE, FURTHEST PAIR, dynamic problems, problems from Machine Learning, Model Checking, Language Theory etc.

 $<sup>{}^1\</sup>exists \delta > {\rm 0}, \, {\rm 3-Sat}$  cannot be solved in  ${\rm 2}^{\delta n}$ 

### Psychological barrier?

If we treat k-SAT  $\rightarrow$  OV as an outlier, why 15 years between defining SETH and using it in P? Psychological barrier?

A: If you know too much (P, NP, NP-completeness), you might disregard a reduction from a hard problem to an easy one

B: If you know less (summing and composing functions)



### Psychological barrier?

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B: If you know less (summing and composing functions)



B: "Both the time and the blow-up can be exponential, great."

arbitrary equipartition of X:  $x_1, x_2, \ldots, x_{\frac{n}{2}}, x_{\frac{n}{2}+1}, x_{\frac{n}{2}+2}, \ldots, x_n$ 

Find an assignment

- A of the red variables and
- B of the blue variables

such that all the clauses are satisfied by  $\boldsymbol{A}$  or by  $\boldsymbol{B}$ 

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	R	В	$C_1$	$C_2$	<i>C</i> <sub>3</sub>	<i>C</i> <sub>4</sub>	$C_5$	$C_6$	<i>C</i> <sub>7</sub>	$C_8$
$A_1$	1	0	1	0	0	1	0	0	1	0
$A_2$	1	0	0	0	0	1	1	1	0	1
$A_3$	1	0	0	1	0	1	0	0	1	1
$A_4$	1	0	0	0	1	1	0	1	1	1
$B_1$	0	1	1	1	0	0	1	1	1	0
<i>B</i> <sub>2</sub>	0	1	0	1	0	1	0	1	0	0
<i>B</i> <sub>3</sub>	0	1	1	1	1	1	0	0	0	1
$B_4$	0	1	0	1	0	0	1	0	0	1

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## Consequence for $\operatorname{OV}$ under the SETH

From a SAT-instance on *n* variables and *m* clauses, we created  $N := 2^{\frac{n}{2}+1}$  vectors in dimension d := m + 2

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An algorithm solving OV in time  $2^{o(d)}N^{2-\varepsilon}$ would solve SAT in  $2^{o(m)}2^{n(1-\varepsilon/2)} \rightarrow$  breaking SETH

Sharp contrast with the simple algorithms in  $O(N^2d)$  and  $O(2^dN)$ 

#### DIAMETER

diam(G) = largest distance between a pair of vertices of G

$$u$$
 longest<sub>*u*,*v*</sub> shortestPath(*u*,*v*)?  $v$ 

- In weighted graphs, nothing known better than APSP
- In unweigthed graphs, solvable in  $ilde{O}(n^{\omega})$
- ▶ In unweighted sparse  $(m = \Theta(n))$  graphs, solvable in  $O(n^2)$
- $\frac{3}{2}$ -approximable in  $\tilde{O}(m^{1.5})$
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- ► In sparse graphs,  $\frac{3}{2}$ -approximable in  $\tilde{O}(n^{1.5})$

Linear reduction from ORTHOGONAL VECTORS: no n<sup>1.99</sup> algorithm even to  $(\frac{3}{2} - \varepsilon)$ -approximate Diameter on unweighted sparse instances, assuming the SETH.



So far, all the pairs but of  $A \times B$  are at distance  $\leq 2$ 





A pair (a4,b2) is at distance  $2 \Leftrightarrow \langle a_4, b_2 \rangle \neq 0$ 



diam $(G) = 3 \Leftrightarrow \exists (a_i, b_j)$  at distance  $3 \Leftrightarrow$  orthogonal pair



If no orthogonal pair, diam(G) = 2

## 3-SUM Hardness

Introduced in 1995 by Gajentaan and Overmars to explain why some geometric problems require quadratic time

- are there three aligned points?
- are there three lines meeting at a point? (same by duality)
- is there a hole in a union of triangles?
- computing the area of a union of triangles
- is a rectangle covered by a set of infinite strips?
- Line separator of a non-intersecting axis-parallel segments?
- motion planning problems
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the quadratic algorithm is not easy

