

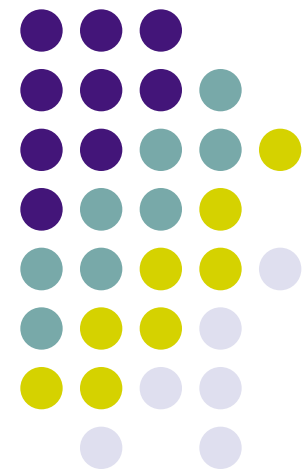
SAT-Based Analysis of Feature Models is Easy



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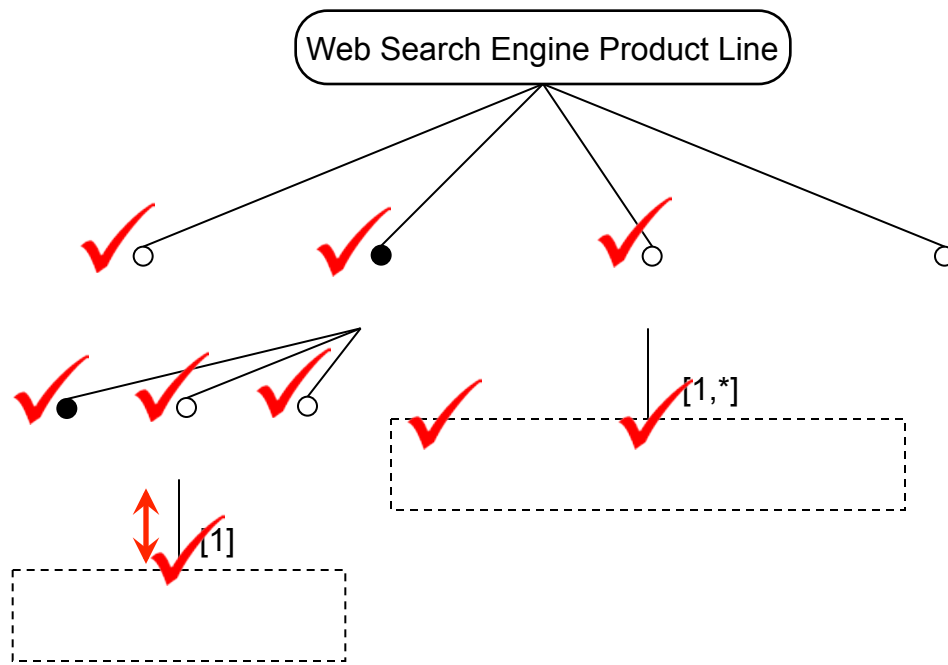
SPLC, Aug 2009 – San Francisco, USA

Outline

- Feature Models
- Feature Model Analysis
- SAT-Based Analysis
- Research Goal
- Hardness of SAT Problems
- Hardness of Feature Model SAT Problems
- Conclusion and Research Impact

