



How strong is Nisan's pseudo-random generator?

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ABSTRACT

We study the resilience of the classical pseudo-random generator (PRG) of Nisan (1992) [6] against space-bounded machines that make multiple passes over the input. Nisan's PRG is known to fool log-space machines that read the input once. We ask what are the limits of this PRG regarding log-space machines that make multiple passes over the input. We show that for every constant k Nisan's PRG fools log-space machines that make $\log^k n$ passes over the input, using a seed of length $\log^{k'} n$, for some $k' > k$. We complement this result by showing that in general Nisan's PRG cannot fool log-space machines that make $n^{O(1)}$ passes even for a seed of length $2^{\Theta(\sqrt{\log n})}$. The observations made in this note outline a more general approach in understanding the difficulty of derandomizing BPNC¹.

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1. Introduction and preliminaries

The seminal work of Nisan [6] gives a PRG which fools log-space machines that read their input *once*. We study the resilience of this PRG against log-space machines that make multiple passes over the input. Our initial motivation comes from understanding the fooling power of Nisan's PRG for circuits. Although the derandomization of circuit classes, and in particular of BPNC¹ is an ambitious goal, the following discussion seems to put things in proper context. It is easy to see that $\text{NC}^1 \subseteq \text{L}$, e.g. [1]. However $\text{BPNC}^1 \subseteq \text{BPL}$ is not known to be true, where BPNC¹ and BPL are the standard definitions of the two-sided error randomized analogs of NC¹ and L. By definition BPL is characterized by log-space machines that read their randomness only once. On the other hand a family of probabilistic circuits roughly corresponds to a space bounded machine that reads its randomness *multiple times*.

To date there are explicit constructions of pseudo-random generators (PRGs) that fool space-bounded machines, which make a single pass over the input. A natural question is whether these PRGs already have the fooling power to show e.g. $\text{BPNC}^1 \subseteq \text{QuasiP}$.

Prior to our work Impagliazzo, Nisan and Wigderson [3] constructed a PRG, more complicated than the original PRG of Nisan (N-PRG), and they showed that it fools log-space machines for some number of passes over the input. We use a simple averaging argument to show that the original N-PRG already has this property² (Theorem 2.4).

Our second contribution is a uniform log-space and $n^{O(1)}$ -passes distinguisher against N-PRG, which also answers our derandomization question in the negative (Theorem 3.2). It seems interesting to understand further whether this distinguisher can be generalized so as to put new derandomization questions in perspective – see Section 4 for a short discussion.

Preliminaries and notation. Derandomizing space and time-bounded classes is an area of intense interest; cf. the

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² To the best of our knowledge, this property of Nisan's PRG was not previously known (also: Noam Nisan, personal communication).

somewhat older but excellent surveys by Saks [8] and Kabanets [4].

We use standard names for complexity classes NC, BPNC, BPL; see e.g. [1]. In particular, we denote $\text{QuasiP} := \bigcup_{c>0} \text{DTIME}(2^{\log^c n})$, BPNC^1 denotes the class of languages decidable by probabilistic uniform polynomial size circuits of depth $O(\log n)$ and bounded fan-in, and BPL denotes the class of languages decidable by probabilistic Turing Machines that read their random tape once.

BP^*L denotes [7] the class of languages decidable by log-space machines with an auxiliary read-only, polynomially long, and two-way tape. In particular, $\text{BPNC}^1 \subseteq \text{BP}^*\text{L}$. We define $\text{BPL}[r]$ to be the class of languages decidable by log-space machines with at most $r(n)$ passes over the randomness, and 2-sided error bounded away from $1/2$. Observe that a log-space Turing Machine with a polynomially-long, two-way random tape works in time $n^{O(1)}$, given that it always halts. Thus,

$$\text{BPNC}^1 \subseteq \text{BP}^*\text{L} = \text{BPL}[n^{O(1)}] := \bigcup_{k>0} \text{BPL}[n^k]$$

We also know that $\text{NC}^1 \subseteq \text{L} = \text{BPL}[0]$. In this sense, derandomizing along $\text{BPL}[r]$ indicates progress towards the derandomization of BPNC^1 . Also, let $\text{BPL}[\text{polylog}] := \bigcup_{k>0} \text{BPL}[\log^k n]$.

