# Undirected ST-Connectivity in Log-Space

## Omer Reingold

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### Undirected s-t connectivity(USTCON)

 Is t reachable from s in a undirected graph G?

- BFS, DFS take
   O(n) space
- USTCON ∈ NL (nondeterministic logspace Turing machine)



## SL Complexity class

- SL = problems log-space reducible to USTCON
- Defined by Papadimitriou in 1982 via Symmetric Turing machine
- $L \subseteq SL \subseteq NL \subseteq L^2$  (  $SPACE(log^2 n)$  )
- Problems in SL:
  - Vertex-disjoint paths: are there k vertex-disjoint paths between s and t?
  - Is a graph a bipartite?
  - Is there a cycle containing a given edge?
  - Exclusive or 2-satisfiability
  - **-** ...

## Sequential of Works

Savitch's Theorem

USTCON 
$$\in L^2$$

- Nisan, Szemeredi and Wigderson 1989
   USTCON ∈ L<sup>3/2</sup>
- Armoni, Ta-Shma, Wigderson, and S. Zhou 2000 USTCON  $\in L^{4/3}$
- Trifonov 2005

USTCON  $\in$  SPACE(O(log n log log n))

## Important Results

- Omer Reingold paper L = SL ⊆ NL
- All problems in SL are now in L.
- Showing that a problems are not in L, by showing that such no log-space reduction from it to USTCON exist
- Best paper award STOC 2005 Godel's prize 2009
- Trifonov got Best student paper award in STOC 2005

#### Outline

#### I. Introduction

- Space Complexity
- Connectivity is NL-complete
- Savitch's Theorem (NL  $\subset$  L<sup>2</sup>)
- Immerman's theorem (NL=coNL)

#### II. Transforming to $(N,D, \lambda)$ -graph

- Expander Graph
- Transforming into an expander

## **Space Complexity**



#### Motivation

Complexity classes correspond to bounds on resources

One such resource is space: the number of tape cells a TM uses when solving a problem



## **Space Complexity Classes**

For any function  $f: \mathbb{N} \to \mathbb{N}$ , we define:

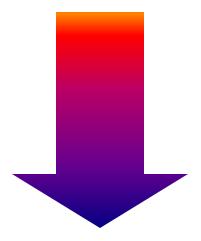
```
SPACE(f(n))={ L : L is decidable by a
          deterministic O(f(n)) space TM}
```

NSPACE(f(n))={ L : L is decidable by a non-deterministic O(f(n)) space TM}

## Low Space Classes

#### **Definitions (logarithmic space classes):**

- L = SPACE(logn)
- NL = NSPACE(logn)

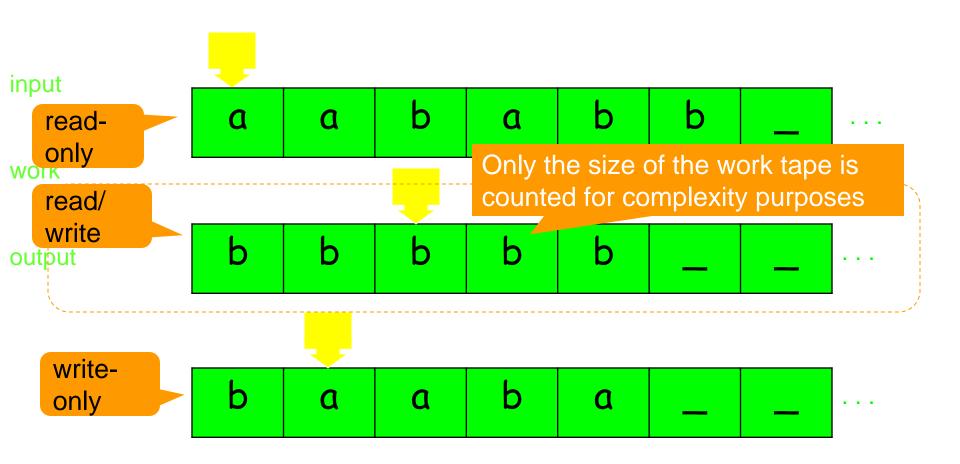


## Problem!

How can a TM use only logn space if the input itself takes n cells?!

