# Lower bound for read-once nondeterministic branching program for satisfiable Tseitin formula using tree-width

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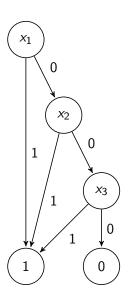
Summer School on Algorithms and Lower Bounds 2018
Prague
July 9, 2018

#### Outline

- Branching programs
- ► Tseitin formulas
- Lower bounds

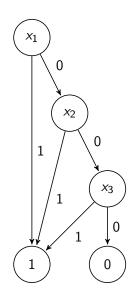
#### Branching program

- ▶ BP is a way to represent Boolean function
  - directed graph without cycles;
  - two sinks: labeled with 0 and 1, one source;
  - every internal vertex labeled with a variable and has two outgoing edges: labeled with 0 and 1;
  - ▶ the value of function equals label of the sink in the end of corresponding path.

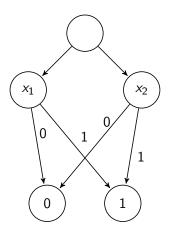


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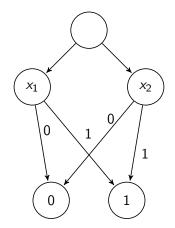
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  - the value of function equals label of the sink in the end of corresponding path.
- BP size is between circuit and formula sizes
  - $C(f) \leq 3BP(f) \leq O(L^{1+\epsilon}(f)),$
  - C(f) circuit complexity of f, L(f) size of minimal formula, BP size of minimal branching program.



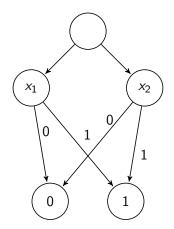
- NBP additionally has non-deterministic nodes:
  - non-deterministic nodes are unlabeled
  - ► the value equals 1 iff there exists a path to 1-sink



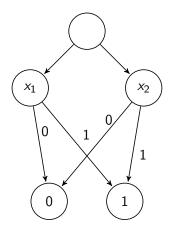
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- k-(N)BP if for every path every variable occurs no more than k times
- OBDD is 1-BP with fixed order for variables in every path



#### Known lower bounds for k-BPs

- ▶ (Borodin, Razborov, Smolensky, 1993)  $CLIQUE\_ONLY_n(G): \{0,1\}^{\frac{n\cdot(n-1)}{2}} \rightarrow 0,1$ 
  - ► CLIQUE\_ONLY<sub>n</sub>(G) = 1 iff graph G on n vertices is exactly  $\frac{n}{2}$ -clique
  - ▶ 1-NBP( $CLIQUE\_ONLY_n$ ) =  $2^{\Omega(n)}$
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  - ▶ 1-NBP $(f) = 2^{\Omega(n)}$
- ► (Thathachar, 1998) an explicit functions f<sub>k</sub> for every k:
  - k-NBP $(f_k) = 2^{\Omega(n^{1/k})}$
  - $(k+1)-\mathsf{BP}(f_k) = O(n)$

# Known lower bounds for k-BPs (2)

- ▶ (Duris, Hromkovic, Jukna, Sauerhoff, Schnitger, 2004)
  - lackbox parity of the number of triangles in a graph,  $\overline{\triangle}$  is 1 iff graph has no triangles
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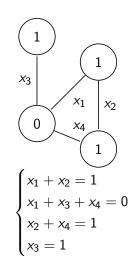
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- ▶ (Juhna, 1995)
  - $ightharpoonup f_k$  characteristic function of error-correcting codes
  - $\blacktriangleright$  k-NBP $(f_k) = 2^{\Omega(\sqrt{n})}$

#### Tseitin formulas

- ▶ Tseitin  $TS_{G,c}$  formula defined for a graph
  - every edge is labeled with a variable
  - every vertex has a 0-1 label:  $c:V \rightarrow 0,1$
  - $ightharpoonup TS_{G,c}(x) = 1 \iff$

$$\bigwedge_{v \in V} \left( \sum_{e \text{ incident } v} x_e = c(v) \bmod 2 \right)$$

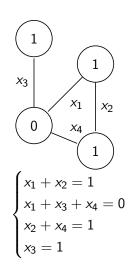


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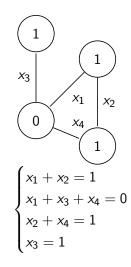


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- Unsatisfiable Tseitin formulas are classical hard examples for proof systems:
  - Resolution [Tseitin, 1968], [Urquhart, 1987]
  - ▶ Bounded depth Frege [Ben-Sasson, 2002], [Pitassi, Rossman, Servedio, Tan, 2016]
  - ▶ Polynomial Calculus over field with char != 2 [Alekhnovich, Razborov, 2001]
  - ► Tree-like Lovasz-Schrijver [Itsykson, Kojevnikov, 2006]



