NP with Small Advice

Lance Fortnow
Department of Computer Science
University of Chicago
Chicago, IL 60637
fortnow@cs.uchicago.edu

Adam R. Klivans* Department of Computer Science The University of Texas at Austin Austin, TX 78712 klivans@cs.utexas.edu

Abstract

We prove a new equivalence between the non-uniform and uniform complexity of exponential time. We show that $\mathsf{EXP} \subseteq \mathsf{NP}/\mathsf{log}$ if and only if $\mathsf{EXP} = \mathsf{P}^{\mathsf{NP}}_{||}$. Our equivalence makes use of a recent result due to Shaltiel and Umans showing EXP in $\mathsf{P}^{\mathsf{NP}}_{||}$ implies EXP in $\mathsf{NP}/\mathsf{poly}$.

1. Introduction

Let A and B be uniform complexity classes such that $B \subseteq A$. If A seems much "larger" than B then it is often the case that we can prove that B is *strictly* contained in A, e.g. let B = P and A = EXP. Is the same true if we consider a *non-uniform* analogue of B? That is to say, augment B by giving it access to some advice string b such that b depends only on the length of x; can we still separate A from B/b? If not, can we derive interesting consequences on A if it is contained in B/b, i.e. can we show that A collapses to some smaller complexity class?

These questions are of central importance in computational complexity theory, particularly in the area of derandomization, where both separations of uniform from non-uniform classes or collapses of uniform classes have important consequences:

Separations

 It is known that if EXP cannot be computed by nondeterministic polynomial-size circuits then it is possible to obtain similar derandomizations of AM [18, 21, 25]. Shaltiel and Umans [24] were the first to prove that if EXP

NP/poly then AM ⊆ NSUBEXP for infinitely many input lengths.

Collapses

Perhaps less well known than the above derandomizations are equally important results showing that uniform complexity classes such as EXP or NEXP collapse if they are contained in smaller, non-uniform classes:

- Babal et al. [2] showed that EXP ⊆ P/poly implies that EXP = MA, improving on work due to Meyer [17] who first proved that EXP ⊆ P/poly implies EXP = Σ₂^p.
- Impagliazzo et al. [13] improved the above collapse and showed that NEXP ⊆ P/poly if and only if NEXP = EXP = MA. This result is crucial to Kabanets and Impagliazzo's breakthrough paper [15] showing that derandomizing BPP implies proving circuit lower bounds.

If we pay particular attention to MA, then the above separations and collapses match up nicely— if $\mathsf{EXP} \subseteq \mathsf{P/poly}$ then EXP collapses to MA, and if $\mathsf{EXP} \not\subset \mathsf{P/poly}$ then MA can be derandomized (and will be contained in $\mathsf{NSUBEXP}$).

The same is not true, however, for AM. Separating EXP from NP/poly implies that AM is contained in non-deterministic, sub-exponential time [24]. Placing EXP \subseteq NP/poly, however, implies only that EXP $= \Sigma_3^P$, the third level of the polynomial-time hierarchy¹.

Is it true that $\mathsf{EXP} \subseteq \mathsf{NP/poly}$ implies that $\mathsf{EXP} = \mathsf{AM}$? If so, combining this fact with the above deran-

 $[\]ast$ Work done while visiting the Toyota Technological Institute at Chicago.

¹ Actually one can prove that under the assumption that $\mathsf{EXP} \subseteq \mathsf{NP/poly}$, $\mathsf{EXP} \subseteq \mathsf{ZPP}^{\Sigma_2^\mathsf{P}}$ [7]

domization of AM [24] would yield a rare unconditional derandomization of AM, namely that AM is contained in Σ_2 – SUBEXP, the subexponential time analogue of Σ_2^P (AM is currently only known to be in Π_2^P)—see Gutfreund et al. [12] for a discussion. Shaltiel and Umans [25] have asked if EXP \subseteq NP/log implies that EXP = AM, as even this is not known.

