

KR-IST - Lecture 7a

Automated Reasoning

Chris Thornton

November 16, 2011

Assuming we have some facts and rules showing how implications may be derived from those facts, we can use an adapted search method to explore potential implications and determine which conclusions are justifiable.

This is known as **automated reasoning**.

Rules of partying

drinking \Rightarrow partying

dehydration \Rightarrow drinking

heat and anxiety \Rightarrow dehydration

gym \Rightarrow heat

sleep and anxiety \Rightarrow dehydration

infStudent \Rightarrow anxiety

infStudent \Rightarrow gym

(Each line here represents a separate rule with the \Rightarrow operator denoting 'implies'.)

Exploring implication sequences

A set of rules forms a **rulebase**.

Each rule can be used to produce a new fact (i.e., a conclusion) from one or more established facts.

But the process can work in two different ways.

Forwards reasoning

In **forwards reasoning** we use a 'forwards chaining' search process to recursively generate conclusions.

Taking whatever facts are initially established, we check to see which rules may then be used, i.e, which rules have all their conditions satisfied by the facts.

We then add the relevant conclusion(s) and repeat the operation, continuing on until no new conclusions can be produced.

Forwards-chaining with the partying rulebase

Assume 'infStudent' is the only established fact.

On the basis of this we can add

Forwards-chaining with the partying rulebase

Assume 'infStudent' is the only established fact.

On the basis of this we can add

- ▶ {anxiety, gym}.

Forwards-chaining with the partying rulebase

Assume 'infStudent' is the only established fact.

On the basis of this we can add

- ▶ {anxiety, gym}.

On the basis of {infStudent, anxiety, gym} we can add

Forwards-chaining with the partying rulebase

Assume 'infStudent' is the only established fact.

On the basis of this we can add

- ▶ {anxiety, gym}.

On the basis of {infStudent, anxiety, gym} we can add

- ▶ {heat}.

Forwards-chaining with the partying rulebase

Assume 'infStudent' is the only established fact.

On the basis of this we can add

- ▶ {anxiety, gym}.

On the basis of {infStudent, anxiety, gym} we can add

- ▶ {heat}.

And on the basis of {infStudent, anxiety, gym, heat} we can add

Forwards-chaining with the partying rulebase

Assume 'infStudent' is the only established fact.

On the basis of this we can add

- ▶ {anxiety, gym}.

On the basis of {infStudent, anxiety, gym} we can add

- ▶ {heat}.

And on the basis of {infStudent, anxiety, gym, heat} we can add

- ▶ {dehydration}.

Forwards-chaining with the partying rulebase

Assume 'infStudent' is the only established fact.

On the basis of this we can add

- ▶ {anxiety, gym}.

On the basis of {infStudent, anxiety, gym} we can add

- ▶ {heat}.

And on the basis of {infStudent, anxiety, gym, heat} we can add

- ▶ {dehydration}.

And so on.

Note that we are expanding a tree of 'nodes' in the usual way but in this case the nodes are sets of facts/conclusions.

Forwards reasoning may generate many irrelevant conclusions

Unfortunately, forwards reasoning has the effect of generating *every* justifiable conclusion, including ones that can play no role in justifying any useful or significant conclusions.

In an alternative approach, we start from the conclusion that we would like to draw and work 'backwards' through the implication sequences to see whether it can be justified in terms of the known facts.

Backwards reasoning procedure

Assume we would like to know whether 'partying' can be concluded on the basis of 'infStudent' and the partying rulebase.

First, we identify a rule which has 'partying' as its conclusion.

We then try to determine whether each of its conditions can be concluded, using the exact, same procedure to do it.

Backwards-chaining example

Backwards-chaining example

(1) To conclude 'partying', use 'drinking \Rightarrow partying'

Backwards-chaining example

- (1) To conclude 'partying', use 'drinking \Rightarrow partying'
- (2) To conclude 'drinking', use 'dehydration \Rightarrow drinking'.