Our results. In Section 2 we observe (Theorem 2.4) that a PRG resilient against multiple passes corresponds to a PRG with larger seed-length that fools single-pass machines. In Section 3 we complement this result by presenting a *uniform* log-space distinguisher which distinguishes N-PRG-strings even for *seed of length* $2^c \sqrt{\log n}$, for any $c > 0$. This holds for the standard family³ of hash functions for N-PRG. Our distinguisher uses some elementary algebraic properties. It relies on a deep result due to Mulmuley [5] (which is a derandomization of the RNC² algorithm by Borodin, Gathen and Hopcroft [2]) for solving a non-singular system of linear equations in the functional analog of NC². This in particular implies an $O(\log^2 n)$ space algorithm. Our distinguisher works in logarithmic space – it uses the algorithm of [5] in linear systems of size $O(2^c \sqrt{\log n})$, where n is the length of the whole input.

2. $\text{BPL}[\log^{O(1)} n] \subseteq \text{QuasiP}$: Nisan’s PRG against poly-log passes

We show that for a fixed space of an adversary, longer seed length in N-PRG fools adversaries that make more passes over the input. To show this we do not rely on the specifics of N-PRG. In this sense we show that using in a “black-box” way the analysis of N-PRG we can trade seed-length for passes over the input. Intuitively, this becomes possible since [6] proves that it is not only hard to distinguish between the computation of a log-space machine on a random and on a pseudo-random tape, but more generally hard to distinguish between “partial computations”,

i.e. when we start at an arbitrary state and end to an arbitrary state. It is an easy exercise to check that such a property is also be a necessary condition.

Notation and preliminaries for N-PRG. We identify a one-way, non-uniform Turing Machine (i.e. TM with advice) M by a family of *Finite State Machines* (FSMs).

Let $G : A \rightarrow B$ be an arbitrary function, and let D be a probability distribution on A . We denote by $G(D)$ the probability distribution of the random variable $G(x)$, where x is chosen from D .

Let $N \geq 1$, and let D be a probability distribution over $\{0, 1\}^N$. For any $t \geq 1$, we denote by D^t the probability distribution over $\{0, 1\}^{Nt}$ obtained by taking t concatenated copies of a string x that is chosen from D .

Let D_1, D_2 be probability distributions over a finite set A . We use the notation

$$\|D_1 - D_2\|_1 = \sum_{x \in A} \left| \Pr_{y_1 \in D_1} [y_1 = x] - \Pr_{y_2 \in D_2} [y_2 = x] \right|$$

Let Q be an FSM with alphabet $\{0, 1\}$, and with a designated initial state, and let D be a probability distribution over $\{0, 1\}^n$. We denote by $Q(D)$ the matrix whose (i, j) -th entry is the probability getting from state i to state j after reading a string x chosen from D .

For a matrix $P \in \mathbb{R}^{N \times N}$ let $\|P\|_1 = \max_i \sum_j |P_{i,j}|$.

Definition 2.1 (*Pseudo-random generator against FSMs*). Let $G : \{0, 1\}^m \rightarrow \{0, 1\}^n$ be computable in time polynomial in n , and let $\varepsilon, w > 0$. We say that G is a *pseudo-random generator against FSMs* for space w with parameter ε if for any FSM Q with 2^w states, we have $\|Q(U_n) - Q(G(U_m))\|_1 \leq \varepsilon$.

Theorem 2.2. (See Nisan [6].) *There exists $c > 0$ such that for any $N > 0$, there exists a function $G : \{0, 1\}^{N^2} \rightarrow \{0, 1\}^{N^{2cN}}$ computable in time polynomial in 2^{cN} which is a pseudo-random generator against FSMs for space cN , with parameter 2^{-cN} .*

Our “seed-length-buys-passes” theorem. Instead of considering a distinguisher as an FSM with multiple passes over the input, it is convenient to consider a one-way FSM whose input contains multiple copies of the original input. For a function $G : \{0, 1\}^m \rightarrow \{0, 1\}^n$ we define $G^2 : \{0, 1\}^m \rightarrow \{0, 1\}^{2n}$, $x \mapsto G(x) \circ G(x)$, where \circ denotes concatenation of strings. The following simple lemma states that N-PRG works (with a small loss in the parameter) even if the space-bounded machine is allowed to make two passes over the random tape.

Lemma 2.3. *Let $G : \{0, 1\}^m \rightarrow \{0, 1\}^n$ be a PRG against FSMs for space $2s$ with parameter ε . Then $G^2 : \{0, 1\}^m \rightarrow \{0, 1\}^{2n}$ is a PRG against FSMs with space s with parameter $\varepsilon' = \varepsilon \cdot 2^{2s}$.*

Proof. Suppose that G^2 is not pseudo-random against FSMs of space s with parameter ε' . We show that G is not a PRG against FSMs for space $2s$ with parameter ε .