1.1. Our Results

We give a new collapse for exponential time if it is computed by a nondeterministic, slightly non-uniform complexity class. More precisely we show that if $\mathsf{EXP} \subseteq \mathsf{NP}/\log$ then $\mathsf{EXP} = \mathsf{P}^{\mathsf{NP}}_{||}$, i.e. EXP is computed by a polynomial-time turing machine with non-adaptive access to an NP -oracle. Further, we can also prove the converse:

Theorem 1 The following are equivalent.

1.
$$\mathsf{EXP} \subseteq \mathsf{P}^\mathsf{NP}_\mathsf{II}$$

2.
$$EXP \subseteq NP/\log$$

The forward direction of our equivalence makes use of a new hardness amplification result due to Shaltiel and Umans. They prove that if EXP $\not\subset$ NP/poly then EXP $\not\subset$ PNP/poly. The contrapositive gives a partial collapse of exponential time which we show how to strengthen via a non-standard method of computing advice. As a result we obtain EXP \subseteq PNP implies EXP \subseteq NP/log, improving on the conclusion EXP \subseteq AM/log obtained by Shaltiel and Umans [25].

The backwards direction requires two collapses. First we prove that if $EXP \subseteq NP/\log$ then $EXP = P^{NP}$, and then we use the fact that the ODDMAXBIT function is complete for P^{NP} to show how the above advice strings can be computed and verified non-adaptively.

We also prove variations of Theorem 1 for other classes.

Theorem 2 The following are equivalent.

$$\textit{1.} \; \mathsf{PSPACE} \subseteq \mathsf{P}^{\mathsf{NP}}_{||}$$

2. PSPACE
$$\subseteq$$
 NP/ \log

Theorem 3 The following are equivalent.

1.
$$P^{\#P} \subseteq P_{||}^{NP}$$

2.
$$P^{\#P} \subseteq NP/\log$$

Is it possible to prove something similar to Theorem 1 for NEXP? We show that, in fact, such a statement is vacuously true for NEXP since one can separate NEXP from NP/log outright via diagonalization

(it is also known that NEXP $\not\subset P_{||}^{NP}$ [11]). We can consider, however, the consequences of NEXP being contained in randomized complexity classes that take advice (such classes have been a focus of research interest as of late [4, 10]). We observe that the techniques of Impagliazzo et al. [13] can be used to prove that NEXP \subseteq BPP/log implies NEXP = BPP, strengthening a result of Trevisan and Vadhan [27].

1.2. Related Work

The first important collapse of a uniform class contained in a non-uniform class is due to Karp and Lipton [17] who showed that $NP \subseteq P/poly$ implies that $PH = \Sigma_2^P$ and that $NP \subseteq P/log$ implies P = NP. For exponential time, aside from the collapse results mentioned above due to Babai et al. [2] and Impagliazzo et al. [13], Buhrman and Homer [8] showed that if $EXP^{NP} \subseteq EXP/poly$ then $EXP^{NP} = EXP$ and Buhrman, Fortnow, and Pavan [7] showed a weak relativization of Impagliazzo et al. [13], namely that for any $A \in EXP$, $NEXP^A \subseteq P^A/poly$ implies $NEXP^A \subseteq P^A/poly$ implies

Buhrman, Chang and Fortnow [6] give an equivalence of a non-uniform collapse to NP and a uniform inclusion.

Theorem 4 (Buhrman-Chang-Fortnow) The following are equivalent.

- 1. $coNP \subseteq NP/1$
- 2. The polynomial-time hierarchy collapses to D^p

where D^p is the set of languages that are the difference of two NP languages.

Buhrman, Chang and Fortnow also generalize Theorem 4 to show that coNP in NP/k if and only if the polynomial-time hierarchy collapses to the 2^k th level of the Boolean hierarchy where the first level of the Boolean hierarchy is NP and the i+1st level is the set of differences of sets in NP and the sets in the ith level.

This extension only works for finite k but Buhrman, Fortnow and Chang conjecture that it extends to $k = O(\log n)$

Conjecture 5 (Buhrman-Chang-Fortnow) The following are equivalent.

