

Welcome to CS 4995 : Computability and Logic

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Brief Bio

I received bachelors and masters degrees from Pennsylvania State University and then received a PhD from the University of Toronto in 1992. After that, I spent 2 years as a postdoc at UCSD, and then 2 years as an assistant professor (in mathematics with a joint appointment in computer science) at the University of Pittsburgh. For the next four years, I was a faculty member of the Computer Science Department the University of Arizona. In the fall of 2001, I moved back to Toronto, as Professor in the Computer Science Department, with a joint appointment in Mathematics. In 2021 I joined the Department of Computer Science at Columbia University.

The above picture was taken in London in front of Bertrand Russell's flat. If you click on the picture to see an enlarged version, and then go to the upper right quadrant, the blue sign mentioning this landmark will be legible.

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Teaching

CS4995F	Logic and Computability, 2022
CSC2541F	AI and Ethics: Mathematical Foundations and Algorithms
CSC2429	Proof Complexity, Mathematical Programming and Algorithms, Winter 2018
CSC165	Mathematical Expression and Reasoning for Computer Science, Winter 2018
CS2429	Proof Complexity, 2017
CSC 263	Data Structures and Analysis, Fall 2015
CSC2401	Introduction to Complexity Theory, Fall 2015
CSC 2429	Communication Complexity: Applications and New Directions, Fall 2014
CSC 2429	Approaches to the P versus NP Problem and Related Complexity Questions, Winter 2014
CSC 2429	Communication Complexity, Information Complexity and Applications, Fall 2013
CSC 2429	Foundations of Communication Complexity, Fall 2009
CSC 2402	Methods to Deal with Intractability, Fall 2009
CSC 2429	PCP and Hardness of Approximation, Fall 2007
CSC 448/2405	Formal Languages and Automata, Spring 2006
CSC 448/2405	Formal Languages and Automata, 2005
CSC 448/2405	Formal Languages and Automata, 2003
CSC 2416	Machine Learning Theory, Fall 2005
CSC 364	Computability and Complexity, Fall 2002
CSC 2429	Propositional Proof Complexity, Fall 2002
CSC 2429	Derandomization. Spring 2001

CS 4995: Computability and Logic

Fall, 2022

ANNOUNCEMENTS: (Students, please check for announcements every week.)

Posted Sept 13: Welcome to the class! Stay tuned for more announcements.

COURSE TIMES, CONTACT INFO

Instructor: Toniann Pitassi, email: toni@cs.columbia.edu

Office Hours:

Lectures:

- [Course Information Sheet](#)

HOMEWORK ASSIGNMENTS:

- [Homework 1, Due Sept 27](#)

EXAM INFORMATION:

GRADES AND MARKING:

LECTURE NOTES:

- [Week 1](#)
- [Week 2](#)

COURSE NOTES:

- [Propositional Calculus](#)
- [Predicate Calculus](#)
- [Completeness](#)
- [Herbrand, Equality, Compactness](#)
- [Computability](#)
- [Incompleteness I](#)

CS 4995 – Fall 2022

Logic and Computability

Lectures: [unclear]

Instructor: Toniann Pitassi, toni@cs.columbia.edu

Office hours: Fri 4-5 (tentative)

TA: [unclear]

Web Page: <http://www.cs.columbia.edu/~toni/Courses/Logic2022/4995.html>

Course Notes: Postscript files for course notes and all course handouts will be available on the web page.

Topics:

Propositional logic: syntax and semantics, Resolution and Propositional Sequent Calculus soundness and completeness. First order logic: syntax and semantics, First Order Sequent Calculus soundness and completeness. Gödel's Incompleteness theorems. Computability: Recursive and recursively enumerable functions, Church's thesis, unsolvable problems

Marking Scheme:

2 assignments (20 do each)

2 tests (25 do each)

class participation (10 do)

Due Dates:

See web page

The work you submit must be your own. You may discuss problems with each other; however, you should prepare written solutions alone.

Important

→ All lectures are mandatory.

Check CourseWorks -- some lectures may be held online via zoom.

- Work hard on understanding lecture notes,
work hard on assignments
- start early -- cannot cram/solve in a
couple of days
- Come to office hrs!
- Homeworks must be written up independently.
You may discuss with other students in class
but NO outside people/sources allowed.

COURSE INTRO

Foundations of mathematics involves the **axiomatic method** - write down axioms (basic truths) and prove theorems from axioms from purely logical reasoning

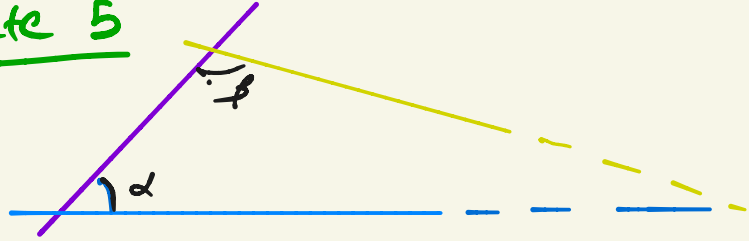
Example 1 Euclidean geometry (300 BC, "Elements")



