

The Satisfiability Problem

Cook's Theorem: An NP-Complete Problem

Restricted SAT: CSAT, 3SAT

Boolean Expressions

- ◆ Boolean, or propositional-logic expressions are built from variables and constants using the operators AND, OR, and NOT.
 - ◆ Constants, and the values of variables, are true and false, represented by 1 and 0, respectively.
 - ◆ We'll use concatenation for AND, + for OR, - for NOT.

Example: Boolean expression

- ◆ $(x+y)(-x + -y)$ is true only when variables x and y have opposite truth values.
- ◆ **Note:** parentheses can be used at will, and are needed to modify the precedence order NOT (highest), AND, OR.

The Satisfiability Problem (*SAT*)

- ◆ Study of boolean expressions generally is concerned with the set of *truth assignments* (assignments of 0 or 1 to each of the variables) that make the function true.
- ◆ NP-completeness needs only a simpler question (SAT): does there exist a truth assignment making the expression true?

Example: SAT

- ◆ $(x+y)(-x + -y)$ is satisfiable.
- ◆ There are, in fact, two satisfying truth assignments:
 1. $x=0; y=1.$
 2. $x=1; y=0.$
- ◆ $x(-x)$ is not satisfiable.

SAT as a Language/Problem

- ◆ An instance of SAT is a boolean expression.
- ◆ Must be coded in a finite alphabet.
- ◆ Use special symbols $(,), +, -$ as themselves.
- ◆ Represent the i -th variable by symbol x followed by integer i in binary.

Example: Encoding for SAT

- ◆ $(x+y)(-x + -y)$ would be encoded by the string $(x1+x10) (-x1+-x10)$

SAT is in **NP**

- ◆ There is a multitape NTM that can decide if a Boolean expression of length n is satisfiable.
- ◆ The NTM takes $O(n^2)$ time along any path.
- ◆ Use nondeterminism to guess a truth assignment on a second tape.
- ◆ Replace all variables by guessed truth values.
- ◆ Evaluate the expression for this assignment.
- ◆ Accept if true.

Cook's Theorem

- ◆ SAT is NP-complete.
- ◆ To prove, we must show how to construct a polytime reduction from each language L in **NP** to SAT.
- ◆ Start by assuming the most restricted possible form of NTM for L (next slide).

Assumptions About NTM for L

1. One tape only.
 2. Head never moves left of the initial position.
 3. States and tape symbols are disjoint.
- ◆ **Key Points:** States can be named arbitrarily, and the constructions **many-tapes-to-one** and **two-way-infinite-tape-to-one** at most square the time.

More About the NTM M for L

- ◆ Let $p(n)$ be a polynomial time bound for M .
- ◆ Let w be an input of length n to M .
- ◆ If M accepts w , it does so through a sequence $I_0 \vdash I_1 \vdash \dots \vdash I_{p(n)}$ of $p(n)+1$ ID's.
 - ◆ Assume trivial move from a final state.
- ◆ Each ID is of length at most $p(n)+1$, counting the state.

From ID Sequences to Boolean Expressions

- ◆ The Boolean expression that the transducer for L will construct from w will have $(p(n)+1)^2$ “*variables*.”
- ◆ Let variable X_{ij} represent the j -th position of the i -th ID.
 - ◆ i and j each range from 0 to $p(n)$.

Picture of Computation as an Array

Initial ID	X_{00}	X_{01}	\dots	$X_{0p(n)}$
I_1	X_{10}	X_{11}	\dots	$X_{1p(n)}$
\vdots				
\vdots				
\vdots				
$I_{p(n)}$	$X_{p(n)0}$	$X_{p(n)1}$	\dots	$X_{p(n)p(n)}$

Intuition

- ◆ From M and w we construct a boolean expression that forces the X 's to represent one of the possible ID sequences of NTM M with input w , if it is to be satisfiable.
- ◆ And the expression *is* satisfiable if some sequence leads to acceptance.

From ID's to Boolean Variables

- ◆ The X_{ij} 's are not boolean variables; they are states and tape symbols of M .
- ◆ However, we can represent the value of each X_{ij} by a family of Boolean variables y_{ijA} , for each possible state or tape symbol A .
- ◆ y_{ijA} is true if and only if $X_{ij} = A$.

Points to Remember

1. The Boolean expression has components that depend on n .
 - ▶ These must be of size polynomial in n .
2. Other pieces depend only on M .
 - ▶ No matter how many states/symbols M has, these are of constant size.
3. Any logical expression about a set of variables whose size is independent of n can be written in constant time.

Designing the Expression

- ◆ We want the Boolean expression that describes the X_{ij} 's to be satisfiable if and only if the NTM M accepts w .
- ◆ Four conditions:
 1. **Unique**: only one symbol per position.
 2. **Starts right**: initial ID is q_0w .
 3. **Moves right**: each ID follows from the previous by a move of M .
 4. **Finishes right**: M accepts.