# Tseitin formulas (2)

- (Itsykson, Knop, Romashchenko, Sokolov, 2017) Exponential lower bound for OBDD(join) proof systems for unsatisfiable Tseitin formulas
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  - $DBDD(TS_{G,c}) = 2^{\Omega(n)}$
- ▶ OBDD is a partial case of 1-BP
  - ► (Bryant, 1991) (Sieling, Wegener, 1995)  $f: OBDD(f) = 2^{\Omega(n)}$ , 1-BP(f)=poly(n)

The goal: what is the size of 1-BP for satisfiable Tseitin formulas?

#### Lower bound for Tseitin formula on an expander

#### Theorem:

1-NBP for satisfiable Tseitin formula for (n, d,  $\alpha$ )-expander is  $2^{\Omega(n)}$ , where

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- ▶  $(n, d, \alpha)$ -expander is a d-regular graph on n vertices with absolute value of the second largest eigenvalue  $\leq d \cdot \alpha$

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**Generalized theorem:** 1-NBP for a satisfiable Tseitin formula on a connected graph G has at least  $2^{|V|-k_G(I)-k_G(|E|-I)+1}$  nodes, where the value  $k_G(I)$  denotes the maximal number of connected components that can be obtained from G by deleting of I edges.

#### The comparison with other results

Satisfiable Tseitin formulas  $TS_{G,w}$  on  $(n,d,\alpha)$ -expander can be represented by:

- $ightharpoonup CNF(TS_{G,c})=O(n)$
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Best previously known gaps:

$CNF(f) = O(n^3)$	1-NBP(f)= $2^{\Omega(n)}$ (Duris et al, 2004)
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$1-NBP(\rceil f)=O(n)$	$1-NBP(f)=2^{\Omega(n)}$ (Duris et al, 2004)
	probabilistic construction
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**Theorem:** 1-NBP for a satisfiable Tseitin formula on a connected graph G has at least  $2^{|V|-k_G(I)-k_G(|E|-I)+1}$  nodes, where the value  $k_G(I)$  denotes the maximal number of connected components that can be obtained from G by deleting of I edges.

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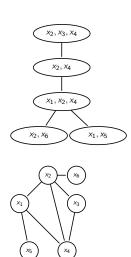
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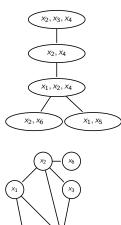
Get that at least  $2^{(C_1-C_2)n}$  different nodes are on the *I*-th level, so is in the 1-NBP

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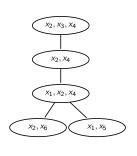
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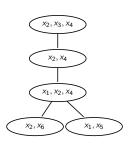
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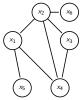




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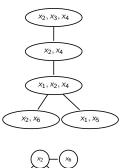




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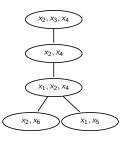


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**Tree-width** (path-width) of a graph is the minimal width among all its tree (path) decompositions minus 1.





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**Grid Minor Theorem** [Robertson, Seymour 1986], [Chuzhoy 2015]:

Every graph G of a tree-width t has a grid minor of size  $t^{\delta}$ , where  $\delta < \frac{1}{36}$ .

# Lower bound for any graph based on its tree-width

**Lower bound using tree-width**: 1-NBP for satisfiable Tseitin formula on a graph G has size  $\Omega(2^{t^{\delta}})$ , where t is a tree-width of G,  $\delta < \frac{1}{36}$ .

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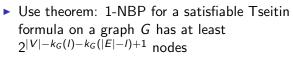
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After that we get a lower bound  $2^{\Omega(2\varepsilon\sqrt{|V|})} = 2^{\Omega(s)}$ 

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- ▶ **Deletion of edge** *x<sub>i</sub>*: substitute any value that will not break the satisfiability of the formula
- ▶ **Deletion of vertex** *v*: delete all connected edges one-by-one
- ▶ Contraction of edge  $x_i$ : the same as the satisfiability of the formula  $\exists x_i : Ts_{G,w}(x)$ 
  - in 1-NBP all nodes labeled with x<sub>i</sub> should be changed to non-deterministic nodes

# Upper bound using path-width

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No exponential lower bounds for semantic 1-NBP for a boolean function

All known results with exponential lower bounds are for functions with non-boolean domain [Cook, Edmonds, Medabalimi, Pitassi, 2016], [Jukna, 2009]