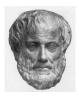
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# Back to Aristotle

Or perhaps you have met logic in a philosophical setting? You're aware of the work of Aristotle (384 BC - 322 BC), and in particular his discussion of syllogisms. For example, his famous 'Buffy' syllogism:



All vampires are demons. Angel is a vampire. Therefore Angel is a demon.

### Logics are languages

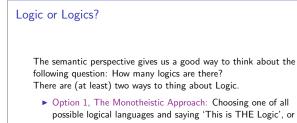
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- We want you to think of logics as languages.
- In particular we want you to think of logics as ways of talking about relational structures or models.
- That is there are two key components in the way we will approach logic
  - The logic: fairly simple, precisely defined, formal languages.
  - (This is where the funny symbols like  $\land$  and  $\exists$  live).
  - The model or relational structure: A simple 'world' (or 'database') that the logic talks about.

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 Option 2, The Polytheistic Approach: As a discipline that investigates different logical languages.

# What is Logic, and why should I care?

- Probably all of you have heard about 'Logic' before.
- But what is logic for you? Perhaps it's the science that studies strange symbols like

# $(p \land q) \rightarrow (p \lor q)$

### $\forall x (\mathsf{Human}(x) \rightarrow \mathsf{Mortal}(x))$

that are (allegedly) important in natural language semantics, computer science, computational linguistics, for (somewhat mysterious) reasons.

 And perhaps you've encountered what logicians called 'theorems', expressions like:

 $p \lor \neg p \text{ or } p \to p.$ 

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#### Tomorrow it will rain or it won't...

Either way, logic may not have struck you as particularly exciting or relevant to your work.

- Sentences like "John loves Mary, or not" or "It will rain or it won't, tomorrow" sound a bit silly. They don't seem to be very informative.
- Nor do simple syllogisms seem to have much to with with reasoning in natural language (though, to be fair, they do seem similar to the types of arguments found when reasoning about simple ontologies or when working with WORDNET).
- And they certainly seem far removed from the type of arguments found in computer science and mathematics. And the mathematicians notion of 'theorem' seems very different (and much richer) than the logicians notion.

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### Semantic perspective

That is, our perspective on logic is fundamentally semantic. It is due to Alfred Tarski (1902–1983).



The semantic perspective is also known as the model-theoretic perspective, or even the Tarskian perspective.

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# Monotheism in the 20th century

Logical monotheism was a powerful force for much of the twentieth century.



Perhaps the most influential monotheist was Willard van Orman Quine, who championed first-order classical logic as the one-true-logic with vigor.

Though (disturbingly for the monotheists) there were always those who worshiped at other temples (such as the intuitionistic logicians or Arthur Prior).

## Polytheism in the 21st century

- But polytheism gradually became the dominant thread as time went by.
- ▶ Why? Because logic spread everywhere. Computer scientists used it. Early artificial intelligence relied on it. It cropped up in economic and cognitive science. And it became a corner stone of natural language semantics.
- However the most important point for this course, is that polytheism as regards logic is very natural from a semantic perspective.
- Once we have fixed the model or relational structures we wish to work with (that is, once we have fixed our 'world') it is natural to play with different ways of talking about it.

# Relational Structures (informal)

A relational structure (or model) consists of the following

- ► A non-empty set (often called *D*, for domain) of the model; think of these as the objects of interest.
- A collection of relations R on the objects in D; think of these as the relations of interest. We shall only work with binary relations (that is, two place relations like "loves", "<", or "to-the-right-of" in this course) to keep the notation simple.
- ► A collection of properties on the objects in *D*; think of these as the properties of interests (perhaps "is red", "is activated", or "is an even number").
- ► A collection of designated individuals, that is, elements of D that we find really special (maybe "Buffy", "0", or "1")

Properties are thought of as subsets. That is, given any set D, a property on D is simply a subset P of D; that is  $P \subseteq D$ .

Binary relations are though of as sets of ordered pairs. That is, given any set D, a binary relation R is a subset of  $D \times D$ ;

 $\langle D, \{ \mathsf{loves}, \mathsf{detests} \}, \emptyset, C \rangle$ 

 $C = \{judy \mapsto ju, johnny \mapsto jo, terry \mapsto te, frank \mapsto fr\}$ 

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A small mathematical reminder:

that is,  $R \subseteq D \times D$ .

Another look at our first relational structure

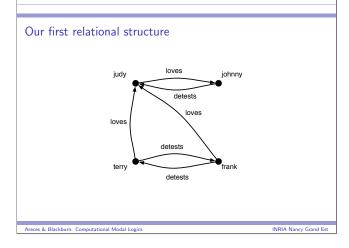
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 $D = \{ju, jo, te, fr\}$ 

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 $\mathsf{loves} = \{(ju, jo), (te, ju), (fr, ju)\}$  $detests = \{(jo, ju), (te, fr), (fr, te)\}$ 

Reminder





A relational structure (or model) is a tuple of the form:

 $\langle D, \{R_m\}, \{P_n\}, \{C_l\}\rangle$ 

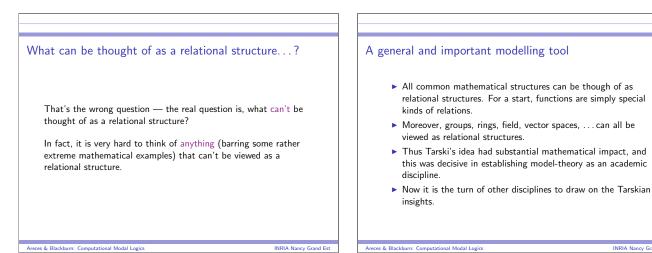
Sometimes we work with simpler forms. For example the following

 $\langle D, R, \emptyset, \emptyset \rangle$ 

we would usually write as:

 $\langle D, R \rangle$ 

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# The three big themes

In this course we use the model-theoretic perspective to provide a window on the following three issues:

- Inference: roughly speaking, what methods are there for gaining new information by working with this logic?
- Expressivity: roughly speaking, what can I describe (and what can't I describe) using this logic?
- Computation: can computers help with such and such logic? If so how, and how much?

# Inference tasks

The semantic perspective give us a good way to think about inference tasks. We will mention the following:

- Model Checking: Given a certain logical description φ, and a model *M*, does the formula correctly describe (some aspect of) the model? More simply: is the formulas true (or satisfied) in the model?
- Satisfiability Checking: Given a certain logical description φ, does there exist a model where the description is satisfied?
- $\blacktriangleright$  Model Building: Given a certain logical description  $\varphi,$  exhibit a model where that description is true.
- Validity Checking: Given a logical description φ, is it true (or satisfied) in all models?

