

People rarely
learn unless they
have fun in what
they are doing

Dale Carnegie

About me

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- Email me for any personal/individual issue...

The Discussion Board on KEATS

- For any question, use the **Discussion Board** first.
- Give opportunity for peers to think about, and to provide a answer
- Everyone can read and benefit from the discussion
- We always respond within 48 hours

4CCS1ELA ELEMENTARY LOGIC WITH APPLICATIONS

LECTURE 8: PROPOSITIONAL DEFINITE CLAUSE PROGRAMMING

Previously in ELA and what's next

- So far you have studied:
 - Propositional and first order logic
 - Truth tables and natural deduction

- In next three lectures:

Transform propositional and first order logic formulas into **programs**!

The 'Programming with Logic' Lectures

- The material in these three lectures is taken from a number of different sources.
- If you study the material in the lecture slides and tutorials, this will be sufficient for the exams!
- You will revisit and build on these lectures next year in 5CCS2PLD.
 - For those interested, I can also recommend more advanced reading material.

Objectives for the day

- Remember Conjunctive Normal Form
- Learn about and work on Propositional Horn and Definite Clause Rules
- Learn about and work on Programming with Definite Clause Rules

Feel free to ask questions any time!

Conjunctive Normal Form(CNF)

Conjunctive Normal Form (CNF)

- CNF is a **conjunction** of one or more **formulas**, each of which is a **disjunction** of one or more literals
 - Simply, CNF is an **AND** of **ORs**(remember: a **literal** is a propositional **variable** or the negation of a propositional variable)
- The only connectives permitted are: \wedge \vee \neg
- **Note:** The \neg operator can only be used as part of a literal.

$$(A \vee B) \wedge C$$

Example

- Which formula is in CNF and which one is not?
- $(P \vee \neg Q) \wedge (\neg P \vee Q)$
- $(P \rightarrow R) \wedge (\neg P \vee Q)$
- $\neg(P \vee Q) \wedge T$

Example

- Which formula is in CNF and which one is not?
- $(P \vee \neg Q) \wedge (\neg P \vee Q)$ is in CNF
- $(P \rightarrow R) \wedge (\neg P \vee Q)$ is **not** in CNF
- $\neg(P \vee Q) \wedge T$ is **not** in CNF

Conjunctive Normal Form (CNF)

- CNF is a **conjunction** of one or more formulas, each of which is a **disjunction** of one or more literals
 - Simply, CNF is an **AND** of **ORs**
 $(A \vee B) \wedge C$
- A conjunction of literals is in CNF
 - Because it is like a conjunction of one-literal formulas
 - $A \wedge B$
 - *The example is a conjunction of two formulas with one literal each.*
- A disjunction of literals is in CNF
 - Because it is like a conjunction of a single formula
 - $A \vee B$
 - *The example is a conjunction of just one disjunction.*

Exercise

Which of the following formulae are in **CNF**, and why?

1. $\neg Q \vee (S \wedge P)$

2. $P \vee Q$

3. $(\neg Q \vee S) \wedge (\neg Q \vee P)$

4. $P \wedge Q$

5. P

Exercise

Which of the following formulae are in **CNF**, and why?

1. $\neg Q \vee (S \wedge P)$

2. $P \vee Q$

3. $(\neg Q \vee S) \wedge (\neg Q \vee P)$

4. $P \wedge Q$

5. P

Transform a formula in CNF

- Use equivalence rules
- Apply them until you get to CNF

1) $F \rightarrow G \equiv \neg F \vee G$

2) $F \leftrightarrow G \equiv (F \rightarrow G) \wedge (G \rightarrow F)$

3) $\neg(F \vee G) \equiv \neg F \wedge \neg G$

4) $\neg(F \wedge G) \equiv \neg F \vee \neg G$

5) $\neg\neg F \equiv F$

6) $F \vee (G \wedge H) \equiv (F \vee G) \wedge (F \vee H)$

7) $(F \wedge G) \vee H \equiv (F \vee H) \wedge (G \vee H)$

(F, G and H are propositional formulas and not literals)

