Isomorphism Problems and Minimum Circuit Size

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Characters:

- (1) Graph Isomorphism and generalizations
- (2) Minimum Circuit Size and related problems

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Given:  $\omega_0, \omega_1 \in \Omega$ Question:  $(\exists h \in H) h(\omega_0) = \omega_1$  ?

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Instantiations:

Isomorphism Problem	Н	Ω
Discrete Log	$\mathbb{F}_{p}$	$\mathbb{F}_{p}$
Graph Isomorphism	S <sub>n</sub>	graphs with <i>n</i> vertices
Linear Code Equivalence	Sn	subspaces of $\mathbb{F}_q^n$
Permutation Group Conjugacy	Sn	subgroups of $S_n$
Matrix Subspace Conjugacy	$\operatorname{GL}_n(\mathbb{F}_q)$	subspaces of $\mathbb{F}_q^{n  imes n}$

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### Breaking Pseudorandom Generators

A pseudorandom generator is an efficient deterministic algorithm PRG such that  $PRG(U_{\ell})$  looks like  $U_r$  for  $\ell \ll r$ .

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"Hard" problems underlying PRG constructions that fool circuits/efficient programs reduce to MCSP/MKTP.

PRG construction of [Hastad Impagliazzo Levin Luby] based on one-way functions.

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**Lemma:** There exists a polynomial-time probabilistic Turing machine M using oracle access to MCSP/MKTP so that the following holds. For any circuit C of size n, if  $\sigma \sim \{0,1\}^n$  and then

 $\Pr[C(\tau) = C(\sigma)] \ge 1/\operatorname{poly}(n) \text{ with } \tau \doteq M(C, C(\sigma)).$ 

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 $C(\tau) = \sigma(G_0)$  means  $\tau^{-1} \circ \sigma$  is an isomorphism from  $G_0$  to  $G_1$ .

Yieds randomized reduction from Graph Isomorphism to  $\rm MCSP/MKTP$  without false positives [Allender Das].

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Question: How to eliminate errors?

Suffices to obtain reductions without false negatives.

Approach: Use MCSP/MKTP to *verify* witnesses of nonisomorphism.

Let  $G_0$ ,  $G_1$  be *rigid* graphs, *i.e.*, no non-trivial automorphisms.

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Key fact: if  $G_0 \equiv G_1$ , there are only n! distinct graphs among permutations of  $G_0$  and  $G_1$ ; if  $G_0 \not\equiv G_1$ , there are 2(n!).

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Key fact: if  $G_0 \equiv G_1$ , there are only n! distinct graphs among permutations of  $G_0$  and  $G_1$ ; if  $G_0 \neq G_1$ , there are 2(n!).

Consider sampling  $r \sim \{0, 1\}$  and  $\pi \sim S_n$  uniformly, and outputting the adjacency matrix of  $\pi(G_r)$ .

- If  $G_0 \equiv G_1$ , this has entropy  $s \doteq \log n!$
- If  $G_0 \not\equiv G_1$ , this has entropy s+1

Main idea: Use  $\operatorname{KT-complexity}$  of a random sample as a proxy for entropy.

Let 
$$y = \pi(G_r)$$
,  $\pi \sim S_n$ ,  $r \sim \{0, 1\}$ .

Hope: KT(y) is typically near the entropy, never much larger:



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where  $s = \log(n!)$ 

Witness nonisomorphism by checking  $KT(y) > \theta$ .

Let 
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Implies that  $\operatorname{KT}(y)/t \leq s + o(1)$  for sufficiently large  $t = \operatorname{poly}(n)$ .

## Entropy Estimator

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**Corollary:** KT(y)/t is a probably approximately correct (PAC) underestimator for the entropy.

### Witnessing Graph Nonisomorphism

Let 
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Reality: KT(y)/y is typically near the entropy, never much larger:



where  $s = \log(n!/|\operatorname{Aut}(G_i)|)$  (assumed the same for  $i \in \{0, 1\}$  for ease of exposition).

Witness nonisomorphism by checking  $KT(y)/t > \theta$ .

## Witnessing Graph Nonisomorphism

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Using entropy estimator yields randomized reduction with two-sided error (from which false positives can be eliminated using known search-to-decision for Graph Isomorphism).