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# The Model Checking task

- As we shall learn, this is the simplest.
- However, it has also proved to be one of the most useful.
- A classic application is hardware verification. The model *M* is a mathematical picture of (say) a chip. The logical description φ describes some desirable feature of of the chip. If the *M* makes φ true, then the chip will have that property.
- Incidentally, this example already suggests the need for "designing logics for their application". After all, there is not reason to think that an off-the-shelf logic will provide exactly what is needed to talk usefully about chips and their properties.

# Validity checking

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- A great deal of attention has been devoted to this task essentially, when people talk about "writing a theorem prover", they are talking about creating a computational tool for solving this task.
- ▶ Why? After all, we've already mentions that  $p \lor \neg p$  and  $p \to p$  are not going to set too many pulses racing...
- ▶ The answer is: checking if  $\varphi$  is valid is boring. But checking if  $\varphi$  follows from  $\Gamma$  ( $\Gamma \models \varphi$ ) is usually interesting. E.g.:

 $\{(p \lor q)\} \models p \quad ??? \quad No \\ \{(p \lor q), \neg q\} \models p \quad ??? \quad Yes \\ ((p \lor q) \land \neg q) \to p \text{ is valid}$ 

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## Axiomatics is an ancient idea



The idea goes back to Euclid's celebrated book "The Elements". This is rightly considered one of the foundational blocks of mathematics. It is certainly that, but it is also one of the foundations of modern logic.

Satisfiability checking and Model Building

- A nice way to think of these problems is in terms of constraints. We have some description, and we ask ourselves is there anything that matches this description? That is, does a model making this description actually exist, and can we build it?
- Very useful. The description might be almost anything: for example, a description of a parse tree (if you're doing computational linguistics).

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### Logic is a tool for working with theories

- Let's turn to mathematics. The intuitive idea is that we write down a set  $\Sigma$  of all our axioms. These are the properties that we assume are fundamental and indisputable; what we take for granted.  $\Sigma$  is our theory.
- For example Peano axioms are a theory for the natural numbers.
- Checking if the Goldbach theory is true in the natural numbers boils down to verifying that

 $(\bigwedge \mathsf{PEANO}) \to \mathsf{GOLDBACH}$ 

is a 'trivial" formula, that is, a validity.

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# Expressivity

- ► The theme of expressivity is fundamental to this course and to a model-theoretically inclined logician, the theme is absolutely fundamental — though this early in the course is difficult to say very much about it.
- But the fundamental point is this. Once we have said which relational structures we are interested in, there are many logics suitable for talking about them. Each offers a different (often a fascinatingly different) perspective on the same "world".
- Linguists may like to recall the Sapir-Whorf hypothesis: loosely speaking, the limits of our language are the limits of the world. This analogy should not be taken too literally, but it may be suggestive.

# Computation

However, we can already say quite a bit about computation and how it enters the course. In fact it does so at a number of levels.

- First, ideas from theoretical computer science (such as computational complexity) are fundamental tools for analyzing logics.
- Second, more and more computer science is setting the agenda in logic.
- Third, at a practical level we simply need computers when working with logic.

Let's consider these points in turn...

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# Computational Logics: Logic in Action!

- Logic was born as part of philosophy, and achieved greatness as a branch of mathematics.
  - Originally meant to model human reasoning processes
  - and to help making correct inferences
  - Mathematicians then turned it into a new tool for mathematics.
- With the advent of computer science, things changed
  - Logic played a fundamental part in the development of computers (logic circuits)
    - but nowadays computer science fuels logic.
    - P but nowadays computer science racis logic.
- In this course a computational view on logical systems will never be far away.

# Propositional Logic: Syntax

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The language of propositional logic is simple. We have the following basic symbols:

(, )

Propositional symbols:  $p, q, r, p_1, p_2, p_3, \ldots$ 

Logical symbols:  $\top$ ,  $\bot$ ,  $\neg$ ,  $\lor$ ,  $\land$ ,  $\rightarrow$ ,  $\leftrightarrow$ 

Grouping symbols:

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PL is sometimes called Boolean logic (after the pioneering English logician George Boole) and the symbols  $\top$ ,  $\bot$ ,  $\neg$ ,  $\lor$ ,  $\land$ ,  $\rightarrow$  and  $\leftrightarrow$  are often called Boolean connectives.

# Propositional Logic: Semantics

- The semantics is also straightforward. A model for this language is simply an assignment V of true (T) or false (F) to the propositional symbols. So this is a very simple conception of model.
- Thus the models for PL are not relational structures. Or at least, so it seems. Actually, there is a natural way to view PL in terms of relational structures — but that can wait.



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### How easy is it? Is it even possible?

- They say that there are some things that cannot be bought for all the money in the world. (True Love?).
- There are problems that cannot be algorithmically solved even with unlimited computing resources.
- ► The Halting Problem: Given a program *P*, decide whether *P* ends or not.
- Some logics are algorithmically unsolvable in this sense (or to be more precise, the inference problems they give rise to are algorithmically unsolvable).
- Even when an inference problem can be algorithmically solvable, the question arises: how hard is it?

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### Why do we Need Computers?

- ► Why do we need computers?
  - well, after all, if we are lazy and don't want to do the work, it
  - would be nice if somebody else could do it for us! even if we could overcome our laziness, we wouldn't be able to
  - do the task ourselves.
- ► Some of the inference tasks we want to tackle are simply too difficult to perform without the help of computers
  - sometimes billions of possibilities need to be checked to verify
  - that a system satisfies a certain property we want to enforce
    and even using computers we need to be clever, or all the time till the end of the universe won't be enough. that is,
  - computational logic is not (just) about clever engineering.

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# Propositional Logic: Syntax

We then say that  $\top$ ,  $\bot$  and any propositional symbol are formulas (or well-formed formulas, or wff). These single-symbol formulas are often called atomic formulas.

We then construct complex formulas (or compound formulas) in accordance with the following recursive definition:

- ▶ If  $\varphi$  and  $\psi$  are formulas then so are  $\neg \psi$ ,  $(\varphi \lor \psi)$ ,  $(\varphi \land \psi)$ ,  $(\varphi \land \psi)$ ,  $(\varphi \to \psi)$ , and  $(\varphi \leftrightarrow \psi)$ .
- ► Nothing else is a formula.

That's the official syntax — but we often simplify the bracketing. For example we would typically write  $((p \land q) \rightarrow r)$  as  $(p \land q) \rightarrow r$ .

