

In this lecture we consider formal descriptions of the relationships between a finite number of individuals. We may have different types of individual

Informatics 1

Lecture 8 Resolution (continued)

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"I am never really satisfied that I understand anything, because, understand it well as I may, my comprehension can only be an infinitesimal fraction of all I want to understand."

Ada Lovelace, the world's first programmer, student of de Morgan, who taught her mathematics.

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WE CAN PROGRAM!

ADA LOVELACE
World's First Computer Programmer (1815 - 1852)

Ada Lovelace was the daughter of the poet Lord Byron. Her mother wanted her to be nothing like her poet father, so she made sure she had a strong education in science and mathematics. She is famous for translating the notes of Italian mathematician Menabrea on the subject of Charles Babbage's Analytical Engine. Her notes on his article were longer than the article itself. In her later correspondence with Babbage, she suggested that such a machine could later be used for composing music and producing graphics. Her prediction was correct. She also wrote instructions for the machine to calculate Bernoulli numbers: the world's very first computer program.

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Again, [the Analytical Engine] might act upon other things besides number, were objects found whose mutual fundamental relations could be expressed by those of the abstract science of operations, and which should be also susceptible of adaptations to the action of the operating notation and mechanism of the engine . . . Supposing, for instance, that the fundamental relations of pitched sounds in the science of harmony and of musical composition were susceptible of such expression and adaptations, the engine might compose elaborate and scientific pieces of music of any degree of complexity or extent.

In 1852, when only 37 years of age, Ada died of cancer.

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Premises

$X \vee \neg D$	$Y \vee D$
$X \vee Y$	

Conclusion

A valid inference Any assignment of truth values that makes all the premises true will make the conclusion true.

The conclusion follows from the premises

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Premises

$X \vee \neg D$	$Y \vee D$
$X \vee Y$	

Conclusion

For any valid inference Any assignment of truth values that makes the conclusion false will make at least one of the premises false.

Premises

$X \vee \neg D$	$Y \vee D$
$X \vee Y$	

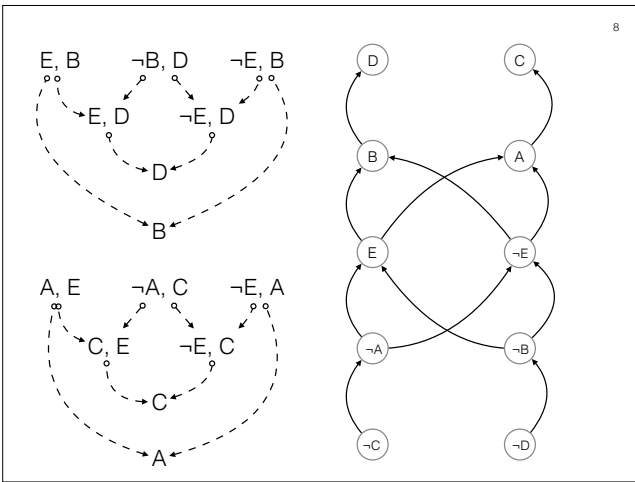
Conclusion

where D does not occur in X or Y

A special property of this inference If some assignment abc of values for ABC makes the conclusion false then the assignments $abcD$ and $abc\bar{D}$ each make one or other of the two premises false.

Resolution

$$\frac{UvVvWvXv\text{-}C \quad XvYvZvC}{UvVvWvXvYvZ}$$



Resolution gives the same information as our earlier graphical analysis.

Clausal Form

Resolution uses CNF
 a conjunction of disjunctions of literals
 $(\neg A \vee C) \wedge (\neg B \vee D) \wedge (\neg E \vee B) \wedge (\neg E \vee A) \wedge (A \vee E) \wedge (E \vee B) \wedge (\neg B \vee \neg C \vee \neg D)$

Clausal form is a set of sets of literals
 $\{ \{ \neg A, C \}, \{ \neg B, D \}, \{ \neg E, B \}, \{ \neg E, A \}, \{ A, E \}, \{ E, B \}, \{ \neg B, \neg C, \neg D \} \}$
 Each set of literals represents the disjunction of its literals.
 An empty disjunction $\{ \}$ represents false \perp .

