# Distributed Computing PWr, WIT 2021

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3: Communication complexity

All pairs shortest path problem (APSP)

- For every pair of nodes (u,v) compute the shortest path from u to v
- Store the results so that routing along these paths is possible



# Find diameter of the graph - naïve solution

Algorithm 11.1 Naive Diameter Construction

- 1: all nodes compute their radius by synchronous flooding/echo
- 2. all nodes flood their radius on the constructed BFS tree
- 3: the maximum radius a node sees is the diameter



#### Naïve solution complexity

time O(D) for diameter D Congestion of messages  $f$ n algorithms executed in parallel



# Reasonable size of messages

something like O(log n)

# Building block -- BFS

Broad First Search

**Definition 11.2.** ( $BFS_v$ ) Performing a breadth first search at node v produces spanning tree  $BFS_v$  (see Chapter 2). This takes time  $\mathcal{O}(D)$  using small messages.



# Pebbles algorithm



Algorithm 11.3 Computes APSP on  $G$ .

- 1: Assume we have a leader node  $\iint$  if not, compute one first)
- 2: compute  $BFS_l$  of leader l
- 3: send a pebble  $\mathcal{P}_{\mathcal{A}}$  traverse BFS<sub>l</sub> in a DFS way;
- 4: while P traverses  $BFS<sub>l</sub>$  do
- if  $P$  visits a new node v then 5:
	- wait one time slot;  $//$  avoid congestion
		- start  $(BFS_v)$  from node v; // compute all distances to v
- // the depth of node u in  $BFS_v$  is  $d(u, v)$ 8:
- end if  $9:$

10: end while

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- if  $P$  visits a new node  $v$  then  $5:$
- wait one time slot;  $//$  avoid congestion 6:
- start  $BFS_v$  from node v; // compute all distances to v  $7:$
- // the depth of node u in  $BFS_v$  is  $d(u, v)$ 8:
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10: end while

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## Time complexity

Theorem 11.5. Algorithm 11.3 computes APSP (all pairs shortest path) in time  $\mathcal{O}(n)$ .

#### Lower bound

Argument showing that complexity of any algorithm is at least b, where **b** is the bound

Known for sequential programs (e.g. the number for steps for sorting)

Considerably more complex to prove for distributed algorithms

#### Graph used for showing a n/log n lower bound

$$
\begin{array}{llll}\n\mathbf{L_0} & := & \{l_i \mid i \in [q] \} \\
\mathbf{L_1} & := & \{l'_i \mid i \in [q] \} \\
\mathbf{R_0} & := & \{r_i \mid i \in [q] \} \\
\mathbf{R_1} & := & \{r'_i \mid i \in [q] \} \\
\mathbf{R_2} & := & \{r'_i \mid i \in [q] \} \\
\end{array} \tag{7} \begin{array}{llll}\n\text{lower left} \\
\text{upper right} \\
\text{lower right}\n\end{array}
$$



Some number of edges between  $L_0$  and  $L_1$ , some number of edges between  $R_0$  and  $R_1$ 



#### Diameter 2 or 3



 $\Delta$ 

 $\mathcal{L}^{\text{max}}_{\text{max}}$  and  $\mathcal{L}^{\text{max}}_{\text{max}}$ 



# Informal argument

One has to check that for each (i,j) there is a connection either on the left or on the right side

#### 2-party communication model

- Alice gets x, Bob gets y
- The goal is to compute  $f(x,y) = \alpha$
- Alice and Bob exchange messages, finally both Alice and Bob must learn  $f(x,y)$

# Communication complexity

The simplest solution:

1. Alice sends x to Bob 2. Bob computes f(x,y) 3. Bob sends  $f(x,y)$  to Alice

Communication complexity

 $length(x) + length(f(x,y))$ 



#### Equality, its complexity?

(Equality.) We define the equality function  $EQ$  to be:

$$
EQ(x,y) := \begin{cases} \frac{1}{x} & x = y \\ 0 & x \neq y \end{cases}.
$$

# Formal definition of communication complexity

The total size of all messages exchanged …

… in the worst case.







# "rectangles"

A set S of pairs is a rectangle iff

If  $(x_0, y_0)$  and  $(x_1, y_1)$  belong to S, then  $(x_0, y_1)$  and  $(x_1, y_0)$  belong to S as well





# Rectangles



#### Importance of rectangles

For a given set of messages exchanged, the set of possible inputs  $(x,y)$  is a rectangle

# "monochromatic" rectangle

A rectangle where the value  $f(x,y)$  is fixed

One cannot stop the computation unless a rectangle is monochromatic



#### Monochromatic rectangles



# Fooling set

# $(x_1,y_1)$ ,  $(x_2,y_2)$ , ...,  $(x_n,y_n)$  is a fooling set iff

- $f(x_1, y_1) = f(x_2, y_2) = ... = f(x_n, y_n) = x$
- for any  $i\neq j$  we have  $f(x_i, y_j) \neq x$

Fooling set for Equality



#### Fooling set lemma

If S is a fooling set for f, then  $CC(f) = \Omega(\log |S|)$ .





 $CC$  of  $EQ$  is  $k-bit$  numbers  $SL(109(2^k)) = L(k)$ 

 $T_{\text{SL}(k)}$ 





#### **Auxiliary fact**

**Lemma 11.21.** Let x, y be k-bit strings. Then  $x \neq y$  if and only if there is an index  $i \in [2k]$  such that the i<sup>th</sup> bit of  $x \circ \overline{x}$  and the i<sup>th</sup> bit of  $\overline{y} \circ y$  are both 0.



#### Mapping to graph

**Definition 11.22.** Using the parameter q defined before, we define a bijective map between all pairs x, y of  $q^2$ -bit strings and the graphs in  $\mathcal{G}$ : each pair of strings x, y is mapped to graph  $G_{x,y} \in \mathcal{G}$  that is derived from skeleton G' by  $adding$ 

- edge  $(l_i, l'_i)$  to **Part L** if and only if the  $(j + q \cdot (i 1))$ <sup>th</sup> bit of x is 1.
- edge  $(r_i, r'_j)$  to Part R if and only if the  $(j + q \cdot (i 1))$ <sup>th</sup> bit of y is 1.

#### Mapping to graph

**Lemma 11.23.** Let x and y be  $\frac{q^2}{2}$ -bit strings given to Alice and Bob.<sup>1</sup> Then graph  $G := G_{x \circ \overline{x}, \overline{y} \circ y} \in \mathcal{G}$  has diameter 2 if and only if  $x = y$ .

#### Lower bound

It follows that computing APSP for a graph requires exchanging  $\Omega(n)$  bits between the left and the right part, i.e.  $\Omega(n/log(n))$  messages of size  $log(n)$ 

# Randomized complexity of equality

Algorithm 11.25 Randomized evaluation of  $EQ$ .

- 1: Alice and Bob use public randomness. That is they both have access to the same random bit string  $z \in \{0,1\}^k$
- 2: Alice sends bit  $a := \sum_{i \in [k]} x_i \cdot z_i \mod 2$  to Bob
- 3: Bob sends bit  $b := \sum_{i \in [k]} y_i \cdot z_i \mod 2$  to Alice
- 4: if  $a \neq b$  then

5: **we know** 
$$
x \neq y
$$

 $6:$  end if