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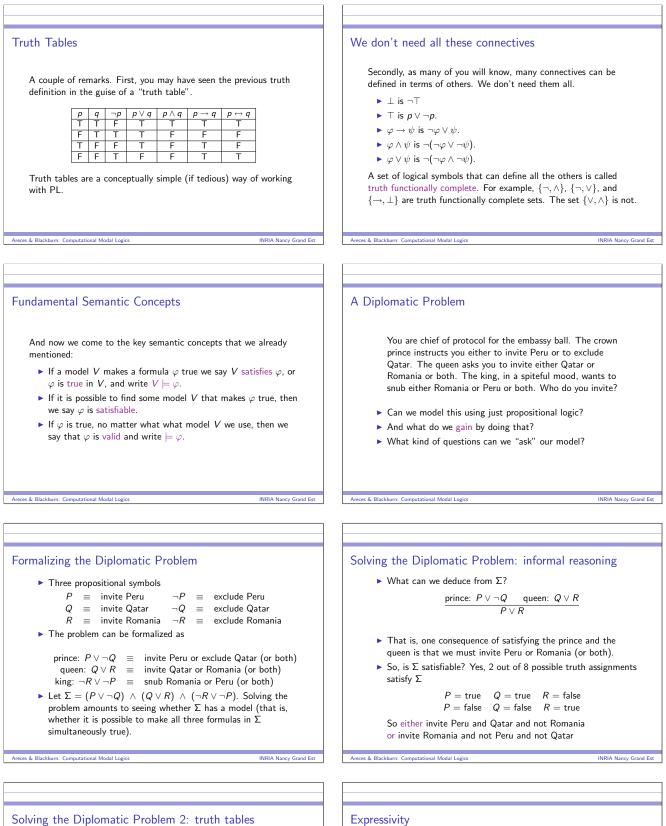
# Propositional Logic: Semantics

So: V determines the truth values of the propositional formulas. We then determine whether other formulas are true or false with respect to V by using the following rules. Note: iff is short for if and only if:

		is always true
$\perp$		is always false
$\neg arphi$ is true	iff	arphi is false
$\varphi \lor \psi$ is true	iff	either $arphi$ or $\psi$ (or both) are
$\varphi \wedge \psi$ is true	iff	both $arphi$ and $\psi$ are
$arphi  ightarrow \psi$ is true	iff	either $\varphi$ is false or $\psi$ is true
$\varphi \leftrightarrow \psi$ is true	iff	$arphi$ and $\psi$ are both true, or they are both false

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Is there a way of computing this solution?

Т

т

on the chessboard before we're finished ...

 $R \mid P \lor \neg Q \mid$ 

Т

Т

Т

F

F

Т

Т

 $Q \lor R$ 

Т

т

F

т

Т

т

F

This works — but it's about as exciting as watching paint dry.

And may take considerably longer; truth tables are  $2^n$  in the

number of propositional symbols. There could be a lot of rice

 $\neg R \lor \neg P$ 

F

т

F

Т

Т

Т

Т

Т

Σ

F

Т

F

F

F

F

Т

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Yes. Use truth tables.

Р Q

Т т F

Т F Т

Т F F

F Т т

F

F

F F F

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Т F

- As we remarked earlier, it is possible to think about the semantics of PL in terms of relational structures.
- > This gives us a way of comparing the expressivity of PL with the more powerful logics we shall study later.
- ► The idea is simple: think of PL as a way of talking about one element (!) relational structures of the form  $\langle \{d\}, \{P_n\} \rangle$ .
- > That is, we have one individual, and one property for every propositional letter  $p_n$  (think of each  $P_n$  as a colour — we are covering the individual with coloured dots).
- This way of thinking about PL semantics is equivalent to the truth conditional semantics. Can you see why?
- That is, PL validity is completely determined by one element relational structures! Measured this way, its expressivity is low.

# Computability

- ► We haven't directly said much about computability, but it should be clear that PL is a "computable logic".
- For a start, model checking is clearly computationally straightforward — it's linear in the length of the input formula.
- And checking satisfiability (and hence validity) is clearly computable too. The truth table method shows that we can do it in 2<sup>n</sup> steps, where n is the number of propositional symbols in the input formula.
- ► Can we do better that  $O(2^n)$  steps? Can other methods do satisfiability/validity checking more efficiently.
- Sadly, it seems the answer is no.

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# More than Diplomacy

- ▶ We saw a simple use of propositional logic in the "Diplomatic Problem"
- But the expressive power of PL is enough for doing many more interesting things:
- graph coloring
   constraint satisfaction problems (e.g., Sudoku)
  - hardware verification planning (e.g., graphplan)

Graph Coloring: The Nitty-Gritty Details

We will read p<sub>ij</sub> as node i has color j

1. Each node has (at least) one color.

3. Related nodes have different colors. 1. Each node has one color:  $p_{i1} \lor \ldots \lor p_{ik}$ ,

for  $1 \le i \le n$ , and  $1 \le l < m \le k$ 

So let's turn to satisfiability checking ....

We'll use tableaux to perform this task.

possible ways of building a model.

attempts to build a model.

A tableaux is essentially a tree-like data structure that records

Each branch of a tableaux records one way of trying to build a

model. Some branches ("closed branches") don't lead to

models. Others branching ("open branches") do.

The best way to learn is via an example...

Tableaux are built by applying rules to an input formula.

These rules systematically tear the formula to detect all

2. Each node has no more than one color.

2. Each node has no more than one color:  $\neg p_{il} \lor \neg p_{im}$ ,

3. Neighboring nodes have different colors.  $\neg p_{il} \lor \neg p_{jl}$ , for i and j neighboring nodes, and  $1 \leq l \leq k$ 

We have to say that

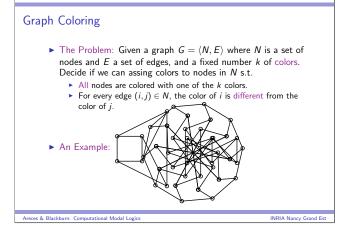
for  $1 \leq i \leq n$ 

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Note that these problems have real world applications!

• We will use  $n \times k$  propositional symbols that we write  $p_{ij}$  (n is

the number of nodes in N, k the number of colors)



# Graph Coloring: Complexity

 Using the encoding in the previos page we efectively obtain for each graph G and k color, a formula  $\varphi_{G,k}$  in PL such that

every model of  $\varphi_{G,k}$  tell us a way of painting G with k colors

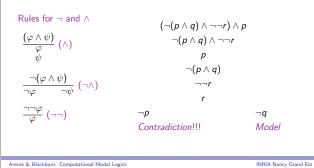
- ▶ If  $\mathcal{M}$  is a model of  $\varphi_{G,k}$  in which  $p_{ij}$  is true, then paint node *i* in G with color k.
- What have we done?!!!
  - Perhaps you know that graph coloring is a difficult algorithmic problem.
  - It is actually what is called an NP-complete problem (i.e., one of the hardest problems in the class of non-deterministied polynomial problems).
  - Assuming that, we just proved that PL-SAT is also NP-complete.

