Average Case Complexity

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Impagliazzo's Five Worlds

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The Five Worlds of Impagliazzo

(based on "A Personal View of Average Case Complexity" by R. Impagliazzo, 1995)

1 Algorithmica:

$$P = NP$$
 (or $NP \subseteq BPP$)

- "Paradise"
- AI rules
- No secrets
- Cryptography is dead

 $P = NP \Rightarrow$ we can efficiently invert any poly-time function $f: \{0,1\}^{\ell(n)} \to \{0,1\}^n$. Given $y \in \{0,1\}^n$, non-deterministically guess an $x \in \{0,1\}^{\ell(n)}$ and check if f(x) = y, if so, output x. Since P = NP, this search can be done in polytime.

It is impossible to have cryptography without a one-way function (OWF).

Oracle: \exists an oracle O s.t. $NP^O = P^O$ [Baker, Bill, Solovay, '75].

2 Heuristica:

$$NP \neq P$$
 but $(NP, U) \subseteq AVGP$
 $NP \not\subseteq BPP$ but $(NP, U) \subseteq HEURBPP$

"Paradox": \exists hard instances of NP-Hard problems, but they are hard to find.

VLSI minimization: Given a circuit specification $C(x_1, ..., x_n)$ to compute some $f : \{0, 1\}^n \to \{0, 1\}$, we want the minimum sized circuit C_{min} s.t.

$$\forall x \in \{0,1\}^n, \ C_{min}(x) = C(x) \ .$$

In Algorithmica, we can define the predicate:

$$Check(\tilde{C}) = \begin{cases} T \text{ if } \underbrace{\forall x \ \tilde{C}(x) = C(x)}_{\in coNP = P} \\ F \text{ otherwise} \end{cases}$$

Then we find the smallest \tilde{C} s.t. $Check(\tilde{C})$, which is an NPSEARCH problem, and thus can be done in polynomial time. This approach doesn't work in Heuristica.

Open Question: Suppose $(NP, U) \subseteq \text{AvgP}$. Is then $(PH, U) \subseteq \text{AvgP}$? (cf. $P = NP \Rightarrow P = PH$).

Claim 1. $(NP, U) \in \text{HEURBPP} \Rightarrow \# \text{OWF}$

Given a candidate polytime function $f: \{0,1\}^{\ell(n)} \to \{0,1\}^n$, define

$$L = \{y | \exists x \ f(x) = y\}$$

and define $D = \{D_n\} \in PSAMP$, D_n is sampled: "Given a random x, output f(x)".

By [Impagliazzo, Levin], $(NP, U) \in \text{HeurBPP} \Rightarrow \text{Can solve any } (NP, PSAMP)$ search problem including (L, D)

3 Pessiland:

$$(NP, PSAMP) \not\subseteq HEURBPP$$
, but $\not\equiv OWF$

Is it true that $(NP, PSAMP) \nsubseteq HEURBPP \Rightarrow \exists OWF?$ We know:

$$(NP, PSAMP) \nsubseteq HEURBPP \Rightarrow \exists (BH, U) \text{ s.t. } \forall BPP \text{ type algorithm } A,$$

 $\exists \delta \text{ s.t. } A \text{ fails on } (BH, U) \text{ on } > \delta \text{ fraction of inputs.}$

Thus we can easily generate/sample hard instances for any A.

The existence of a OWF is equivalent to being able to generate hard "solved instances": suppose $f: \{0,1\}^{\ell(n)} \to \{0,1\}^n$ is a OWF, then generating algorithm:

- 1: Pick a random $x \in \{0,1\}^{\ell(n)}$
- 2: Compute $b = f(x) \in \{0, 1\}^n$
- 3: Create a SAT formula $\psi(z_1,\ldots,z_{\ell(n)}) \equiv [f(z_1,\ldots,z_{\ell(n)})=b]$ (can be done by Cook-Levin)
- 4: Output (x, ψ)

Note $\psi(x) = T$. For a random x, ψ must be hard to find witnesses for, otherwise we get a pre-image of f(x).

Suppose we have a generating algorithm $S: \{0,1\}^{r(n)} \to \{(x,\psi) \mid \psi(x) = T\}$ and it's hard to find a witness for ψ for random input to S. Define $f: \{0,1\}^{r(n)} \to \{0,1\}^{poly(n)}$, $f(z) = S(z)|_2$, the formula part of S's output. f is a OWF. If $S(z)|_2 = S(z')|_2$, $S(z')|_1$ is a satisfying assignment for f(z).

If ∄OWF (∃ a generic inverter for any polytime computable function)

- We can learn efficiently the behaviour of an unknown algorithm by observing its input/output behaviour on some sample distribution.
- We can use randomized compression to compress samplable distributions.
- More?

