

# The Diameter of Randomly Perturbed Digraphs and 2 Applications

Abraham Flaxman

&

Alan Frieze  
(CMU Math)

Introduction: Smoothed Analysis:

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[Spielman & Teng, 2001]

Proposed in a theoretical explanation for the impressive performance of the simplex algorithm for linear programming.

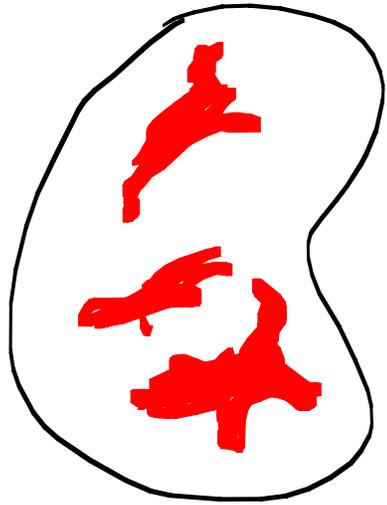
# Introduction: Smoothed Analysis:

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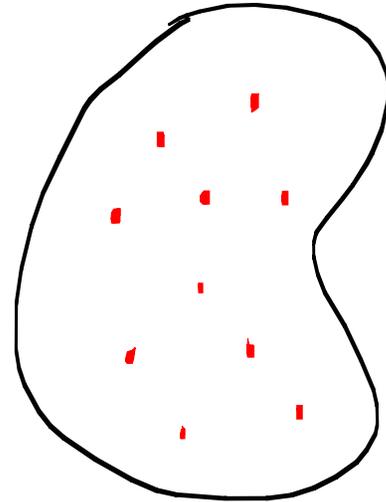
Proposed in a theoretical explanation for the impressive performance of the simplex algorithm for linear programming.

In short, define a random perturbation and show the hard instances are unlikely with respect to this perturbation.

# Introduction: Smoothed Analysis:



Things like this  
should be **difficult** in  
practice



Things like this  
should be **doable** in  
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Is the perturbation "right"?

(In their case, additive noise, consisting of independent  $\mathcal{N}(0, \epsilon)$ .)

# Smoothed analysis of discrete problems

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Simple answer: XOR with a random graph.

but...

if random graph has too many edge,  
there will be nothing left of the original  
instance.

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(Acceptable in certain situations, for example,  
property testing [Spielman and Teng, 2002])

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But we want to say something about sparse  
graphs.

So, we perturb by XORing with  $G_{n,p}$   
where  $p = \frac{\epsilon}{n}$ .

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Semirandomness

[Santha & Vazirani, 1986]

Semirandom instances

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Semirandom instances

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To go from semirandom instances to smoothed instances, make adversary oblivious.

Central Observation:

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Theorem: Let  $\varepsilon > 0$ . Let  $\bar{G}$  be an  $n$ -node connected graph.

Let  $G = \bar{G} + R$  where  $R \sim \mathcal{G}_{n, \varepsilon/n}$ .

Then, whp,

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(In paper, stated for digraphs, but holds for directed/undirected, and for many similar perturbations)

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(Also similar to [Bollobás + Chung, 88] which shows diameter of a cycle + random matching is  $\Theta(\log n)$ .)

Proof:

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Fix  $s, t$ . We will show a path of length  $O(\epsilon^{-1} \log n)$  connects  $s$  and  $t$  whp.

To do so, we explore neighborhoods around  $s$  and  $t$ , alternating between edges of  $\overline{G}$  and  $R$ .

Proof:

•  
s

•  
t

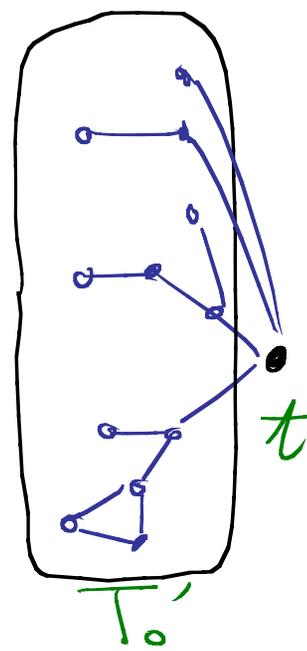
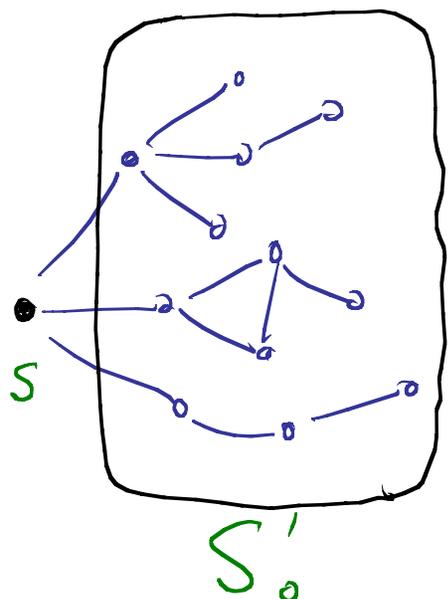
First, we find  $S'_0$  &  $T'_0$ , where

$$S'_0 = \{v : d_{\bar{G}}(s, v) \leq \Theta(\varepsilon^{-1} \log n)\}$$

and

$T'_0$  is defined analogously.