Unique

- ◆ Take the AND over all i, j, Y , and Z of $(-Y_{ij}Y + -Y_{ij}Z)$.
- ◆ That is, it is not possible for X_{ij} to be both symbols Y and Z .

Starts Right

- ◆ The Boolean Function needs to assert that the first ID is the correct one with $w = a_1 \dots a_n$ as input.
 1. $X_{00} = q_0$.
 2. $X_{0i} = a_i$ for $i = 1, \dots, n$.
 3. $X_{0i} = B$ (blank) for $i = n+1, \dots, p(n)$.
- ◆ Formula is the AND of y_{0iz} for all i , where Z is the symbol in position i .

Finishes Right

- ◆ The last ID must have an accepting state.
- ◆ Form the OR of Boolean variables $Y_{p(n),j,q}$ where j is arbitrary and q is an accepting state.

Running Time So Far

- ◆ Unique requires $O(p^2(n))$ symbols be written.
 - ◆ Parentheses, signs, propositional variables.
- ◆ Algorithm is easy, so it takes no more time than $O(p^2(n))$.
- ◆ Starts Right takes $O(p(n))$ time.
- ◆ Finishes Right takes $O(p(n))$ time.

Running Time – (2)

- ◆ **Caveat:** Technically, the propositions that are output of the transducer must be coded in a fixed alphabet, e.g., $x10011$ rather than y_{ijA} .
- ◆ Thus, the time and output length have an additional factor $O(\log n)$ because there are $O(p^2(n))$ variables.
- ◆ But log factors do not affect polynomials

Moves Right

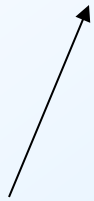
Works because
Unique assures
only one y_{ijx} true.

- ◆ $X_{ij} = X_{i-1,j}$ whenever the state is none of $X_{i-1,j-1}$, $X_{i-1,j}$, or $X_{i-1,j+1}$.
- ◆ For each i and j , construct an expression that says (in propositional variables) the OR of " $X_{ij} = X_{i-1,j}$ " and all $y_{i-1,k,A}$ where A is a state symbol ($k = i-1, i$, or $i+1$).
- ◆ **Note:** $X_{ij} = X_{i-1,j}$ is the OR of $y_{ijA} \cdot y_{i-1,jA}$ for all symbols A .

Constraining the Next Symbol

... A B C ...

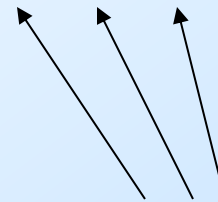
B



Easy case;
must be B

... A q C ...

? ? ?



Hard case; all
three may depend
on the move of M

Moves Right – (2)

- ◆ In the case where the state is nearby, we need to write an expression that:
 1. Picks one of the possible moves of the NTM M .
 2. Enforces the condition that when $X_{i-1,j}$ is the state, the values of $X_{i,j-1}$, $X_{i,j}$, and $X_{i,j+1}$ are related to $X_{i-1,j-1}$, $X_{i-1,j}$, and $X_{i-1,j+1}$ in a way that reflects the move.

Example: Moves Right

Suppose $\delta(q, A)$ contains (p, B, L) .

Then one option for any i, j , and C is:

$C \quad q \quad A$

$p \quad C \quad B$

If $\delta(q, A)$ contains (p, B, R) , then an option for any i, j , and C is:

$C \quad q \quad A$

$C \quad B \quad p$

Moves Right – (3)

- ◆ For each possible move, and for each i and j , express the constraints on the six X 's by a Boolean expression.
- ◆ For each i and j , take the OR over all possible moves.
- ◆ Take the AND over all i and j .
- ◆ **Small point:** for edges (e.g., state at 0), assume invisible symbols are blank.

Running Time

- ◆ We have to generate $O(p^2(n))$ Boolean expressions, but each is constructed from the moves of the NTM M , which is fixed in size, independent of the input w .
- ◆ Takes time $O(p^2(n))$ and generates an output of that length.
 - ◆ Times $\log n$, because variables must be coded in a fixed alphabet.

Cook's Theorem – Finale

- ◆ In time $O(p^2(n) \log n)$ the transducer produces a Boolean expression, the AND of the four components: Unique, Starts, Finishes, and Moves Right.
- ◆ If M accepts w , the ID sequence gives us a satisfying truth assignment.
- ◆ If satisfiable, the truth values tell us an accepting computation of M .

Conjunctive Normal Form

- ◆ A Boolean expression is in *Conjunctive Normal Form* (CNF) if it is the AND of *clauses*.
- ◆ Each clause is the OR of *literals*.
- ◆ A literal is either a variable or the negation of a variable.
- ◆ Problem *CSAT*: is a Boolean expression in CNF satisfiable?