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# Tableaux for PL

Let's see if we can build a model for  $(\neg(p \land q) \land \neg \neg r) \land p$ .

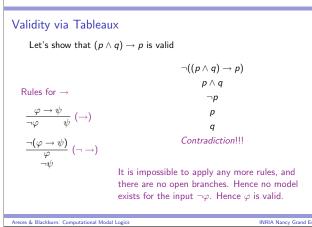


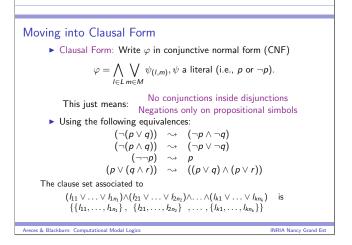
Satisfiability and Validity are Dual

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- A formula  $\varphi$  is valid iff  $\neg \varphi$  is not satisfiable.
- A consequence of this observation is: if we have a method for solving the satisfiability problem (that is, if we have an algorithm for building models) then we have a way of solving the validity problem.
- ▶ Why? Because: to test whether  $\varphi$  is valid, simply give  $\neg \varphi$  to the algorithm for solving satisfiability. If it can't satisfy it, then  $\varphi$  is valid.
- ▶ Well, we have an algorithm for satisfiability (namely the tableaux method), so let's put this observation to work.

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This conversion to CNF can lead to exponentially big

 $(p_1 \wedge q_1) \vee (p_2 \wedge q_2) \vee \cdots \vee (p_n \wedge q_n).$ 

 $(p_1 \vee \cdots \vee p_{n-1} \vee p_n) \wedge (p_1 \vee \cdots \vee p_{n-1} \vee q_n) \wedge \cdots \wedge (q_1 \vee \cdots \vee q_{n-1} \vee q_n).$ 

• Which has  $2^n$  clauses: each clause contains either  $p_i$  or  $q_i$ .

bigger than the original formula. But they are only

equisatisfiable to the input and not equivalent.

We can obtain formulas en CNF which are only polynomially

Conjunctive Normal Form

formulas. Consider

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► In CNF we get a formula:

# Decision Methods for PL > The most traditional methods for solving the SAT problem for propositional logics (PL-SAT) behave as follows: They always answer SATISFIABLE or UNSATISFIABLE after a finite time, for any input formula $\varphi$ . They always answer correctly > The best known complete methods probably are truth tables tableaux axiomatics, Gentzen calculi, natural deduction, resolution Davis-Putnam

# Example

1.  $\neg(\neg(p \lor q) \lor (\neg \neg q \lor (p \lor q)))$ 2.  $\neg(\neg(p \lor q) \lor (q \lor (p \lor q)))$ 3.  $(\neg \neg (p \lor q) \land \neg (q \lor (p \lor q)))$ 4.  $((p \lor q) \land \neg (q \lor (p \lor q)))$ 5.  $((p \lor q) \land (\neg q \land \neg (p \lor q)))$ 6.  $((p \lor q) \land (\neg q \land (\neg p \land \neg q)))$ 7. {{p,q}, { $\neg q$ }, { $\neg p$ }, { $\neg q$ }} 8.  $\{\{p,q\},\{\neg q\},\{\neg p\}\}$ The Diplomatic Problem:  $(P \lor \neg Q) \land (Q \lor R) \land (\neg R \lor \neg P)$  $\{\{P, \neg Q\}, \{Q, R\}, \{\neg R, \neg P\}\}$ 

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# CNF: Using New Propositional Symbols

Consider again

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 $\varphi = (p_1 \wedge q_1) \vee (p_2 \wedge q_2) \vee \cdots \vee (p_n \wedge q_n).$ 

• We can write  $\varphi'$  as:

 $(r_1 \vee \cdots \vee r_n) \land (\neg r_1 \vee p_1) \land (\neg r_1 \vee q_1) \land \cdots \land (\neg r_n \vee p_n) \land (\neg r_n \vee q_n).$ 

- A model satisfies  $\varphi'$  if at least one of the new variables  $r_i$  is true. If  $r_i$  is true, then  $p_i$  and  $q_i$  are true: Every model that satisfies the translation also satisfies  $\varphi$ .
- $\blacktriangleright$  On the other hand, if we have a model for  $\varphi$  then it makes some  $p_i$  and  $q_i$  true. We can get a model for  $\varphi'$  by setting  $r_i$ true

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### The Davis-Putnam Algorithm > The Davis-Putnam method is perhaps one of the most widely used algorithms for solving the SAT problem of $\mathsf{PL}$ Despite its age, it is still one of the most popular and successful complete methods Let $\Sigma$ be the clause set associated to a formula $\varphi$ procedure $DP(\Sigma)$ if $\Sigma = \{\}$ then return SAT // (SAT) // (UNSAT) if $\{\}\in\Sigma$ then return UNSAT if $\Sigma$ has unit clause {1} then $DP(\Sigma[\{1=true\}])$ // (Unit Pr.) Choose literal 1 and if DP( $\Sigma[{l=true}]$ ) return SAT then return SAT else return DP( $\Sigma$ [{l=false}]) // (Split)

Examples  $\neg(\neg(p \lor q) \lor (\neg \neg q \lor (p \lor q))) - \mathsf{CNF} \rightarrow \{\{p,q\}, \{\neg q\}, \{\neg p\}\}$  $\{\{P, \neg Q\}, \{Q, R\}, \{\neg R, \neg P\}\}$ 

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# Davis-Putnam: The (Split) Rule

- ▶ The (Split) rule is non-deterministic: Which literal do we chose?
  - MOM's heuristics: pick the literal that occurs most often in the minimal size clauses (with ties broken at random or following a fix order). This method is hard to beat for speed and simplicity.
  - Jeroslow-Wang's heuristics: estimate the contribution each literal is likely to make to satisfying the clause set and pick the best

$$\operatorname{pre}(I) = \sum_{c \in \Sigma \& I \in c} 2^{-|c|}$$

SATZ, one of the best available implementations of DP, uses a heuristics aimed at maximizing unit propagation: generate candidate set of branching literals, perform unit propagation, choose the literal leading to the smallest simplified clause set

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# You Might get Lucky

- ▶ Indeed, some method (called 'incomplete methods') rely in that you might get lucky.
- We can't cover them in the course, but intuitively,
  - they are stochastic methods
  - that randomly generate valuations
  - and try to maximize the probability that the valuation actually satisfies the input formula
- Examples of these methods are GSAT and WalkSAT.
- ▶ For example, a *k*-coloring algorithm based on GSAT was able to beat specialized coloring algorithms.