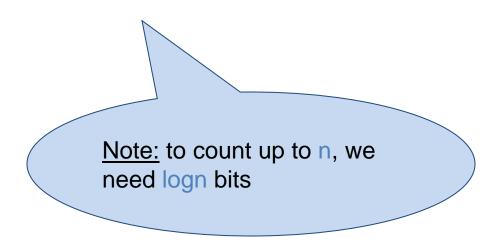


## 3Tape Machines



## Example

Question: How much space would a TM that decides {a^b^ | n>0} require?

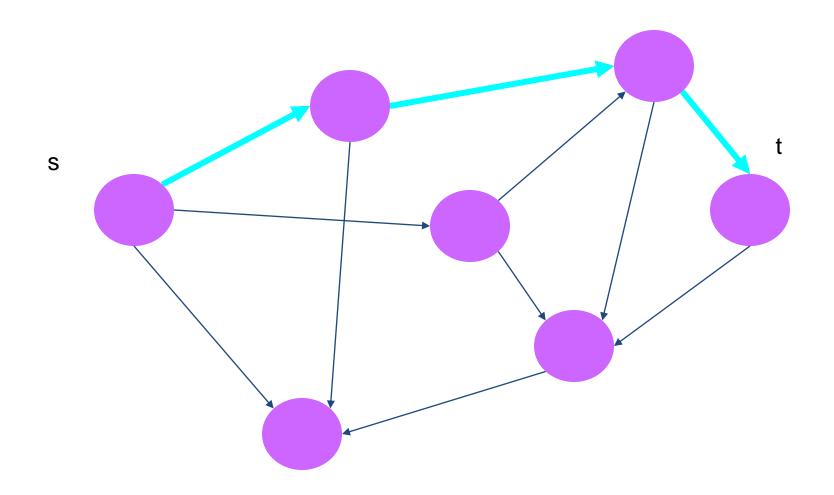


## **Graph Connectivity**

#### **CONN**

- Instance: a directed graph G=(V,E) and two vertices s,t∈V
- Problem: To decide if there is a path from s to t in G?

## **Graph Connectivity**



#### CONN is in NL

- Start at s
- For i = 1, .., |V| {
  - Non-deterministically choose a neighbor and jump to it
  - Accept if you get to t
    }
- If you got here reject!

- Counting up to |V| requires log|V| space
- Storing the current position requires log|V| space

## Configurations

## Which objects determine the configuration of a TM of the new type?

- The content of the work tape
- The machine's state
- The head position on the input tape
- The head position on the work tape
- The head position on the output tape

If the TM uses logarithmic space, there are polynomially many configurations

## Log-Space Reductions

#### **Definition:**

A is log-space reducible to B, written A≤<sub>L</sub>B, if there exists a log space TM M that, given input w, outputs f(w) s.t.

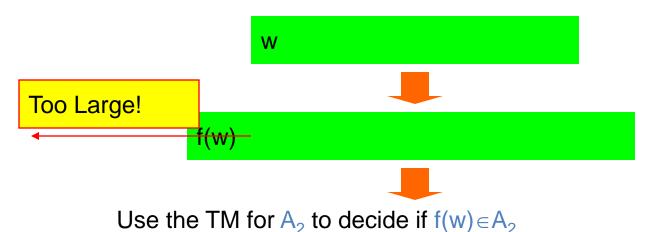
 $w \in A \text{ iff } f(w) \in B$ 

the reduction

# Do Log-Space Reductions Imply what they should?

Suppose  $A_1 \le_L A_2$  and  $A_2 \in L$ ; how to construct a log space TM which decides  $A_1$ ?