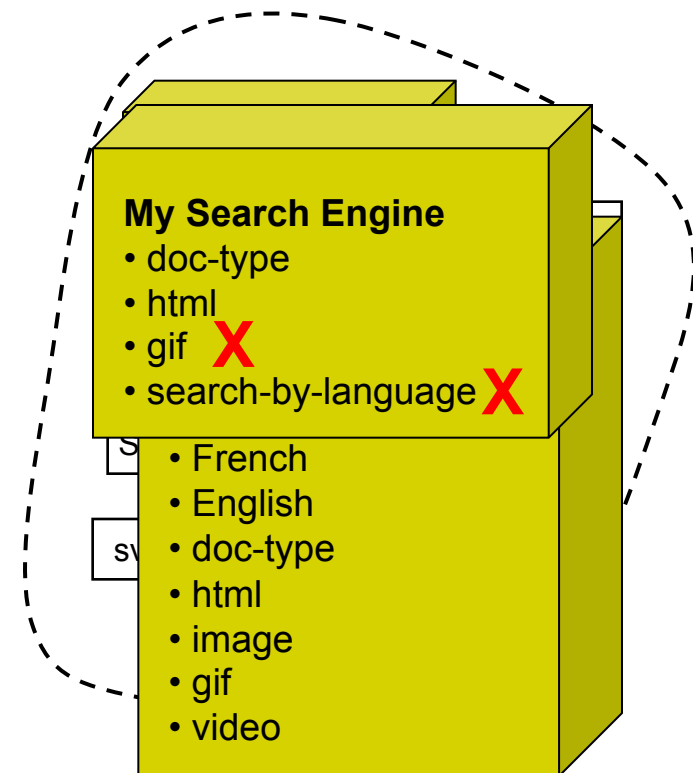
Feature Models

Representing the similarities and differences within a system family



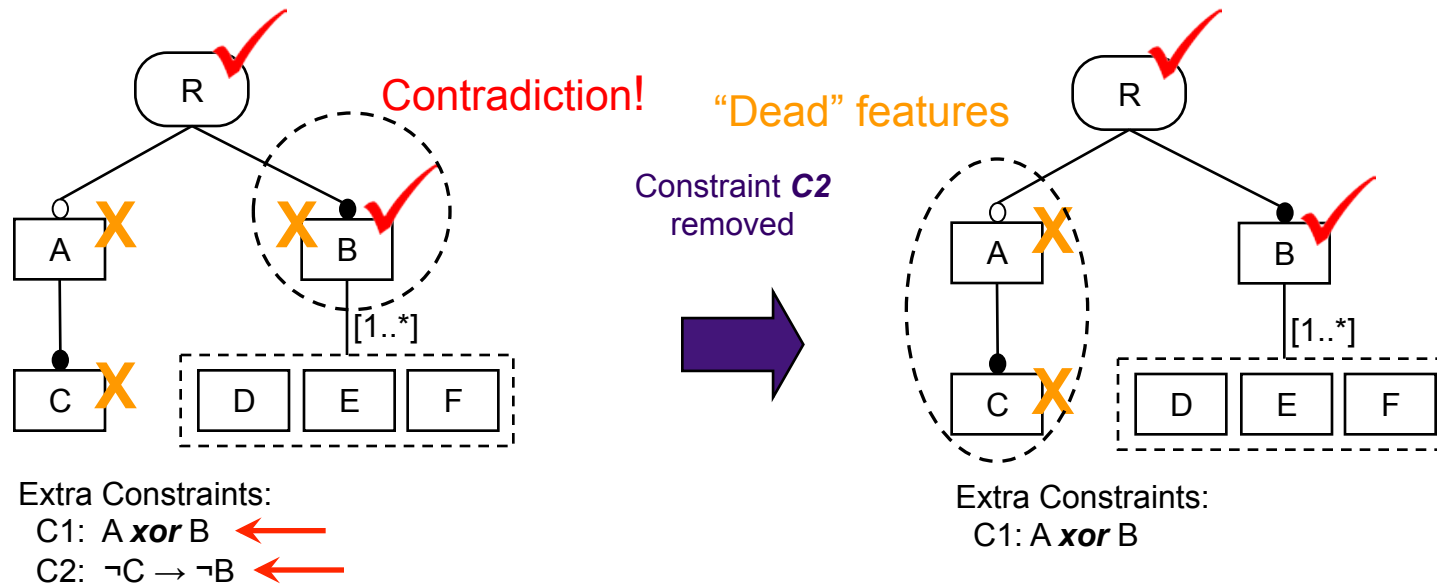
search-by-language → page-translation ←
page-preview → ¬svg