The School of Athens,
Raphael

Axiomatic system where all theorems are derivable from a small number of simple axioms/postulates

Postulate 5



If sum of $\alpha + \beta$ is < 180 then the 2 lines (blue + yellow) eventually meet (on same side as α, β angles)

Euclid's Postulates

1. A straight **line segment** can be drawn joining any two points.
2. Any straight **line segment** can be extended indefinitely in a straight **line**.
3. Given any straight **line segment**, a **circle** can be drawn having the segment as **radius** and one endpoint as center.
4. All **right angles** are **congruent**.
5. If two lines are drawn which **intersect** a third in such a way that the sum of the inner angles on one side is less than two **right angles**, then the two lines inevitably must **intersect** each other on that side if extended far enough. This postulate is equivalent to what is known as the **parallel postulate**.

Euclid's fifth postulate cannot be proven as a theorem, although this was attempted by many people. Euclid himself used only the first four postulates ("**absolute geometry**") for the first 28 propositions of the **Elements**, but was forced to invoke the **parallel postulate** on the 29th. In 1823, Janos Bolyai and Nicolai Lobachevsky independently realized that entirely self-consistent "**non-Euclidean geometries**" could be created in which the parallel postulate *did not hold*. (Gauss had also discovered but suppressed the existence of non-Euclidean geometries.)

SEE ALSO:

[Absolute Geometry](#), [Circle](#), [Elements](#), [Line Segment](#), [Non-Euclidean Geometry](#), [Parallel Postulate](#), [Pasch's Theorem](#), [Right Angle](#)

REFERENCES:

Hofstadter, D. R. *Gödel, Escher, Bach: An Eternal Golden Braid*. New York: Vintage Books, pp. 88-92, 1989.

Referenced on Wolfram|Alpha: [Euclid's Postulates](#)

CITE THIS AS:

Weisstein, Eric W. "Euclid's Postulates." From *MathWorld*--A Wolfram Web Resource. <https://mathworld.wolfram.com/EuclidsPostulates.html>

Example 2 - group Theory (Cayley, 1854)

axiom 1: $\forall x y z [x \cdot (y \cdot z) = (x \cdot y) \cdot z]$ (associativity)

axiom 2: $\exists u$

$$[\forall x [x \cdot u = u \cdot x = x]] \wedge$$

$$[\forall x \exists y [x \cdot y = y \cdot x = u]]$$

there exists an identity element

and every element has an inverse

A **group** is a model for the axioms

(G, \cdot) — a function from $G \times G \rightarrow G$
↑ a set

Integers

$\cdot = +$

Examples of groups

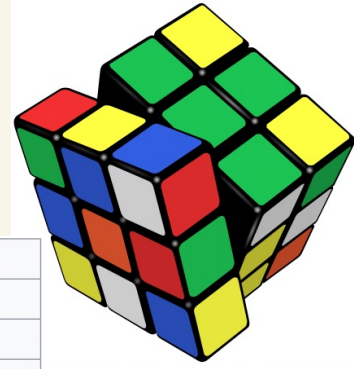
① $G = \mathbb{Z}$ (the integers) $\bullet = \text{addition}$

Examples of groups

① $G = \mathbb{Z}$ (the integers)

\cdot = addition

② Rubik's cube group



Basic 90°	180°	-90°
F turns the front clockwise	F^2 turns the front clockwise twice	F' turns the front counter-clockwise
B turns the back clockwise	B^2 turns the back clockwise twice	B' turns the back counter-clockwise
U turns the top clockwise	U^2 turns the top clockwise twice	U' turns the top counter-clockwise
D turns the bottom clockwise	D^2 turns the bottom clockwise twice	D' turns the bottom counter-clockwise
L turns the left face clockwise	L^2 turns the left face clockwise twice	L' turns the left face counter-clockwise
R turns the right face clockwise	R^2 turns the right face clockwise twice	R' turns the right face counter-clockwise

← basic moves

G = all possible moves

\cdot = composition of moves

Course Outline

We will study FIRST ORDER Logic (PREDICATE LOGIC)

I. Start with simpler PROPOSITIONAL Logic
(no quantifiers)

- Language of propositional logic ("syntax")
- Meaning ("semantics")
- Two proof systems for prop. logic:
Resolution, and PK
- We will prove SOUNDNESS + COMPLETENESS
for both

Course Outline (cont'd)

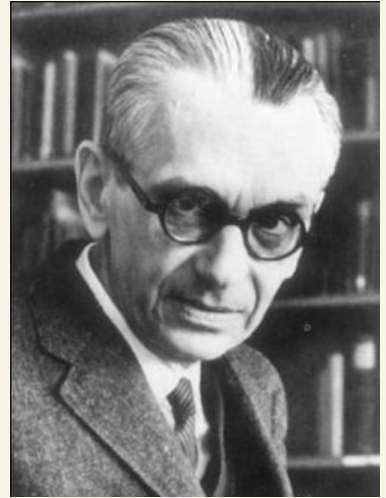
II. FIRST ORDER (PREDICATE) LOGIC

- Language ("syntax")
- Meaning ("semantics")
- Proof system LK (extends PK)