#### Wrong Solution:



## Log-Space reductions

```
Claim: if
```

- 1.  $A_1 \leq_L A_2$  f is the log-space reduction
- 2.  $A_2 \in L$  M is a log-space machine for  $A_2$

Then,  $A_1$  is in L

<u>Proof</u>: on input x, in or not-in  $A_1$ :

Simulate M and

whenever M reads the i<sup>th</sup> symbol of its input tape run f on x and wait for the i<sup>th</sup> bit to be outputted

## **NL Completeness**

#### **Definition:**

A language B is NL-Complete if

- 1. B∈NL
- 2. For every  $A \in NL$ ,  $A \leq_{L} B$ .

If (2) holds, B is NL-hard

#### Savitch's Theorem

## Theorem: $\forall S(n) \ge log(n)$

#### **Proof:**

First we'll prove NL\_SPACE(log<sup>2</sup>n) then, show this implies the general case

 $NSPACE(S(n)) \subset SPACE(S(n)^2)$ 

#### Savitch's Theorem

#### **Theorem:**

 $NSPACE(logn) \subseteq SPACE(log^2n)$ 

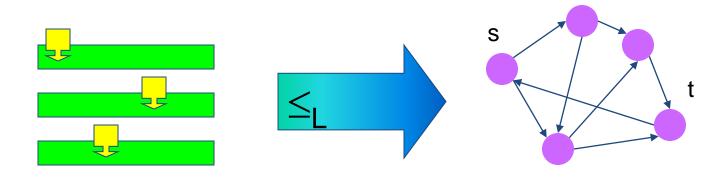
#### **Proof**:

- First prove CONN is NL-complete (under logspace reductions)
- 2. Then show an algorithm for CONN that uses log<sup>2</sup>n space

## **CONN** is NL-Complete

**Theorem:** CONN is NL-Complete

**Proof**: by the following reduction:

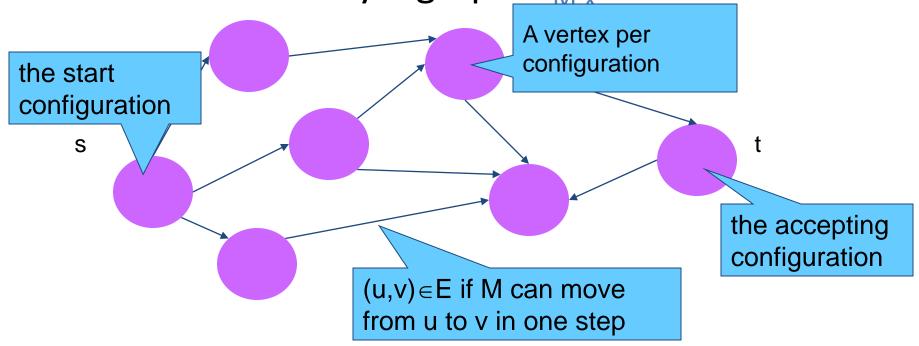


"Does M accept x?"

"Is there a path from s to t?"

## **Configurations Graph**

A Computation of a NTM M on an input x can be described by a graph  $G_{Mx}$ :



## **CONN** is NL-Complete

**Corollary:** CONN is NL-Complete

Proof: We've shown CONN is in NL. We've also presented a reduction from any NL language to CONN which is computable in log space (Why?) ■

## A Byproduct

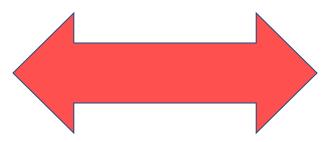
Claim: NL P

#### **Proof:**

- Any NL language is log-space reducible to CONN
- Thus, any NL language is poly-time reducible to CONN
- CONN is in P
- Thus any NL language is in P.

