# Borne inférieure de circuit : une application des expanders 

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## Motivation

We have knowledge on a system, expressed as a list of constraints, a CNF:

$$
F=\bigwedge_{i=1}^{n} \bigvee_{j} \ell_{j} \text { where } \ell_{j} \in\{x, \neg x\} \text { for some variable } x
$$

We want to query $F$ many times:

- Is $F$ satisfiable? Is $F\left[x_{1} \leftarrow 0, x_{2} \leftarrow 1, x_{3} \leftarrow 0\right]$ still satisfiable?

■ How many assignments do satisfy $F\left[x_{1} \leftarrow 0\right]$ ?

- etc.

Example: car configuration on the website of Renault.

## Motivation

- Problem: All these queries are hard (NP or \#P complete).

■ Strategy: Compile $F$ to an optimized data structure that support these queries in polynomial time.

- Main idea: Spend time (possibly exponential) only once to optimize and not for each query

Data structure: boolean circuits with good properties.

## Which data structure?

In this talk DNNF: Decomposable Negation Normal Form A DNNF:

- a boolean circuit $C$ with $\vee$ and $\wedge$ gates
- Negation Normal Form: inputs are labeled by $x$ or $\neg x$ with $x$ a variable
- Decomposable: For $\alpha$ an $\wedge$-gate whose inputs are $\alpha_{1}$ et $\alpha_{2}$, we have $\operatorname{var}\left(\alpha_{1}\right) \cap \operatorname{var}\left(\alpha_{2}\right)=\emptyset$



## Remarks

- DNFs are DNNFs
- Stable by partially assigning variables

■ One of the most general family of circuits that still supports interesting queries

- Satisfiability in linear time
- Enumeration of satisfying assignments with linear delay
- Existential quantification of a subset of variables



## Questions: upper bounds

## Question (Upper bounds)

How can we use the structure of a formula to compile it in FPT-time?


Figure: Incidence graph

■ Which parameters are relevent?
■ Close to the parametrized complexity of \#SAT.

## Questions: Lower bounds

In this talk:

## Question (Lower bounds)

Can we transform every CNF-formula $F$ into a DNNF of polynomial size in $|F|$ ?

The answer is no:

- A $2^{\Omega(\sqrt{|F|})}$ lower can be deduced from known lower bound on monotone circuits
- In this talk: we use expanders to get a $2^{\Omega(|F|)}$ lower bound on an infinite family of CNF.


## Graph formula and vertex covers

- Given a graph $G=(V, E)$, define $F_{G}=\bigwedge_{(x, y) \in E}(x \vee y)$
- Satisfying assignment of $F=$ vertex covers of $G$

■ $S \subseteq V: \operatorname{VC}(G, S)=$ vertex covers $C$ of $G$ such that $S \subseteq C$

## Key theorem:

## Theorem

Let $G$ be a graph of degree $d$ and $\mu_{d}=\left(1+2^{-d}\right)>1$ :

$$
\# \mathrm{VC}(G, S) \leq \mu_{d}^{-|S|} \# \mathrm{VC}(G)
$$

$\rightarrow$ if $S$ is big, $\operatorname{VC}(G, S)$ is exponentially smaller than $\operatorname{VC}(G)$

## Proof of the key theorem

For $S=\{s\}, N_{s}=$ neighbors $(s),\left|N_{s}\right|=d:$
■ \#VC( $G)=\# \mathrm{VC}$ that contain $s+\# \mathrm{VC}$ that do not contain $s$

- Transform a VC C containing $s$ to one which do not.

Remember $C \cap N_{S}$


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Remember $C \cap N_{S}$


- From this and $C \cap N_{s}$, one can reconstruct $C$
- \#VC containing $s \leq 2^{d} \times \# \mathrm{VC}$ that don't

■ $\left(1+2^{-d}\right) \# \mathrm{VC}(G,\{s\}) \leq \# \mathrm{VC}(G)$
■ For $|S|>1$, induction.

## Proof strategy

Let $G=(V, E)$ be a graph $(x, y) \in E, D$ a DNNF for $F_{G}, v \in D$ such that:


Solutions of $D_{v}$ and $D$ :

- must assign $x$ or $y$ to 1 (otherwise, not a solution of $F$ )


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Let $G=(V, E)$ be a graph $(x, y) \in E, D$ a DNNF for $F_{G}, v \in D$ such that:


Solutions of $D_{v}$ and $D$ :

- must assign $x$ or $y$ to 1 (otherwise, not a solution of $F$ )

■ Actually they either all assign $x$ to 1 or all $y$ to 1

## How to find such gates

$\left(x_{1}, y_{1}\right), \ldots,\left(x_{n}, y_{n}\right)$ an induced matching of $G$ and $v$ a gate such that:


One can always find $S \subseteq X \cup Y$ of size $n$ such that each solution of $v$ must contain $S$

1 Choose $G$ wisely
2 Greedily look for a gate $v$ with enough variables in subcircuit: roughly $|V| / 2$
3 Extract large induced matching $S$ from $\operatorname{var}(v)$ to $V \backslash \operatorname{var}(v)$

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## Expanders

■ Goal: ensure that there is always a large induce matching between $W \subseteq V$ of size roughly $|V| / 2$ and $(V \backslash W)$ in $G$
■ Boundary expansion: $G=(V, E)$ is a $(c, d)$-expander iff

- it is of degree $d$ and
- for each $W \subseteq V$, if $\frac{|V|}{d} \leq|W| \leq \frac{|V|}{2}$ then $\partial W=\left|N_{W} \backslash W\right| \geq c|W|$.
■ Bounded degree + expansion: one can find large induced matching from subset of variables $W$ of size roughly $|V| / 2$ to $V \backslash W$


## Theorem

There exists a familly of CNF formulas $\left(F_{n}\right)_{n \in \mathbb{N}}$ such that $\left|\operatorname{var}\left(F_{n}\right)=n\right|$ and every DNNF computing $F_{n}$ is of size $2^{\Omega(n)}$.

## Trying to explain old lower bounds

■ Known lower bounds of this kind are usually of the form $2^{\Omega(\sqrt{|F|})}$

- Most examples are based on ( $n \times n$ ) matrices or grids

■ In grids, large subsets of variables have a boundary of size roughly $\sqrt{N}$ where $N=n^{2}$ is the number of variables

- Expander is a way of having a linear size boundary and allows us to lift lower bounds


## Conclusion

- We prove a strong exponential lower bound on some family of circuits representing a very restricted class of CNF formulas (2-CNF, monotone, read 3)
- Closes open questions in the domain of knowledge compilation (Marquis, Darwich, 2002)
- Can we find other lower bounds using these kind of techniques?