# Relevant Bibliography

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There are many good introductions to logic out there. Two interesting ones, written from radically different perspectives are:

- Philosophy of Logic by Willard Van Orman Quine, Harvard University Press; New edition, 1980). Still in stock at amazon.
- ► An Introduction to Non-Classical Logic, by Graham Priest, Cambridge University Press; 2nd edition, 2008.

The first is a monotheistic bible. The second raises polytheism to levels worthy of Terry Pratchett's novel "Small Gods"

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# Relevant Bibliography

- One of the main founders of PL was George Boole (1815–1864), mathematician and philosopher.
- His book "An Investigation of the Laws of Thought" was one of the first mathematical treatments of logic, and one of the most important conceptual advances in logic since the Aristotelian syllogistic.



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# What we covered up to now

- We discussed the balance between expressive power and complexity.
  - We can code complex problems in PL
  - (but the coding can be unintuitive, long, complex)
  - We have eficient decision methods for PL (able to cope with problems with hundres of propositional symbols, but our codings easily get into the thousands).
- > Still, no matter how nicely we paint them, 1-point relational structures are booooooooring.

#### Areces & Blackburn: Computational Modal Logic

# **Relevant Bibliography**

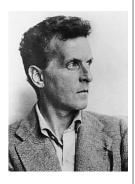
- ▶ The life of "the greatest sane logician" and inventor of Model Theory. Alfred Tarski: Life and Logic, by Anita Burdman Feferman and Solomon Feferman, Cambridge University Press, 1 paperback edition, 2008
- An introduction to good old fashioned model theory, by Harold Simmons, http:

//www.cs.man.ac.uk/~hsimmons/BOOKS/books.html

#### Areces & Blackburn: Computational Modal Logics

# Relevant Bibliography

- The truth table method was pioneered by the philosopher Ludwig Wittgenstein (1889-1951) in his first famous philosophical work, the "Tractatus Logico-Philosophicus"
- He used the method in support of his celebrated "picture" theory of meaning.



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# **DP:** Performance

- > The worst case complexity of the algorithm we show is  $O(1,696^n)$ , and a small modification moves it to  $O(1,618^n)$ .

  - 1.267.650.000.000.000.000.000.000.000  $1.696^{100}$ 87.616.270.000.000.000.000.000
  - $1.618^{100}$ 790.408.700.000.000.000.000
- > DP can reliably solve problems with up to 500 variables
- Sadly real world applications easily go into the thousands of variables (remember coloring: #nodes  $\times \#$ colors).
- But this is worst time complexity. You might get lucky...

# **Relevant Bibliography**

- Tableau were originally introduced by the Dutch logician Willem Beth.
- The particular form presented here is due to Raymond Smullyan, logician, magician, and puzzle-supremo.
- His classic exposition of the method is in his book "First-Order Logic" (1968), which remains one of the best technical expositions of the subject.



Areces & Blackburn: Computational Modal Logics

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# **Relevant Bibliography**

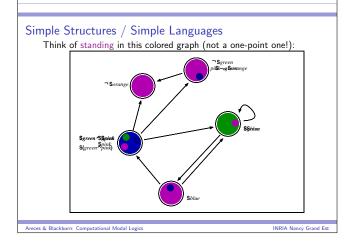
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- The Davis Putnam Algorithm
- It was developed by Martin Davis and Hilary Putnam.
- It was then improved (with the split rule) by Martin Davis, George Logemann and Donald Loveland. The correct name is DPLL.
- Davis' Web page: http: //www.cs.nyu.edu/cs/faculty/davism/
  - Davis, Martin; Putnam, Hillary (1960). A Computing Procedure for Quantification Theory. Journal of the ACM 7 (1): 201–215.
  - Davis, Martin; Logemann, George, and Loveland, Donald (1962). A Machine Program for Theorem Proving. Communications of the ACM 5 (7): 394–397.

### **Relevant Bibliography**

 $\ensuremath{\textbf{Cook's Theorem}}$  : the satisfiability problem for propositional logic is NP-complete.

- That is, any problem in NP can be reduced in polynomial time to PL SAT.
- In plain English: if we find a cheap way of solving PL SAT, we'll also have a cheap way of solving a hell of a lot more. (Coda: probably there is no cheap way. Too good to be true. But still, it has not been shown. P <sup>2</sup>= NP).
- Cook's Web page:
- way or ably rue. But
- http://www.cs.toronto.edu/~sacook/ Cook, Stephen (1971). The complexity of theorem proving procedures, Proceedings of the Third Annual ACM Symposium on Theory of Computing, 151–158.



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#### Diamonds are forever!

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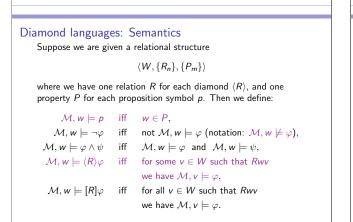
- But let's face it, we're here to work with relational structures. And although we saw yesterday that PL has a semantics in terms of one-point relational structures (wow!), and although we saw today that PL can, in a certain, code up information about graphs, PL isn't exactly our dream language.
- Why not? Because relational structures are full of points and lines and other nice things, and we really want to be able to get our hands on these directly! We want to be able to describe them, to compute with them, and to draw inferences about them. Using PL for this is like stroking a cat while wearing a suit of armor!
- ► In this lecture we introduce a special language which let's us do this: we call the diamond language. How will this language work. From the inside ...

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# Graphs with multiple relations The previous sequence of slides motivates the language we will use except that we will use a diamond symbol ◇ instead of *S*, and it also motivates the way we will define the semantics (we will continue to "stand inside models"). But there is more addition to make. Judy Judget State S

I he previous graphs only had one relation. We often want to work with more than one relation (as in the above relational structure) so we will want multiple diamonds, one for each relation. Areces & Biackhum: Computational Modal Logics INFIA Nancy Grand Est

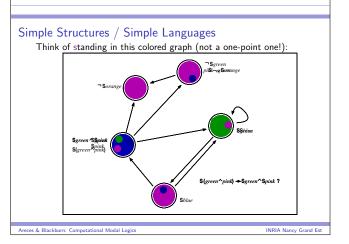


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# The Story So Far

- We looked at SAT-solving (that is, model building) for propositional calculus in some detail.
- In particular, we discussed the Davis-Putnam algorithm.
- ▶ We also briefly met the concept of an NP-complete problem.
- In a nutshell, what we learned was this: although PL looks very simple, it is actually capable of coding some very tough problems indeed.

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### Diamond languages: Syntax

We build the diamond language on top of PL. It is a very simple extension. First we decide how many relations R we want to work with, and then we add the following two symbols for each R:

#### $\langle R \rangle$ [R]

If we are only going to work with a single relation, we usually write these as:

◊ □

We then extend the definition of formula by saying that if  $\varphi$  is a formula, then so are  $\langle R \rangle \varphi$  and  $[R]\varphi$ .