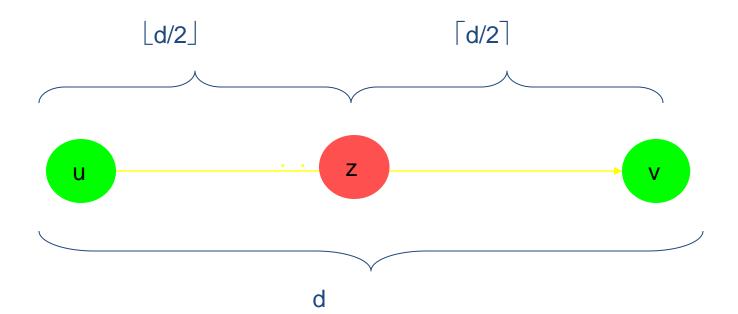
#### What Next?

We need to show CONN can be decided by a deterministic TM in O(log<sup>2</sup>n) space.

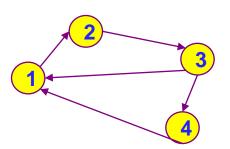


### The Trick

"Is there a vertex z, so there is a path from u to z of size \[ \d/2 \] and one from z to v of size \[ \d/2 \]?"



## Example of Savitch's algorithm



```
boolean PATH(a,b,d) {
   if there is an edge from a to b then
      return TRUE
   else {
      if (d=1) return FALSE
      for every vertex v (not a,b) {
        if PATH(a,v, [d/2]) and
            PATH(v,b, [d/2]) then
      return TRUE
      }
      return FALSE
   }
}
```

(a,b,c)=Is there a path from a to b, that takes no more than c steps.

```
(1,4,3) TRUE

3Log<sub>2</sub>(d)
```

## O(log<sup>2</sup>n) Space DTM

Claim: There is a deterministic TM which decides CONN in O(log<sup>2</sup>n) space.

#### **Proof:**

To solve CONN, we invoke PATH(s,t,|V|)

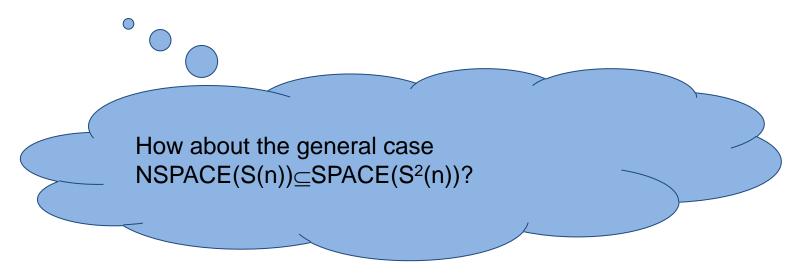
The space complexity:

$$S(n)=S(n/2)+O(log n)=O(log^2 n)$$

### Conclusion

#### Theorem:

 $NSPACE(logn) \subseteq SPACE(log^2n)$ 



## Formally

 $s_i(n)$  can be computed with space  $s_i(n)$ 

Claim: For any two space constructible functions

$$s_1(n), s_2(n) \ge logn, f(n) \ge n$$
:

simulation overhead

$$NSPACE(s_1(n)) \subseteq SPACE(s_2(n))$$



$$NSPACE(s_1(f(n))) \subseteq SPACE(s_2(f(n)))$$

E.g NSPACE(n) $\subseteq$ SPACE(n<sup>2</sup>) $\Rightarrow$  NSPACE(n<sup>2</sup>) $\subseteq$ SPACE(n<sup>4</sup>)

#### Savitch: Generalized Version

#### Theorem (Savitch):

```
\forall S(n) \ge \log(n)

\mathsf{NSPACE}(S(n)) \subseteq \mathsf{SPACE}(S(n)^2)
```

## Corollary

Corollary: PSPACE = NPSPACE

#### **Proof:**

Clearly, PSPACE NPSPACE.

By Savitch's theorem, NPSPACE⊂PSPACE. ■

#### **NON-CONN**

Clearly, NON-CONN is coNL-Complete.
 (Because CONN is NL-Complete. See coNP )

• If we'll show it is also in NL, then NL=coNL.

