

A Model for Computer Reasoning Under Uncertainty

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Outline

- ◆ How do people make decisions and predictions?
- ◆ Basic issues in absolute reasoning - the Logic of Argumentation
- ◆ An introduction to our model
- ◆ Relative reasoning

How do people reason?

- ◆ Arguments For
- ◆ Arguments Against
- ◆ Undercutting arguments

Is it going to rain?

◆ “It is going dark. I think it is going to rain.”

Is it going to rain?

- ◆ “It is going dark. I think it is going to rain.”
- ◆ “It is late in the day. It always goes dark in the evening!”

Numbers or hunches?

- ◆ Proven evidence
- ◆ Quantitative evidence
- ◆ Qualitative evidence

- ◆ Numerical probability
 - Laws of chance
- ◆ Epistemic probability
 - Past experience

Structure of an argument

- ◆ If [grounds] is/are [threshold] then [proposition] is [force]

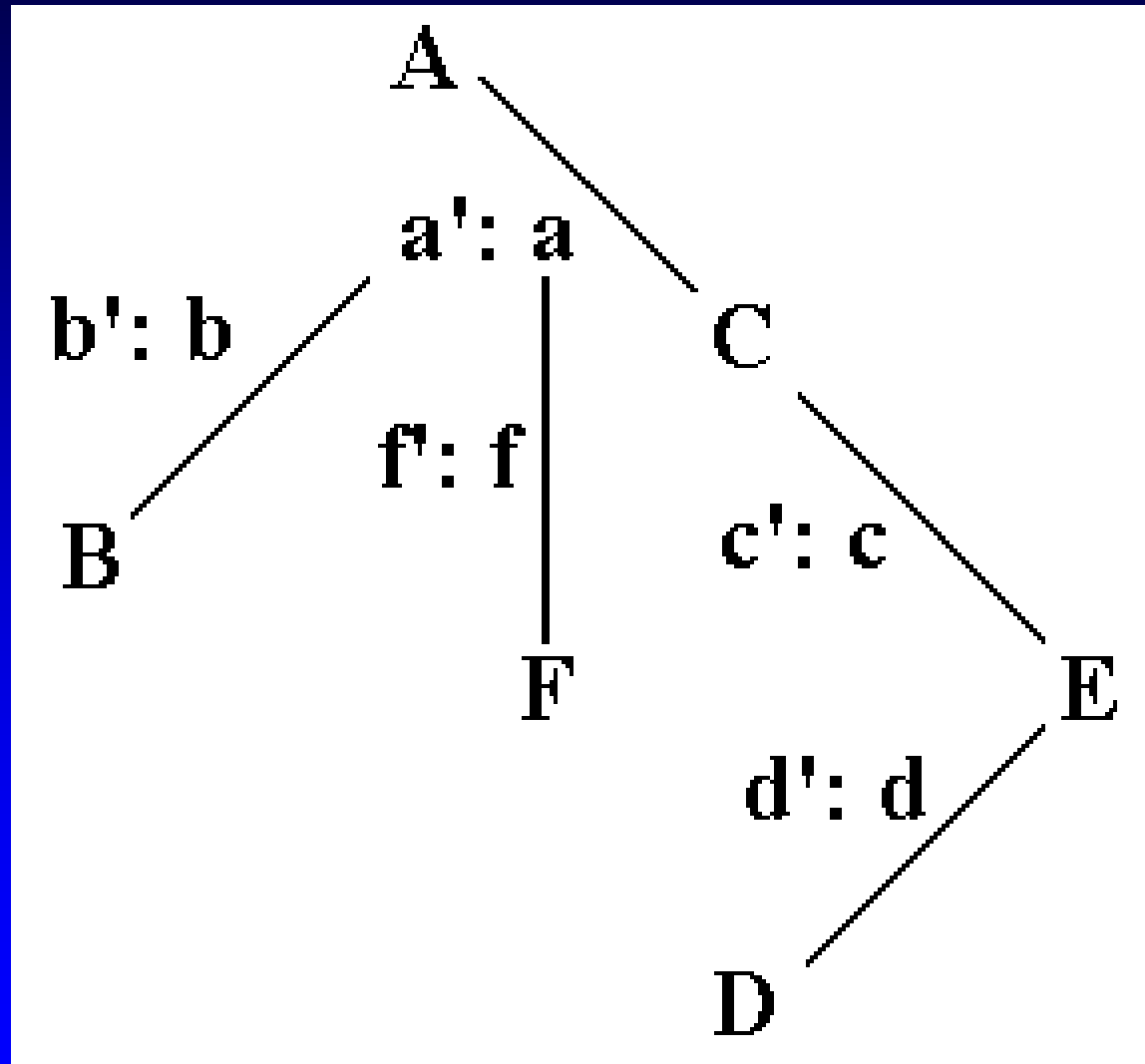
Structure of an argument

- ◆ If [grounds] is/are [threshold] then [proposition] is [force]
- ◆ If falling_rain is ‘certain’ then we_will_get_wet is ‘probable’