The clausal form represents the conjunction of these disjunctions (an empty conjunction $\{ \}$ represents true \top).

Using sets builds in idempotence, associativity and commutativity.

Clausal Form

Clausal form is a set of sets of literals

$$\{ \{\neg A, C\}, \{\neg B, D\}, \{\neg E, B\}, \{\neg E, A\}, \{A, E\}, \{E, B\}, \{\neg B, \neg C, \neg D\} \}$$

A (partial) truth assignment makes a clause true
iff it makes at least one of its literals true
(so it can never make the empty clause $\{\}$ true)

A (partial) truth assignment makes a clausal form true
iff it makes all of its clauses true
(so the empty clausal form $\{\}$ is always true).

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Clausal form is a set of sets of literals

$$\{ \mathbf{x}_0, \mathbf{x}_1, \dots, \mathbf{x}_{n-1} \}$$

where $x_i = \{ L_0, \dots, L_{m_i-1} \}$

Resolution rule for clauses

$$\frac{\mathbf{X} \quad \mathbf{Y}}{(\mathbf{X} \cup \mathbf{Y}) \setminus \{ \neg A, A \}} \quad \text{where } \neg A \in \mathbf{X}, A \in \mathbf{Y}$$

If a valuation makes everything in the conclusion false
then that valuation must make everything in one or
other of the premises false.

If it makes A true, then it makes everything in \mathbf{X} false
If it makes A false, then it makes everything in \mathbf{Y} false

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If we have derived $\{\}$ by
resolution, then, for any
valuation we are given, the
special property lets us find a
constraint that it violates. So
there are no valuations
satisfying all the constraints.

Davis Putnam

Take a collection C of clauses.

For each propositional letter, A

For each pair $(X, Y) \mid X \in C \wedge Y \in C \wedge A \in X \wedge \neg A \in Y$

if $R(X, Y, A) = \{\}$ return UNSAT

if $R(X, Y, A)$ is contingent $C := C \cup \{ R(X, Y) \}$

remove any clauses containing A or $\neg A$

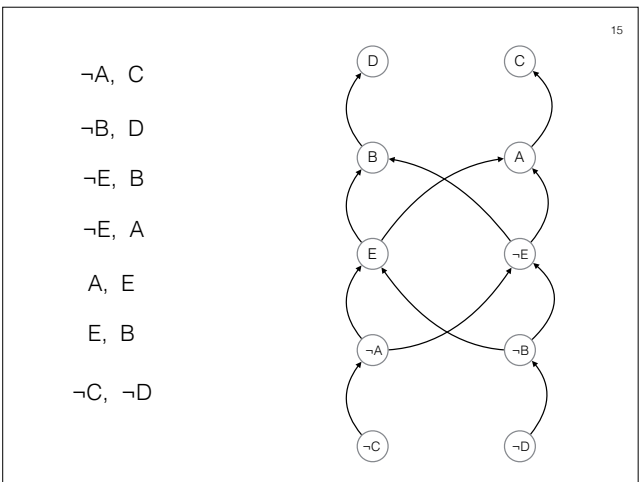
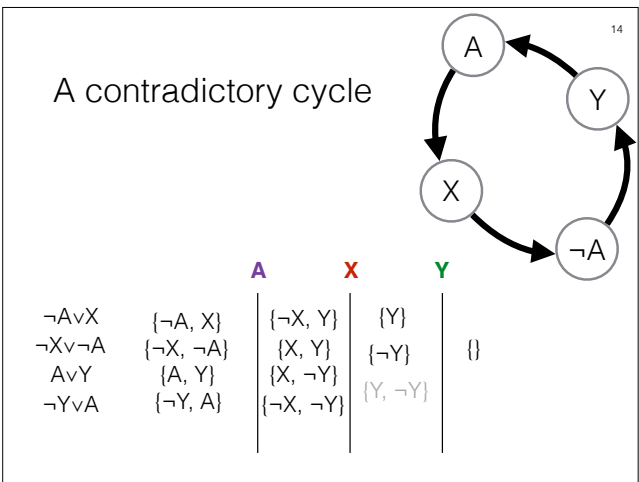
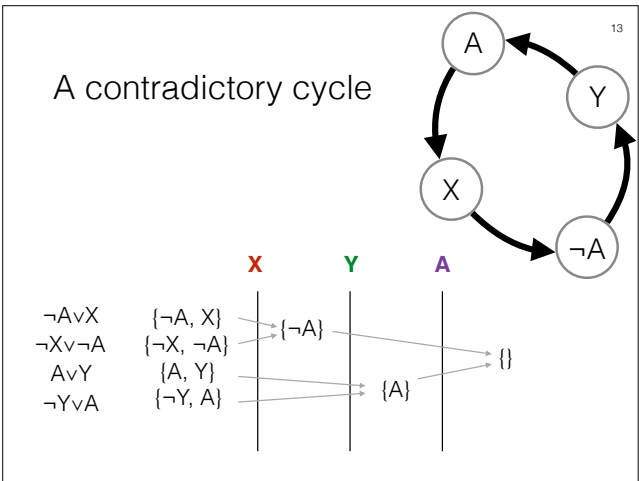
return SAT