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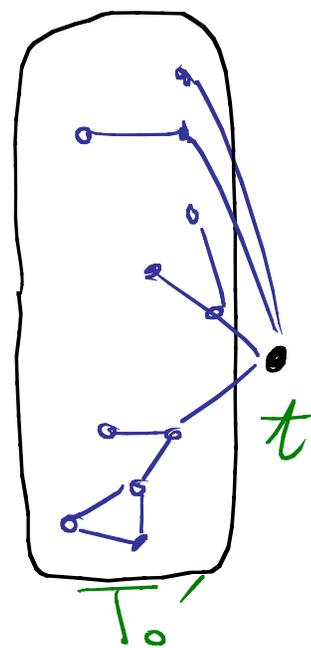
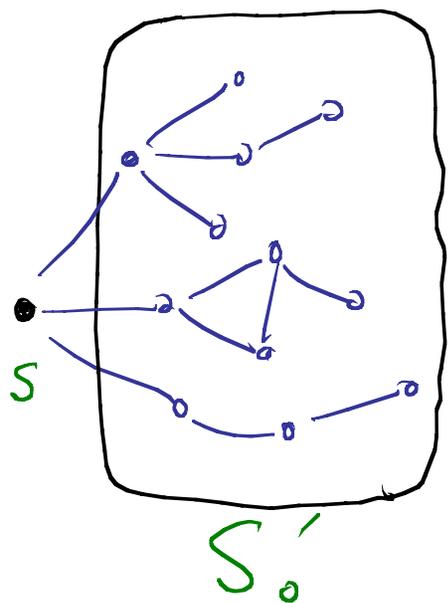
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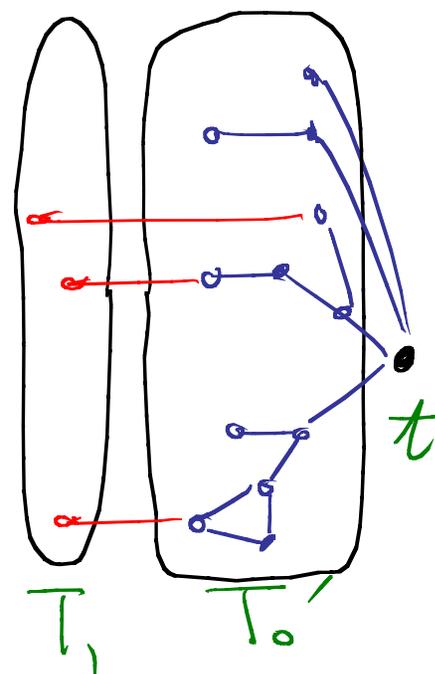
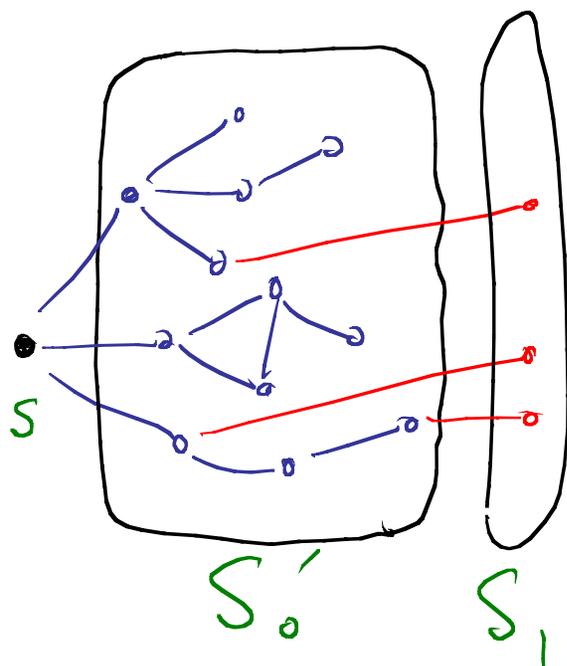
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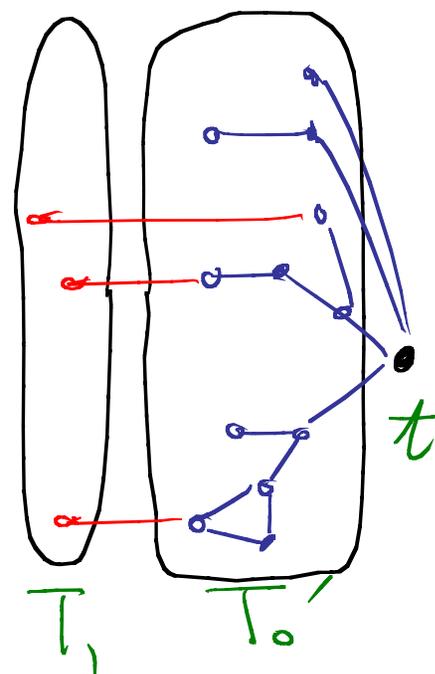
