Hardness Magnification for all Sparse NP Languages

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"Hardness Magnification"

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("Gap-MKtP[a, b]": distinguish between $Kt(x) \le a$ and $Kt(x) \ge b$)

If Gap-MKtP[m^{10} , $m^{10} + O(m)$] **doesn't have** n^3 polylog *n*-size (De Morgan) Formulas, then **EXP** $\not\subset$ **NC**¹.

(Oliveira-Pich-Santhanam'19)

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Similar magnification results for MKtP (Minimum time-bounded Kolmogorov Complexity, Kt(x)) Kt(x) = "measure of how much info needed to generate x quickly" oroolo gotoo MKtP ≈ MCS^Ditb (Other Hardness Magnification Results) $n^{1-\varepsilon}$ -approximate Clique [Sri'03] ("Gap-MKtF $\geq b$) Average-case MCSP [OS'18] k-Vertex-Cover [OS'18] If Gap-MKtF n-size low-depth circuit LBs for NC¹ [AK'10,CT'19] (De Morgan sublinear-depth circuit LBs for P [LW'13] nam'19)

Suggests new approaches to proving strong lower bounds?





It is argued that HM can bypass the **Natural Proof Barrier** [Razborov-Rudich]



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- A real theorem [CHOPRS to appear in ITCS'20] In some cases, the required weak LB actually implies the *non-existence* of natural proofs

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[OPS'19]

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[OPS'19]

We know how to prove $n^{1.99}$ -size formula lower bound for Gap-MKtP ! [OPS'19]

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Can we improve it by a factor of $n^{1+\varepsilon}$?

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Formula-⊕: De Morgan Formulas where each leaf node computes XOR of a subset of input bits

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Known LB against Formula- \oplus (Tal'16) : F_2 -Inner-Product \notin Formula- $\oplus \left[\frac{n^2}{polylog n}\right]$

Stronger LB than required

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Can we adapt the proof techniques to Gap-MKtP?

Weak LB

Strong LB

Magnification

Suggests new approaches to proving strong lower bounds? Indicates proving "weak" lower bounds are even harder than previously thought??



• Hardness magnification:

Proving *almost-linear size lower bounds* is already as hard as proving *super-polynomial lower bounds*...

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What is special about MCSP and MKtP? Is it because they are "compression" problems?

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Our result: Hardness magnification holds for all sparse NP languages!

Theorem 1:

- Let *L* be **any** $2^{n^{o(1)}}$ -sparse NP language.
- If L doesn't have $n^{1.01}$ -size circuits, then for all k, NP $\not\subset$ SIZE $[n^k]$.

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Similar results for other models!

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- Compared with [MMW'19]: Our techniques yield weaker consequences (e.g. they get $NP \not\subset P/poly$), but apply to more restricted models.
- (Best known formula LB: n^3 /polylog n) [Håstad 90s, Tal] (Best known branching program LB: n^2 /polylog n) [Nečiporuk 60s]

(Input length $n = 2^m$)

Theorem 2:

If MCSP[m^{10}] doesn't have n^3 polylog *n*-size (De Morgan) Formulas, then **PSPACE** $\not\subset$ (nonuniform) **NC**¹.

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Similar results for MKtP[m^{10}] and EXP $\not\subset$ NC¹ (improving upon [OPS'19] which required lower bounds for Gap-MKtP)

Algorithms with small non-uniformity

Theorem 3:

Let *L* be a $2^{n^{0(1)}}$ -sparse NP language not computable by an $n^{1.01}$ -time $n^{0.01}$ -space deterministic algorithm with $n^{0.01}$ bits of advice, then NP $\not\subset$ SIZE $[n^k]$ for all *k*.

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The hypothesis is "close" to what we can prove!

There is a $(2^{n^{0.01}} \cdot n)$ -sparse language $L \in \text{DTIME}[\tilde{O}(n^{1.01})]$, not computable by an $n^{1.01}$ -time deterministic algorithm with $n^{0.01}$ bits of advice.

(Adaptation of time hierarchy theorem)

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Can we make it sparser?

Let *L* be **any** $2^{n^{o(1)}}$ -sparse NP language. • If *L* doesn't have $n^{3.01}$ -size formulas, then **for every** *k*, NP **doesn't have** n^k -size formulas.

Assume: **NP** has n^k -size formulas for some k.

Intuition

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Goal: Design $n^{3.01}$ -size formulas for $2^{n^{o(1)}}$ -sparse NP language L.



(Sparse) $L \cap \{0,1\}^n$

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Set $t \coloneqq n^{0.001/k} > \log$ (Sparsity of *L*).

Standard hashing tricks imply:

There is a hash function $H_s: \{0,1\}^n \to \{0,1\}^{O(t)}$ that is

- Perfect: maps YES-instances of *L* into *distinct* images
- described by an O(t)-bit seed s
- linear over \mathbf{F}_2

(there is a "correct" seed s that makes the hash function H_s perfect)

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(Construction: pick some coordinates from the Error Correcting Code)

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Define an O(t)-input auxiliary NP problem K ("kernel problem"):

Input: Hash seed *s*, hash value *h*, index $i \in [n]$ **Output:** The *i*-th bit of **some** $x \in L$ such that $H_s(x) = h$.

For the "correct" *s*, this *x* is *unique*

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NP has n^k -size formulas $\Rightarrow K$ has formulas of size $n^{0.001}$! On input (s, h, i), guess (x, y), where y witnesses $x \in L$. Accept $\Leftrightarrow x_i = 1$ and $H_s(x) = h$.

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Claim: for the "correct" *s*, the following decides L:

On input $x \in \{0,1\}^n$, accept iff: $\forall i \in [n], K(s, H_s(x), i) = x_i$

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Thank you!