## Computational Complexity; slides 15, HT 2022 Search problems, and total search problems

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We noted that NP problems have "search" counterparts that are of equal difficulty.

(recall FSAT: find a satisfying assignment)

For search problems having guaranteed solutions, we'll see that a novel classification is needed...

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Conclude that in a sense, computing a s.a. is no harder than SAT. Complexity class **FNP**: functions checkable in poly-time. For NP-complete problems, e.g. SAT, suppose we want to compute a satisfying assignment, not just test for satisfiability. This is at least as challenging as SAT...

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Complexity class **FNP**: functions checkable in poly-time.

- FSAT is FNP-complete (via Cook-Levin)
- So are function versions of other NP-complete problems

- many problems of local optimisation, e.g. LOCAL-MAX-CUT of a weighted graph.
- Factoring
- NASH: the problem of computing a Nash equilibrium of a game (comes in many versions depending on the structure of the game)
- PIGEONHOLE CIRCUIT: Input: a boolean circuit with n input gates and n output gates Output: either input vector x mapping to 0 or vectors x, x' mapping to the same output
- many other problems associated with "non-constructive" existence results

NP search problem is modelled as a relation  $R(\cdot, \cdot)$  where

- R(x, y) is checkable in time polynomial in |x|, |y|
- input x, find y with R(x, y) (y as certificate)
- total search problem:  $\forall x \exists y \quad (|y| = poly(|x|), R(x, y))$

SAT: x is boolean formula, y is satisfying bit vector. Decision version of SAT is polynomial-time equivalent to search for y.

FACTORING: input (the "x" in R(x, y)) is number N, output (the "y") is prime factorisation of N. No decision problem! contrast with "promise problems"

## Reducibility among search problems

FP, FNP: search (or, function computation) problems where output of function is computable (resp., checkable) in poly time. Any NP problem has FNP version "find a certificate".

#### Definition

Let R and S be search problems in FNP. We say that R (many-one) reduces to S, if there exist polynomial-time computable functions f, g such that

$$(f(x),y) \in S \implies (x,g(x,y)) \in R.$$

**Observation:** If S is polynomial-time solvable, then so is R. We say that two problems R and S are (polynomial-time) equivalent, if R reduces to S and S reduces to R.

*Theorem:* FSAT, the problem of finding a s.a. of a boolean formula, is FNP-complete.

(To help motivate/understand that definition of reducibility)

Consider 2 versions of FACTORING: one using base-10 numbers, and the other version using base-2 numbers. Intuitively, these two problems have the same difficulty: there is a fast algorithm to factor in base 2, if and only if there is a fast algorithm to factor in base 10.

In trying to make that intuition mathematically precise, we get the definition of the previous slide.

TFNP: "Total" function computation problems in NP

As we shall see, it looks like we really do need to introduce a new complexity class, in fact a collection of complexity classes...

Contrast with "promise problems", e.g.  ${\rm PROMISE}\ {\rm SAT}:$   ${\rm SAT}\text{-instances}$  where you've been promised there is a satisfying assignment. But such a promise isn't directly checkable.

## Some total search problems seem hard. (F)NP-hard?

#### Theorem

There is an FNP-complete problem in TFNP if and only if NP=co-NP.

*Proof:* "if": if NP=co-NP, then any FNP-complete problem is in TFNP (which is F(NP∩co-NP)).

"only if": Suppose X $\in$ TFNP is FNP-complete, and *R* is the binary relation for X.

Consider problem FSAT (given formula  $\varphi$ , find a satisfying assignment.) We have FSAT  $\leq_p X$ .

Any unsatisfiable  $\varphi$  would get a certificate of unsatisfiability, namely the string y with  $(f(\varphi), y) \in R$  and g(y) = "no" (or generally, anything other than a satisfying assignment).

N. Megiddo and C.H. Papadimitriou. On total functions, existence theorems and computational complexity. *Theoretical Computer Science*, **81**(2) pp. 317–324 (1991).

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FACTORING (for example) cannot be NP-hard unless NP = co-NP. Unlikely! So FACTORING is in strong sense "NP-intermediate".

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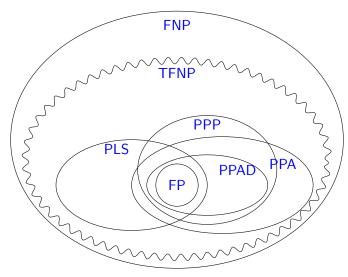
OK can we have, say, FACTORING is TFNP-complete? Good question! TFNP-completeness is as much as we can hope for, hardness-wise

TFNP doesn't (seem to) have complete problems (which needs syntactic description of "fully general" TFNP problem). (Similarly, RP, BPP, NP $\cap$ co-NP don't have complete problems) Try to describe "generic" problem/language X in NP $\cap$ co-NP as pair of NTMs that accept X and  $\overline{X}$ : what goes wrong? Advantage of (problems arising in) Ladner's theorem: you just have to believe  $P \neq NP$ , to have NP-intermediate. For us, we have to believe that FACTORING (say) is not in FP, also that NP $\neq$ co-NP.