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# We don't need both boxes and diamonds

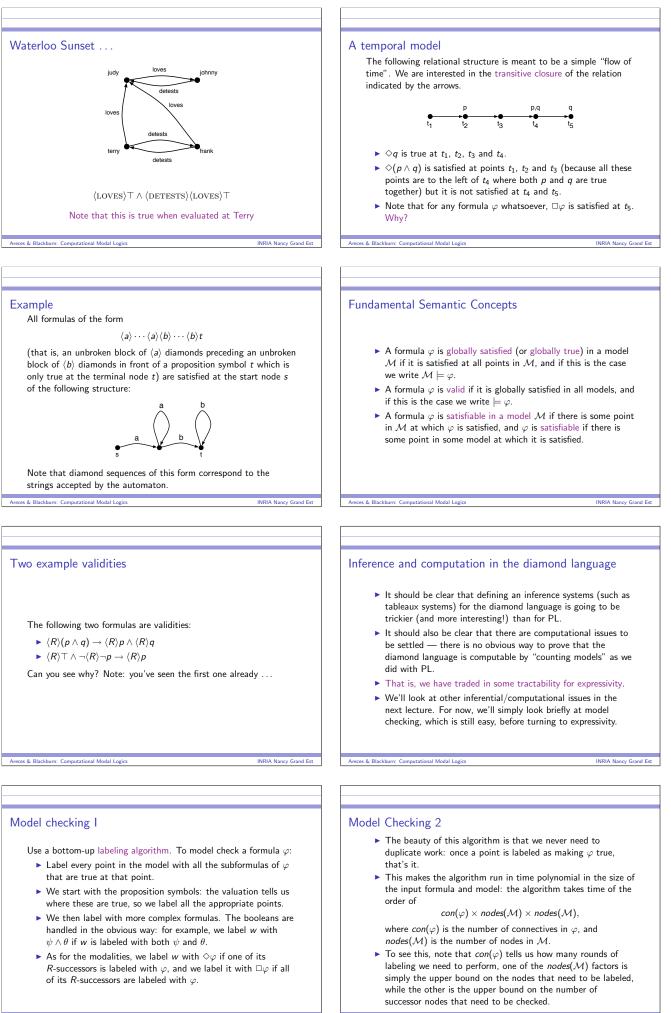


 $\Box \varphi \text{ is } \neg \Diamond \neg \varphi.$  $\Diamond \varphi \text{ is } \neg \Box \neg \varphi.$ 

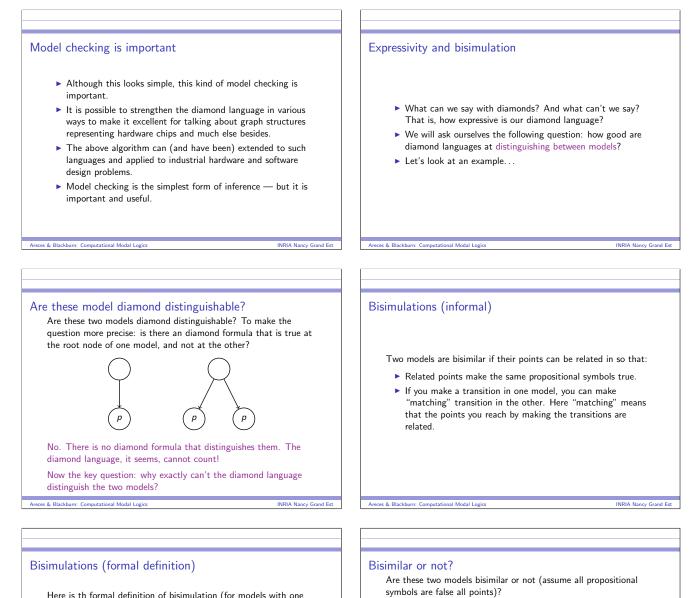
So, like WallE, we can choose either the diamond or the box — but we choose the diamond!

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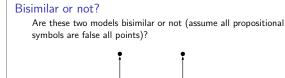


Here is th formal definition of bisimulation (for models with one relation R). A bisimulation between models  $\mathcal{M} = (W, R, V)$  and  $\mathcal{M}' = (W', R', V')$  is a non-empty binary relation E between their domains (that is,  $E \subseteq W \times W'$ ) such that whenever wEw' we have that:

Atomic harmony: w and w' satisfy the same proposition symbols, Zig: if Rwv, then there exists a point v' (in  $\mathcal{M}'$ ) such that vEv' and R'w'v', and Zag: if R'w'v', then there exists a point v (in  $\mathcal{M}$ ) such that vEv' and Rwv.

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If they are bisimilar, what is the bisimulation? If they are not bisimilar, what is a formula that distinguishes them?  $\Box(\Box \bot \lor \Diamond \Box \bot) \text{ is a formula that distinguishes these models: it is true in <math>\mathcal{M}$  at s, but false in  $\mathcal{N}$  at t.

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If they are bisimilar, what is the bisimulation? If they are not bisimilar, what is a formula that distinguishes them?

Yes, they are bisimilar; to this this, bend the upward-pointing arrow on the left of the left-hand model downwards. Arrecs & Blackburn: Computational Model Logics INRIA Nancy Grand Est

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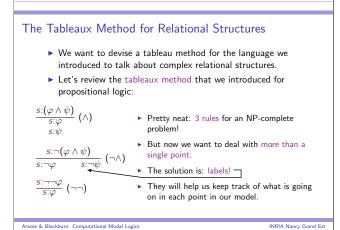
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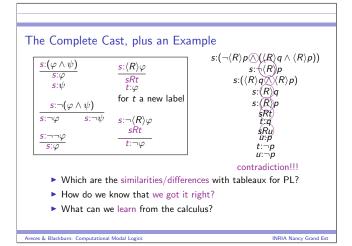
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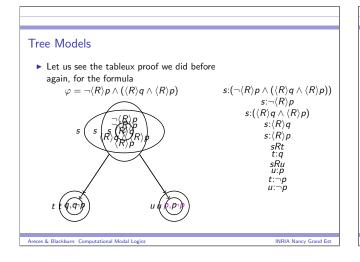
# Counting models

- The proof that the satisfiability problem for PL is decidable is very simple:
  - Suppose that you are given a formula φ and you are looking for a model of φ.
  - First note that propositional symbols that do not appear in φ are irrelevant.
  - We know that our models has only one point.
  - $\blacktriangleright$  Hence, we only need to list all possible ways of labelling that single node with propositional symbols in  $\varphi.$
- What about the  $\langle R \rangle$  language?