Example

- Transform this formula into CNF:

$$\neg Q \vee (S \wedge P)$$

We apply **Rule 6)** and we get:

$$(\neg Q \vee S) \wedge (\neg Q \vee P)$$

Exercise

- Transform the following formulas into CNF:

1. P

2. $P \rightarrow Q \wedge R$

3. $Q \rightarrow S$

4. $\neg(S \wedge R) \vee T$

Exercise

- Transform the following formulas into CNF:

1. P (already in CNF)

1. $P \rightarrow Q \wedge R$

2. $Q \rightarrow S$

3. $\neg(S \wedge R) \vee T$

Exercise

- Transform the following formula into CNF:

$$1. P \rightarrow Q \wedge R$$

$$\equiv \neg P \vee (Q \wedge R) \quad (\text{we applied 1})$$

$$\equiv (\neg P \vee Q) \wedge (\neg P \vee R) \quad (\text{we applied 6})$$

Now it is in CNF!

Exercise

- Transform the following formula into CNF:

$$2. \quad Q \rightarrow S$$

$$\equiv \neg Q \vee S$$

(we applied 1))

In CNF!

Exercise

- Transform the following formula into CNF:

$$3. \neg(S \wedge R) \vee T$$

$$\equiv (\neg S \vee \neg R) \vee T \quad (\text{we applied 4})$$

In CNF!

Associativity

- Remember the law of associativity:
- $P \vee (Q \vee R) \equiv (P \vee Q) \vee R$

- So:

$$(\neg S \vee \neg R) \vee T \equiv \neg S \vee (\neg R \vee T)$$

- It doesn't matter where we put the brackets

- So we can simply drop the brackets

$$(\neg S \vee \neg R) \vee T \equiv \neg S \vee (\neg R \vee T) \equiv \neg \mathbf{S} \vee \neg \mathbf{R} \vee \mathbf{T}$$

Back to the exercise

- We started with these formulas:

1. P
2. $P \rightarrow Q \wedge R$
3. $Q \rightarrow S$
4. $\neg(S \wedge R) \vee T$

- We transformed them into CNF. This is our '**Knowledge Base**' now:

1. P
2. $(\neg P \vee Q) \wedge (\neg P \vee R)$
3. $\neg Q \vee S$
4. $\neg S \vee \neg R \vee T$

KB1

Propositional Horn and Definite Clauses

Clause

- A **clause** is a disjunction of one or more literals.
- So let's rephrase the CNF definition:
 - CNF is a **conjunction** of one or more **formulas**, each of which is a **disjunction** of one or more literals. Or:
- CNF is a **conjunction** of one or more **clauses**!

Let's count the clauses in our KB

CNF is a **conjunction** of one or more **clauses**
(disjunctions of 1 or more literals)

1. P
2. $(\neg P \vee Q) \wedge (\neg P \vee R)$
3. $\neg Q \vee S$
4. $\neg S \vee \neg R \vee T$

KB1

- CNF 1., 3., and 4. have one clause
- CNF 2. has 2 clauses:
 $(\neg P \vee Q)$ and $(\neg P \vee R)$

Horn clauses

1. P	KB1	1 clause
2. $(\neg P \vee Q) \wedge (\neg P \vee R)$		2 clauses
3. $\neg Q \vee S$		1 clause
4. $\neg S \vee \neg R \vee T$		1 clause

- How many positive literals do you see in each clause?
 - Just one positive literal!
- **A Horn clause is a clause with no more than one positive literal**

Horn clauses

- Any propositional formula can be transformed into CNF
- But not all CNF formulas are made up *only* of Horn clauses...