- 1. $coNP \subseteq NP/\log$
- 2. The polynomial-time hierarchy collapses to $\mathsf{P}_{||}^{\mathsf{NP}}$

Since EXP in NP/poly implies EXP $\subseteq \Sigma_3^P$ [1, 29], Theorem 4 implies EXP \subseteq NP/1 if and only if EXP = D^p. Likewise Conjecture 5 implies Theorem 1 so we can view our Theorem 1 as a partial resolution of Conjecture 5.

2. Preliminaries

2.1. Complexity Classes

We assume the reader is familiar with complexity classes $\mathsf{P} = \cup_k \mathsf{DTIME}(n^k)$, $\mathsf{NP} = \cup_k \mathsf{NTIME}(n^k)$, $\mathsf{EXP} = \cup_k \mathsf{DTIME}(2^{n^k})$, $\mathsf{NEXP} = \cup_k \mathsf{NTIME}(2^{n^k})$, $\mathsf{PSPACE} = \cup_k \mathsf{DSPACE}(n^k)$ as well as notions of oracle turing machines and the polynomial-time hierarchy (see e.g. [3] for further explanations).

The non-uniform class NP/log is the set of languages L such that there exists a language A in NP and a function $a: \mathcal{N} \to \Sigma^*$ with $|a(n)| = O(\log n)$ such that for all x in Σ^* , x is in L if and only if (x, a(|x|)) is in A. NP/poly has the same definition except that we allow $|a(n)| = O(n^k)$ for some k. Similarly NP can be replaced with any machine based complexity class, e.g. BPP/log is the set of languages accepted by a BPP machine augmented with an advice string of length $O(\log n)$ which depends only on the input length.

The class P^{NP} consists of the languages accepted in polynomial-time with oracle access to some NP language. Since SAT, the set of satisfiable Boolean formula, is NP-complete, we can use SAT as the oracle language. We will make use of the following theorem giving a natural complete language for P^{NP}:

Theorem 6 (Krentel [19]) Let $\phi(x_1, \ldots, x_n)$ be a Boolean formula. Let a be the lexicographically smallest satisfying assignment for ϕ , if there is one. The problem of determining whether the nth bit of a is equal to one is many-one complete for P^{NP} .

The above language is often referred to as ODD-MAXBIT.

The class $\mathsf{P}_{||}^{\mathsf{NP}}$ (sometimes written $\mathsf{P}_{tt}^{\mathsf{NP}}$) is the set of languages accepted in polynomial-time with non-adaptive oracle access to SAT; in other words all queries must be made before any the oracle returns any answers.

2.2. Randomized Classes

We also assume the reader is familiar with randomized complexity classes such as BPP and MA, the set of languages accepted by a Merlin-Arthur game where on input x, Merlin, the prover, sends a single message y and Arthur (the verifier) probabilistically verifies the purported proof y to determine membership of x. AM is the set of languages accepted by an Arthur-Merlin

game where on input x, Arthur sends a random challenge r to Merlin who responds with y; Arthur then probabilistically verifies y to determine acceptance of x (see the survey by Kabanets [14]).

2.3. Alternation and Games

We will make use of the characterization of PSPACE due to Chandra, Kozen, and Stockmeyer as a game [9]. Chandra et al. showed that PSPACE is equivalent to the following two person game: on input x, players alternate announcing bits for a polynomial number of rounds and a polynomial-time computable judge chooses a winner based on x and the announced bits:

Theorem 7 (Chandra-Kozen-Stockmeyer) A language L is in PSPACE if there exists a polynomial-time relation R on 2k + 1 strings where $k = n^{O(1)}$ and players P_1 and P_2 such that

- On round i for i odd, P_1 takes as input x and all strings from previous rounds and ouputs string x_i .
- On round j for j even, P_2 takes as input x and all strings from previous rounds and outputs string y_j .
- After k rounds, the input x is in the language L if and only if $R(x, x_1, y_1, x_2, y_2, \dots, x_k, y_k)$ is true.

Furthermore, each player P_i requires only PSPACE to output his/her string for each round. Hence we say each player has a *strategy* computable in PSPACE.

3. The Proof

In this section we give the proof of Theorem 1 showing the following are equivalent:

- 1. $EXP \subset NP/log$
- 2. $\mathsf{EXP} \subset \mathsf{P}^\mathsf{NP}_\mathsf{II}$

We use the following nice result of Shaltiel and Umans [25]:

Theorem 8 (Shaltiel-Umans) *If* $EXP \subseteq P_{||}^{NP}/poly$ *then* $EXP \subseteq NP/poly$.