SOUNDNESS

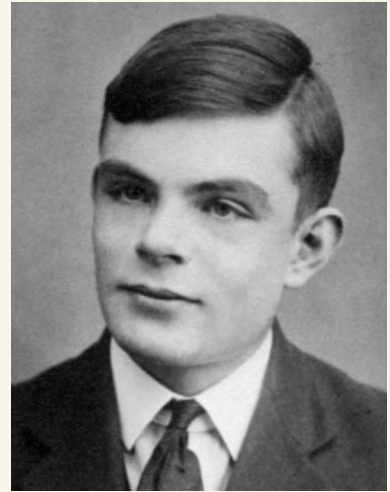
** COMPLETENESS

MAJOR COROLLARIES OF
COMPLETENESS

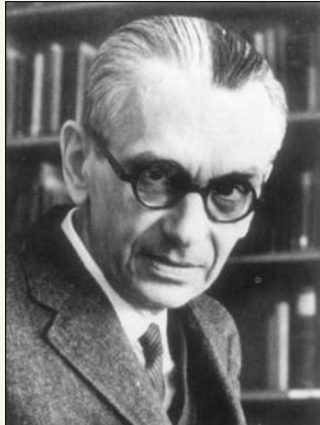


COURSE OUTLINE (cont'd)

III. Computability



IV. Axiomatizable Theories



Incompleteness Theorems

Interplay/connections between
computability + Logic

TODAY

1. Intro

2. Propositional Logic

Syntax / semantics

Resolution: proof system for
propositional logic

- soundness
- completeness

Pages 1-9 of Lecture Notes,
plus supplementary notes on Resolution

PROPOSITIONAL LOGIC

Vocabulary: x, y, z
 P_1, P_2, Q, \dots propositional variables
 $\neg, \vee, \wedge, (,)$

Examples: $((\overset{0}{P} \vee \overset{1}{Q}) \vee \overset{0}{R})$ \leftarrow $\underbrace{P=0, Q=1, R=0}$
 $(\underbrace{\neg P}_1 \vee \underbrace{\neg Q}_0)$
 P

prop variables take on values of either T or F
 $\begin{matrix} 1 & 0 \end{matrix}$

PROPOSITIONAL Logic

Inductive Definition of a Propositional Formula

1. Atoms/Propositional variables: $P_1, P_2, \dots, X, Y, Z, \dots$
are formulas
2. IF A is a formula, then so is $\neg A$
3. IF A, B are formulas, so is $(A \wedge B)$
4. " " " " " " $(A \vee B)$

$(A \supset B)$ is shorthand for $(\neg A \vee B)$

$(A \leftrightarrow B)$ is shorthand for $(\neg A \vee B) \wedge (\neg B \vee A)$

A **subformula** of a formula is any substring of A which itself is a formula

Unique Readability Thm says the grammar for generating formulas is not ambiguous

Semantics

A **truth assignment** $\tau: \{\text{atoms}\} \rightarrow T, F$

propositional variables

true
false

Extending τ to every formula:

$$(1) (\neg A)^\tau = T \quad \text{iff} \quad A^\tau = F$$

$$(2) (A \wedge B)^\tau = T \quad \text{iff} \quad A^\tau = T \wedge B^\tau = T$$

$$(3) (A \vee B)^\tau = T \quad \text{iff} \quad \text{either } A^\tau = T \text{ or } B^\tau = T$$