Horn clauses

Is this formula in CNF? If not, transform it!

$$\neg(S \wedge R) \wedge (P \rightarrow (Q \vee R))$$

Not in CNF

Horn clauses

Is this formula in CNF? If not, transform it!

$$\neg(S \wedge R) \wedge (P \rightarrow (Q \vee R))$$

$$\equiv (\neg S \vee \neg R) \wedge (P \rightarrow (Q \vee R)) \quad (\text{rule 4})$$

$$\equiv (\neg S \vee \neg R) \wedge (\neg P \vee (Q \vee R)) \quad (\text{rule 1})$$

$$(\neg S \vee \neg R) \wedge (\neg P \vee Q \vee R) \quad (\text{rule 8}) \quad \text{In CNF!}$$

Horn clauses

- How many clauses does $(\neg S \vee \neg R) \wedge (\neg P \vee Q \vee R)$ contain?
 - Two clauses
- Are they Horn clauses?
 - $(\neg P \vee Q \vee R)$ is not a Horn clause (count the positive literals – there are two!)

Definite clauses

1. P
2. $(\neg P \vee Q) \wedge (\neg P \vee R)$
3. $\neg Q \vee S$
4. $\neg S \vee \neg R \vee T$

KB1

- We saw that each Horn clause in the above CNF formulas has exactly one positive literal.
- **A definite clause is a Horn clause with exactly one positive literal.**

Definite clauses

- Back to the previous example:

$$(\neg S \vee \neg R) \wedge (\neg P \vee Q \vee R)$$

- We said that $(\neg P \vee Q \vee R)$ is **not** a Horn clause but $(\neg S \vee \neg R)$ is a Horn clause.
- Is $(\neg S \vee \neg R)$ also a definite clause?
- No! it has 0 positive literals!

Exercise

In the following CNF formula which clauses are **Horn clauses** and which are **definite clauses**?

$$(\neg Q \vee \neg S) \wedge (\neg Q \vee P) \wedge (\neg Q \vee P \vee R)$$

Exercise

In the following CNF formula which clauses are **Horn clauses** and which are **definite clauses**?

$$(\neg Q \vee \neg S) \wedge (\neg Q \vee P) \wedge (\neg Q \vee P \vee R)$$



HORN

DEFINITE

NEITHER

Definite clauses: formal procedure

1. Take any propositional well formed formula (wff) α

(from now on greek letters α (alpha), β (beta), γ (gamma) will denote any wff i.e. α stands for $\neg P, P \wedge Q, P \rightarrow Q \dots$)

2. Transform α to CNF. Let's write ' $\text{cnf}(\alpha)$ ' to denote the transformation of α to CNF

3. $\text{cnf}(\alpha)$ is a formula of the form:

$$\beta_1 \wedge \dots \wedge \beta_n$$

where $n \geq 1$, and each β_i is a clause

(a disjunction of literals: positive or negative propositional variables)

4. If β_i is of the form

$$\neg X_1 \vee \dots \vee \neg X_m \vee X, \quad m \geq 0,$$

(exactly one positive and 0 or more negative literals) then β_i is **definite clause**

From definite clauses to **DEFINITE RULES**

- A definite clause of the form

$$\neg X_1 \vee \dots \vee \neg X_m \vee X$$

can be represented as the equivalent:

$$X_1 \wedge \dots \wedge X_m \rightarrow X$$

- Can you see why ?
- $\neg(F \wedge G) \equiv \neg F \vee \neg G$
- $F \rightarrow G \equiv \neg F \vee G$

From definite clauses to **DEFINITE RULES**

$$\begin{aligned} & \neg X_1 \vee \dots \vee \neg X_m \vee X \\ & \equiv (\neg X_1 \vee \dots \vee \neg X_m) \vee X \\ & \equiv \neg(X_1 \wedge \dots \wedge X_m) \vee X \\ & \equiv \mathbf{X_1 \wedge \dots \wedge X_m \rightarrow X} \end{aligned}$$

Example

1. P
2. $(\neg P \vee Q) \wedge (\neg P \vee R)$
3. $\neg Q \vee S$
4. $\neg S \vee \neg R \vee T$

KB1

- First, list all **definite clauses** of these CNF formulas
- Then, represent the definite clauses as **rules**

P
 $(\neg P \vee Q)$
 $(\neg P \vee R)$
 $\neg Q \vee S$
 $\neg S \vee \neg R \vee T$



$\rightarrow P$
 $P \rightarrow Q$
 $P \rightarrow R$
 $Q \rightarrow S$
 $(S \wedge R) \rightarrow T$

Formulas-CNF-Definite Clauses- Definite Rules... Why all this hassle?