Web Search Domain



Feature Model Analysis

Constructing and Maintaining feature models can be a laborious task



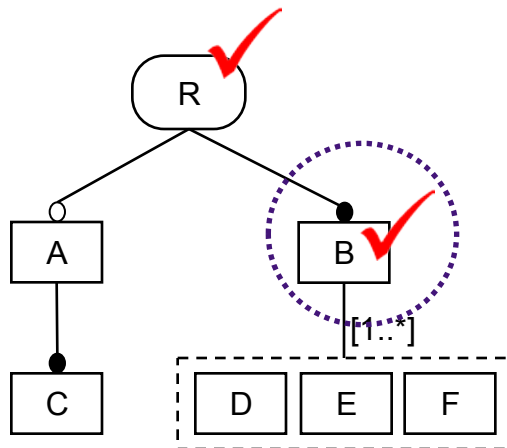
Model is **Inconsistent!**

Model contains **"dead" features**

Automated support is required for **Debugging** feature models

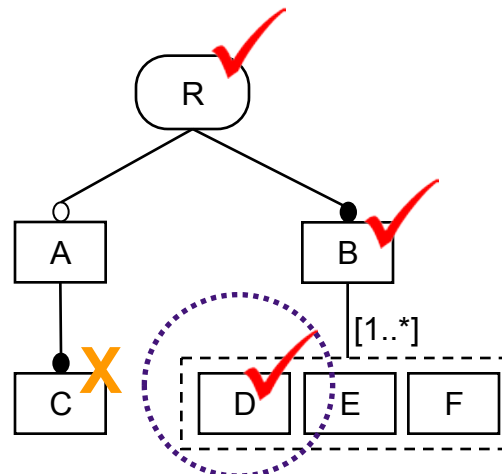
Feature Model Analysis

Product Configuration



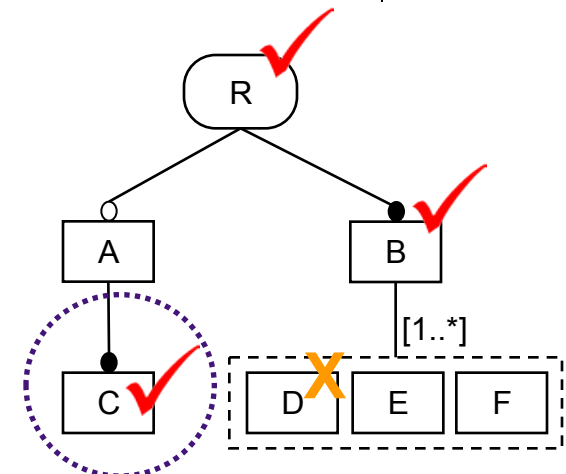
Extra Constraints:
C1: C *xor* D

Propagation of R selection



Extra Constraints:
C1: C *xor* D

Propagation of C deselection



Extra Constraints:
C1: C *xor* D

Toggling D selection

Automated support is required for **Configuring** feature models

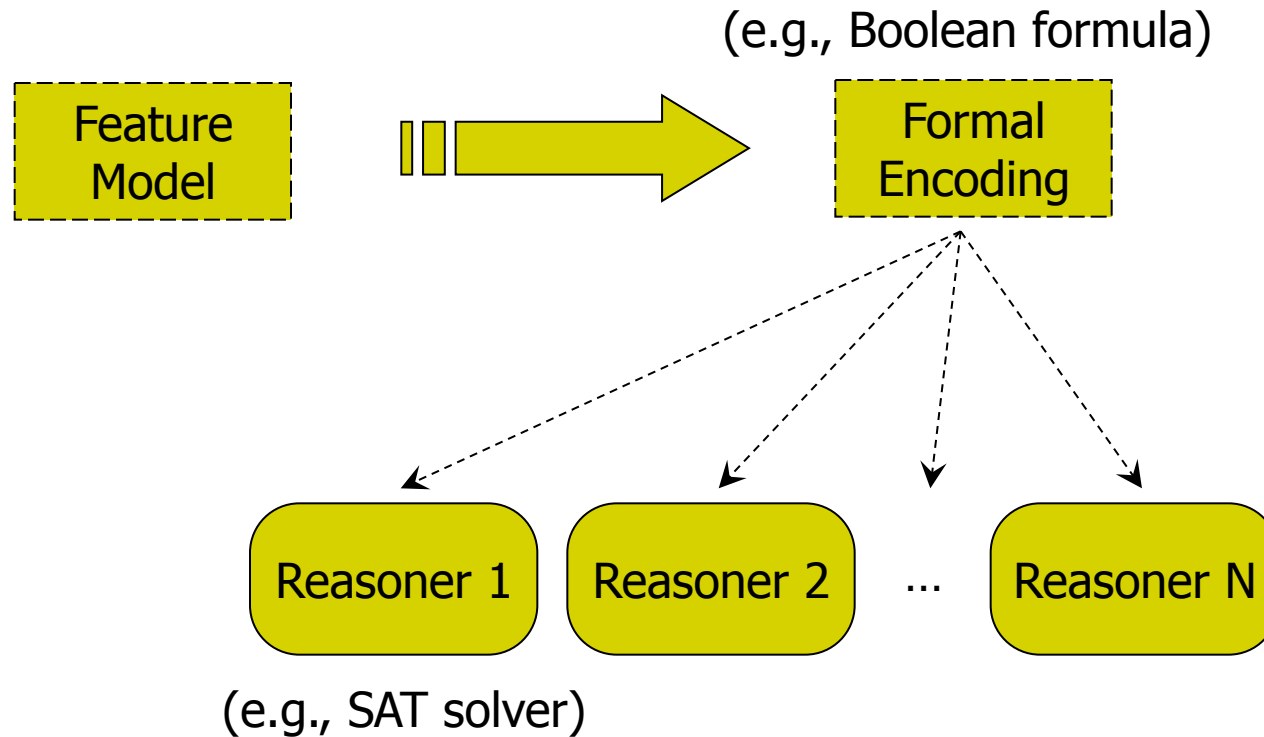
Feature Model Analysis

Automated Reasoning and Configuration

- A long list ...
 - Checking consistency
 - Detecting dead/common features
 - Filtering/listing configurations
 - Computing valid domains
 - Resolving conflicts
 - Counting configurations
 - Checking refactoring/edits (e.g., equivalence, implication, difference)
 - Computing metrics (e.g., variability degree, commonality of a feature)
 - ...

Feature Model Analysis

An effective strategy to automate FM analysis is the use of formalisms



SAT-Based Analysis

Encoding feature models as Boolean formulas

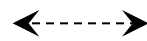
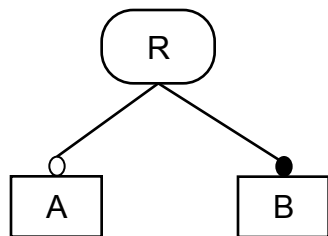
$$f = (R) \text{ and } (\sim A \text{ or } R) \text{ and } (\sim B \text{ or } R) \text{ and } (\sim R \text{ or } B)$$

- **Boolean formula**
 - Variables; Domain = $\{true, false\}$
 - Logic operators = {and, or, not, implication, bi-implication}
- **CNF formula (conjunctive normal form)**
 - Disjunction of clauses; Clause is a conjunction of literals;
 - Literal is a variable or its negation
- **Satisfiability Problem**
 - Is there an assignment to f 's variables that evaluates f to *true*?
 - If so, f is satisfiable, otherwise f is unsatisfiable
- **SAT solvers**
 - Systems that check formula satisfiability
 - E.g., f is satisfiable ($R=A=B=true$)

SAT-Based Analysis

Encoding feature models as Boolean formulas

Feature Model



$$f = (R) \text{ and } (\sim A \text{ or } R) \text{ and } (\sim B \text{ or } R) \text{ and } (\sim R \text{ or } B)$$

Analysis

Answer

SAT formulation

Consistency	Yes!	f is SAT (e.g., $R=\text{true}$, $A=\text{true}$, $B=\text{true}$)
Dead Features	None!	$(f \ \& \ A)$ is SAT \rightarrow A is dead
Common Features	$\{R, B\}$	$(f \ \& \ \sim B)$ is UNSAT \rightarrow B is common
Valid Domains	$R=\{\text{true}\}$, $A=\{\text{true}, \text{false}\}$, $B=\{\text{true}\}$	\rightarrow ...
List Configurations	1. $\{R, A, B\}$, 2. $\{R, \sim A, B\}$	\rightarrow ...