Therefore, there exists an FSM with state space $\{1, \dots, 2^s\}$ such that

$$\|Q(G^2) - Q(U_n^2)\|_1 > \varepsilon' \tag{2.1}$$

³ Note that *some* restriction on the complexity of the family of hash functions is necessary for a distinguisher to exist.

Let 1 be the initial state of Q . For a string $x \in \{0, 1\}^n$, and for $i, j \in \{1, \dots, 2^s\}$ we write $i \xrightarrow{x}_Q j$ to denote the event that starting from state i and reading the string x , the FSM Q ends up to state j . For any $i, j \in \{1, \dots, 2^s\}$ let

$$p_{i,j} = \Pr_{x \in G} [1 \xrightarrow{x}_Q i \text{ and } i \xrightarrow{x}_Q j]$$

and

$$q_{i,j} = \Pr_{y \in U_n} [1 \xrightarrow{y}_Q i \text{ and } i \xrightarrow{y}_Q j]$$

From (2.1) we have

$$\sum_{i \in \{1, \dots, 2^{2s}\}} \sum_{j \in \{1, \dots, 2^{2s}\}} |p_{i,j} - q_{i,j}| \geq \|Q(G^2) - Q(U_n^2)\|_1 > \varepsilon'$$

Therefore, there exist $i^*, j^* \in \{1, \dots, 2^s\}$ such that

$$|p_{i^*,j^*} - q_{i^*,j^*}| > \varepsilon'/2^{2s}$$

Let Q' be an FSM with state space $\{1, \dots, 2^s\} \times \{1, \dots, 2^s\}$, and alphabet $\{0, 1\}$. We define the transition function of Q' so that for any $b \in \{0, 1\}$ and for any $i, j \in \{1, \dots, 2^s\}$, we have $(i, j) \xrightarrow{b}_{Q'} (i', j')$ iff $i \xrightarrow{b}_Q i'$ and $j \xrightarrow{b}_Q j'$. We set the initial state of Q' to be $(1, i^*)$. We have

$$\begin{aligned} & \|Q'(G) - Q'(U_n)\|_1 \\ &= \sum_{i,j \in \{1, \dots, 2^{2s}\}} \left| \Pr_{x \in G} [(1, i^*) \xrightarrow{x}_{Q'} (i, j)] \right. \\ &\quad \left. - \Pr_{y \in U_n} [(1, i^*) \xrightarrow{y}_{Q'} (i, j)] \right| \\ &\geq \left| \Pr_{x \in G} [(1, i^*) \xrightarrow{x}_{Q'} (i^*, j^*)] \right. \\ &\quad \left. - \Pr_{y \in U_n} [(1, i^*) \xrightarrow{y}_{Q'} (i^*, j^*)] \right| \\ &= \left| \Pr_{x \in G} [1 \xrightarrow{x}_Q i^* \text{ and } i^* \xrightarrow{x}_Q j^*] \right. \\ &\quad \left. - \Pr_{y \in U_n} [1 \xrightarrow{y}_Q i^* \text{ and } i^* \xrightarrow{y}_Q j^*] \right| \\ &= |p_{i^*,j^*} - q_{i^*,j^*}| \\ &> \varepsilon'/2^{2s} \\ &= \varepsilon \end{aligned}$$

Therefore, G is not a PRG against FSMs of space $2s$ with parameter ε . \square

Note that every time we apply Lemma 2.3 on a PRG G we get a new PRG G' which is secure against twice as many passes as G , with slightly worse space and error parameters. By repeating $O(\log \log n)$ times, we obtain the following Theorem 2.4.

Theorem 2.4. $\text{BPL}[\text{polylog}] \subseteq \text{QuasiP}$.

Theorem 2.4 is a corollary of the following theorem.

Theorem 2.5. For every space-constructible $r(n)$, $\text{BPL}[r(n)] \subseteq \text{DTIME}(2^{O(r(n)^2 \log^2 n)})$.

Proof. Recall that in N-PRG for space parameter N , the seed length is N^2 and the distinguishing parameter is $\varepsilon = 2^{-cN}$, for a universal constant $c > 0$. Start by setting $N = \alpha r(n) \log n$, for a large enough constant α , and consider distinguishers with slightly smaller space. That is, for this N Nisan's PRG fools distinguishers of space N and in particular of space $r(n) \log n$, with $\varepsilon = 2^{-c\alpha r(n) \log n}$. By applying Lemma 2.3 we have that this output of N-PRG also fools $\frac{r(n) \log n}{2}$ -space adversaries that make 2 passes over the input with distinguishing parameter $2^{(1-c\alpha)r(n) \log n}$. Iterating Lemma 2.3 k times we have that the same generator fools $\frac{r(n) \log n}{2^k}$ -space adversaries that make 2^k passes over the input with parameter $2^{(1+\frac{1}{2}+\dots+\frac{1}{2^{k-1}}-c\alpha)r(n) \log n} \leq 2^{(2-c\alpha)r(n) \log n}$.