Example

Definitions

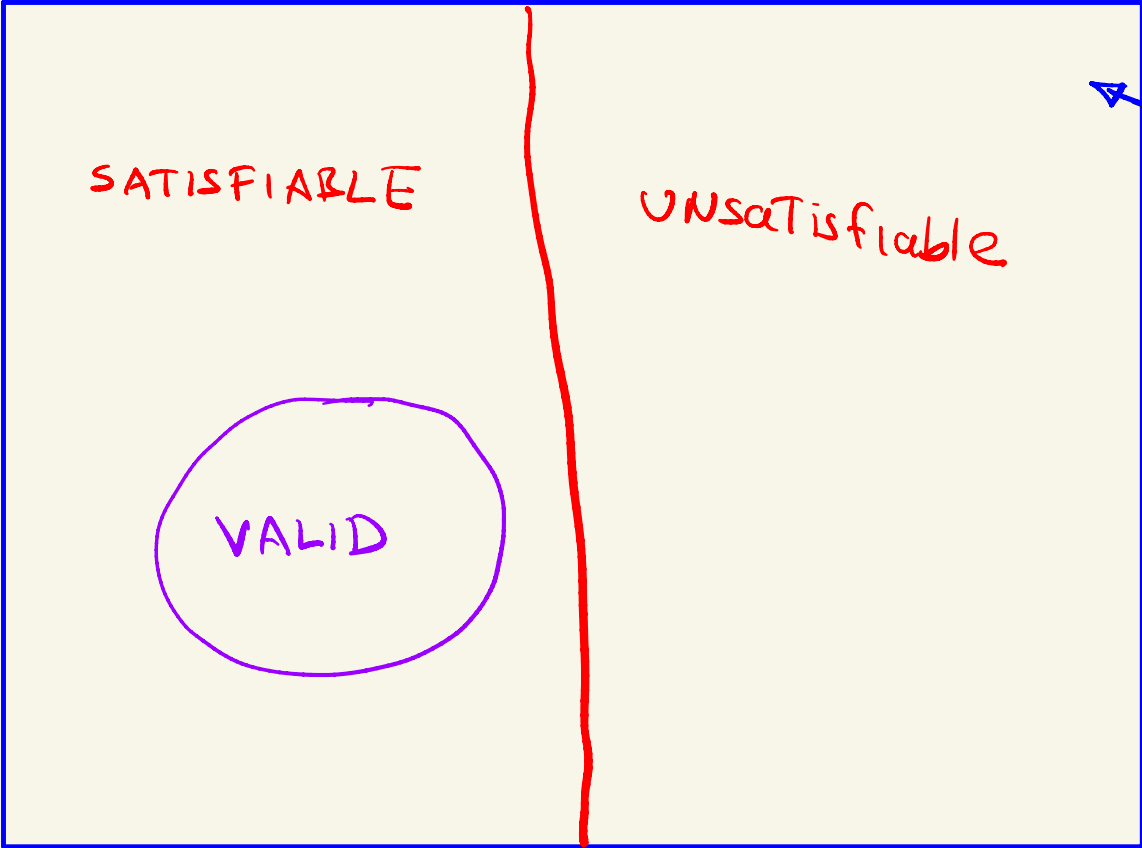
τ satisfies A iff $A^\tau = T$

A is **satisfiable** iff there exists some truth assignment τ such that $A^\tau = T$

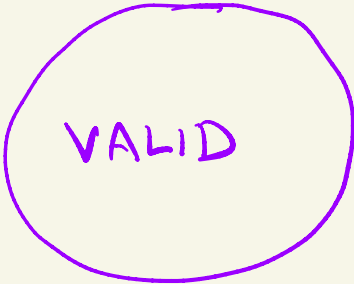
A is **unsatisfiable** iff for every truth assignment τ , $A^\tau = F$

A is a **tautology** (or **valid**) iff for every truth assignment τ , $A^\tau = T$

x	y	z	
0	0	0	1
0	0	1	0
0	1	0	1
0	1	1	0
1	0	0	1
1	0	1	0
1	1	0	0
1	1	1	1



SATISFIABLE



UNSATISFIABLE

all propositional formulas

Definitions Let $\hat{\Phi}$ be a set of propositional formulas

\mathcal{T} satisfies A iff $A^{\mathcal{T}} = T$

\mathcal{T} satisfies a set $\hat{\Phi}$ of formulas iff
 \mathcal{T} satisfies A for all $A \in \hat{\Phi}$

$\hat{\Phi}$ is satisfiable iff $\exists \mathcal{T}$ that satisfies $\hat{\Phi}$
otherwise $\hat{\Phi}$ is unsatisfiable

$\hat{\Phi} \models A$ (A is a logical consequence of $\hat{\Phi}$) iff
 $\forall \mathcal{T} [\mathcal{T} \text{ satisfies } \hat{\Phi} \Rightarrow \mathcal{T} \text{ satisfies } A]$

$\models A$ (A is valid or A is a tautology) iff
 $\forall \mathcal{T} [\mathcal{T} \text{ satisfies } A]$

Examples

Classify as either a tautology, satisfiable but not tautology, UNSatisfiable

① $(x \vee y)$ satisfiable, not valid

② $\neg((x \vee y) \vee z) \vee (x \vee z)$

← $(x \vee y \vee z) \supset x \vee z$
 $(x \wedge y) \vee z \supset x \vee z$

③ $\neg((x \wedge y) \vee z) \vee (x \vee z)$

③ $\underbrace{(x) \wedge (\bar{x} \vee y) \wedge (y \vee z) \wedge (\bar{z})}_{\text{unsatisfiable}}$

← unsatisfiable $\bar{z} : \neg z$

x	y	z	
0	0	0	0
0	0	1	0
0	1	0	0
0	1	1	0
1	0	0	0
1	0	1	0
1	1	0	0
1	1	1	0

More Examples

$$\textcircled{1} \quad (x \wedge y) \stackrel{?}{\models} (x \vee y)$$

$$\textcircled{2} \quad \stackrel{?}{\models} (x \vee \neg x)$$

$$\textcircled{3} \quad \{(A \vee B), (\neg A \vee B)\} \stackrel{?}{\models} B$$

$$\textcircled{4} \quad A \vee B \stackrel{?}{\models} B$$

Some easy facts (check them)

1. If $\Phi \models A$ and $\Phi \cup \{A\} \models B$ then $\Phi \models B$
2. $\Phi \models A$ iff $\Phi \cup \{\neg A\}$ is unsatisfiable
3. A is a tautology iff $\neg A$ is unsatisfiable

Let \mathcal{T} satisfy Φ .