...

Research Goal and Relevance

Problem

Continuous emergence of SAT-based tools in the SPL field (e.g. configurators, reasoners) however the fundamental underlying problem tackled (SAT) is well-known to be **hard**

→ **Satisfiability is NP-complete (e.g., 3-SAT)**

Therefore, it is fair to ask...

- How well do SAT-based reasoners and configurators scale?
- Can we rely on the efficiency of SAT-based tools?

Research Goal and Relevance

Good news!

- Some SAT problems are tractable (e.g., 2-SAT)
- Yet for others tractability boundaries are known (e.g., 3-SAT)

Relevant Research Question:

Are SAT problems induced from feature models tractable as observed by researchers? If so, what evidences support this fact?

Hardness of 3-SAT Problems

Random 3-CNF Formula

$(\bar{A} \text{ or } B \text{ or } \bar{C}) \text{ and } (\bar{A} \text{ or } \bar{D} \text{ or } C) \text{ and } (D \text{ or } \bar{C} \text{ or } \bar{B})$

Clauses has exactly **3 literals**

Clause Generation:

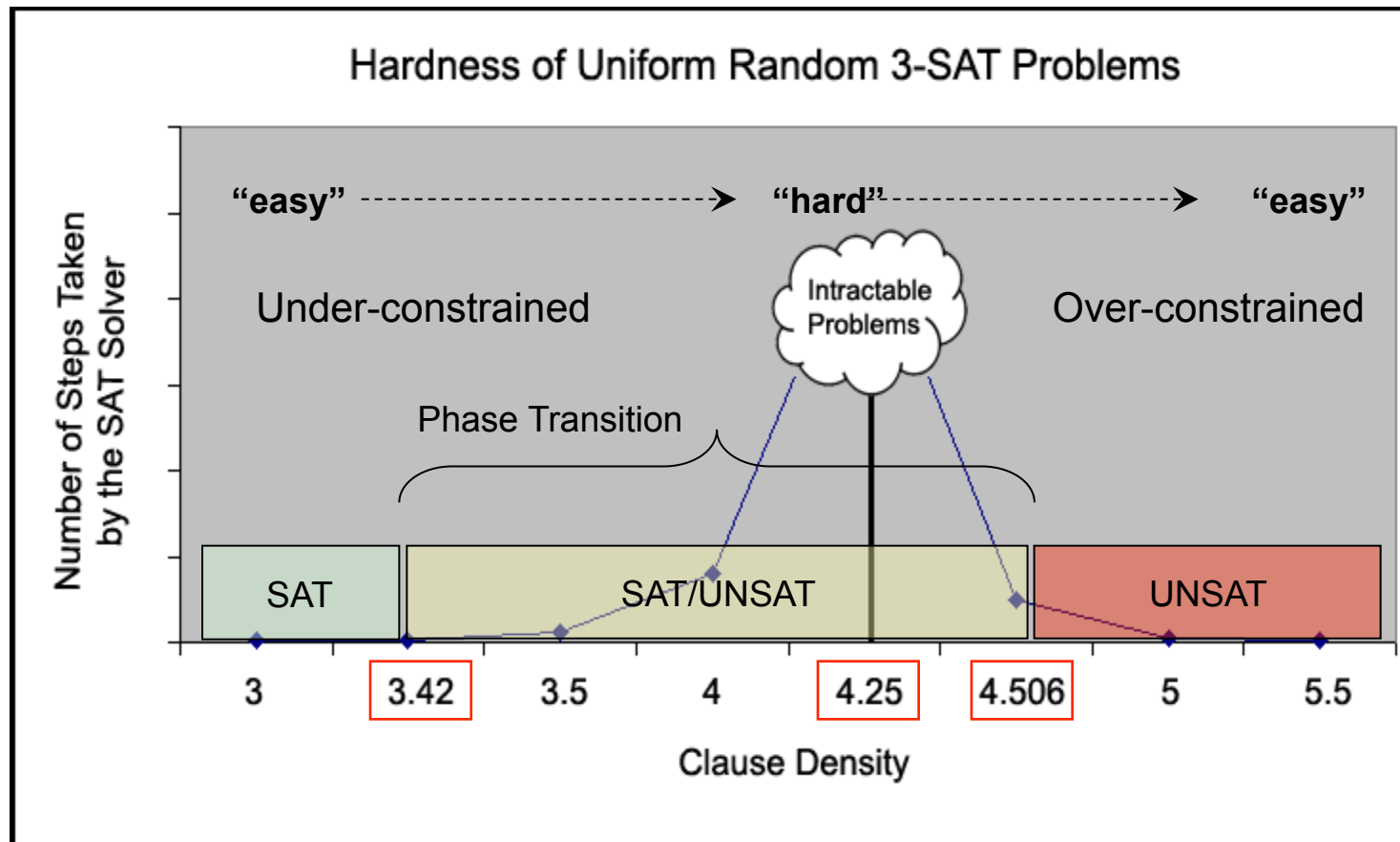
- Select 3 distinct variables randomly
- Negate each with probability 50%
- Create a distinct clause

Clause density: $\#clauses / \#variables = 3/4 = 0.75$

- Low density \rightarrow **under-constrained**
- High density \rightarrow **over-constrained**