- **We program with definite rules!**
- Definite clause programming is the basis of *logic programming*

Logic programming

Logic Programming

- In a **procedural** style of programming, the program explicitly describes the **individual steps** of computation.
 - Examples: Imperative programming (C), object-oriented programming (Java)
- In contrast, **Logic programming** is a **declarative** style of programming.
 - The programmer says **what** they want to compute, but does not explicitly specify **how** to compute it.
 - It is up to the interpreter (compiler/implementation) to figure out how to perform the computation requested.
 - Examples: Logic programming (Prolog), database query languages (SQL), functional programming (Haskell)

Logic programming

- A logic program is given as a set of assumed properties (stated as logical **formulas**) about the world (or rather about the world of the program)
 - What we just called a knowledge base!
- The user supplies a logical formula stating a property that might or might not hold in the world as a **query**
- The system determines whether the queried property is a **consequence** of the assumed properties in the program.

Consequence

- We say that a formula G is a **logical consequence** of formulas F_1, \dots, F_n (or, G logically follows from F_1, \dots, F_n), if in every interpretation where each and every of F_1, \dots, F_n evaluates to 1 , G also evaluates to 1 .

- Notation:

$$F_1, \dots, F_n \models G$$

- Examples:

$$p, q \vee \neg p, \neg p \vee \neg q \models q$$

Example

1. If I am in the office, then you can pop in if I am not too busy.
2. If I am in the office, then I am not too busy.
3. *Therefore, if I am in the office, then you can pop in.*

Let

L stand for 'I am in the office',

P stand for 'you can pop in'

B stand for 'I am too busy'

Write the premises and conclusion using formal language

Example

1. If I am in the office, then you can pop in if I am not too busy.
2. If I am in the office, then I am not too busy.
3. Therefore, if I am in the office, then you can pop in.

Let

L stand for 'I am in the office',

P stand for 'you can pop in'

B stand for 'I am too busy'

$$L \rightarrow (\neg B \rightarrow P)$$

$$L \rightarrow \neg B$$

$$\therefore L \rightarrow P$$

Does the *conclusion* logically follows (is a consequence of) the *premises*?

Deciding consequence using a Truth-table

	L	P	B	$\neg B$	$\neg B \rightarrow P$	$L \rightarrow (\neg B \rightarrow P)$	$L \rightarrow \neg B$	$L \rightarrow P$
1	1	1	1	0	1	1	0	1
2	1	1	0	1	1	1	1	1
3	1	0	1	0	1	1	0	0
4	1	0	0	1	0	0	1	0
5	0	1	1	0	1	1	1	1
6	0	1	0	1	0	1	1	1
7	0	0	1	0	1	1	1	1
8	0	0	0	1	0	1	1	1

Deciding consequence using a Truth-table

	L	P	B	$\neg B$	$\neg B \rightarrow P$	$L \rightarrow (\neg B \rightarrow P)$	$L \rightarrow \neg B$	$L \rightarrow P$	
1	1	1	1	0	1	1	0	1	
2	1	1	0	1	1	1	1	1	★
3	1	0	1	0	1	1	0	0	
4	1	0	0	1	0	0	1	0	
5	0	1	1	0	1	1	1	1	★
6	0	1	0	1	0	1	1	1	★
7	0	0	1	0	1	1	1	1	★
8	0	0	0	1	0	1	1	1	★

In every interpretation in which both premises are true, the conclusion is also true, so: $L \rightarrow P$ is a logical consequence of $L \rightarrow (\neg B \rightarrow P)$ and $L \rightarrow \neg B$

Deciding consequence

- You can use truth-tables and natural deduction to decide whether G is a logical consequence of F_1, \dots, F_n
- But truth-tables can get very large very quickly
 - A truth table with 10 variables has 1024 rows
 - A truth table with 80 variables would take 38 billion years to make (if 1 millionth of a second is needed to make one row)
- Natural deduction is unsuitable for automation - it requires ingenuity in deciding which rule to apply.
- So we need an algorithm – an efficient one!