Assume $\Phi \models A$ + $\Phi \cup A \models B$

Then \mathcal{T} satisfies A

∴ \mathcal{T} satisfies B also

Equivalence

A and B are **equivalent** (written $A \Leftrightarrow B$)
iff $A \vDash B$ and $B \vDash A$

Examples

1. $(A \wedge B) \stackrel{? \text{ yes}}{\Leftrightarrow} (B \wedge A)$

2. $(\neg A \vee B) \stackrel{?}{\Leftrightarrow} (\neg B \vee A)$
NO

$\tau: A = 1 \quad B = 0$ then $(\neg A \vee B)^T = 0$
and $(\neg B \vee A)^T = 1$

Resolution : Proof System for Prop Logic

- Resolution is basis for most automated theorem provers
- Proves that formulas are UNSatisfiable
(recall F is a tautology iff $\neg F$ is unsatisfiable)
- Formulas have to be in a special form: CNF

$$\underbrace{(x_1 \vee (x_2 \vee \bar{x}_3))}_{C_1} \wedge \underbrace{(\bar{x}_2 \vee x_4)}_{C_2} \wedge \underbrace{(\bar{x}_4)}_{C_3} \wedge \underbrace{(x_1 \vee x_3)}_{C_4} \wedge \underbrace{(x_1)}_{C_5}$$

Converting a formula to CNF

- Obvious method (deMorgan) could result in an exponential blowup in size

Example $(X_1 \wedge X_2) \vee (X_3 \wedge X_4) \vee (X_5 \wedge X_6) \vee \dots (X_{n-1} \wedge X_n)$

- Better method : **SAT LEMMA**

There is an efficient method to transform any propositional formula F into a CNF formula g such that F is satisfiable iff g is satisfiable

SAT LEMMA : proof by example

$$F : \underbrace{(Q \wedge R) \vee \neg Q}_{P_B}$$
$$\underbrace{\hspace{10em}}_{P_A}$$

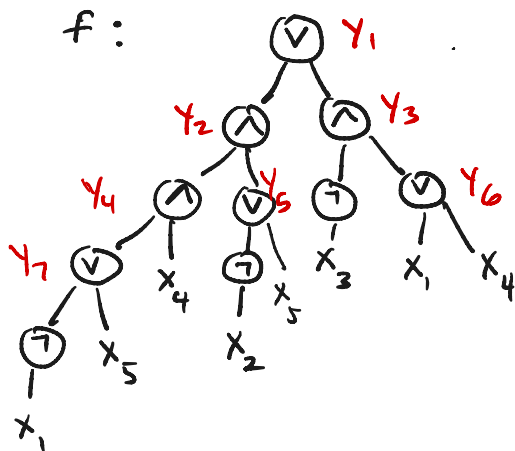
← new variables
←

$$g : (P_B \Leftrightarrow (Q \wedge R)) \wedge (P_A \Leftrightarrow P_B \vee \neg Q) \wedge (P_A)$$

$$(\neg P_B \vee Q)(\neg P_B \vee R)(\neg Q \vee \neg R \vee P_B)$$

SAT LEMMA Let f be a formula of size m (m leaves) with n variables $x_1 \dots x_n$. Then there exists an equivalent 3CNF formula g with $O(m)$ variables and size $O(m)$

Example



g :

$$\begin{aligned}
 & (y_1) \wedge \\
 & (y_1 \leftrightarrow y_2 \vee y_3) \wedge \\
 & (y_2 \leftrightarrow y_4 \wedge y_5) \wedge \\
 & (y_3 \leftrightarrow \neg x_3 \wedge y_6) \wedge \\
 & (y_4 \leftrightarrow y_7 \wedge x_4) \wedge \\
 & (y_5 \leftrightarrow \neg x_2 \vee x_5) \wedge \\
 & (y_6 \leftrightarrow x_1 \vee x_4) \wedge \\
 & (y_7 \leftrightarrow \neg x_1 \vee x_5)
 \end{aligned}$$

g (in CNF form):

$$\begin{aligned}
 & (y_1) \\
 & (\neg y_1 \vee y_2 \vee y_3) (\neg y_2 \vee y_1) (\neg y_3 \vee y_1) \\
 & (\neg y_2 \vee y_4) (\neg y_2 \vee y_5) (\neg y_4 \vee \neg y_5 \vee y_2) \\
 & \vdots \\
 & \vdots \\
 & \vdots \\
 & (\neg y_7 \vee \neg x_1 \vee x_5) (x_1 \vee y_7) (\neg x_5 \vee y_7)
 \end{aligned}$$

$$((\neg x_1 \vee x_5) \wedge x_4)$$

Demorgan's Rules to push negations to leaves;

$$\neg(A \vee B) \equiv \neg A \wedge \neg B$$

$$\neg(A \wedge B) \equiv \bar{A} \vee \bar{B}$$

$$\neg\neg A \equiv A$$

RESOLUTION

Start with CNF formula $F = C_1 \wedge C_2 \wedge \dots \wedge C_m$
view F as a set of clauses $\{C_1, C_2, \dots, C_m\}$

Resolution Rule :