Backwards-chaining example

- (1) To conclude 'partying', use 'drinking \Rightarrow partying'
- (2) To conclude 'drinking', use 'dehydration \Rightarrow drinking'.
- (3) To conclude 'dehydration' use 'heat and anxiety \Rightarrow dehydration'.

Backwards-chaining example

- (1) To conclude 'partying', use 'drinking \Rightarrow partying'
- (2) To conclude 'drinking', use 'dehydration \Rightarrow drinking'.
- (3) To conclude 'dehydration' use 'heat and anxiety \Rightarrow dehydration'.
- (4) To conclude 'heat' use 'gym \Rightarrow heat' and to conclude 'anxiety' use 'infStudent \Rightarrow dehydration'

Backwards-chaining example

- (1) To conclude 'partying', use 'drinking \Rightarrow partying'
- (2) To conclude 'drinking', use 'dehydration \Rightarrow drinking'.
- (3) To conclude 'dehydration' use 'heat and anxiety \Rightarrow dehydration'.
- (4) To conclude 'heat' use 'gym \Rightarrow heat' and to conclude 'anxiety' use 'infStudent \Rightarrow dehydration'
- (5) To conclude 'gym' use 'infStudent \Rightarrow gym'.

Backwards-chaining example

- (1) To conclude 'partying', use 'drinking \Rightarrow partying'
- (2) To conclude 'drinking', use 'dehydration \Rightarrow drinking'.
- (3) To conclude 'dehydration' use 'heat and anxiety \Rightarrow dehydration'.
- (4) To conclude 'heat' use 'gym \Rightarrow heat' and to conclude 'anxiety' use 'infStudent \Rightarrow dehydration'
- (5) To conclude 'gym' use 'infStudent \Rightarrow gym'.
- (6) 'infStudent' is an established fact.

Backwards-chaining example

- (1) To conclude 'partying', use 'drinking \Rightarrow partying'
- (2) To conclude 'drinking', use 'dehydration \Rightarrow drinking'.
- (3) To conclude 'dehydration' use 'heat and anxiety \Rightarrow dehydration'.
- (4) To conclude 'heat' use 'gym \Rightarrow heat' and to conclude 'anxiety' use 'infStudent \Rightarrow dehydration'
- (5) To conclude 'gym' use 'infStudent \Rightarrow gym'.
- (6) 'infStudent' is an established fact.

The conclusion 'partying' is therefore justified by the rules and the known facts.

Backwards and forwards reasoning are both applications of search.
In forwards reasoning

Backwards and forwards reasoning are both applications of search.

In forwards reasoning

- ▶ What are the states?

Backwards and forwards reasoning are both applications of search.

In forwards reasoning

- ▶ What are the states?
- ▶ Where do successors come from?

Backwards and forwards reasoning are both applications of search.

In forwards reasoning

- ▶ What are the states?
- ▶ Where do successors come from?

What about in backwards reasoning?

Reasoning as search

- ▶ Forwards reasoning is the process of searching for a solution path connecting initial fact(s) with desired conclusion(s). States are combinations of facts and each rule is a method for generating a single successor (i.e., it defines a single transition).

- ▶ Forwards reasoning is the process of searching for a solution path connecting initial fact(s) with desired conclusion(s). States are combinations of facts and each rule is a method for generating a single successor (i.e., it defines a single transition).
- ▶ Backwards reasoning is the process of searching for a solution path connecting some final conclusion with one or more initial facts. States are combinations of required conclusions and the transitions are defined by the rules. Each rule is a method for generating further 'required conclusions' from existing required conclusions.

Reasoning as search

- ▶ Forwards reasoning is the process of searching for a solution path connecting initial fact(s) with desired conclusion(s). States are combinations of facts and each rule is a method for generating a single successor (i.e., it defines a single transition).
- ▶ Backwards reasoning is the process of searching for a solution path connecting some final conclusion with one or more initial facts. States are combinations of required conclusions and the transitions are defined by the rules. Each rule is a method for generating further 'required conclusions' from existing required conclusions.