The proof of the above theorem makes use of the fact that EXP has a low-degree extension f, and if this extension is computable in $\mathsf{P}^{\mathsf{NP}}_{||}$ then for each query q made by the oracle-machine, one can give an advice p equal to the fraction of x's resulting in a q(x) which should be answered as true by the NP oracle. For any x, it then suffices to choose a random low-degree curve through x and guess witnesses for a p fraction of points on this curve.

Proof of Theorem 1:

 $(2 \Rightarrow 1)$

Fix an EXP-complete language L. By Theorem 8, L is in NP/poly. Fix the appropriate NP-machine M and let a_n be the lexicographically smallest advice string such that for all x of length n, x is in L iff $M(x,a_n)$ accepts.

Fix n. Let b_i be the ith bit of a_n . We can compute b_i in time exponential in n so by assumption computing b_i is in $\mathsf{P}^{\mathsf{NP}}_{||}$. Let Q_i be the set of queries to SAT made by the $\mathsf{P}^{\mathsf{NP}}_{||}$ algorithm to compute b_i . Let $Q = \bigcup_i Q_i$. Let r be the number of formulas in Q that are satisfiable. r is our $O(\log n)$ bits of advice.

Our NP/log algorithm works as follows on input x of length n: guess a subset S of r formulas in Q and guess and verify their satisfying assignments. For each i, simulate the $P_{\parallel}^{\text{NP}}$ algorithm to compute b_i answering each query yes if it is in S and no otherwise. From the b_i 's we now have a_n . Now output $M(x, a_n)$.

 $(1 \Rightarrow 2)$

This direction follows by combining the following two lemmas:

Lemma 9 If $EXP \subseteq NP/\log then \, EXP \subseteq P^{NP}$. **Lemma 10** If $P^{NP} \subseteq NP/\log then \, P^{NP} = P^{NP}_{||}$.

Proof of Lemma 9:

It is known that if EXP is in NP/log then EXP = PSPACE. This follows, for example, from the fact that if EXP \subset PA/poly then EXP \subseteq MAA, i.e. a relativized version of a collapse due to Babai et al. observed by Buhrman et al. [2, 7]. Choosing A = NP places EXP \subseteq MANP \subseteq PSPACE.

By Theorem 7, we can view PSPACE as a interactive game between two players and a polynomial-time computable judge (recall each player's strategy is computable in PSPACE and thus NP/log by assumption). Let L be a PSPACE-complete language and fix an input x. We will give an P^{NP} algorithm to determine whether x is in L.

Let T be the set of all $n^{O(1)}$ advice strings and let M be the NP advice taking machine deciding L. For each advice string $a \in T$, simulate M(x, a) and divide T into two groups labeled IN and OUT depending on whether M(x, a) accept or rejects. Since one advice string gives the correct answer, if either IN or OUT is empty then we know whether x is in L. This simulation can be carried out in P^{NP} .

Otherwise, IN and OUT are both non-empty. Do the following for each pair of advice strings a_i and a_o where

 a_i is chosen from IN and a_o is chosen from OUT: simulate players P_1 and P_2 where P_1 's strategy is computed using advice a_i and P_2 's strategy is simulated using advice a_o . Since each strategy is in PSPACE \subseteq NP/log, the entire simulation is computable in P^{NP}.

Since some advice string a is the correct advice string, either a will be in IN and P_1 using this advice will defeat P_2 using any advice from OUT or vice versa. If the good advice string is in IN (and hence causes P_1 to always beat P_2), then we know x is in L and we will accept correctly. If we discover a to be in OUT we reject.

Proof of Lemma 10:

From Theorem 6, we know that the ODDMAXBIT language consisting of the set of formulas whose lexicographically minimum satisfying assignment sets the last variable to true is complete for P^{NP} . Hence, it suffices to give a $\mathsf{P}^{\mathsf{NP}}_{||}$ algorithm for deciding ODDMAXBIT.