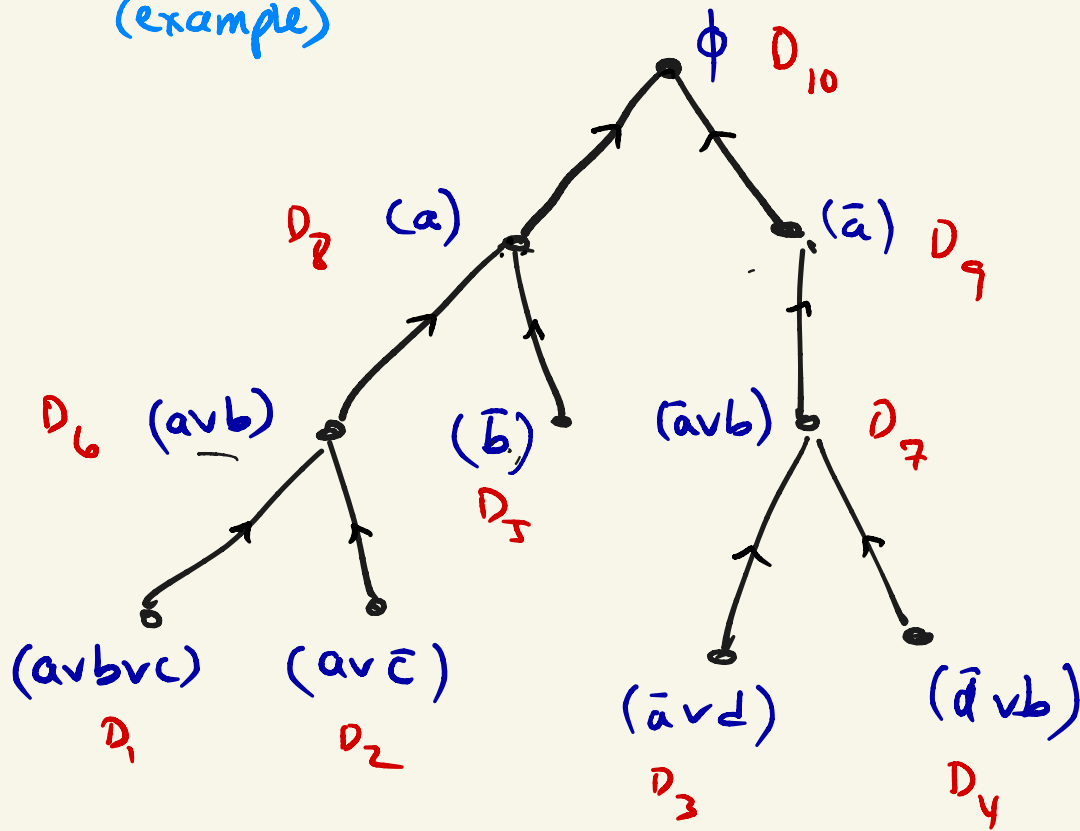
$(A \vee x), (B \vee \bar{x})$ derive $(A \vee B)$

A Resolution Refutation of F is a sequence of clauses D_1, D_2, \dots, D_g such that:
each D_i is either a clause from F , or follows from 2 previous clauses by Resolution rule,
and final clause $D_g = \phi$ (the empty clause)

Resolution Refutation

(example)

$$F = (a \vee b \vee c) (a \vee \bar{c}) (\bar{b}) (\bar{a} \vee d) (\bar{d} \vee b)$$



Resolution Soundness

Fact: If C_1, C_2 derive C_3 by Resolution rule,
then $C_1, C_2 \models C_3$

(Exercise: Show $(A \vee x), (B \vee \bar{x}) \models (A \vee B)$)

From above Fact we can prove by induction:

RESOLUTION SOUNDNESS THEOREM

If a CNF formula F has a RES refutation, then F is unsatisfiable

RESOLUTION COMPLETENESS THM

Every unsatisfiable CNF formula F has a RESOLUTION refutation

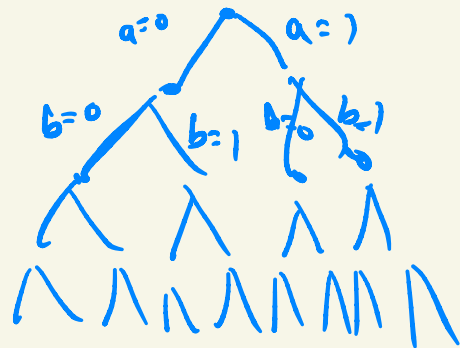
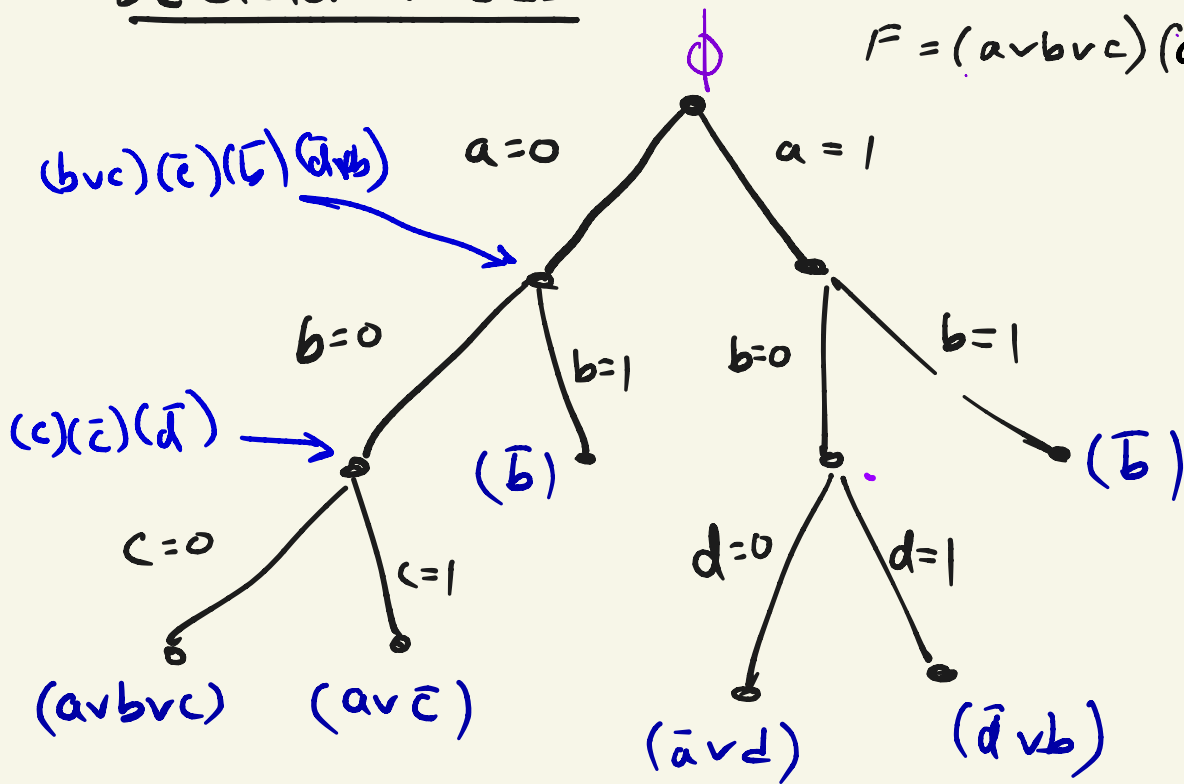
Proof idea

We describe a canonical procedure for obtaining a RES refutation for F

The procedure exhaustively tries all truth ass's - **via a decision tree**
then we show that any such decision tree can be viewed as a RES refutation

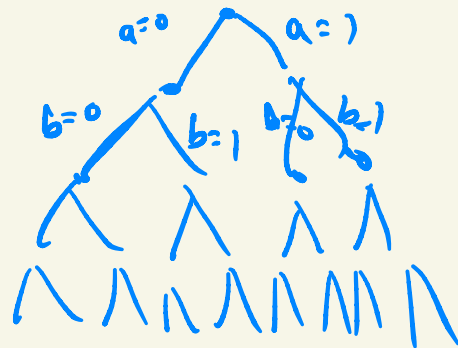
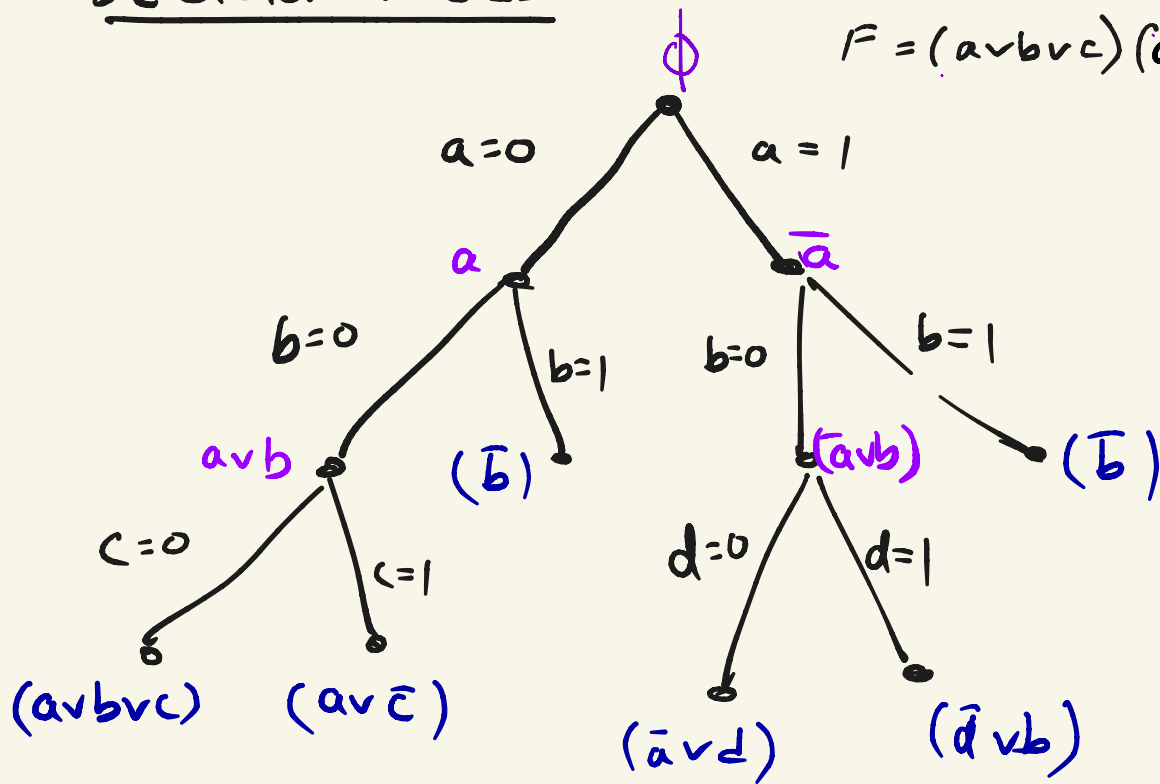
DECISION TREES