Definite Clause Propositional Programming

Going back to our example

1. P
2. $(\neg P \vee Q) \wedge (\neg P \vee R)$
3. $\neg Q \vee S$
4. $\neg S \vee \neg R \vee T$

KB1

- First, list all **definite clauses** of these CNF formulas
- Then, represent the definite clauses as **rules**

P
 $(\neg P \vee Q)$
 $(\neg P \vee R)$
 $\neg Q \vee S$
 $\neg S \vee \neg R \vee T$



$\rightarrow P$
 $P \rightarrow Q$
 $P \rightarrow R$
 $Q \rightarrow S$
 $(S \wedge R) \rightarrow T$

Propositional definite clause programming

$\rightarrow P$

$P \rightarrow Q$

$P \rightarrow R$

$Q \rightarrow S$

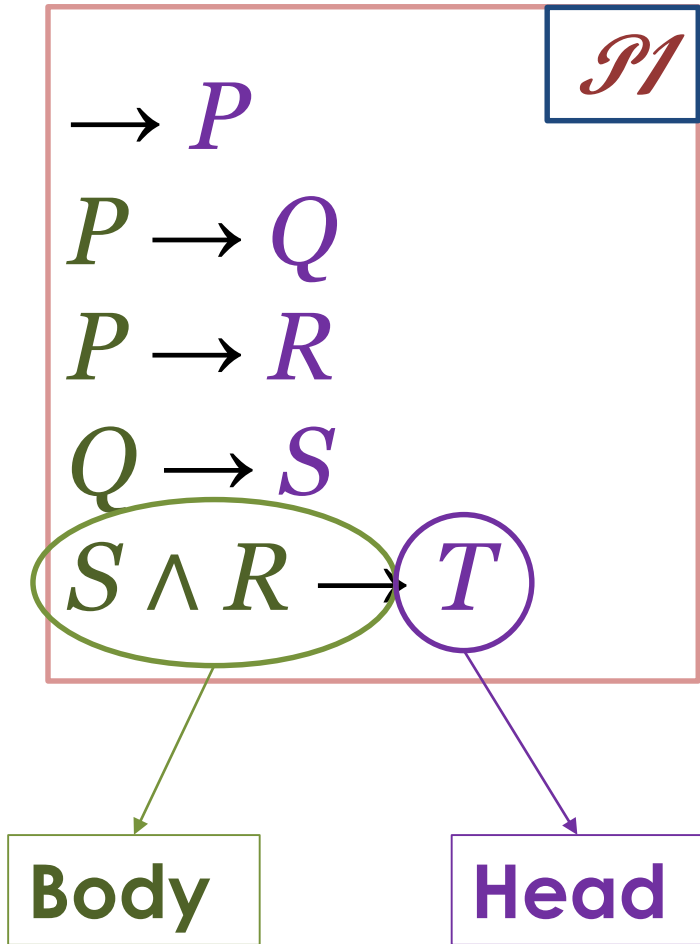
$S \wedge R \rightarrow T$

$\mathcal{P1}$

- Is T a logical consequence of $\mathcal{P1}$?