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- We have dealt in the previous slide with multiple points. What about lines?
- $\blacktriangleright$  Remember that the operator we introduced to talk about lines in our language was  $\langle R\rangle\varphi$  and we said that

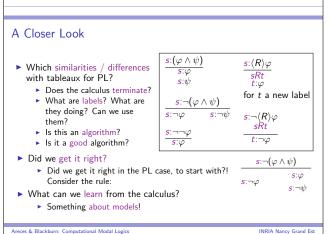
 $\mathcal{M}, w \models \langle R \rangle \varphi$  iff there is w' s.t. wRw' and  $\mathcal{M}, w' \models \varphi$ .

- ► Start with the labelled formula  $s:\langle R \rangle \varphi$ .  $\longrightarrow$   $s:\langle R \rangle \varphi$ If this formula is satisfiable, it is because there is an *R*-sucessor *t* where  $\varphi$  holds.  $f:\varphi$ for *t* a new label
- ► Start with the labelled formula  $s:\neg \langle R \rangle \varphi$ .  $\longrightarrow s:\neg \langle R \rangle \varphi$ If there is an *R*-successor *t*, then  $\varphi$  should  $\xrightarrow{sRt} sRt$ not hold at *t*.  $\xrightarrow{t:\neg \varphi} (\neg \langle R \rangle)$

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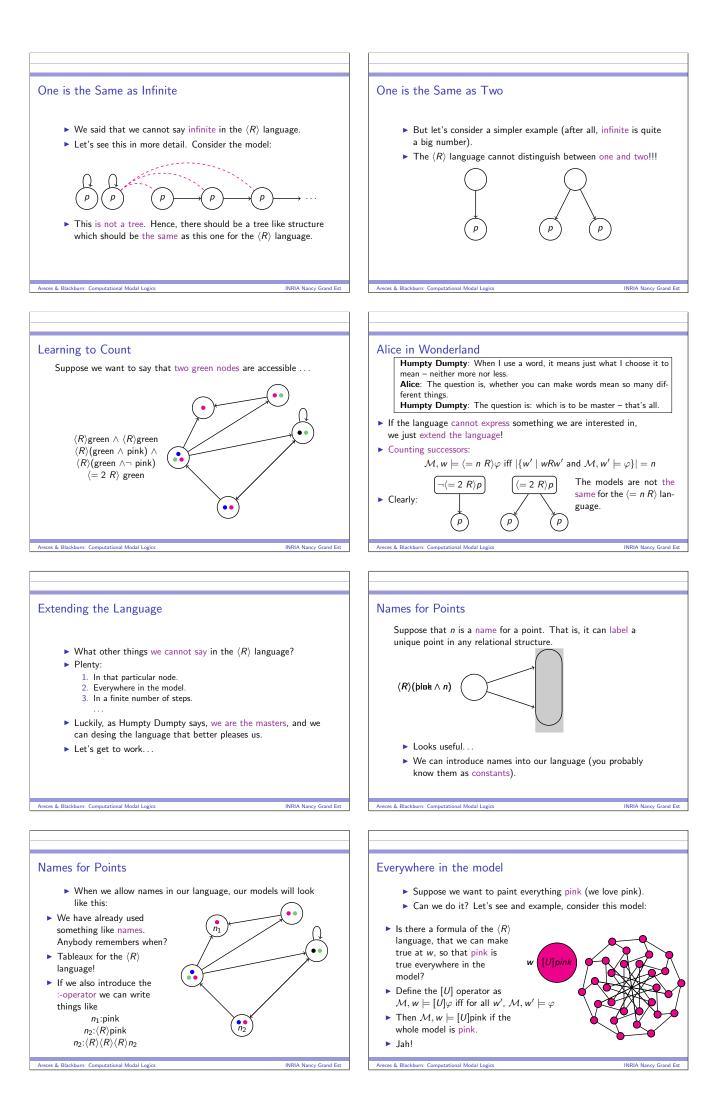
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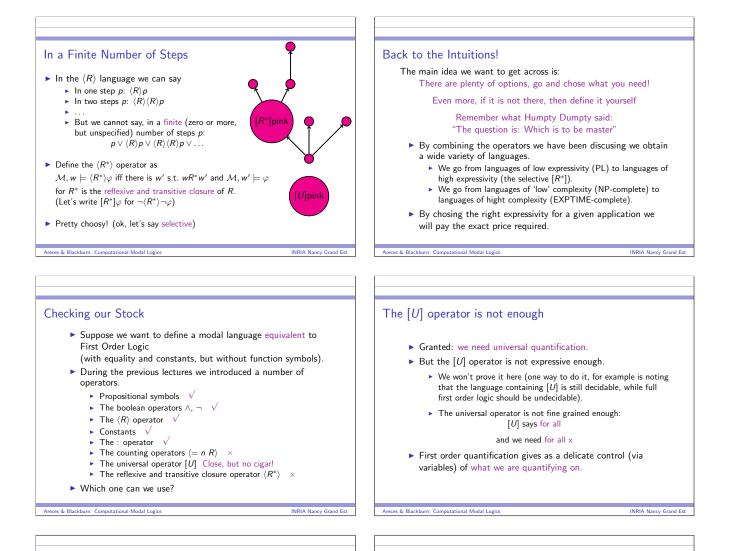




#### Tree and Finite Model Properties Using the rules of the tableaux $s:(\varphi \wedge \psi)$ $s:\langle R \rangle \varphi$ calculus we only explore finite, $S:\varphi$ sRt t:φ tree models. $s:\psi$ Let's assume that the calculus for t a new label $s:\neg(\varphi \land \psi)$ is correct (you will have to believe me). **s**:¬φ $s:\neg \langle R \rangle \varphi$ sRt• Then the $\langle R \rangle$ -language $\frac{s:\neg\neg\varphi}{s:\varphi}$ $t:\neg\varphi$ cannot say infinite, cannot say non-tree. **Theorem:** A formula in the $\langle R \rangle$ -language is satisfialle if and only

**Theorem:** A formula in the  $\langle R \rangle$ -language is satisfiable if and only if it is satisfiable in a finite, tree relational structure.





# A Detour: Renaming Points

- I will define a litle piece of notation that I will need in the next slide.
- As I want it to be very clear, I'll do it here and give an example.

Let

•

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To infinity and beyond...?!