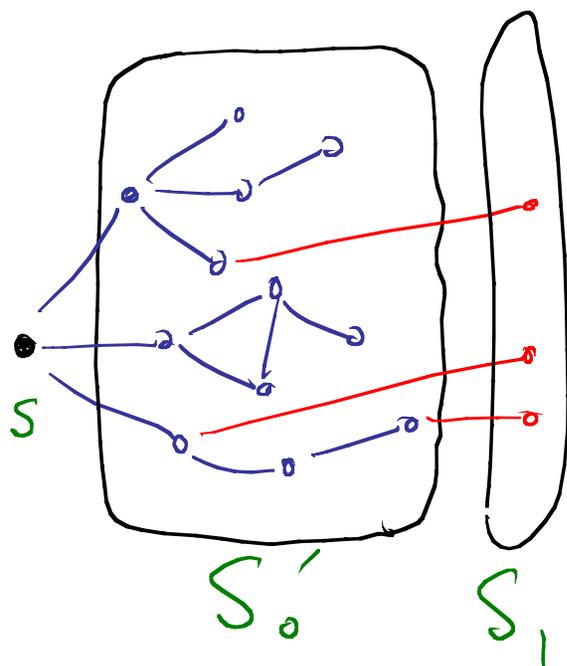
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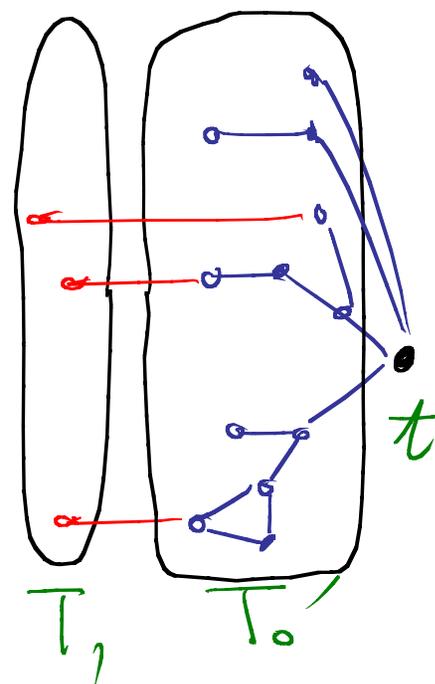
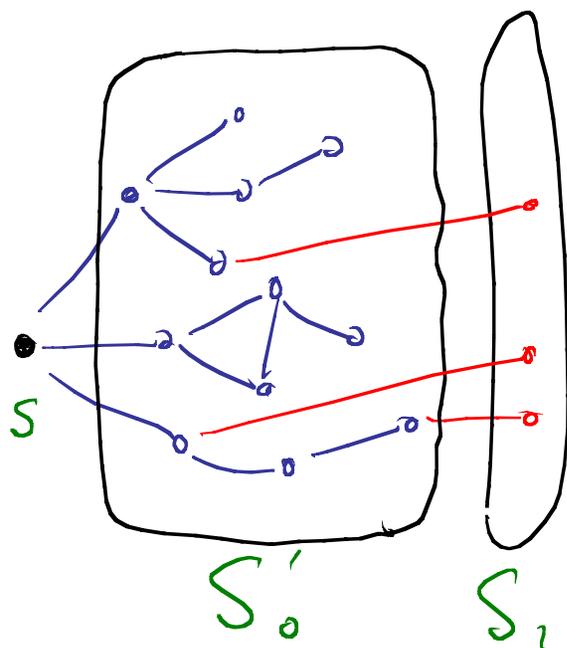
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$$\mathbb{E}[|S_1|] \approx |S'_0| \cdot n \cdot \frac{\epsilon}{n} = O(\log n).$$