Given a formula ϕ of n variables, let a_i be the setting of the ith variable in the minimum satisfying assignment ($a_i = 0$ if there is no satisfying assignment). We can compute a_i in P^{NP} and thus in NP/log. Hence, given the correct advice we can compute a_i with one query to NP.

For each possible advice string b, we compute a_1, \ldots, a_n via n parallel queries to NP (we can do this since each bit is computable by assumption by one independent query to NP). Given all of these purported minimum assignments, we find the lexicographically minimum assignment a' that satisfies ϕ . Since at least one advice is correct a' is the minimum satisfying assignment and the last bit of a' gives us the answer to the ODDMAXBIT question.

3.1. Extending the Proof to PSPACE and $P^{\#P}$

The proof of Theorem 8 in Shaltiel and Umans [25] extends to PSPACE and $P^{\#P}$.

Theorem 11 (Shaltiel-Umans) If PSPACE is in P $_{||}^{NP}$ then PSPACE is in NP/poly. If P $_{||}^{\#P}$ is in P $_{||}^{NP}$ then P $_{||}^{\#P}$ is in NP/poly.

To prove Theorem 2 note that the proof of Theorem 1 goes through directly using PSPACE instead of EXP.

To prove Theorem 3 that P^{HP} is in $\mathsf{P}^{\mathsf{NP}}_{||}$ if and only if P^{HP} is in NP/\log we need a little more work. To show the "if" direction we first need the following lemma.

Lemma 12 If $P^{\#P}$ is in NP/poly then for every L in $P^{\#P}$ there exists an NP machine M and a sequence of advice strings a_1, \ldots where

- 1. For all x, x is in L if and only if $M(x, a_{|x|})$ accepts,
- 2. For all n, $|a_n|$ is bounded by a fixed polynomial in n, and
- 3. The language $D = \{1^n0^i \mid \text{the ith bit of } a_n \text{ is one}\}$ is in $P^{\#P}$.

Proof:

Valiant [28] showed that Permanent (computing the *i*th bit of the permanent of a given 0-1 matrix) is Turing-complete for $P^{\#P}$. Similar to EXP, if the Permanent is in $P^A/poly$ then the Permanent is in MA^A [2, 7]. Setting A = SAT we have Permanent in the polynomial-time hierarchy.

Let L be in $P^{\#P}$ and let M be an NP machine such that there exists a sequence of polynomially-long advice strings b_1, \ldots where x in L if and only if $M(x, b_{|x|})$ accepts. Consider the language D consisting of the strings 1^n0^i where the ith bit of the lexicographically least advice that computes L correctly on all inputs on length n is one. We can define D with a few quantifiers over L and L is reducible to the permanent which is in the polynomial-time hierarchy. This puts D in the polynomial-time hierarchy and thus in $P^{\#P}$ because of Toda's theorem [26] that every language in the polynomial-time hierarchy is in $P^{\#P}$.

We can now prove that $P^{\#P}$ in $P_{||}^{NP}$ implies $P^{\#P}$ in NP/\log using the same techniques as the proof of Theorem 1 using Theorem 11 and Lemma 12.

Since $P^{NP} \subseteq P^{\#P}$, the other direction of Theorem 3 follows from the appropriate analog of Lemma 9.

Lemma 13 If
$$P^{\#P} \subseteq NP/\log then P^{\#P} \subseteq P^{NP}$$
. **Proof:**

Fix a $\mathsf{P}^{\#\mathsf{P}}$ complete language L. If L is in NP/\log then L is in Σ_3^p , the third level of the polynomial-time hierarchy [20, 29]. We can view Σ_3^p as a three round game between two players and a polynomial-time judge. Each player's strategy is computable in the polynomial-time hierarchy and thus in $\mathsf{P}^{\#\mathsf{P}}$ by Toda [26]. We can now show L is in P^{NP} by the same argument as the proof of Lemma 9.

