# Recursive Backdoors for SAT

Nikolas Mählmann, Sebastian Siebertz, Alexandre Vigny

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 $\phi$  is not in 2CNF but very *close* to 2CNF.

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### Example:

$$\phi = (x_{1_{-}} \lor x_{2_{-}} \lor x_{3_{+}} \lor x_{4_{+}}) \land (x_{4_{+}} \lor x_{5_{+}}) \land (x_{5_{+}} \lor x_{6_{+}}) \land \dots$$

 $\{x_1, x_2\}$  is a backdoor of  $\phi$  to 2CNF.

A backdoor B of  $\phi$  to  $\mathcal C$  is a set of variables that reduces  $\phi$  to a formula from  $\mathcal C$  no matter which assignment is chosen.

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$$\{x_{1}, x_{2}\} \text{ is a backdoor of } \phi \text{ to 2CNF}.$$

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# Using Backdoors to Solve SAT

Algorithm: Given a backdoor of  $\phi$  of size k to some tractable class  $\mathcal{C}$ , test every of the  $2^k$  possible assignments.

Runtime complexity:

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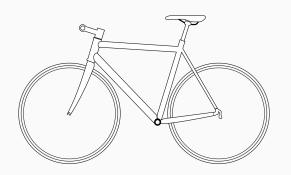
There exists fpt backdoor detection algorithms to 2CNF, Horn, ...

### **Motivation for Recursive Backdoors**

handlebars : {straight, riser, drops, wide}

frameset : {city, racing, mtb}

tire width : {21mm, 23mm, 28mm, 30mm, 35mm, 50mm}

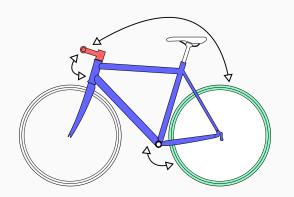


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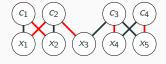
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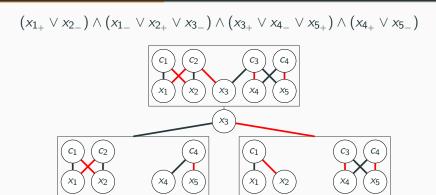
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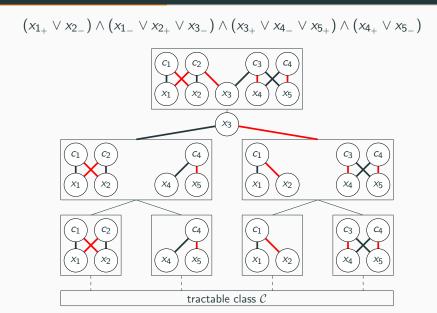


$$(x_{1_{+}} \lor x_{2_{-}}) \land (x_{1_{-}} \lor x_{2_{+}} \lor x_{3_{-}}) \land (x_{3_{+}} \lor x_{4_{-}} \lor x_{5_{+}}) \land (x_{4_{+}} \lor x_{5_{-}})$$





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# **Recursive Backdoor Depth**

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RBs with a limited depth can contain an **unbounded** number of variables!

Given a RB of  $\phi$  of depth k to a tractable class  $\mathcal C$  we can decide satisfiability of  $\phi$  in time:

$$2^k \cdot poly(|\phi|)$$

## **RB** Detection

Again we need an fpt detection algorithm for RBs:

Input:  $(\phi, k)$ 

# Output:

- There exists no RB of depth at most k for  $\phi$ , or
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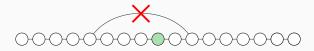
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## Theorem (Mählmann, Siebertz, Vigny)

RB detection to  $C_0$  is fixed parameter tractable.

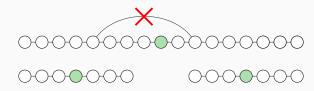
### **Bounded Diameter**

RB to  $C_0$  of depth  $\leq k$  implies diameter  $\leq \lambda_k := 4 \cdot 2^k$ .



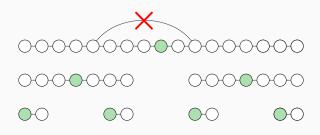
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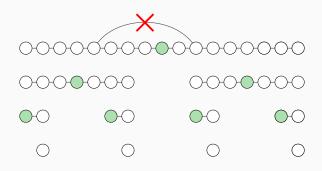
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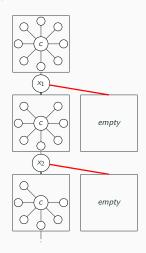


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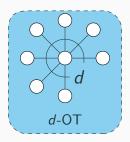
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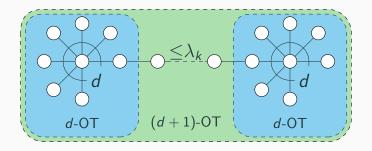
For k = d:



 $\rightarrow$  a *d*-clause in *G* is a *d*-obstruction-tree.

### **Obstruction-Trees:** k = d + 1

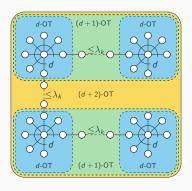
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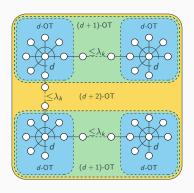
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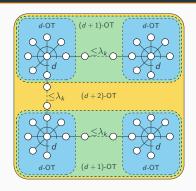
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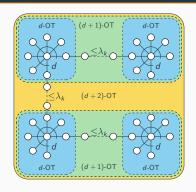
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Given  $\phi$  with maximal clause degree d, there exists an algorithm SEARCH $_i$  that either:

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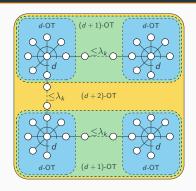
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- concludes that no RB of depth  $\leq k$  to  $\mathcal{C}_0$  exists

## **Summary**

#### What we have seen:

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- RBs generalize SAT backdoors and extend their power
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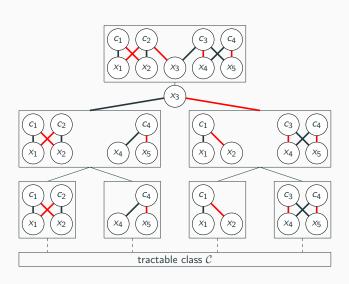
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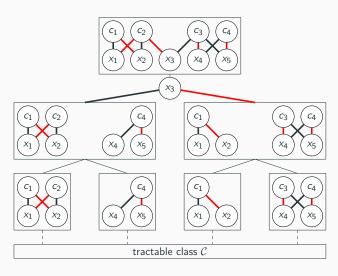
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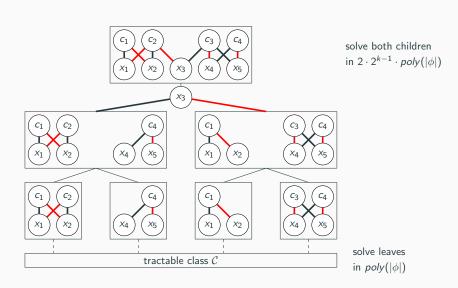
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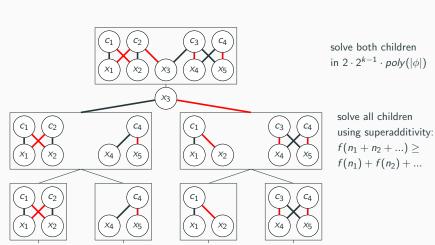
Thank you for listening!





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tractable class  $\mathcal C$ 

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