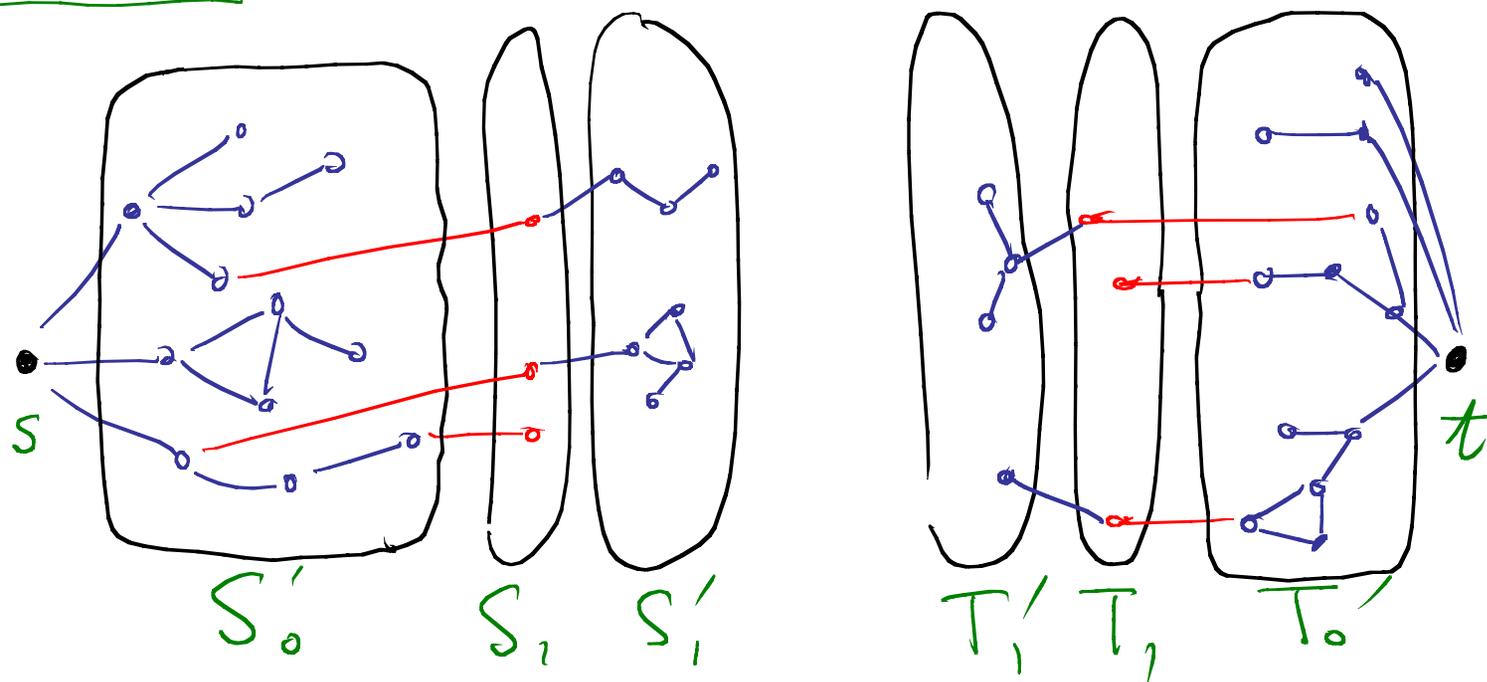
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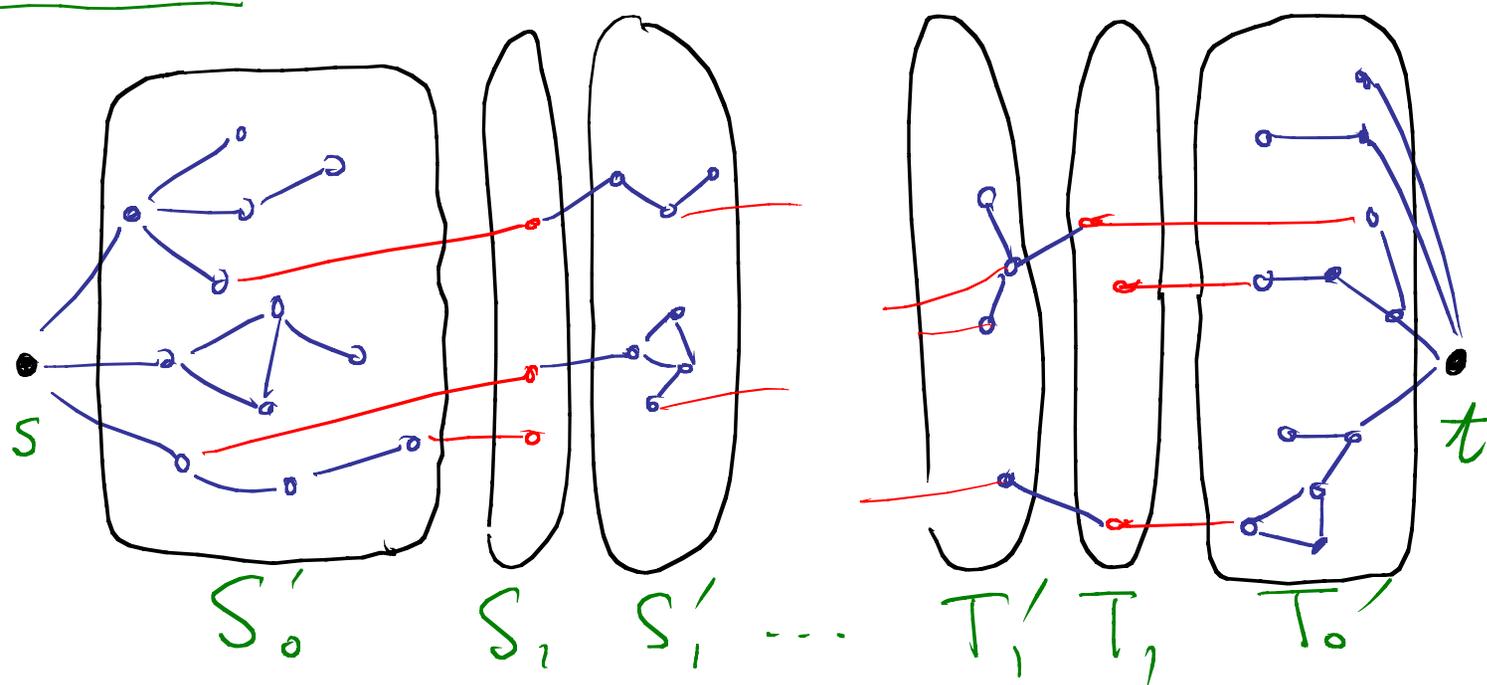