4. On the Non-Uniform Complexity of NEXP

We would like to to extend the equivalence in Theorem 1 to hold for NEXP. We can do so, but the equivalence holds vacuously in the sense that NEXP is not

contained in either class. Fu, Li and Zhong [11] showed that $NEXP \nsubseteq P_{||}^{NP}$. This result and Theorem 1 does not immediately imply that NEXP is not contained in NP/\log since we do not know how to directly show NEXP in NP/\log implies NEXP = EXP. Instead we prove the separation directly.

Theorem 14 NEXP $\not\subset$ NP/ log.

Proof:

Assume by way of contradiction that $NEXP \subseteq NP/\log$. Then by a padding argument, $NEEXP \subseteq NEXP/poly$. I.e. non-deterministic doubly exponential time is contained in a non-uniform analogue of NEXP. But now we apply the assumption that $NEXP \subseteq NP/\log$ again and obtain $NEEXP \subseteq NP/poly$. Via a standard diagonalization argument one can show that even EEXP, deterministic doubly exponential time, does not have non-deterministic polynomial-size circuits. This is because in doubly exponential time we can enumerate over all say quasipolynomial-size non-deterministic circuits.

Roy [23] improves Theorem 14. First need we need the following result by Buhrman [5].

Theorem 15 (Buhrman)

$$\mathsf{EXP}^{\mathsf{NP}}_{||}\subseteq \mathsf{NEXP/poly}.$$

Proof:

Fix an EXP machine M and let Q_n be the union of the set of all queries to SAT made by M(x) on all x of length n. Our advice a_n is $|Q \cap \mathsf{SAT}|$.

Our NEXP machine on input x and advice $a_{|x|}$ works as follows: Compute $Q_{|x|}$ and guess which of the $a_{|x|}$ formula are satisfiable and guess their satisfying assignments. If the advice is correct and we have guessed the assignments then we know which queries made by M(x) are satisfiable and we just simulate M(x) with those answers.

Theorem 16 (Roy)

$$\mathsf{NEXP} \not\subseteq \mathsf{P}^\mathsf{NP}_{||}/\log$$
.

Proof:

Assume NEXP $\subseteq P_{||}^{NP}/\log$. By padding we have NEE $\subseteq EXP_{||}^{NP}/poly$ where NEE $= NTIME(2^{2^{O(n)}})$. By Theorem 15 and the assumption we have

$$\mathsf{NEE} \subseteq \mathsf{EXP}_{||}^{\mathsf{NP}}/\mathsf{poly} \subseteq \mathsf{NEXP}/\mathsf{poly} = \mathsf{P}_{||}^{\mathsf{NP}}/\mathsf{poly}$$

and thus NEE has polynomial-size circuits with NP gates. However $\Sigma_4^{\mathsf{E}} \subseteq \mathsf{NEE}$ cannot have polynomial-size circuits with NP gates using diagonalization techniques due to Kannan [16].

4.1. NEXP versus randomized, non-uniform classes

In light of the fact that NEXP is known to not be in NP/log, it seems natural to consider the consequences of NEXP being contained in BPP/log or MA/log. Separating NEXP from BPP is an outstanding open question; we prove this would also imply NEXP is not contained in BPP/log (for a definition and discussion of BPP with advice see [27]):

Theorem 17 NEXP \subseteq BPP/ \log *implies* NEXP = BPP.

The proof follows by combining two recent results from derandomization. The first is due to Impagliazzo et al. [13] who showed that $NEXP \subset P/poly$ implies NEXP = MA. The second is due to Trevisan and Vadhan [27] who use the instance-checkability of EXP to show that $EXP \subseteq BPP/log$ implies $EXP \subseteq BPP$ (see Proposition 5.6 of Trevisan and Vadhan [27]). Theorem 17 follows by noticing that $NEXP \subseteq BPP/log$ implies NEXP = EXP (since $BPP \subseteq P/poly$) and then applying the above result due to Trevisan and Vadhan [27].

5. Challenges

Is it possible to prove a similar consequence for NEXP and MA/log? Applying an argument from Impagliazzo et al. one can prove that NEXP \subseteq MA/log implies that either NEXP = EXP or NEXP \subseteq NTIME $(2^{n^{\epsilon}})/n^{\epsilon}$. Unfortunately we do not know of a hierarchy theorem strong enough to show that the latter inclusion is false.

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