

# Cliquewidth and Knowledge Compilation

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# Boolean functions

$$f(x) : B^n \rightarrow B$$

$$B : \{0, 1\}$$

$n$  : a positive integer

$$x = (x_1, x_2, \dots, x_n) : x_i \in B$$

# Boolean functions

*Clausal entailment query:*

Given a partial truth assignment, can it be extended to a complete satisfying assignment?

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*Good representation of Boolean functions:*

The clausal entailment query can be answered in poly-time.

Some applications require good representations of Boolean functions.

# Boolean function representations - normal forms

- Conjunctive Normal Form (CNF)
- Disjunctive Normal Form (DNF)

DNF representation:

$$\bigvee_{Y \in T} \left( \bigwedge_{i|y_i=1} x_i \bigwedge_{j|y_j=0} \neg x_j \right)$$

where  $T$  is a set of solutions to a Boolean function  $f$

DNF is a good representation while CNF is not.

# Knowledge compilation

- Off-line phase:
  - propositional theory is compiled into some target language
  - the target language must be a good representation!
  - can be slow

# Knowledge compilation

- On-line phase:
  - the compiled target is used to efficiently answer a number of queries
  - fast (partly due to being good)

# Knowledge compilation representation

NNF : Negation Normal Form

- conjunctions and disjunctions are the only connectives used (e.g. CNF, DNF)

DNNF : Decomposable Negation Normal Form

- conjunctions and disjunctions are the only connectives used
- atoms are not shared across conjunctions



# Knowledge compilation representation

## Properties:

- DNNF is a highly tractable representation
- every DNF is also a DNNF
- $\exists$  exponential DNF & linear DNNF for the same Boolean function

# Automated DNNF construction & graph parameters

- efficient DNNF compilation achieved when the input clausal form is parameterised by the *treewidth* of the primal graph of the input CNF

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- efficient DNNF compilation achieved when the input clausal form is parameterised by the *treewidth* of the primal graph of the input CNF
- treewidth is always high for dense graphs
- better parameter: *cliquewidth*

# Knowledge compilation result

Given a circuit  $Z$  of cliquewidth  $k$ , there is a DNNF of  $Z$  having size  $O(9^{18k} k^2 |Z|)$ .

Moreover, given a clique decomposition of  $Z$  of width  $k$ , there is a  $O(9^{18k} k^2 |Z|)$  algorithm constructing such a DNNF.

# Main result

Let  $Z$  be a Boolean circuit having cliquewidth  $k$ .  
Then there is another circuit  $Z^*$  computing the same function  
as  $Z$  having treewidth at most  $18k + 2$   
and which has at most  $4|Z|$  gates where  $Z$  is the number of  
gates of  $Z$ .

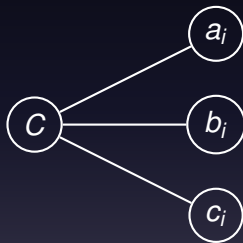
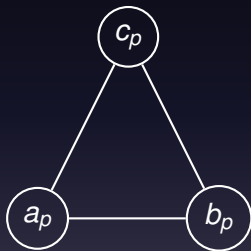
Consequence: cliquewidth is not more 'powerful' than treewidth  
for Boolean function representation

# Obtaining the Know. Comp. Res. from the Main Result

- upgrade from DNNF parameterized by treewidth of the primal graph of the input CNF to the treewidth of its incidence graph

# Primal vs. incidence graph

$$C = a \vee b \vee c$$





# Obtaining the Know. Comp. Res. from the Main Result

- upgrade from DNNF parameterized by treewidth of the primal graph of the input CNF to the treewidth of its incidence graph
- extension from input CNF to input circuits (by Tseitin transformation plus projection removing additional variables)
- replacing the treewidth of the input circuit by the cliquewidth of the input circuit using the main result

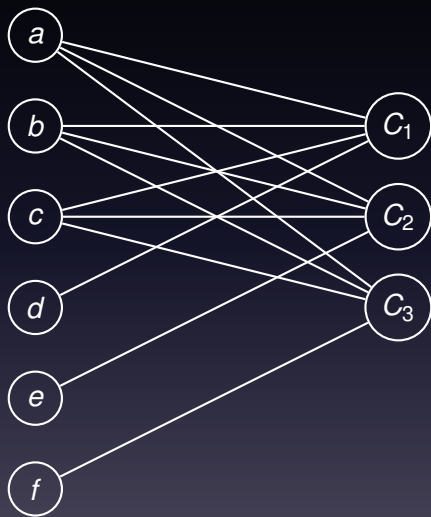
# Small Cliquewidth and Large Treewidth

- a necessary condition: existence of large complete bipartite subgraphs
- examples: complete graph, complete bipartite graph

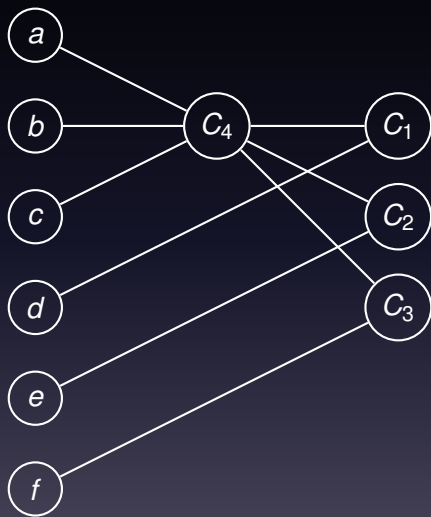
## Elimination of large bicliques in Boolean circuits

- necessary and sufficient condition:  
a set  $X$  of many gates of the same type ( $\vee$  or  $\wedge$ ) share a large set of  $Y$  common inputs
- elimination: introduce a new gate  $g$  of the same type with inputs  $Y$ ; connect the output of  $g$  to all of  $X$  instead  $Y$
- example:  $(a \vee b \vee c \vee d) \wedge (a \vee b \vee c \vee e) \wedge (a \vee b \vee c \vee f)$
- new gate:  $C = (a \vee b \vee c)$
- modified circuit:  $(C \vee d) \wedge (C \vee e) \wedge (C \vee f)$

## Elimination of large bicliques in Boolean circuits



## Elimination of large bicliques in Boolean circuits



# Conclusions

- showed an efficient knowledge compilation parameterised by cliquewidth of a Boolean circuit
- showed that cliquewidth is not more 'powerful' than treewidth for Boolean function representation