(Again, see the coNP)

### An Algorithm for NON-CONN

We'll see a log space algorithm for counting reachability

- 1. Count how many vertices are reachable from s.
- Take out t and count again.
- 3. Accept if the two numbers are the same.

### Immerman's Theorem

```
Theorem [Immerman/Szelepcsenyi]: NL=coNL Proof:
```

- (1) NON-CONN is NL-Complete
- (2) NON-CONN∈NL
- Hence, NL=coNL. ■

# Corollary

### **Corollary:**

 $\forall s(n) \ge log(n)$ , NSPACE(s(n))=coNSPACE(s(n))

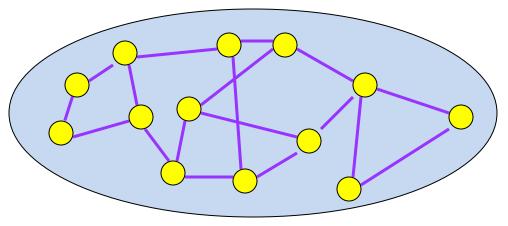
# Summary

- Connectivity is NL-complete
- Savitch's Theorem (USTCONN  $\in$  NL  $\subseteq$  L<sup>2</sup>)
- Immerman's theorem (NL=coNL)

## **USTCONN** is in log-space

- Low diameter property of Expander
- Connectivity Amplification
  - Powering
  - Zig-Zag product
- Log-space algorithm for USTCONN

# Expander



- Combinatorial: no small cuts, high connectivity
- Probabilistic: rapid convergence of random walk
- Algebraic: small second eigenvalue

Theorem. [Cheeger, Buser, Tanner, Alon-Milman, Alon, Jerrum-Sinclair,...]: All properties are equivalent!

# Expander Graph

- D-regular graphs: Every vertex has degree D
- A  $(N, D, \lambda)$  is a D-regular graph of N vertices where  $\lambda(G) \le \lambda$
- G = (N, D, λ) is an expander iff the spectral gap
   1-λ > 0
- G = (N, D, λ) is an expander if there exists ε >0 such that for any set S, |S| < ½ N, at least (1+ ε)|S| vertices of G are connected to some vertex in S</li>

# Normalized Adjacency Matrix M<sup>n</sup>

• G: D-regular undirected graph  $M^{n}(v_{i,}v_{j})=M(v_{i},v_{j})/D$ 

$$M (D=3)$$

	$V_1$	V <sub>2</sub>	<b>V</b> <sub>3</sub>	$V_4$
$V_1$	1	0	2	0
V <sub>2</sub>	0	1	1	1
<b>V</b> <sub>3</sub>	2	1	0	0
V <sub>4</sub>	0	1	0	2

#### Mn

	<b>v</b> <sub>1</sub>	V <sub>2</sub>	<b>v</b> <sub>3</sub>	V <sub>4</sub>
$v_1$	1/3	0	2/3	0
V <sub>2</sub>	0	1/3	1/3	1/3
<b>V</b> <sub>3</sub>	2/3	1/3	0	0
V <sub>4</sub>	0	1/3	0	2/3

# $(N,D,\lambda)$ -graph

- $1_N=(1,...,1)$  is an eigenvector of  $M^n$  with eigenvalue 1 since  $M^n*1_N=1*1_N$
- $|\lambda| <= 1$  for any other eigenvalue  $\lambda$  of M<sup>n</sup>
  - $\lambda(G)$ : the second largest eigenvalue of  $M^n$
  - (N,D,  $\lambda$ )-graph: a D-regular graph G on N vertices such that  $\lambda(G) <= \lambda$ .

# Diameter of a $(N,D,\lambda)$ -graph

Lemma: Diameter of a  $(N,D,\lambda)$  is bounded by  $O(\log N)$ 

#### Proof:

- Pick any vertex s, let l=O(logN). Then at least
   (1+ε)<sup>l</sup>>=N/2 vertices are at distance at most l to s.
- Pick any two vertices s and t, then at least one vertex is of distance at most I from both s and t
   →a path of length at most 2 I between any two vertices.