$$F = (a \vee b \vee c) (a \vee \bar{c}) (\bar{b}) (\bar{a} \vee d) (\bar{d} \vee b)$$



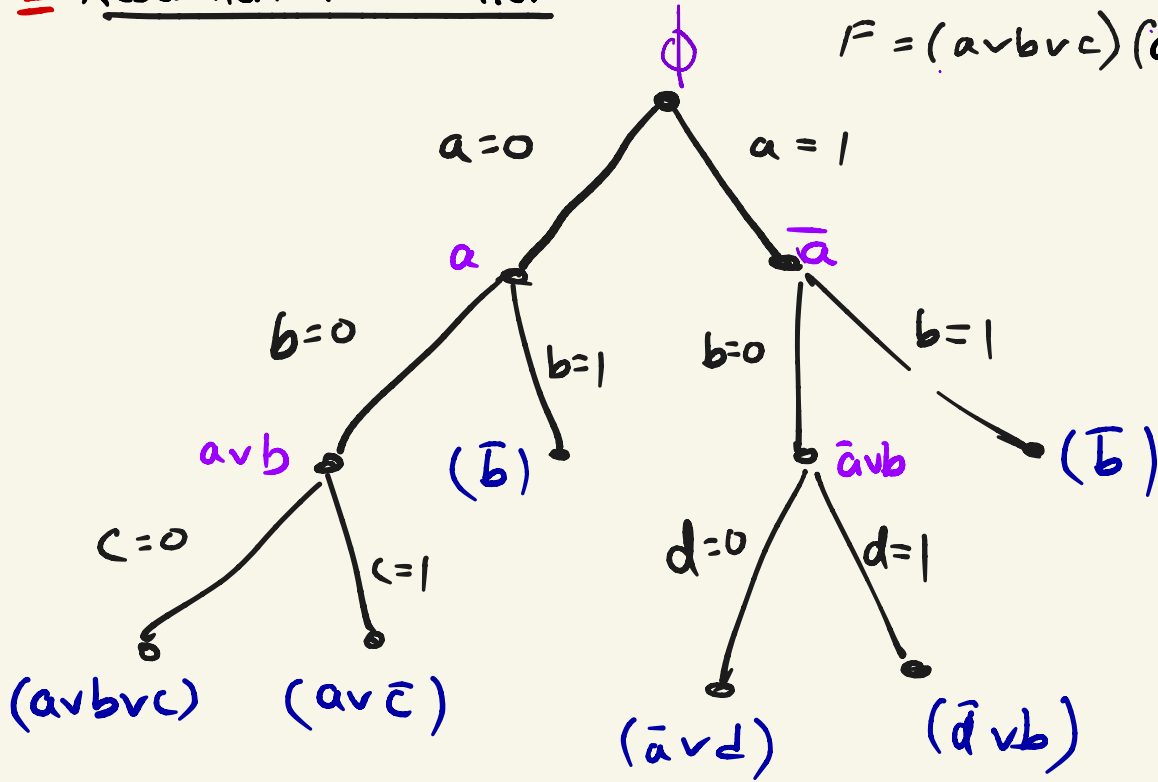
DECISION TREES

$$F = (a \vee b \vee c) (\bar{a} \vee \bar{c}) (\bar{b}) (\bar{a} \vee d) (\bar{d} \vee b)$$



Resolution Refutation

$$F = (a \vee b \vee c) (\bar{a} \vee \bar{c}) (\bar{b}) (\bar{a} \vee d) (\bar{d} \vee b)$$



COMPLEXITY OF RESOLUTION REFUTATIONS

Let Π be a RES refutation of CNF F over $x_1 \dots x_n$

SIZE(Π) = Number of clauses in Π

Π is tree-like if directed acyclic graph (ignoring initial clauses of F) is a tree

Upper bound: $\text{size}(\Pi) \leq 2^n$ Why?

Lower bound: Are there UNSAT formulas $\{F_n\}_{n \geq 1}$ requiring exponential-sized RES proofs?

Let F have m clauses, n vars.

1. F unsat $\rightarrow \exists$ a Res ref of F
of size $\leq O(2^n)$

2. There are formulas F where $m = O(n)$

and F unsat

and any Res Ref of F

requires size $\geq 2^{\Omega(n)}$

~~EF~~ there .

If some prop. proof system has poly length refutations for all unsat formulas then $NP = co NP$