Hardness of SAT Problems

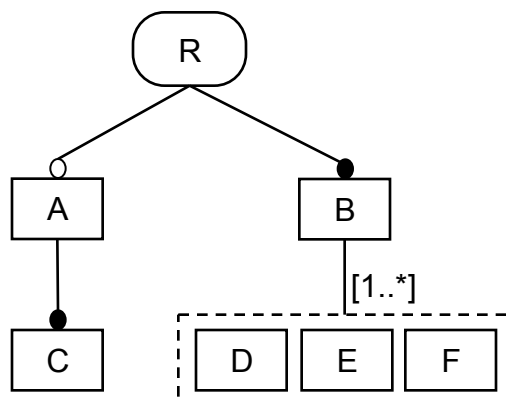
What we know about the hardness of 3-SAT problems?



Hardness of Feature Model SAT Problems

Properties of Feature Models as SAT problems

Feature Tree:



$$Fm = Ft \text{ and } Ctc$$

Cross-tree Constraints:

C1: $A \text{ xor } B$
C2: $\neg C \rightarrow \neg B$

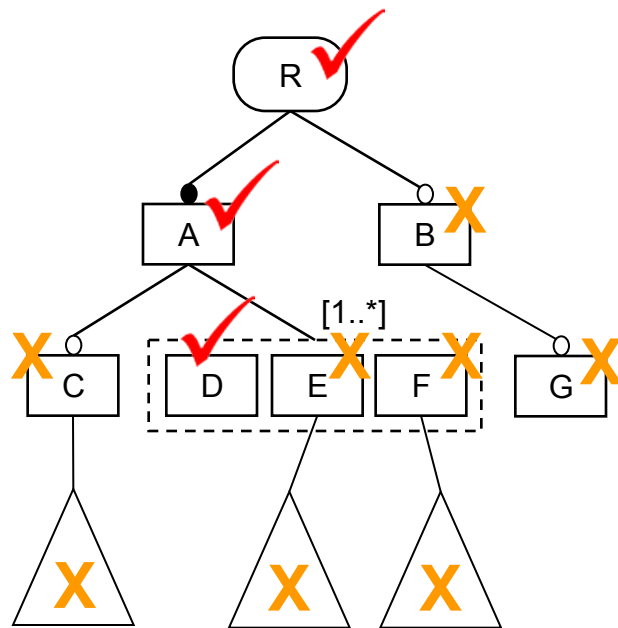
Facts

- Ft is larger (# of variables) than Ctc
- Ft is structured (hierarchy of variables)
- Ctc is an arbitrary propositional formula

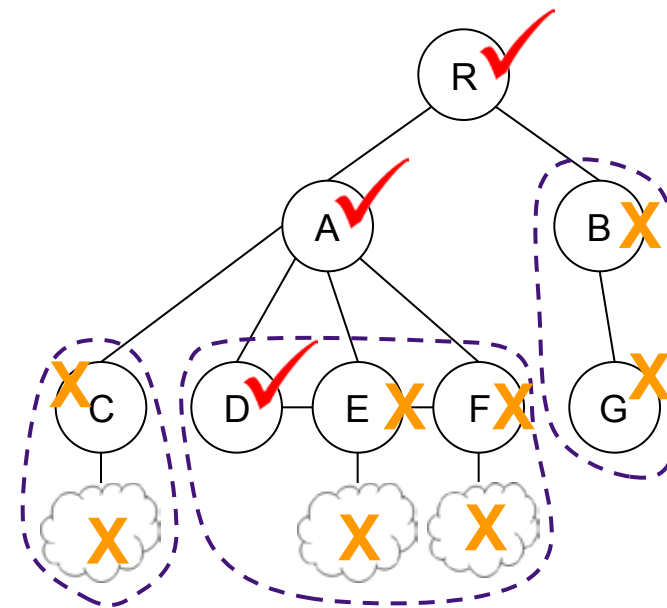
Hardness of Feature Model SAT Problems

Satisfiability properties of **feature tree** formulas

Feature Tree



Constraint Graph



- » A well-formed feature tree is always satisfiable
- » Complexity: $O(1)$

- » SAT solver complexity: $O(n)$
- » Backtrack-free

The satisfiability of feature trees can be checked in linear time by a SAT solver!

Hardness of Feature Model SAT Problems

The cross-tree constraints are arbitrary propositional formulas

$$Fm = Ft \text{ and } Ctc$$

linear time

? (empirical analysis)

Critical Question: Can the CTC formula cause the feature model SAT problem to be intractable?

What is the representativeness of the Ctc?

$$\text{CTCR} = \text{vars}(Ctc) / \text{vars}(Ft)$$

Hardness of Feature Model SAT Problems

3-CNF feature models

$3\text{-CNF-FM} = Ft$ and 3-CNF

Facts about 20 real feature models studied:

1. CTCR in is usually $< 30\%$
2. Clause density is usually < 2
3. Cross-tree constraints are usually a conjunction of binary & ternary clauses
4. Model sizes usually lower than 1,000 features

Easier SAT Problems

Facts about 3-CNF feature models used in the experiments:

1. CTCR values of up to 30%
2. Clause density values of up to 7
3. All clauses have 3 variables
4. Model sizes up to 10,000 features