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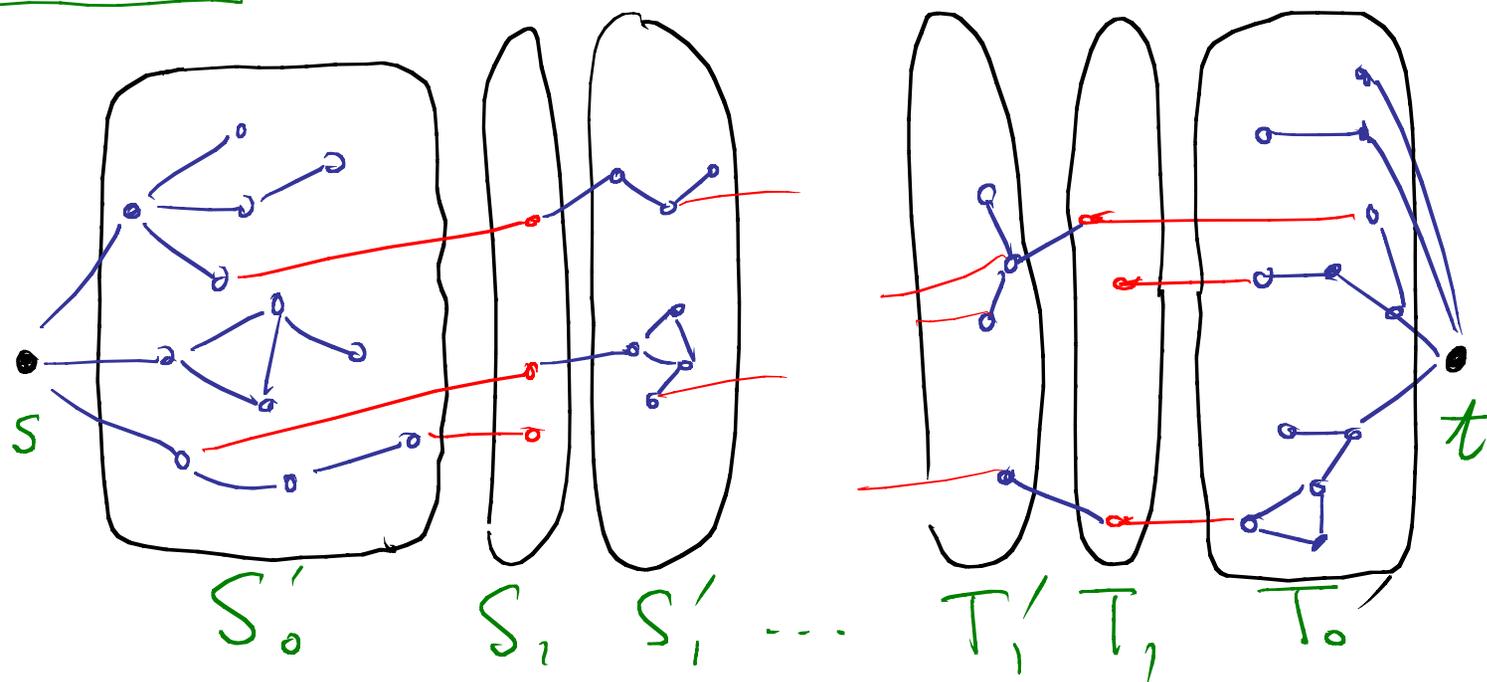
Now, we let  $S_1', T_1'$  be defined by

