## The Satisfiability Problem

(This slide through to "NP-complete" is optional and not covered in lecture or tested.)

While propositional logic is pretty straightforward, that doesn't mean that there's nothing but triviality within. For example, consider the satisfiability problem. Given a proposition in conjunctive normal form, determine whether or not there is a choice of truth values for the atomics that makes the proposition true (i.e. satisfied).

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For example consider the proposition

$$(P \lor Q \lor R) \land (\neg P \lor \neg Q) \land (\neg P \lor \neg R) \land (\neg R \lor \neg Q).$$

Is it satisfiable?

The satisfiability problem is probably the biggest open problem in computer science and is part of the whole "P versus NP" question. A problem that an algorithm can give an answer to in polynomial time is considered to be in "class P". A problem whose answer can be **verified** in polynomial time is in "class NP". So, for example, a Sudoku puzzle is in class NP.

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The big question is: Are the two classes the same? Is there a polynomial solution **finding** algorithm for every problem which has a polynomial time **verifying** algorithm?

### NP-complete

One idea that has been used to attack the P vs. NP problem is the idea of NP-completeness. An NP problem is NP-complete if any other NP-class problem can be modeled using the first type of problem (said model made in polynomial time). The satisfiability problem is NP-complete.

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Interestingly, so is minesweeper. (See 'Minesweeper is NP-Complete.pdf' in the 'Extra Resources / Further Reading' module on Carmen.)

A set is a collection of distinct objects, each of which is called an element of the set. We tend to write sets within curly braces: { .... }. Some examples:

•  $\mathbb{N} = \{0, 1, 2, \dots\}$ , the set of natural numbers,

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- $\{\{3,10\},\{2,3,17\},\{\frac{5k-1}{2}\mid k\in\mathbb{N}\}\}$

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The elements of a set are required to be distinct, but the order of the elements is not important. For example
 {x,y} = {y,x}, and if x = y then it is also the same as {x}.

A set with just one element is Called a "singleton Set".

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- The cardinality of a set is the number of elements it contains and is written |S|.

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- As you might expect S = T means that  $S \subseteq T$  and  $T \subseteq S$ .

• The union of two sets A and B (denoted  $A \cup B$ ) is the set that contains any element that is in <u>either</u> set. E.g., if  $A = \{1, 2, 4\}$  and  $B = \{3, 4\}$  then  $A \cup B = \{1, 2, 3, 4\}$ .

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- The Cartesian product of A and B (denoted  $A \times B$ ) is the set of ordered pairs  $\{(a,b)|(a \in A) \land (b \in B)\}$ . For our example,  $A \times B = \{(1,3),(1,4),(2,3),(2,4),(4,3),(4,4)\}$ .  $|C \times D| = |C| \cdot |D|$

### The Power Set

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Consider  $A = \{1, 2, 4\}$  from before. What is  $|\mathscr{P}(A)|$ ?

$$\mathcal{P}(A) = \{ \phi, \{13, \{1, 23, \{2, 4\}\}, A, \{1, 4\}, \{23, \{4\}\}\} \}$$

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Notice that A has three elements and  $\mathscr{P}(A)$  has eight. If |B|=10, what do you think the cardinality (size) of  $\mathscr{P}(B)$  is?



$$P(s)=2^{s}$$

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If |S| = n that's n questions each with one of two answers, so  $2^n$  ways of answering all the questions, or  $2^n$  subsets.

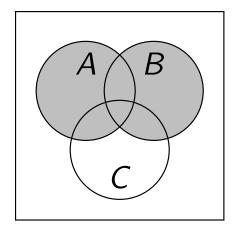
## Venn Diagrams

A Venn diagram is a pictorial representation of **all** possible intersections between a finite number of different sets. They represents the sets as regions inside closed curves (for example, the interior of a circle) and elements as points in a plane. For example, if I wanted to confirm (*not prove*) that

$$(A \cup B) - C = (A - C) \cup (B - C)$$

then I could draw the picture for both sides and confirm that they are the same.

# $(A \cup B) - C = (A - C) \cup (B - C)$





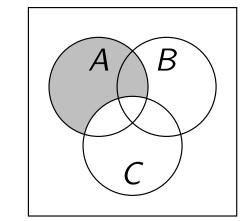


Figure: A - C

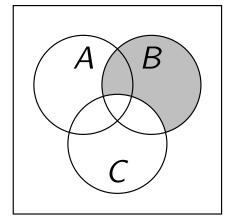
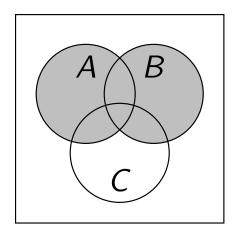


Figure: B - C

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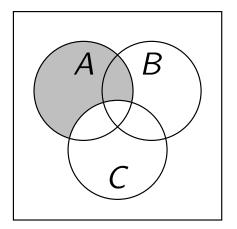


Figure: A - C

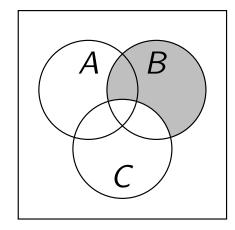


Figure: B - C

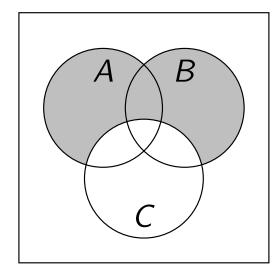


Figure:  $(A \cup B) - C$ 

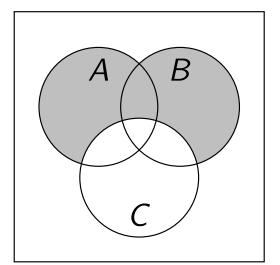
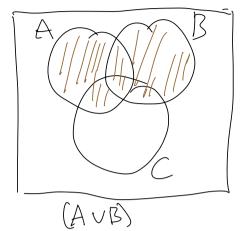
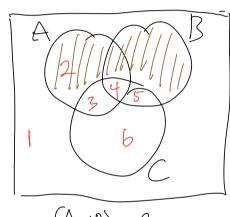


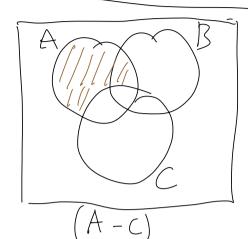
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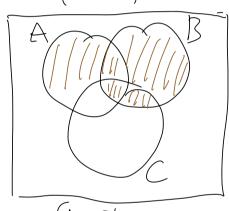
### ? (A-C) UB (AUB)-C











(A-C)VB

A= {2,3,43, B= £4,53, C= {3,4,5,63} (AUB)-C={2,3,4,53-C={23  $(A-C)UB = \{23VB = \{2,4,5\}$ 

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E.g.,

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- $(f_n) = (1, 1, 2, 3, 5, 8, 13, ...)$

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Like propositions, predicates are generally named with a letter, but because of the dependence on variables, a function-like notation is used. For example, naming the above predicate P tells us that P(4) and P(9) are true but P(5) and P(3.14159) are false.

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In other words, predicates are simply functions that return Boolean values.

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There are two common quantifiers:  $\forall$  and  $\exists$ .

We use the universal quantifier when we want to assert that a predicate is true for every element in a given set. So

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$$(\forall x \in \mathbb{R})[(x > 0) \Rightarrow (e^{\ln x} = x)].$$