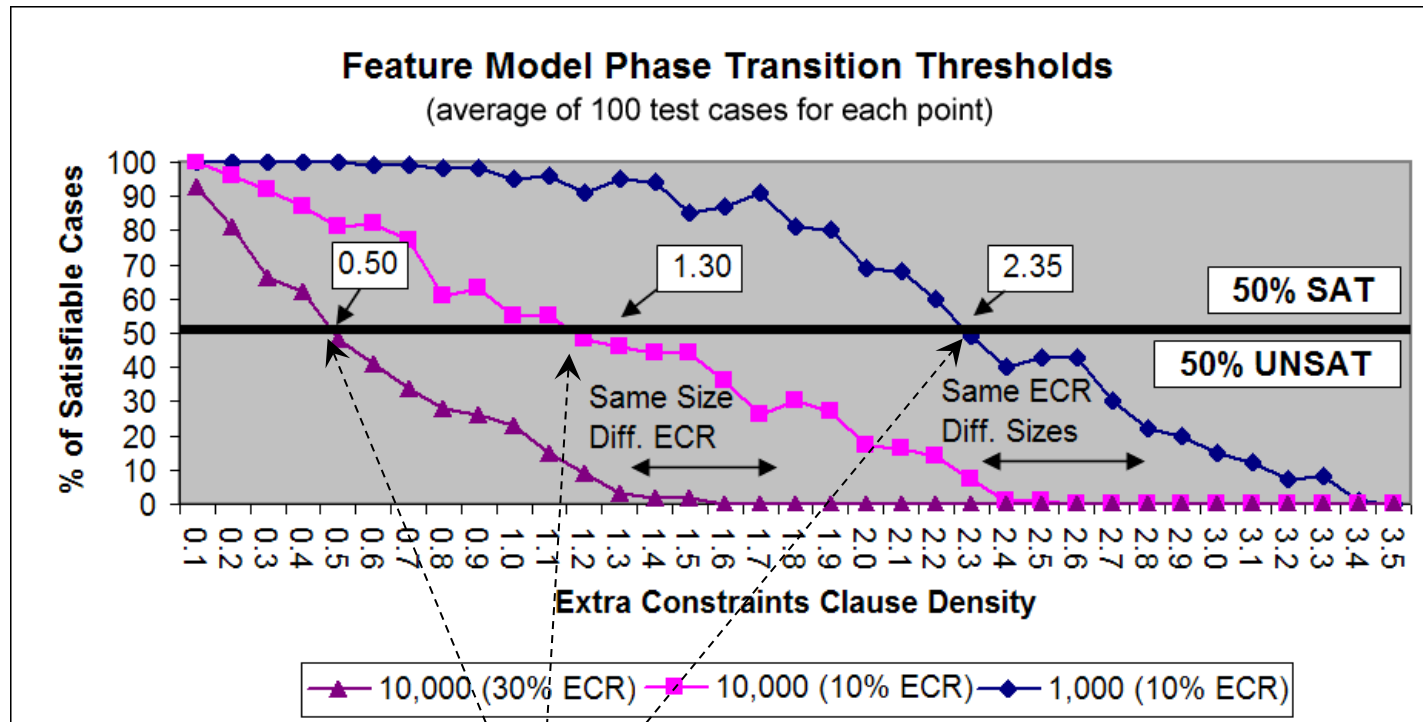
Harder SAT Problems

and also ...