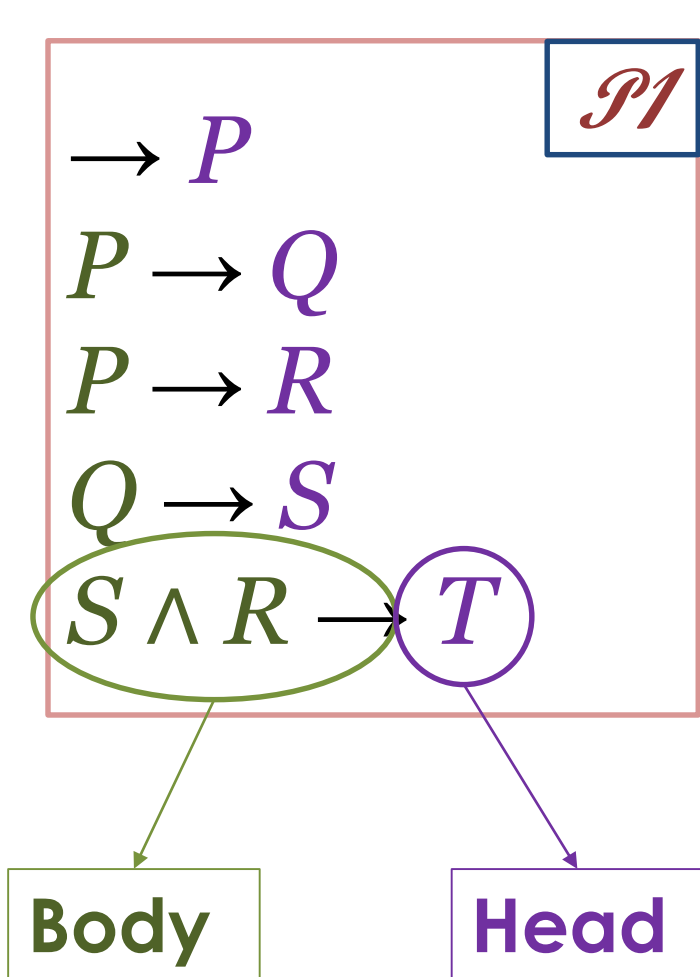
$\mathcal{P1} \models T$?

Propositional Definite clause programming



$?T \leftarrow$ Query

Propositional Definite clause programming



? $T \leftarrow$ **Query**

- Look for a rule with head T and replace query ? T with body of rule (expand T)
- Select *any* literal in the new query and repeat

Propositional Definite clause programming

P1

$\rightarrow P$

$P \rightarrow Q$

$P \rightarrow R$

$Q \rightarrow S$

$S \wedge R \rightarrow T$

? T

? $S \wedge R$

? $Q \wedge R$

? $P \wedge R$

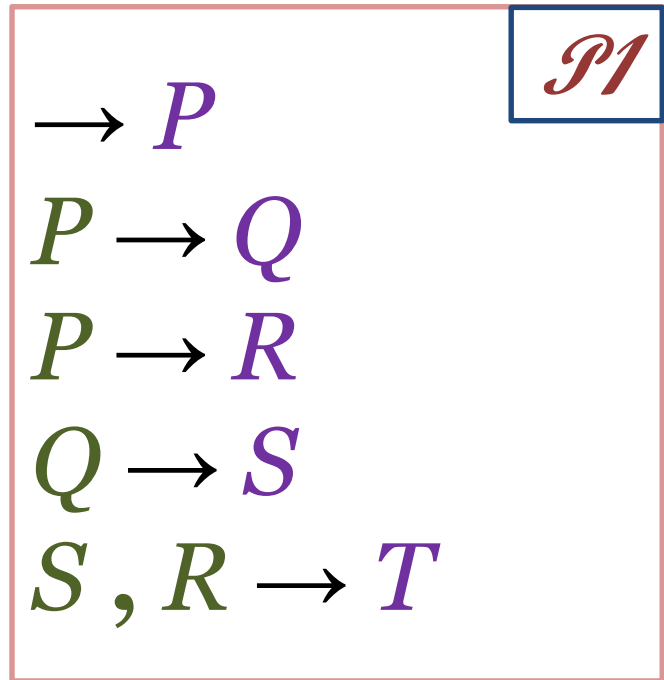
? R

? P

?

Success

Propositional Definite clause programming

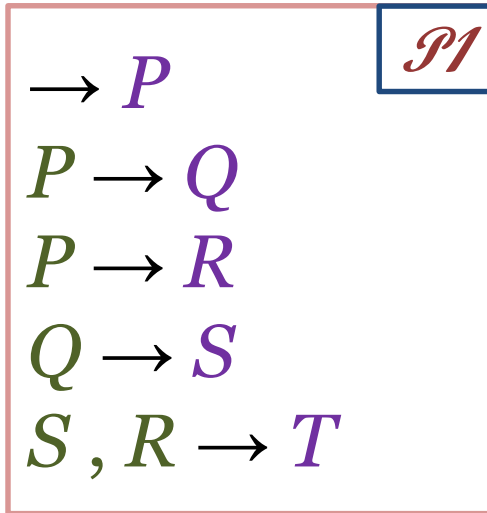


? T
? S, R
? Q, R
? P, R
? R
? P
?