Disadvantage of Ladner's theorem: the NP-intermediate problems are unnatural (did not arise independently of Ladner's thm; problem definitions involve TMs/circuits)

**Next:** subclasses of TFNP that have complete problems General idea: define classes in terms of "non-constructive" existence principles

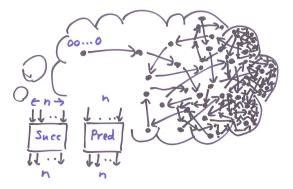
## Some syntactic classes



Johnson, Papadimitriou, and Yannakakis. How easy is local search? *JCSS*, 1988. C.H. Papadimitriou. On the complexity of the parity argument and other inefficient proofs of existence. *JCSS*, 1994.

## PPAD

**PPAD** "given a source in a digraph having in/outdegree at most 1, there's another degree-1 vertex"



The END-OF-LINE problem

given Boolean circuits S, P with n input bits and n output bits and such that  $P(0) = 0 \neq S(0)$ , find x such that  $P(S(x)) \neq x$  or  $S(P(x)) \neq x \neq 0$ .

A problem X belongs to PPAD if  $X \leq_P \text{END-OF-LINE}$ . X is PPAD-complete if in addition, END-OF-LINE< $_P X$ 

Work by myself and others: Nash equilibrium computation is PPAD-complete

...which is taken to indicate it's a hard problem! Let's see why we believe "PPAD is hard"

## PPA, PPP

### PPA: Like PPAD, but the "implicit" graph is undirected.

#### The LEAF problem

given boolean circuit C with n inputs, 2n outputs. regard input as one of  $2^n$  vertices, output as 2 neighbouring vertices. If **0** has degree 1, find some other degree-1 vertex.

PPP ("polynomial pigeonhole principle"): defined in terms of:

#### The **PIGEONHOLE** CIRCUIT problem

given boolean circuit C with n inputs, n outputs. Find *either* a bit-string that is mapped to **0**, *or* two bitstrings that are mapped to the same bit-string

### We have

- END-OF-LINE  $\leq_{p}$  LEAF (hence PPAD  $\subseteq$  PPA)
- END-OF-LINE  $\leq_p$  PIGEONHOLE CIRCUIT

END-OF-LINE reduces to PIGEONHOLE CIRCUIT:

Given S, P, circuits representing an END OF LINE instance, build a circuit  $C_{PPP}$  that does the following:

 $C_{PPP}$  uses S, P to identify any neighbours of a vertex v in the END-OF-LINE graph, then

• If v has no outgoing edge in the END-OF-LINE graph, C<sub>PPP</sub> maps v to itself.

(so all isolated vertices are mapped to themselves)

• Otherwise, let (v, w) be a directed edge in the END-OF-LINE graph.

 $C_{PPP}$  maps v to w

## Evidence of hardness

• Failure to find poly-time algorithms for most of these problems, indeed even sub-exponential algorithms.

cryptographic hardness

### • Separation oracles

Circuits viewed as proxies for unrestricted boolean functions: the search problems stay total even if the circuits in the defs are allowed to be any functions (not necessarily having small circuits)

Warm-up: in the context of END OF LINE/PPAD, if the circuits S and P were replaced with unrestricted boolean functions allowing "black-box access", the problem becomes impossible. Call this "oracle PPAD"

Now define a "PPAD machine" to be a notional machine that, given black-box access to S and P, identifies a solution... Such a machine can't used to solve oracle PPA! Paul Beame, Stephen A. Cook, Jeff Edmonds, Russell Impagliazzo, Toniann Pitassi: The Relative Complexity of NP Search Problems. *JCSS* (1998) This is ongoing work! The hardness of some of these complexity classes has been derived from various cryptographic assumptions (that are stronger than  $P \neq NP$ ).

Further question include: do we "need" any other as-yet undefined classes of TFNP problems? Can we base the hardness of (say) PPAD on weaker assumptions, ideally  $P \neq NP$ ? This is ongoing work! The hardness of some of these complexity classes has been derived from various cryptographic assumptions (that are stronger than  $P \neq NP$ ).

Further question include: do we "need" any other as-yet undefined classes of TFNP problems? Can we base the hardness of (say) PPAD on weaker assumptions, ideally  $P \neq NP$ ?

Thanks!