hardness parameters are known for random 3-SAT problems

Hardness of Feature Model SAT Problems

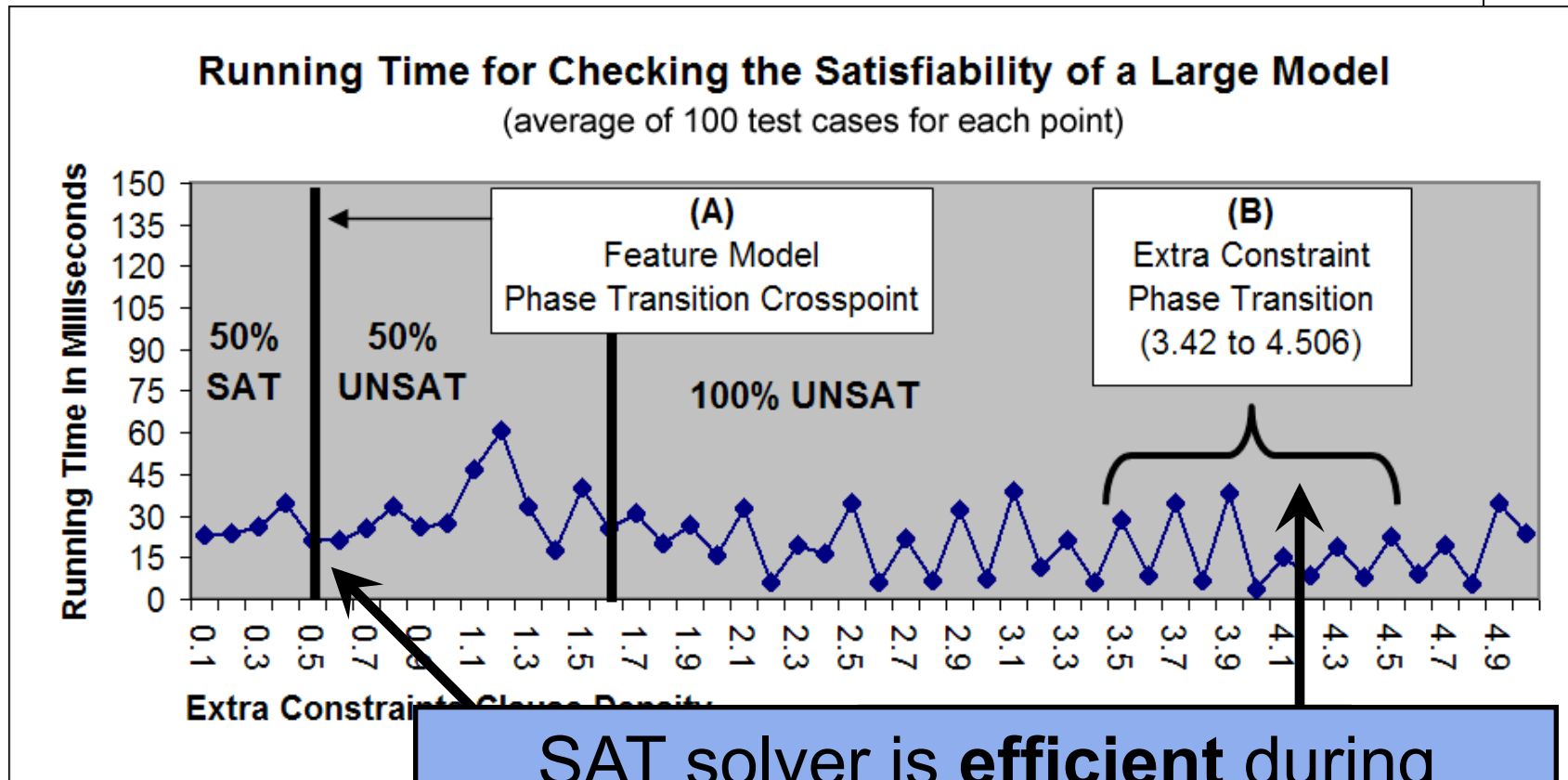
Phase transition cross-over points for 3-CNF-FMs



Phase Transition Crosspoints were computed for Feature Models (3-CNF-FMs)