Success

Replace the \wedge with ,

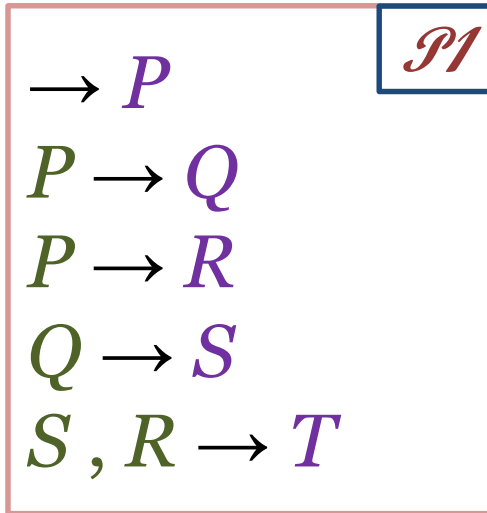
Propositional Definite clause programming



Although choice doesn't matter, **you must be consistent in query literal selection strategy** (e.g. always **leftmost** literal, or always rightmost)

? T
? S, R
? Q, R
? P, R
? R
? P
?
Success

Propositional Definite clause programming



This choice **can** determine whether proof succeeds or fails (there may be more than one such rule)

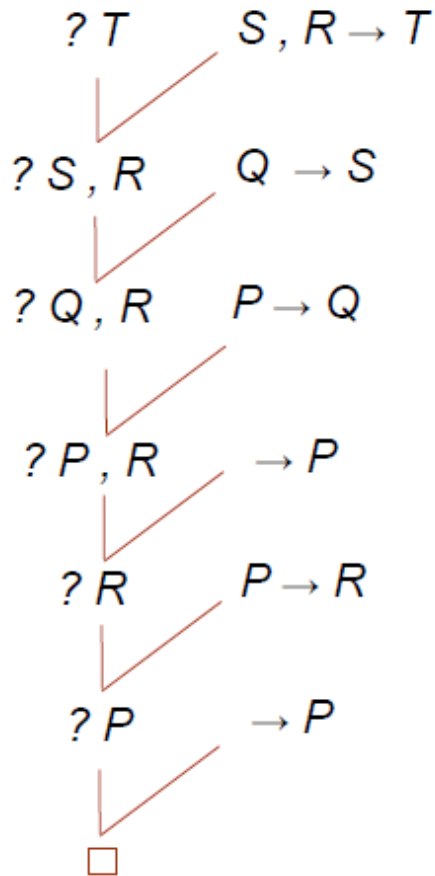
? T
? S, R
? Q, R
? P, R
? R
? P
?
Success

Derivation tree

Query *P1*

$\rightarrow P$
 $P \rightarrow Q$
 $P \rightarrow R$
 $Q \rightarrow S$
 $S, R \rightarrow T$

P1



SUCCEEDS

leftmost query
selection
always
applied

Definite clause programming: formal procedure

- Let ***P*** be a definite clause program containing definite rules of the form $X_1, \dots, X_n \rightarrow Y$
 - Let $? Q_1, \dots, Q_m$ be a query on *P*
1. Choose a literal ***Q_i***
 2. If there is **no rule** $X_1, \dots, X_n \rightarrow Q_i$ in *P* then **exit** and **fail**,
else **choose** a rule $X_1, \dots, X_n \rightarrow Q_i$ in *P*
 3. In the query term
 $? Q_1, \dots, Q_{i-1}, Q_i, Q_{i+1}, \dots, Q_m$
replace Q_i by X_1, \dots, X_n :
 $? Q_1, \dots, Q_{i-1}, X_1, \dots, X_n, Q_{i+1}, \dots, Q_m$
 4. If the query term is empty then **exit** and **success**,
else go to step 1 and repeat 1 - 4.