Where $R(X, Y, A) = X \cup Y \setminus \{ A, \neg A \}$, and
a clause is contingent if does not contain any
complementary pair of literals

Heuristic: start with variables that occur seldom.

On this slide, indentation
indicates grouping. So, for
each atom, we resolve all pairs
satisfying $A \in X \wedge \neg A \in Y$. Once
all the A-resolvants have been
produced we can forget about
clauses containing A or $\neg A$.

Removing clauses that contain
 A or $\neg A$ will not prevent us



By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

	A	$\neg A, C$ $\neg B, D$ $\neg E, B$			
		$\neg E, A$ A, E			
		E, B $\neg C, \neg D$			

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

	A	$\neg A, C$ $\neg B, D$ $\neg E, B$		$\neg E, C$ C, E	17
		$\neg E, A$ A, E			
		E, B $\neg C, \neg D$			

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

	A	$\neg A, C$ $\neg B, D$ $\neg E, B$		B	18
		$\neg E, A$ A, E E, B		$\neg E, C$ C, E	
		$\neg C, \neg D$			

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

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A	B	
$\neg A, C$	$\neg E, C$	$\neg E, D$
$\neg B, D$	C, E	E, D
$\neg E, B$		
$\neg E, A$		
A, E		
E, B		
$\neg C, \neg D$		

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

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A	B	C	
$\neg A, C$	$\neg E, C$	$\neg E, D$	
$\neg B, D$	C, E	E, D	
$\neg E, B$			
$\neg E, A$			
A, E			
E, B			
$\neg C, \neg D$			

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

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A	B	C	
$\neg A, C$	$\neg E, C$	$\neg E, D$	$\neg E, \neg D$
$\neg B, D$	C, E	E, D	$\neg D, E$
$\neg E, B$			
$\neg E, A$			
A, E			
E, B			
$\neg C, \neg D$			

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

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A	B	C	D
$\neg A, C$	$\neg E, C$	$\neg E, D$	$\neg E, \neg D$
$\neg B, D$	C, E	E, D	$\neg D, E$
$\neg E, B$			
$\neg E, A$			
A, E			
E, B			
$\neg C, \neg D$			

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

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A	B	C	D	E
$\neg A, C$	$\neg E, C$	$\neg E, D$	$\neg E, \neg D$	$\neg E, E$
$\neg B, D$	C, E	E, D	$\neg D, E$	E, E
$\neg E, B$				$\neg E, \neg E$
$\neg E, A$				$\neg E, E$
A, E				
E, B				
$\neg C, \neg D$				

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

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A	B	C	D	E
$\neg A, C$	$\neg E, C$	$\neg E, D$	$\neg E, \neg D$	$\neg E, E$
$\neg B, D$	C, E	E, D	$\neg D, E$	E, E
$\neg E, B$				$\neg E, \neg E$
$\neg E, A$				$\neg E, E$
A, E				
E, B				
$\neg C, \neg D$				