Hence, if we choose $N = \alpha r(n) \log n$ for a large enough constant α we get a PRG that fools log-space adversaries that make $r(n)$ passes over the input, with advantage $\varepsilon'' < \frac{1}{2}$ bounded away from $1/2$.

Fix an arbitrary $\text{BPL}[r(n)]$ machine M , compute Nisan's PRG on every seed of length N^2 , use each output of N-PRG as the random tape for M , simulate M , and decide by majority. This algorithm takes time $2^{O(r(n)^2 \log^2 n)}$. \square

3. Breaking Nisan's PRG with polynomially many passes

Let n be the length of the output of N-PRG. Fix $c > 0$ and the seed length to be $2^c \sqrt{\log n}$. In Theorem 2.2 we stated a corollary of the theorem from [6], by choosing the parameters appropriately. We used Theorem 2.2 to obtain a positive result, which is independent of the structure of the PRG. However, for breaking N-PRG we consider its exact form.

Note that our adversary overwhelmingly breaks the security properties (stated for one-pass) of N-PRG. In particular, for seed length $2^c \sqrt{\log n}$ instead of a $2^{c'} \sqrt{\log n}$ -space distinguisher, $c' > 0$, we present a log-space one. Furthermore, we distinguish with probability much bigger than $2^{-c' \sqrt{\log n}}$.

Let us review the description of N-PRG.

Let H be a universal family of hash functions $h : \{0, 1\}^N \rightarrow \{0, 1\}^N$, for some N . We are going to determine all parameters after the description of the PRG. For every integer $k \geq 0$ define the generator

$$G_k : \{0, 1\}^N \times H^k \rightarrow (\{0, 1\}^N)^{2^k}$$

where G_k is defined recursively as follows:

- $G_0(x) = x$, and
- $G_k(x, h_1, \dots, h_k) = G_{k-1}(x, h_1, \dots, h_{k-1}) \circ G_{k-1}(h_k(x), h_1, \dots, h_{k-1})$, where \circ denotes concatenation of strings.

Nisan shows that such a PRG is secure against FSMs that make a single pass over the input. He uses an explicit efficiently computable family H of affine functions $h : GF(2)^N \rightarrow GF(2)^N$. A function h is affine if there is a linear function f_h and a $b \in GF(2)^N$ such that $h(x) = f_h(x) + b$ for all $x \in GF(2)^N$. Nisan's [6] family H has the property that each $h \in H$ can be described in $O(N)$ bits.

The parameters and additional notation. The output of the PRG consists of *blocks*, each of which is an N -bit binary string, and it corresponds to evaluating x on some composition of functions from H . By definition of N-PRG we have that the output y is of the form

$$y = y_1 y_2 \dots y_{N/2} h(y_1) h(y_2) \dots h(y_{N/2})$$

where for each y_i $h(y_i)$ is a block of size N , and $h = h_1$.

The output length is $n = 2^k N$. Therefore, $k = O(\log n)$. For a family H as in [6], the seed length is $O(kN)$. Therefore, for seed length $2^{c\sqrt{\log n}}$ we have that $N = O(2^{c\sqrt{\log n}})$.

The main idea. Suppose that the string y is the output of N-PRG, with $H = \{h_1, \dots, h_k\}$ the family of affine functions and some x . We will describe a test that every such y passes, but almost every string fails to pass. Note that to perform the test we do not need to know the actual h_i . We just need to know the *position* of $h(y_i)$ for the given i .

Here is a property that our test will use. We treat every block of y , which is in particular a binary substring of length N , as a vector in $GF(2)^N$. Let z_1, \dots, z_l be an even number of blocks in y and $h : GF(2)^N \rightarrow GF(2)^N$ an affine function. If z_1, \dots, z_l are linearly dependent then $h(z_1) + \dots + h(z_l) = 0$. This holds since (i) f_h is a linear map, and thus in particular a homomorphism, and (ii) for an even l , $h(z_1) + \dots + h(z_l) = f_h(z_1) + \dots + f_h(z_l) = f_h(z_1 + \dots + z_l)$.