# ST-Connectivity for (N,D, λ)-graph

- Can be determined in space O(Log D\*logN)
- Enumerate all paths from s of length O(log N)
- Memory: log D for remembering an edge in the path, and at most O(log N) edges for a path.

### **Rotation Map**

For D-regular undirected graph G,

$$Rot_G: [N]x[D] \rightarrow [N]x[D]$$

	<b>V</b> <sub>1</sub>	V <sub>2</sub>	<b>V</b> <sub>3</sub>	$V_4$
$V_1$	1	0	1	1
$V_2$	0	0	1	0
<b>V</b> <sub>3</sub>	1	1	0	1
$V_4$	1	0	1	1

$$Rot_{G}(v1,2)=(v3,1)$$

$$Rot_{G}(v2,1)=(v3,2)$$

## Sketch of the algorithm

- Transform input graph into a D-regular nonbipartite graph (How?)
- Amplify the connectivity without increasing too much the degree

### Transforming G to an (N,D, λ)-graph

- Idea: increase the connectivity of G by powering G
- Challenge: keeping degree be constant by using zig-zag expander.

## Powering

G: an (N,D, λ)-graph G by rotation map Rot<sub>G</sub>.
 The t'th power G<sup>t</sup> of G is:

$$Rot_G(v_0,(a_1,...,a_t))=(v_t,(b_1,...b_t)).$$

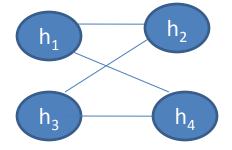
i.e., there is path  $v_0-a_1-b_1-v_1-a_2...v_{t-1}-a_t-b_t-v_t$ .

G: an  $(N,D, \lambda)$ -graph  $\longrightarrow$   $G^t$ :an  $(N,D^t, \lambda^t)$ -graph

In rotation map notation, this means that

# Zig-zag Graph Product

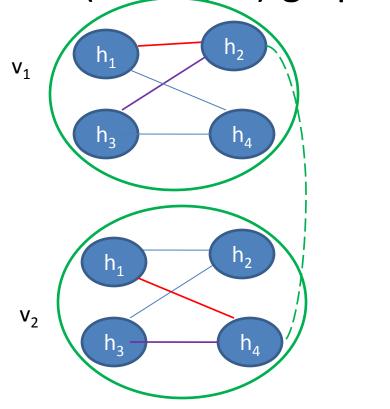
H: an (D, d,  $\alpha$ )-graph



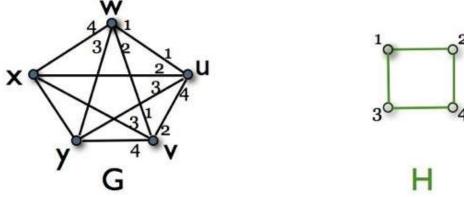
G: an  $(N,D, \lambda)$ -graph



a (ND,  $d^2$ ,  $\lambda'$ )-graph



# Zig-Zag Graph Product



G an  $(n,m,\alpha)$ -graph. H an  $(m,d,\beta)$  -graph.

Theorem. G(z)H is an  $(nm, d^2, \alpha+\beta)$ -graph.

zig-zag u vertex (u,3) edge

### **Main Transformation**

Input: H: a (D<sup>16</sup>,D,1/2)-graph and
 G: a (N,D<sup>16</sup>,λ)-graph where λ≤1-1/(DN<sup>2</sup>)

- Processing: for i=1 to l=O(logN) do  $G_i=(G_{i-1} \bigcirc H)^8$
- Output: G<sub>I</sub>=: a (N<sup>poly</sup>, D<sup>16</sup>, 1/2)-graph

# **USTCONN** is in log-space

• Theorem 1. USTCONN  $\in$  L

• Theorem 2. SL = L

### Questions

Thanks you for listening!