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If a, b, c are pairwise distinct  $a + b + c = 0 \Leftrightarrow (a, a^3), (b, b^3), (c, c^3)$  are aligned

## GEOMBASE

#### Convenient 3-points-on-a-line 3-SUM-hard variant



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## $GEOMBASE \rightarrow SEGMENTS$ SEPARATION

Convenient 3-points-on-a-line  $\operatorname{3-SUM}$ -hard variant



Points become tiny holes between horizontal segments

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## Segments Separation $\rightarrow$ Covered Rectangle

Rotation + Duality! Points  $\leftrightarrow$  Lines & Vertical Segments  $\leftrightarrow$  Strips

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 $\label{eq:relation} \begin{array}{l} \mbox{Rotation} + \mbox{Duality! Points} \leftrightarrow \mbox{Lines \& Vertical Segments} \leftrightarrow \mbox{Strips} \\ \\ \mbox{Point not on any strip} \Leftrightarrow \mbox{Line separating the segments} \end{array}$ 

### **APSP Hardness**

This hypothesis has emerged more recently, introduced by Ryan Williams and Virginia Vassilevska Williams in 2010

APSP is in time  $n^{3-\varepsilon}$  iff so is one of:

- finding a triangle with negative weight
- finding the radius of a weighted graph
- does a given matrix represent a metric?
- finding a shortest cycle in a graph with non-negative weights
- ▶ (*min*, +) matrix multiplication
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Let us recall that unweighted APSP can be solved in  $n^\omega$ 

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TREE EDIT DISTANCE in truly subcubic time is APSP-hard.

#### All-Pairs Negative Triangle (APNT):

Given a tripartite graph on (A, B, C), is there, for every pair  $b \in B, c \in C$ , a vertex  $a \in A$  such that *abc* is a negative triangle?

One can show that  $\operatorname{APSP}$  and  $\operatorname{APNT}$  are equivalent

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For each triple of classes, call  $\operatorname{Negative}\,\operatorname{Triangle}$ 

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Continue with the same triple of classes while possible

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Report if all the pairs of  $B \times C$  were satisfied

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Number of calls to NEGATIVE TRIANGLE:  $\leq n^2 + t^3 = O(n^2)$ 

#### All-Pairs Negative Triangle (APNT):



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Are they pairwise incomparable?

Can we only use SETH by designing fine-grained reductions

- ▶ from *k*-SAT to 3-SUM
- ▶ from *k*-SAT to APSP?

k-TAUT: Are all the assignments of a k-DNF formula satisfying?

NSETH:  $\forall \varepsilon > 0$ ,  $\exists k$ , k-TAUT is not in NTIME $(2^{(1-\varepsilon)n})$ .

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- NSETH is false if randomization is allowed

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Certificate for non-existence of a triple summing to 0:

• a prime p among the first  $n^{1.5}$  primes  $\mathbb{P}_{n^{1.5}}$ ,

• an integer 
$$t = \tilde{O}(n^{1.5})$$
, and

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Why does such a certificate exist?

 $|\{(a_i, a_j, a_k, p) \mid a_i + a_j + a_k = 0 \mod p\}| \leq n^3 \log(3n^c) = \tilde{O}(n^3)$  $\exists p \in \mathbb{P}_{n^{1.5}}, |\{(a_i, a_j, a_k) \mid x + y + z = 0 \mod p\}| = \tilde{O}(n^{1.5})$ 

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Given (p, t, S), we check that:

- all triples of S sum to a non-zero value multiple of p
- expand  $(\Sigma_i x^{a_i \mod p})^3$  with FFT
- check that the coefficients of  $x^0, x^p, x^{2p}$  sum to t

Consequences for the unification 3-SUM is in coNTIME( $\tilde{O}(n^{1.5})$ )

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A fine-grained **deterministic** reduction from k-SAT to either of these problems would break NSETH



No known implication, the dashed ones are ruled out under NSETH

Things I did not mention

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#### Thanks for your attention!