Backwards reasoning and the AND/OR tree

Normally, each node in a search tree 'branches' according to the alternative transitions which are possible at the given state.

The search tree is an **OR-tree** because every node is an **OR-node**.

However, in backwards reasoning, each node branches in two different ways.

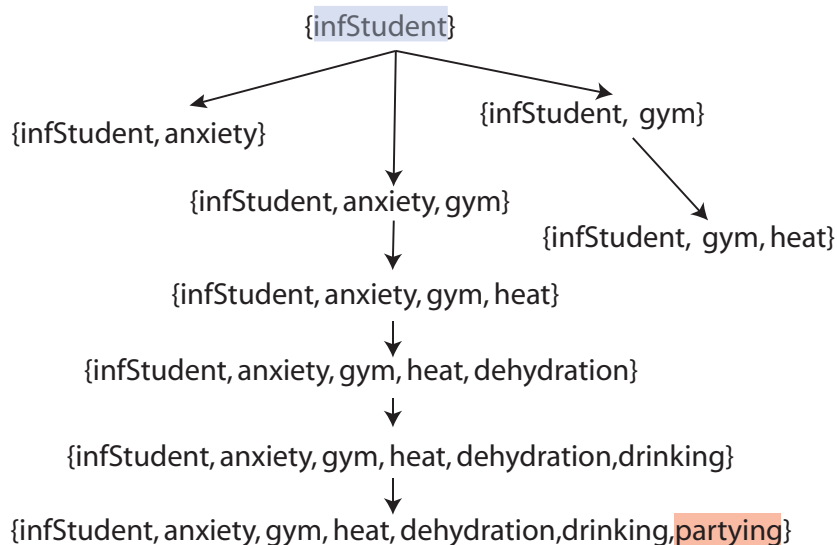
Any rule that satisfies the relevant goal represents an alternative transition. But since it may embody more than one condition, it may produce multiple subgoals *all* of which need to be satisfied.

So the branches from any node in a backwards-reasoning tree divide up into groups of 'AND' branches.

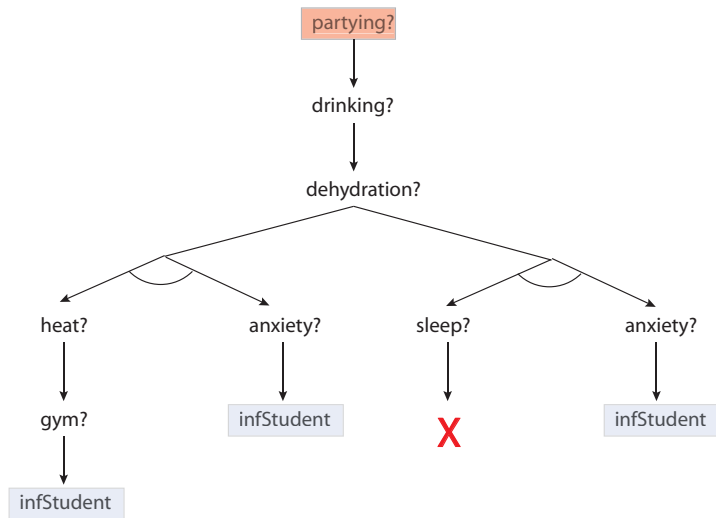
Each group is an alternative (an 'OR').

The tree is therefore an **AND/OR tree**.

Forwards reasoning search tree



Backwards reasoning search tree



Relative strengths of forwards and backwards reasoning

Choice of reasoning strategy depends on the properties of the rule set.

If there is a single goal (conclusion), backward chaining will normally be more efficient, as there is no wasteful generation of irrelevant conclusions.

But if there are many different ways of demonstrating any particular fact, backwards chaining may be wasteful.

Forward chaining is likely to be more efficient if there are many conclusions to be drawn or where we have a small set of initial facts. It may also be preferable if conclusions tend to have many rules.