How to know we are in Pessiland: $(NP, U) \nsubseteq \text{HeurBPP}$, but we can invert any polytime function, $f: \{0,1\}^* \to \{0,1\}^*$.

Levin: there is a complete OWF f_{Levin} s.t.

 $\exists \, \text{OWF} \Leftrightarrow f_{Levin} \text{ is a OWF} .$

4 Minicrypt

∃ OWF, but no public key cryptography (cannot agree on a secret with a stranger using only public channels) ⇒ private-key cryptography (PRG, digital signatures, zero-knowledge, etc.)

Oracle: [Impagliazzo, Rudich]

5 Cryptomania:

Public-key crypto is possible. All sorts of privacy is possible (via math), but maybe not by the government.

- Secure e-voting
- Joint computation of secret inputs without revealing the secrets
- ...

Oracle: [Brassard]

Levin's Universal Search Algorithm

Theorem 1. Suppose $\exists t(n)$ -time algorithm A for SAT. Then the following algorithm will solve SAT in time O(t(n)): More precisely, time $2^{|A|+1} \cdot t(n)$, exponential in the size of A.

Algorithm 1 Levin-Search

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1: On input \psi(x_1, \ldots, x_n)

2: for i = 1 to \infty do

3: Run each TM M of size |M| \le i for \le 2^{i-|M|} steps

4: if any M halted with a satisfying assignment \alpha then
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5: $\mathbf{return} \ \alpha$

6: end if

7: end for

Proof. Consider prefix free encodings of TM's. Calculate the time up to and including stage i: A TM M of size |M| is run for:

$$\sum_{j=1}^{i} 2^{j-|M|} = 2^{i+1-|M|} \text{ steps}$$

Over all TM's, $|M| \leq i$, the time taken is

$$\sum_{M:|M| \le i} 2^{i+1-|M|} = 2^{i+1} \sum_{M:|M| \le i} 2^{-|M|}$$

$$\le 2^{i+1} \text{ by Kraft}$$

At stage i, M is run for $2^{i-|M|}$ steps, so the algorithm terminates at stage i_0 s.t.

$$2^{i_0-|A|} = t \Rightarrow i_0 = \log(t) + |A|$$

Thus the overall time for stage i_0 is $\leq 2^{i_0+1} = t \cdot 2^{|A|+1}$.

Levin's OWF-Complete Function

Recall that a polytime function $f: \{0,1\}^* \to \{0,1\}^*$ is called weakly one-way function (OWF) if there is some constant c > 0 such that for every polytime algorithm A, $\mathbb{P}_x[A(f(x)) \notin f^{-1}(x)] > |x|^{-c}$, i.e., every efficient inverter fails to invert f(x) on at least n^{-c} fraction of uniformly random inputs x of length n. (A strongly OWF is a polytime function f such that, for every c > 0, every polytime inverter fails at inverting f(x) on at least $1 - n^{-c}$ fraction of inputs x of length n. In the later lecture, we show that weakly OWFs can be used to construct strongly OWFs.)

Here we show that there is a particular polytime function such that it is a weakly OWF if any weakly OWF exists. So in a sense, this is a function "complete for one-wayness". This function was defined by Levin as follows.

 $f_{Levin}(y)$: "Interpret $y = \langle M, x \rangle$ where $|M| \leq \log |x|$. Run M on x for $\leq |y|^3$ steps. If M terminates, output $\langle M, M(x) \rangle$. Otherwise, output \perp ."

Claim 2. If there exists a OWF, then f_{Levin} is a weakly OWF.

Proof. Suppose g is a (weakly) OWF. Without loss of generality, g is computable in time $O(n^2)$ on inputs of size n. (If g takes time n^c , define a new function g'(a,x) = (a,g(x)), where $|a| = |x|^c$. Then g' is computable in linear time. Also, g' is OWF if g is. Suppose not. Let I be an inverter for g' that succeeds on at least p fraction of random inputs a, x to g'. We'll use I to invert g: "Given g = g(x) (for a random g(x)), pick random g(x)0 (of appropriate length), and run g(x)1." Then this algorithm inverts g(x)2 with probability at least g(x)3, where the probability is over uniform input g(x)4, as well as the internal randomness of the algorithm.)

Let $y = \langle M_g, x \rangle$ for random x, then $f_{Levin}(y) = \langle M_g, g(x) \rangle$. We know any polytime algorithm inverting g fails with probability $> \frac{1}{|x|^c}$ for some c, given |x| is large enough. Thus any inverter for f_{Levin} must fail on y with probability $> \frac{1}{|x|^c}$. But inputs to f_{Levin} of the form $\langle M_g, x \rangle$ have density $\geq 2^{-|M_g|} \sim \frac{1}{|x|}$, so any inverter for f_{Levin} must fail on a random input with probability $> \frac{1}{|x|^{c+1}}$.