Summary

- ◆ People make decisions by weighing the arguments For and Against
- ◆ They appear to construct trees of arguments leading to a conclusion
- ◆ They use concepts like undercutting
- ◆ Undercutting and negation are areas where humans tend to make errors

A reasoning tree



Logic of Argumentation

- ◆ Arguments For
- ◆ Arguments Against
- ◆ Weigh the arguments For and Against

- ◆ An argument For has no implications for the case Against, and *vice versa*
- ◆ Contradiction is a valid state

How many ways can something be undecided?

- ◆ Equivocal
 - Equal balance of arguments
- ◆ Contradicted
 - Proof For and Against
- ◆ Open
 - No germane information
- ◆ Undefined
 - The question has not been asked

Polar and non-polar terms

◆ Probable

- argument For = ‘probable’
- argument Against = ‘open’

◆ Equivocal

- argument For = ‘equivocal’
- argument Against = ‘equivocal’

Hazards of negation

◆ Probable

- relates to the case *For*

◆ Improbable

- relates to the case *Against*

◆ Not probable

- relates to the case *For*

Set For used in DfW and METEOR

- ◆ contradicted
- ◆ certain
- ◆ probable
- ◆ plausible
- ◆ equivocal
- ◆ open
- ◆ undefined

Set Against used in DfW and METEOR

- ◆ contradicted
- ◆ impossible
- ◆ improbable
- ◆ doubted
- ◆ equivocal
- ◆ open
- ◆ undefined

Inclusive and exclusive terms

◆ Inclusive

- certain, probable, plausible, impossible, improbable, doubted

◆ Exclusive

- contradicted, equivocal, open, undefined

Summary

- ◆ Different kinds of forces of arguments can support the case For or the case Against, or both
- ◆ There are two stages in reaching a conclusion about the likelihood of something
 - (1) Aggregate the arguments For and the arguments Against
 - (2) Resolve the cases For and Against

Combining arguments For or Against

- ◆ If there is an argument for something being ‘probable’ and one for it being ‘plausible’, does that make it more than ‘probable’?
- ◆ If there are three reasons to believe that something is ‘plausible’, does that make it more likely than ‘plausible’?

Combining arguments For or Against

- ◆ In our implementation of the model multiple arguments are not additive - the level of belief in the case For something is the level of belief conferred by the strongest argument

Combining arguments For or Against

Aggregate Force For = $\text{Max}\{F_a, F_b, F_c, \dots\}$

Aggregate Force Against = $\text{Max}\{F_d, F_e, F_f, \dots\}$

where Max returns the value of the force highest in an ordered list

Combining the cases For and Against

Tension = Resolve[For, Against]

where the value returned by Resolve is determined from a matrix containing the sets of terms For and Against

Examples from the resolution matrix

certain vs impossible -> contradicted

probable vs improbable -> equivocal

probable vs doubted -> plausible

plausible vs doubted -> equivocal

Mixing quantitative probability of chance with qualitative terms

- ◆ Include the numbers 0 to 1 in the terms supporting the case For
- ◆ Apply arithmetic of probability to aggregate terms falling in this range

Mixing quantitative probability of chance with qualitative terms

- ◆ “0.4” with “0.3” gives “0.58”
 - ◆ “0.4” with “certain” can give “certain”
 - ◆ “0.4” with “improbable” can give “improbable”
 - ◆ “0.4” with “equivocal” can give “equivocal”
- ...or you can define the hierarchy differently