## Witnessing Graph Nonisomorphism

It suffices to give a probably approximately correct (PAC) overestimator for  $\theta$ :



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## Witnessing Graph Nonisomorphism

It suffices to give a probably approximately correct (PAC) overestimator for  $\theta$ :



Equivalently, it suffices to give a PAC *under*estimator for  $\log |\operatorname{Aut}(G_i)|$ , since  $\theta = \log(n!) - \log |\operatorname{Aut}(G_i)|$ .

# PAC Underestimating $\log |Aut(G)|$

**Claim.** There is an efficient randomized algorithm using MKTP to PAC underestimate  $\log |Aut(G)|$  when given *G*.

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*Proof.* Recall that there is an efficient deterministic algorithm using an oracle for Graph Isomorphism that computes generators for Aut(G).

Plug in an existing RP<sup>MKTP</sup> algorithm for the oracle. This gives us generators for a subgroup  $A \leq Aut(G)$  such that A = Aut(G) with high probability.

|A| can be computed efficiently from its generators. Output log |A|.

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**Theorem:** Graph Isomorphism is in ZPP<sup>MKTP</sup>.

Isomorphism Problem with underlying action  $(H, \Omega)$ :

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Given:  $\omega_0, \omega_1 \in \Omega$ Question:  $(\exists h \in H) h(\omega_0) = \omega_1$  ?

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Use  $y = h_1(\omega_{r_1}) \cdots h_t(G_{r_t})$  where  $h_i \sim H$  and  $r_i \sim \{0, 1\}$ .

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Need:

- Encoding of the cosets of Aut(ω) that achieves KT-complexity close to the entropy s.
- ► Efficiently compute |*H*|.
- PAC underestimator for |Aut(ω)| that is efficiently computable with access to MKTP.

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Proof based on hashing with linear-algebraic family.

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Example: *C* computes a random permutation of a graph *G* on *n* vertices. Each permutation of *G* can be decoded from a string of length  $s + \log s + O(1)$ , where  $s = \log(n!/|\text{Aut}(G)|)$ .

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**Corollary:** If y is the concatenation of t independent samples from a samplable distribution p then for any sufficiently large polynomial t, KT(y)/t is a PAC underestimator for the entropy of p with deviation  $\Delta + o(1)$  where  $\Delta = \text{max-entropy} - \text{min-entropy}$  of p.

## PAC Underestimating $\log |Aut(\omega)|$

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Approach: Efficient procedures with access to  $\operatorname{MKTP}$  to compute:

(a) A list L of elements of H that generates a subgroup  $\langle L \rangle$  of Aut( $\omega$ ) such that  $\langle L \rangle = Aut(\omega)$  with high probability.

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(b) A PAC underestimator for  $\log |\langle L \rangle|$ .

## Finding Generators for $Aut(\omega)$

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# Finding Generators for $Aut(\omega)$

Use the power of  $\ensuremath{\operatorname{MKTP}}$  to invert circuits on average.

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Let C be a circuit that samples a random h and outputs  $h(\omega)$ .

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Use the power of MKTP to invert circuits on average.

Let C be a circuit that samples a random h and outputs  $h(\omega)$ . Consider sampling h' uniformly from H, and running  $M(C, h'(\omega))$ On success, we get h so that  $h(\omega) = h'(\omega)$ , *i.e.*,  $h^{-1}h' \in Aut(\omega)$ In fact, conditioned on M's success,  $h^{-1}h'$  is *uniform* on  $Aut(\omega)$ Only polynomially-many trials are needed to obtain a full set of generators with high probability.

By the Entropy Estimator Corollary, it suffices to show how to sample almost uniformly from  $\langle L \rangle$  using a small circuit *without access to* MKTP.

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[Erdős Rényi] showed that every finite group has such a generating set of size poly(log  $|\Gamma|$ ), and [Babai] gave an efficient randomize algorithm to find one with overwhelming probability. This gives the required circuit.

# Generic Result

**Theorem.** Let Iso be an Isomorphism Problem satisfying the following conditions:

The action (h, ω) → h(ω), products and inverses in H, and |H| can be computed efficiently.

- ► The uniform distribution on *H* can be sampled efficiently.
- There is an efficiently computable complete invariant for *H*.
- There is an efficiently computable complete invariant for Ω.

Then  $Iso \in \mathsf{ZPP}^{MKTP}$ .

Under mild conditions any Isomorphism problems reduces to  $\rm MKTP$  under randomized reductions with zero-sided error.

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Thanks!