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

	A	B	C	D	E	
$\neg A, C$	$\neg E, C$	$\neg E, D$	$\neg E, \neg D$	$\neg E, \neg D$	$\neg E, E$	{}
$\neg B, D$	C, E	E, D	$\neg D, E$	$\neg D, E$	E, E	
$\neg E, B$					$\neg E, \neg E$	
$\neg E, A$					$\neg E, E$	
A, E						
E, B						
$\neg C, \neg D$						

By our analysis of the picture, we know that any valuation satisfying the binary constraints must make A, B, C, D all true. So adding this new constraint makes an inconsistent set of constraints. Use resolution to show this directly.

Resolution

A complete proof procedure for propositional logic that works on formulas expressed in conjunctive normal form. (Robinson 1965)

Conjunctive Normal Form (CNF)

Literal: a propositional variable p or its negation $\neg p$

Clause: a disjunction of (a set of) literals.

CNF: a conjunction of clauses.

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Resolution

From two clauses

$$C_1 = (X \cup \{A\}), C_2 = (Y \cup \{\neg A\})$$

the resolution rule generates the new clause

$$(X \cup Y) = R(C_1, C_2)$$

where X and Y are sets of literals, not containing A or $\neg A$.

(X \cup Y) is the resolvent

A is the variable resolved on

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Resolution

A **resolution refutation** of a CNF F (a set of clauses) is a sequence C_1, C_2, \dots, C_m of clauses such that

$$C_m = \{\}, \text{ and}$$

each C_i is either

a member of F

or

the resolvent of two previous clauses in the proof:

$$C_i = R(C_j, C_k), \text{ where } j, k < i$$

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Resolution

Any resolution proof can be represented as a DAG
nodes are clauses in the proof.

Clauses in F are leaves: they have no incoming edges.

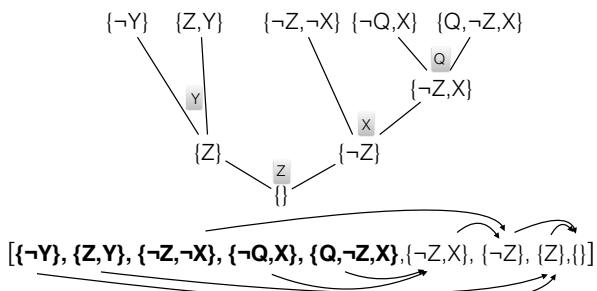
Every clause C_i that arises from a resolution step has two incoming edges. One from each of the clauses (C_j, C_k) that were resolved together to obtain $C_i = R(C_j, C_k)$.

Each non-leaf node C_i is labeled by the variable that was resolved away to obtain it.

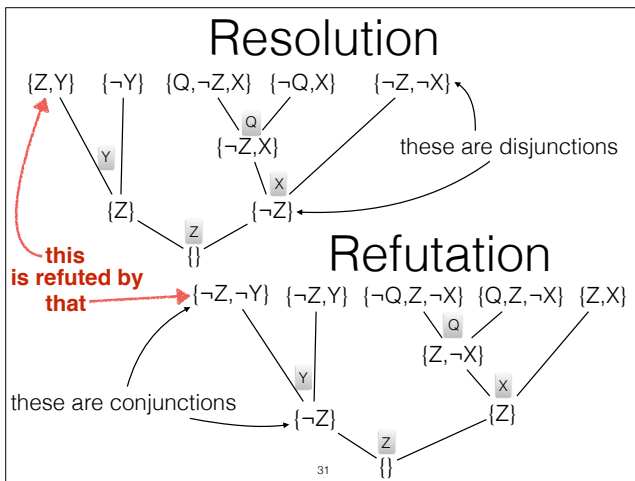
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Resolution

$$F = \{\{-Y\}, \{Z, Y\}, \{-Z, \neg X\}, \{-Q, X\}, \{Q, \neg Z, X\}\}$$



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From the resolution proof we can derive a refutation.

The lower tree demonstrates the fact that whatever values we choose for the variables, we will arrive at a clause that is false for our chosen values. This suffices to show that, no matter what choice of values we make, the conjunction is