Absolute and relative reasoning

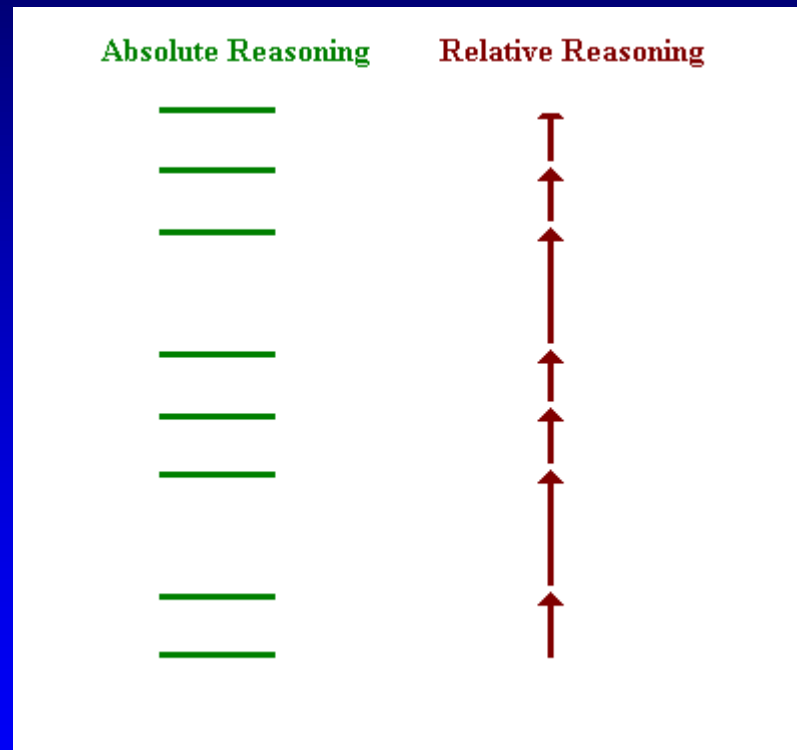
- ◆ “If A is certain then B is doubted”
- ◆ “C is more likely than D”

Absolute and relative reasoning

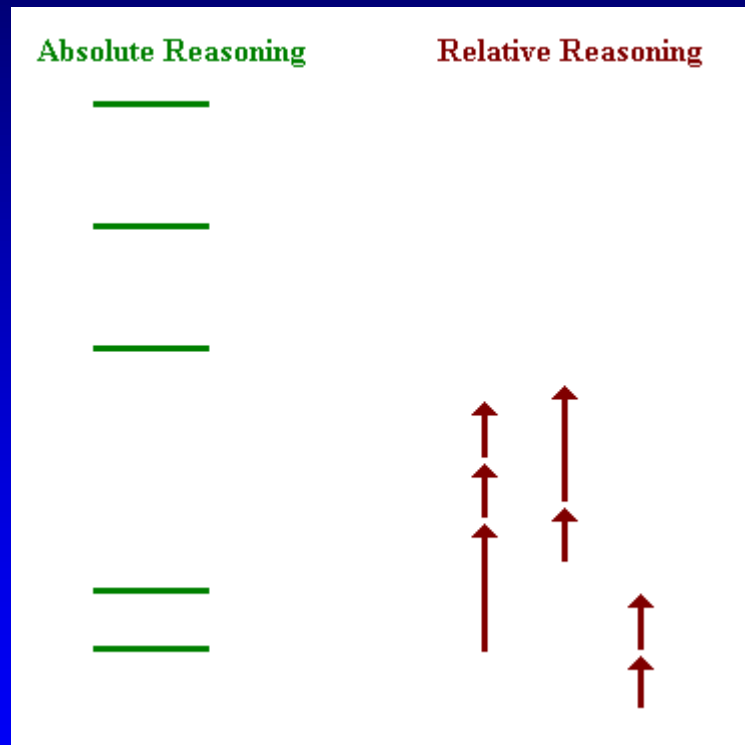
- ◆ A is probable
- ◆ B is probable
- ◆ C is doubted
- ◆ D is more likely than C

- ◆ Are A and B equally likely?
- ◆ Is D probable?

Complete Domain



Incomplete Domain



Absolute and relative reasoning

- ◆ In METEOR the two reasoning models operate independently
- ◆ Their conclusions are combined and reported together

Likelihood versus quantity

In METEOR we predict the likelihood that the product of a biotransformation will be seen, not the quantity of product or the reaction rate; we predict “the most likely metabolite”, not “the expected major metabolite”.

Conclusion

- ◆ In our model we have extended and tightened previous descriptions of the Logic of Argumentation
- ◆ The model supports mixed quantitative and qualitative measures of probability which can be stochastic or epistemic
- ◆ We have introduced and use a parallel universe of relative probability

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- ◆ Button, W. G.; Judson, P. N.; Long, A.; Vessey, J. D. Using Absolute and Relative Reasoning in the Prediction of the Potential Metabolism of Xenobiotics. *JCICS*, **2003**, 43, 1371-1377.