Backward chaining is likely to be more efficient where there is a single conclusion to be drawn or where the initial set of facts is large.

Summary

Summary

- ▶ In a rulebase, each rule shows the conditions which must be satisfied in order to derive the specified conclusion.

Summary

- ▶ In a rulebase, each rule shows the conditions which must be satisfied in order to derive the specified conclusion.
- ▶ The conclusion(s) of one rule may satisfy the conditions of another.

Summary

- ▶ In a rulebase, each rule shows the conditions which must be satisfied in order to derive the specified conclusion.
- ▶ The conclusion(s) of one rule may satisfy the conditions of another.
- ▶ Automated reasoning is the process of searching for a chain of rules which connect certain facts with given conclusions.

Summary

- ▶ In a rulebase, each rule shows the conditions which must be satisfied in order to derive the specified conclusion.
- ▶ The conclusion(s) of one rule may satisfy the conditions of another.
- ▶ Automated reasoning is the process of searching for a chain of rules which connect certain facts with given conclusions.
- ▶ The search process can work 'forwards' from facts to conclusions, or 'backwards' from conclusions to facts.

Summary

- ▶ In a rulebase, each rule shows the conditions which must be satisfied in order to derive the specified conclusion.
- ▶ The conclusion(s) of one rule may satisfy the conditions of another.
- ▶ Automated reasoning is the process of searching for a chain of rules which connect certain facts with given conclusions.
- ▶ The search process can work 'forwards' from facts to conclusions, or 'backwards' from conclusions to facts.
- ▶ The search tree for forwards reasoning is an OR-tree. The search tree for backwards reasoning is an AND-tree.

Summary

- ▶ In a rulebase, each rule shows the conditions which must be satisfied in order to derive the specified conclusion.
- ▶ The conclusion(s) of one rule may satisfy the conditions of another.
- ▶ Automated reasoning is the process of searching for a chain of rules which connect certain facts with given conclusions.
- ▶ The search process can work 'forwards' from facts to conclusions, or 'backwards' from conclusions to facts.
- ▶ The search tree for forwards reasoning is an OR-tree. The search tree for backwards reasoning is an AND-tree.

Questions

- ▶ Would you say that a forwards-chaining reasoner is goal directed?

- ▶ Would you say that a forwards-chaining reasoner is goal directed?

Exercises

In this fault-diagnosis rule set, each line is a rule constructed from a conclusion (the word after 'implies') and one or more conditions (words before 'implies').

```
unexpectedBehaviour and dataCorruption --> diskOverflow
unexpectedBehaviour and networkExposure --> virusInfection
broadband --> networkExposure
broadband --> intenseNetworkUsage
attachmentsOpened --> networkExposure
gamesDownloads --> networkExposure
ADSLConnection --> broadband
cableConnection --> broadband
networkExposure --> firewallNeeded
networkExposure --> emailCapture
crashing --> unexpectedBehaviour
freezing --> unexpectedBehaviour
```

Exercises

In this fault-diagnosis rule set, each line is a rule constructed from a conclusion (the word after 'implies') and one or more conditions (words before 'implies').

```
unexpectedBehaviour and dataCorruption --> diskOverflow
unexpectedBehaviour and networkExposure --> virusInfection
broadband --> networkExposure
broadband --> intenseNetworkUsage
attachmentsOpened --> networkExposure
gamesDownloads --> networkExposure
ADSLConnection --> broadband
cableConnection --> broadband
networkExposure --> firewallNeeded
networkExposure --> emailCapture
crashing --> unexpectedBehaviour
freezing --> unexpectedBehaviour
```

- ▶ Show all the conclusions which can be established using forwards reasoning from the fact 'ADSLConnection'.