- $\mathcal{M} = \langle D, \{R_i\}, \{P_i\}, \{N_i\} \rangle$  be a model,
- w an element in D ( $w \in D$ ),
- ► and n<sub>i</sub> a name.
- We write  $\mathcal{M}[n_i:=w]$  for the model obtained from  $\mathcal{M}$  where the only change is that now  $n_i$  is interpreted as w.  $\mathcal{M} \Rightarrow \mathcal{M}[n_1:=w_2]$

 $w_1(n_1)$ 

W1

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First Order Quantification

- We introduce the operator (n) where n is a name (we will call the operator rename n) as:
- $\mathcal{M},w\models\langle n\rangle\varphi\text{ iff for some }w'\;\mathcal{M}[n{:=}w'],w\models\varphi$   $\blacktriangleright$  Compare with
- $\mathcal{M}, w \models \langle R \rangle \varphi \text{ iff there is } w' \text{ s.t. } wRw' \text{ and } \mathcal{M}, w' \models \varphi.$  $\blacktriangleright \text{ Compare with } \langle U \rangle \varphi := \neg [U] \neg \varphi$
- Compare with  $\langle U \rangle \varphi := \neg [U] \neg \varphi$  $\mathcal{M}, w \models \langle U \rangle \varphi$  iff for some  $w', \mathcal{M}, w' \models \varphi$
- Actually, using  $\langle n \rangle$  and : together we can define [U]:

 $[U]\varphi$  iff  $\neg \langle n \rangle (n:\neg \varphi)$ 

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This language hast tons of expressive power:

- Irr:  $[x](x:\neg \langle R \rangle x)$
- ▶ Tran:  $[x][y](x : \langle R \rangle \langle R \rangle y \rightarrow x : \langle R \rangle y)$
- Ser:  $[x]\langle y \rangle (x : \langle R \rangle y)$

Theorem: If  $M \models$  Irr  $\land$  Tran  $\land$  Ser then M is infinite.

Daddy, Daddy, It's broken!!! 😇

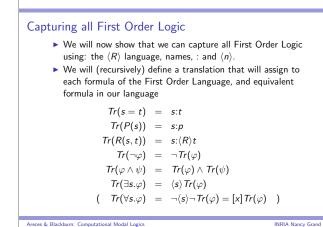
If the language can say 'infinite,' it means that we won't be able to know when to stop when searching for models for a formula.

Just how expressive is the language we just defined? Does it have the tree model property? Does it have the finite model

property? Is it really a MACHO language, or is it

really just a toy? Let's see...

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# The Other Translation

- > Of course, we can do the translation in the other direction as well.
- > We only need to realize that the semantic definition of all the operators we introduced can be defined in first-order logic.

$$\mathcal{M}, w \models \langle R \rangle \varphi \ \ \, \text{iff} \ \ \, \text{there is } w' \text{ s.t. } wRw' \text{ and } \mathcal{M}, w' \models$$

$$Tr_w(\langle R \rangle \varphi) = \exists w'.(R(w, w') \wedge Tr_{w'}(\varphi))$$

• The w in  $Tr_w$  keeps track of where we are evaluating the formula in the model.

# Relevant Bibliography

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- ▶ The first polytheistic logicians was Arthur Prior.
- Prior is the father of Tense Logic, a logic that include the operators F and P to talk about the future and the past.
- He was a strong advocate of the bottom up way of viewing first-order logic that we presented today.
- Prior, Arthur (1967). Chapter V.6 of Past, Present and Future. Clarendon Press, Oxford.

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# Relevant Bibliography

- Unraveling, the procedure to turn arbitrary models into trees, was introduced by Segerberg.
- Segerberg's Web page: http://www.phil.ucalgary.ca/ philosophy/people/segerberg.html
- A more general result about turning things into other things can be proved using bisimulations.
- van Benthem's Web page: http://staff.science.uva.nl/~johan/
  - Segerberg, Krister (1971). An Essay in Classical Modal Logic, Department of Philosophy Uppsala University, Sweden. Uppsala Philosophical Studies.
  - van Benthem, Johan (1985). Modal Logic and Classical Logic, Bibliopolis.







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▶ Let's write down a couple of formulas in First Order Logic and translate them to our language. Again, let's use the convention [X] for  $\neg \langle X \rangle \neg$  $Tr(\forall x.(Man(x) \rightarrow \exists y.(Woman(y) \land Loves(x, y)))))$  $[x](Tr(Man(x) \rightarrow \exists y.(Woman(y) \land Loves(x, y))))$  $[x](Tr(Man(x)) \rightarrow Tr(\exists y.(Woman(y) \land Loves(x, y))))$  $[x](x:Man \rightarrow Tr(\exists y.(Woman(y) \land Loves(x, y))))$  $[x](x:Man \rightarrow \langle y \rangle (Tr((Woman(y) \land Loves(x, y)))))$  $[x](x:Man \to \langle y \rangle (Tr(Woman(y)) \land Tr(Loves(x, y)))) \\ [x](x:Man \to \langle y \rangle (y:Woman \land x: \langle Loves \rangle y))$ 

# The Other Translation

Examples

Let's see the details. Assume that we have a formula in the  $\langle R \rangle$  language extended with constants, and the the : and  $\langle n \rangle$ operators.

We will (recursively) define an equivalent first order formula:

$$\begin{array}{rcl} Tr_x(p) &=& P(x) \\ Tr_x(n_i) &=& (n_i = x) \\ Tr_x(\neg \varphi) &=& \neg Tr_x(\varphi) \\ Tr_x(\varphi \land \psi) &=& Tr_x(\varphi) \land Tr_x(\psi) \\ Tr_x(\langle R \rangle \varphi) &=& \exists x. (R(x, y) \land Tr_y(\varphi)) \text{ for } y \text{ a new variable} \\ Tr_x(\langle R \rangle \varphi) &=& \exists r. Tr_x(\varphi) \\ Tr_x(\langle n \rangle \varphi) &=& \exists n. Tr_x(\varphi) \end{array}$$

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# Relevant Bibliography

Saul Kripke is the person largely responsible for the relational semantics for the diamond language. In fact, when working with diamond languages, relational structures are often called Kripke models. Kripke, a child prodigy, was 15 when he developed his first ideas on the topic. Kripke has many other substantial contributions to logic and philosophy.



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# Relevant Bibliography

- Many of the languages that we have been discussing are investigated in detail in the area known as Modal Logics.
- The name 'modal' (in many cases as opposed to 'classical') doesn't make much sense.
- Some of the languages we discussed today have been extensively studied by you-know-who. Patrick's Web page: http://www.loria.fr/~blackbur
- M. de Rijke also pushed the idea of working with modal logics extending the  $\langle R \rangle$  language.
  - de Rijke's Web page: http://staff.science.uva.nl/~mdr/ Blackburn, Patrick and van Benthem, J (2006). Chapter 1 of the Handbook of Modal Logics, Blackburn, P.; Wolter, F.; and van Benthem, J., editors, Elsevier
  - de Rijke, Maarten (1993). *Extending Modal Logic* PhD Thesis. Institute for Logic, Language and Computation, Unviersity of Amsterdam.



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