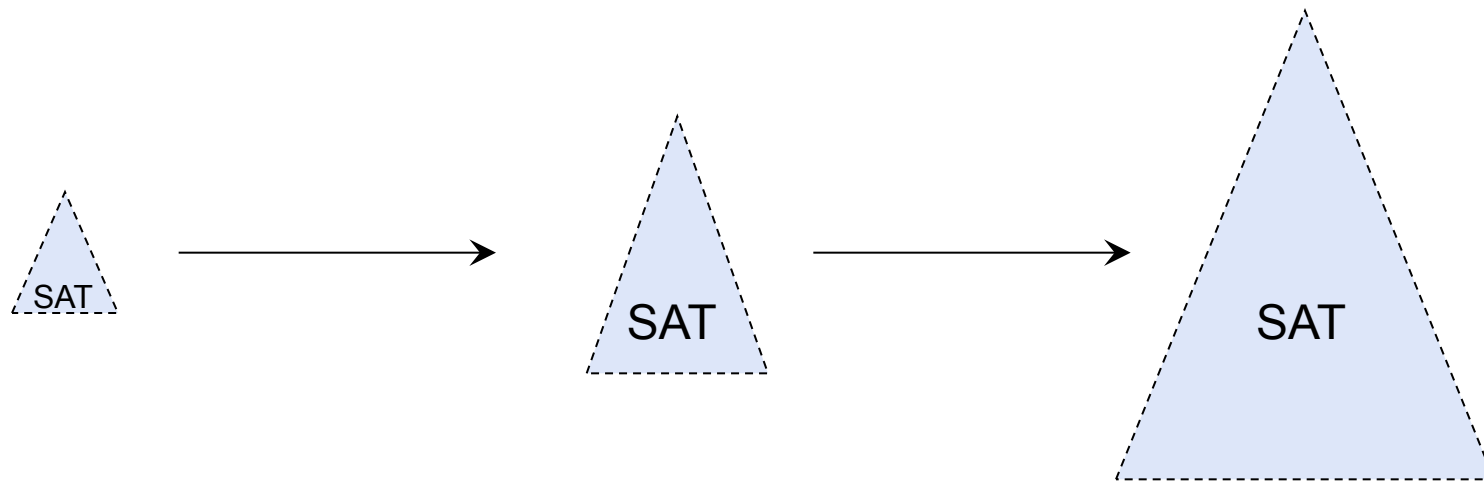
Hardness of Feature Model SAT Problems

Tractability Empirical Analysis



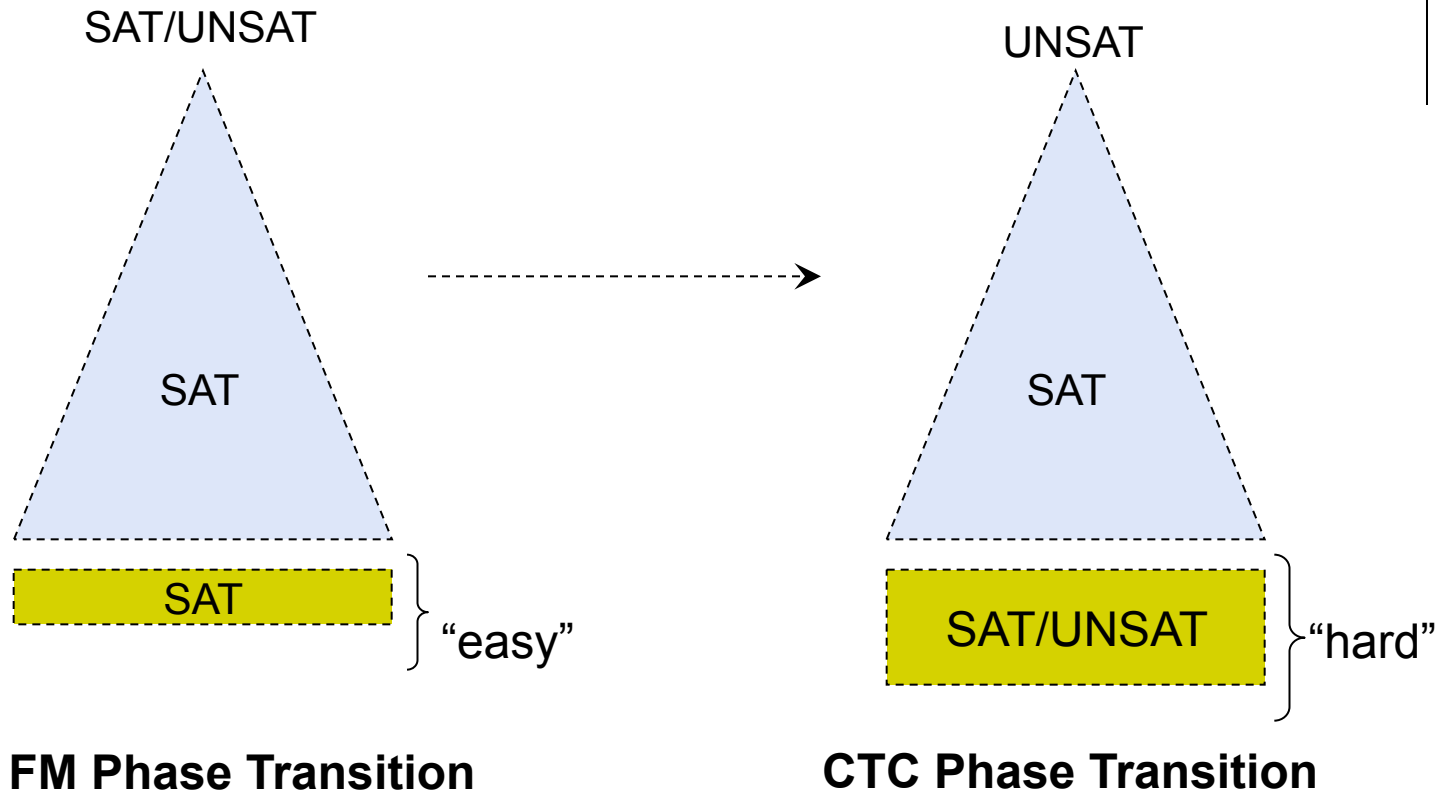
SAT solver is **efficient** during cross-tree constraints phase transition!

Conclusion



Satisfiability of feature tree SAT problems
can be checked efficiently by a SAT solver!

Conclusion



Satisfiability of 3-CNF-FM SAT problems
can be checked efficiently by a SAT solver!

Research Impact

- **Directly Benefits Tool Developers!**
 - Increased confidence in the use of SAT technology
 - Encouragement for new features based on SAT
 - Well-built evidence of tool efficiency and scalability

- **Directly Benefits Tool End-users!**
 - More efficient reasoners
 - More efficient configurators
 - Improved scalability

Want an Example?

Software Product Lines Online Tools

- Web-based reasoning & configuration system
- Includes a repository of Feature Models

SPL^{OT}

(www.splot-research.org)

Weather_Station (23 features)

- Weather Station
 - Measurements
 - [1..3]
 - Pressure
 - Temperature
 - Wind-Speed
 - Data Source
 - [1..1]
 - Internet
 - Demo
 - External Services
 - Output Format
 - [1..1]
 - Text
 - Web-Server
 - File
 - Format
 - [1..1]
 - XML
 - HTML
 - Plain Text
 - Language
 - [1..1]
 - English
 - German
 - Alarm
 - [1..2]
 - Freeze-Point
 - Storm-Alert

Configuration Steps [reset]					
100%					
Step	Decision	#Decisions (cumulative)	#Propagations (at step)	#SAT checks (at step)	SAT time (at step)
1	✓ Weather Station	6 (26.1%)	5	9	1 ms
2	✓ Text	10 (43.5%)	3	6	1 ms
3	✗ Demo	11 (47.8%)	0	2	0 ms
4	✗ Wind Speed	12 (52.2%)	0	2	0 ms
5	✓ Pressure	13 (56.5%)	0	3	0 ms
6	✗ Temperature	15 (65.2%)	1	3	0 ms
7	✓ English	17 (73.9%)	1	3	0 ms
8	✗ Alarm	19 (82.6%)	1	3	0 ms
9	⚡ auto-completion	23 (100.0%)	4	1	0 ms

Done! (Export configuration: [CSV file](#) | [XML](#))

SPLIT

(www.splot-research.org)

Thank you!



Questions?