Example: CNF

$(x + -y + z)(-x)(-w + -x + y + z) (...)$

NP-Completeness of CSAT

- ◆ The proof of Cook's theorem can be modified to produce a formula in CNF.
- ◆ **Unique** is already the AND of clauses.
- ◆ **Starts Right** is the AND of clauses, each with one variable.
- ◆ **Finishes Right** is the OR of variables, i.e., a single clause.

NP-Completeness of CSAT – (2)

- ◆ Only **Moves Right** is a problem, and not much of a problem.
- ◆ It is the AND of expressions for each i and j .
- ◆ Those expressions are fixed, independent of n .

NP-Completeness of CSAT – (3)

- ◆ You can convert any expression to CNF.
- ◆ It may exponentiate the size of the expression and therefore take time to write down that is exponential in the size of the original expression, but these numbers are all fixed for a given NTM M and independent of n .

Conversion to CNF

- ◆ For each truth assignment to the variables of the expression that make the expression false:
- ◆ Use a clause that is the OR of each variable negated iff it is assigned “true.”
- ◆ Thus, the clause is false for this truth assignment and only this.
- ◆ Take the AND of all these clauses.

Example: Conversion to CNF

- ◆ Consider expression $\neg x + yz$.
- ◆ There are three falsifying assignments:
 $(x=1, y=1, z=0)$, $(x=1, y=0, z=0)$, and $(x=1, y=0, z=1)$.
- ◆ The resulting CNF expression is
therefore $(\neg x + \neg y + z)(\neg x + y + z)(\neg x + y + \neg z)$.

k-SAT

- ◆ If a Boolean expression is in CNF and every clause has exactly k literals, we say the expression is in *k-CNF*.
- ◆ The problem *k-SAT* is SAT restricted to expressions in k-CNF.
- ◆ **Example:** We just saw a 3-SAT formula $(-x+-y+z)(-x+y+z)(-x+y+-z)$.

3-SAT

- ◆ This problem is NP-complete.
- ◆ Clearly it is in **NP**, since SAT is.
- ◆ It is not true that every Boolean expression can be converted to an equivalent 3-CNF expression.

3SAT – (2)

- ◆ But we don't need equivalence.
- ◆ We need to reduce every CNF expression E to some 3-CNF expression that is satisfiable if and only if E is.
- ◆ Reduction involves introducing new variables into long clauses, so we can split them apart.

Reduction of CSAT to 3SAT

- ◆ Let $(x_1 + \dots + x_k)$ be a clause in some CSAT instance, with $k \geq 4$.
 - ◆ **Note:** the x 's are literals, not variables; any of them could be negated variables.
- ◆ Introduce new variables y_1, \dots, y_{k-3} that appear in no other clause.

CSAT to 3SAT – (2)

- ◆ Replace $(x_1 + \dots + x_k)$ by
 $(x_1 + x_2 + y_1)(x_3 + y_2 + -y_1) \dots (x_i + y_{i-1} + -y_{i-2})$
 $\dots (x_{k-2} + y_{k-3} + -y_{k-4})(x_{n-1} + x_k + -y_{k-3})$
- ◆ If there is a satisfying assignment of the x 's for the CSAT instance, then one of the literals x_i must be made true.
- ◆ Assign $y_j = \text{true}$ if $j < i-1$ and $y_j = \text{false}$ for larger j .

CSAT to 3SAT – (3)

- ◆ Suppose $(x_1 + x_2 + y_1)(x_3 + y_2 + -y_1) \dots$
 $(x_{k-2} + y_{k-3} + -y_{k-4})(x_{k-1} + x_k + -y_{k-3})$
is satisfiable, but none of the x 's is true.
- ◆ The first clause forces $y_1 = \text{true}$.
- ◆ Then the second clause forces $y_2 = \text{true}$.
- ◆ And so on ... all the y 's must be true.
- ◆ But then the last clause is false.

CSAT to 3SAT – (4)

- ◆ There is a little more to the reduction, for handling clauses of 1 or 2 literals.
- ◆ Replace (x) by $(x+y_1+y_2)(x+y_1+ -y_2)(x+ -y_1+y_2)(x+ -y_1+ -y_2)$.
 - ◆ **Remember**: the y 's are different variables for each CNF clause.
- ◆ Replace $(w+x)$ by $(w+x+y)(w+x+ -y)$.

CSAT to 3SAT Running Time

- ◆ This reduction is surely polynomial.
- ◆ In fact it is linear in the length of the CSAT instance.
- ◆ Thus, we have polytime-reduced CSAT to 3-SAT.
- ◆ Since CSAT is NP-complete, so is 3-SAT.