Exercises

In this fault-diagnosis rule set, each line is a rule constructed from a conclusion (the word after 'implies') and one or more conditions (words before 'implies').

```
unexpectedBehaviour and dataCorruption --> diskOverflow
unexpectedBehaviour and networkExposure --> virusInfection
broadband --> networkExposure
broadband --> intenseNetworkUsage
attachmentsOpened --> networkExposure
gamesDownloads --> networkExposure
ADSLConnection --> broadband
cableConnection --> broadband
networkExposure --> firewallNeeded
networkExposure --> emailCapture
crashing --> unexpectedBehaviour
freezing --> unexpectedBehaviour
```

- ▶ Show all the conclusions which can be established using forwards reasoning from the fact 'ADSLConnection'.

Exercises cont.

Exercises cont.

- ▶ Draw out these conclusions in the form of a tree of deductions with 'ADSLConnection' at the root.

Exercises cont.

- ▶ Draw out these conclusions in the form of a tree of deductions with 'ADSLConnection' at the root.
- ▶ Using backwards reasoning, show whether 'virusInfection' may be concluded on the basis of the facts 'ADSLConnection', 'gamesDownloads' and 'freezing'.

Exercises cont.

- ▶ Draw out these conclusions in the form of a tree of deductions with 'ADSLConnection' at the root.
- ▶ Using backwards reasoning, show whether 'virusInfection' may be concluded on the basis of the facts 'ADSLConnection', 'gamesDownloads' and 'freezing'.
- ▶ Draw out the full AND/OR tree for the conclusion 'virusInfection'. Then use this tree to determine which fact-sets will justify this conclusion.

Exercises cont.

- ▶ Draw out these conclusions in the form of a tree of deductions with 'ADSLConnection' at the root.
- ▶ Using backwards reasoning, show whether 'virusInfection' may be concluded on the basis of the facts 'ADSLConnection', 'gamesDownloads' and 'freezing'.
- ▶ Draw out the full AND/OR tree for the conclusion 'virusInfection'. Then use this tree to determine which fact-sets will justify this conclusion.
- ▶ Estimate the branching factor for the search space for forwards-reasoning with these rules.

Exercises cont.

- ▶ Draw out these conclusions in the form of a tree of deductions with 'ADSLConnection' at the root.
- ▶ Using backwards reasoning, show whether 'virusInfection' may be concluded on the basis of the facts 'ADSLConnection', 'gamesDownloads' and 'freezing'.
- ▶ Draw out the full AND/OR tree for the conclusion 'virusInfection'. Then use this tree to determine which fact-sets will justify this conclusion.
- ▶ Estimate the branching factor for the search space for forwards-reasoning with these rules.
- ▶ Estimate the branching factor for the search space for backwards-reasoning with these rules.

Exercises cont.

- ▶ Draw out these conclusions in the form of a tree of deductions with 'ADSLConnection' at the root.
- ▶ Using backwards reasoning, show whether 'virusInfection' may be concluded on the basis of the facts 'ADSLConnection', 'gamesDownloads' and 'freezing'.
- ▶ Draw out the full AND/OR tree for the conclusion 'virusInfection'. Then use this tree to determine which fact-sets will justify this conclusion.
- ▶ Estimate the branching factor for the search space for forwards-reasoning with these rules.
- ▶ Estimate the branching factor for the search space for backwards-reasoning with these rules.
- ▶ Identify a minimal alteration of the rules which will enable the conclusion 'diskOverflow'.

Exercises cont.

- ▶ Draw out these conclusions in the form of a tree of deductions with 'ADSLConnection' at the root.
- ▶ Using backwards reasoning, show whether 'virusInfection' may be concluded on the basis of the facts 'ADSLConnection', 'gamesDownloads' and 'freezing'.
- ▶ Draw out the full AND/OR tree for the conclusion 'virusInfection'. Then use this tree to determine which fact-sets will justify this conclusion.
- ▶ Estimate the branching factor for the search space for forwards-reasoning with these rules.
- ▶ Estimate the branching factor for the search space for backwards-reasoning with these rules.
- ▶ Identify a minimal alteration of the rules which will enable the conclusion 'diskOverflow'.

- ▶ Russel and Norvig, Chaps. 6-10.

- ▶ Russel and Norvig, Chaps. 6-10.