Therefore, the output of N-PRG y passes the following test:

find an even number of linearly independent blocks z_1, \dots, z_l , and check whether the sum of the blocks corresponding to $h_1(z_i)$ evaluates to 0.

Observe that to perform this test we don't have to know the actual h .

Observe that if y is random then the probability that at least 2 vectors corresponding to N -bit substrings of y sum up to 0 is 2^{-N} .

The log-space distinguisher. Let y be the input to the distinguisher.

1. Let $H_1 := \{y_1, \dots, y_{N+1}\}$, and $H_2 := \{y_{N+2}, \dots, y_{2N+2}\}$. Hence, in both cases for y (either y is the output of N-PRG on random H and x , or y is a random string) we have that (i) $H_1 \cap H_2 = \emptyset$ with probability $\geq 1 - 2^{-\Omega(N)}$, and (ii) each of the sets is larger than N , which guarantees that the vectors in H_1 are linearly dependent, and the same holds for H_2 .
2. Use [5] (see below) to find in space $O(\log n)$ a set of linearly dependent vectors in H_1 : $y_1^{(1)} + y_2^{(1)} + \dots + y_{j_1}^{(1)} = 0$, and a set of linearly dependent vectors in H_2 : $y_1^{(2)} + y_2^{(2)} + \dots + y_{j_2}^{(2)} = 0$. As usual in space-bounded computation, by this we mean that each time we can (re)compute the indices of the vectors on the input tape.
3. If j_1 is even, accept iff $\sum_{j=1}^{j_1} \alpha_{y_j^{(1)}} = 0$, where $\alpha_{y_j^{(1)}}$ is the block indexed by the composition of h_1 with the

composed functions corresponding to $y_j^{(1)}$. Similarly, if j_2 is even. Else, if both j_1 and j_2 are odd then $j_1 + j_2$ is even, and accept iff $\sum_{j=1}^{j_1} \alpha_{y_j^{(1)}} + \sum_{j=1}^{j_2} \alpha_{y_j^{(2)}} = 0$.

Clearly, if the input is random then the probability that the distinguisher accepts is $2^{-\Omega(N)}$. On the other hand, if the input is pseudo-random then with probability at least $1 - 2^{-\Omega(N)}$ we have that (i) $H_1 \cap H_2 = \emptyset$, and (ii) all vectors in $H_1 \cup H_2$ are non-zero. Conditioned on these two events, the distinguisher accepts with probability 1.

Finding the linear dependencies. Let NONSINGULAR-EQUATIONS(n) be the problem of solving a non-singular $n \times n$ system of linear equations [2].

Theorem 3.1. (See Mulmuley [5].) NONSINGULAR-EQUATIONS(n) can be computed in the functional analog of the uniform NC² (i.e. the circuits can have multiple outputs).

Consider the following procedure. Fix $y \in H_1$ and let A be the $N \times N$ matrix with columns $\{z \in H_1 - \{y\}\}$. If $y \neq 0$, then every solution of the system $Ax = y$ is non-zero. Since the set of vectors in H_1 is linearly dependent, there exists at least one y such that the system has a solution. This solution gives us the required set of vectors $y_1^{(1)} + \dots + y_{j_1}^{(1)} = 0$. Similarly for H_2 .

Recall that $NC^2 \subseteq DSPACE(\log^2 n)$. However, when solving the linear system $Ax = y$ in the above procedure, the input length is not n , but polynomial in $N = O(2^{c\sqrt{\log n}})$. Therefore, by Theorem 3.1, the above procedure can be implemented in space $O(\log n)$ and thus we obtain the following theorem.

Theorem 3.2. Let $c > 0$. There exists $k > 0$, such that N-PRG with seed of length $2^{c\sqrt{\log n}}$ is not secure against log-space machines that make n^k passes over the input.

4. Discussion

Constructing a PRG that unconditionally fools two-way log-space machines is a difficult task. If such a reasonably efficient to compute (e.g. in polynomial time) PRG exists then we obtain $L \subsetneq NP$, a somewhat strong lower bound. In this case the language in $NP - L$ is the image of the PRG. However, there are more modest goals to pursue. It seems interesting to understand what is the main issue behind multiple passes. For example, is it possible to construct a PRG that fools log-space machines that make e.g. n^ϵ passes for some fixed $\epsilon > 0$? Can we formulate an interesting family of Nisan-like PRGs and abstract out the property that makes them vulnerable to multiple passes? Furthermore, there are conceivably simpler related questions. For example, can we construct a PRG G that fools a log-space machine when reading its input once, but G does not fool, e.g. two-passes log-space machines?

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