$$S_1' = \{v : d_G(s_0', v) \leq 5\epsilon^{-1}\}$$

and let

$S_2, T_2$  be the  $R$ -nbrs of  $S_1', T_1'$ .

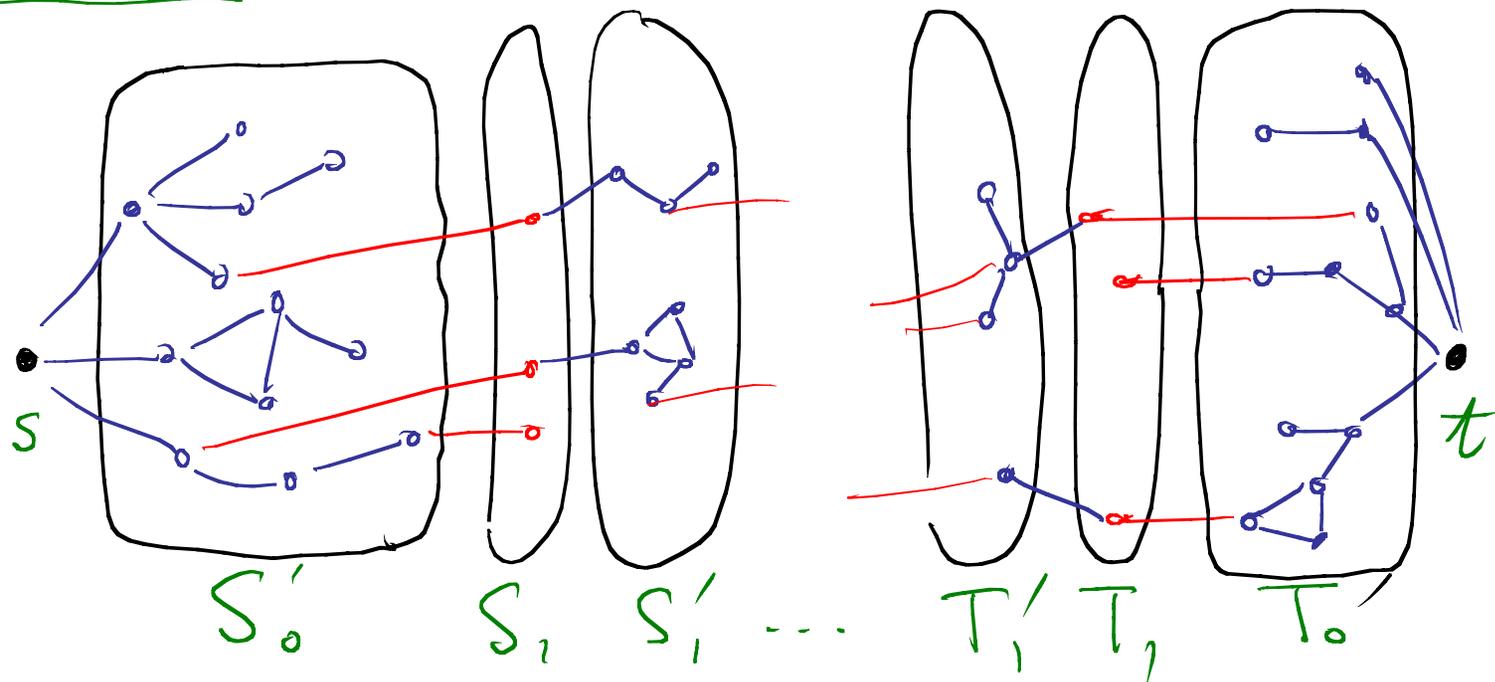
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So we have

$$\begin{aligned} \mathbb{E}[|S_i|] &\approx \mathbb{E}[|S_{i-1}'|] n \cdot \frac{\epsilon}{5} \\ &\approx \left( |S_{i-1}| \frac{\epsilon}{5} \right) n \cdot \frac{\epsilon}{5} \\ &= \epsilon |S_{i-1}|. \end{aligned}$$

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So we have

$$\begin{aligned} \mathbb{E}[|S_i|] &\approx \mathbb{E}[|S_{i-1}|] n \cdot \frac{\epsilon}{5} \\ &\geq (|S_{i-1}| 5\epsilon^{-1}) n \cdot \frac{\epsilon}{5} \\ &= 5 |S_{i-1}|. \end{aligned}$$

$S_i$  and  $T_i$  meet before approx gets too inaccurate.

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- Strong connectivity is NL-complete
- Even when restricted to bounded degree instances.

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ALG: Look for short ( $O(\log n)$ ) paths.  
Accept if you find them between every pair of nodes.

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Elements of Pf: 1. Add edges  $\rightarrow$  low diam

2. degree stays "pretty bounded"

3. If  $\bar{D}$  not conn,  $D$  becomes conn in a good way

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(More complicated than it sounds in  $\log$ -space)

## Application 2:

- A graph is  $k$ -linked if for all terminal pairs  $(s_1, t_1), \dots, (s_k, t_k)$  there are  $k$  disjoint paths from  $s_i$  to  $t_i$ .

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 $\bar{D}$  is not  $k$ -linked but  $D$  is  $k$ -linked in a way not witnessed by short paths.

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- This case doesn't come up in property

testing: TESTING  $k$ -linked:

- If  $\bar{D}$  is  $k$ -linked accept

- If  $\bar{D}$  is  $\epsilon$ -far from  $k$ -linked reject

- o.w. whatever

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Search all terminal sets for disjoint paths of length  $O(\log n)$ .

If  $\bar{D}$  is  $k$ -linked then  $D$  is also, and whp we accept. If  $\bar{D}$  is  $\epsilon$ -far, then  $D$  is not  $k$ -linked  $\Rightarrow$  reject.

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So:

- Smoothed instances of strong-conn are recognized by log-space alg whp (analogous claim should not hold for  $(s, t)$ -conn)
- $k$ -linkedness property is testable in poly-time.