Exercise

- P
- $P \vee Q \rightarrow S$

1. Transform the formulas to CNF
2. then to definite clause program
3. Then draw two derivation trees for the query $?S$ one that fails and one that succeeds.

1. Transform to CNF

- P

Already in CNF

- $P \vee Q \rightarrow S$

$$\neg(P \vee Q) \vee S$$

$$(\neg P \wedge \neg Q) \vee S$$

$$(\neg P \vee S) \wedge (\neg Q \vee S)$$

Now in CNF

2. Transform to definite clause program

P

$(\neg P \vee S) \wedge (\neg Q \vee S)$

KB1

- First, list all **definite clauses** of these CNF formulas
- Then, represent the definite clauses as **rules**

P

$(\neg P \vee S)$

$(\neg Q \vee S)$



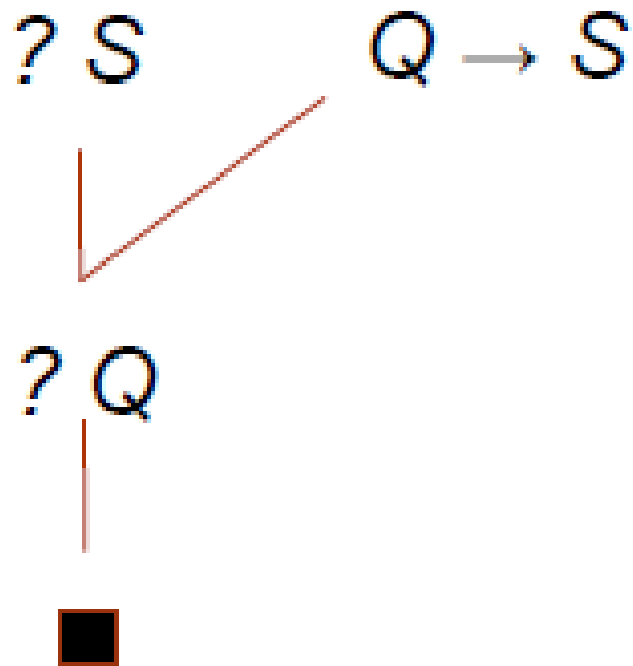
$\rightarrow P$

$P \rightarrow S$

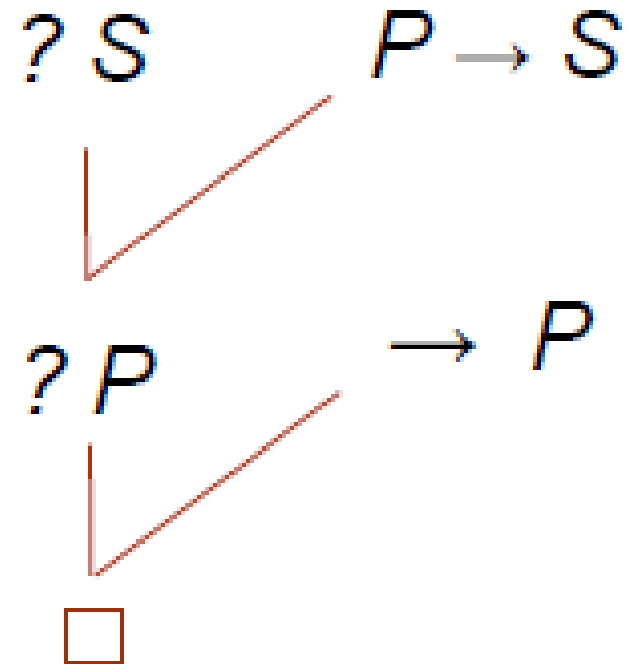
$Q \rightarrow S$

$\mathcal{P1}$

3. draw derivation trees for ? S



FAILS



SUCCEEDS

Tutorials and Next Lecture

- **Large Group Tutorial:**
 - Repeats *lecture exercises* in today's slides
 - make sure you can do them yourself !
 - *Tutorial questions 3 and 4* not in slides
- **Small Group Tutorials:**
 - This week: Work on Questions 1 and 2 only
- **Next Lecture:**
 - Prenex Normal Form
 - First order definite clause programs