

CS344: Introduction to Artificial Intelligence

(associated lab: CS386)

Pushpak Bhattacharyya

CSE Dept.,

IIT Bombay

Lecture-4: Fuzzy Control of Inverted
Pendulum + Propositional Calculus based
puzzles

Lukasiewicz formula for Fuzzy Implication

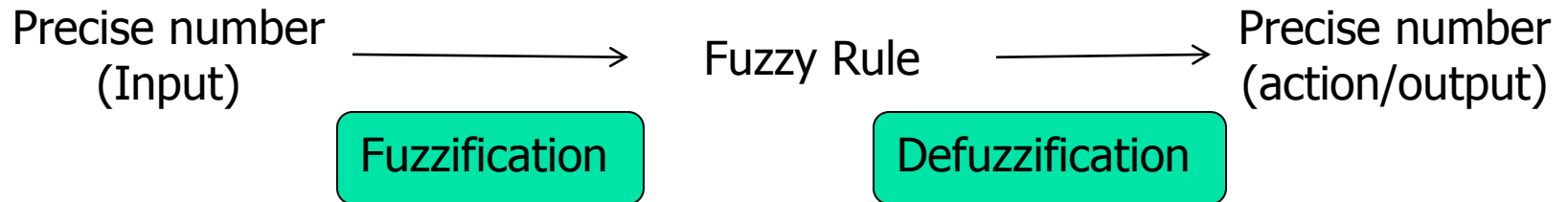
- $t(P)$ = truth value of a proposition/predicate. In fuzzy logic $t(P) = [0,1]$
- $t(P \rightarrow Q) = \min[1, 1 - t(P) + t(Q)]$

Lukasiewicz definition of implication

Use Lukasiewicz definition

- $t(p \rightarrow q) = \min[1, 1 - t(p) + t(q)]$
- We have $t(p \rightarrow q) = c$, i.e., $\min[1, 1 - t(p) + t(q)] = c$
- Case 1:
- $c = 1$ gives $1 - t(p) + t(q) \geq 1$, i.e., $t(q) \geq a$
- Otherwise, $1 - t(p) + t(q) = c$, i.e., $t(q) \geq c + a - 1$
- Combining, $t(q) = \max(0, a + c - 1)$
- This is the amount of truth transferred over the channel $p \rightarrow q$

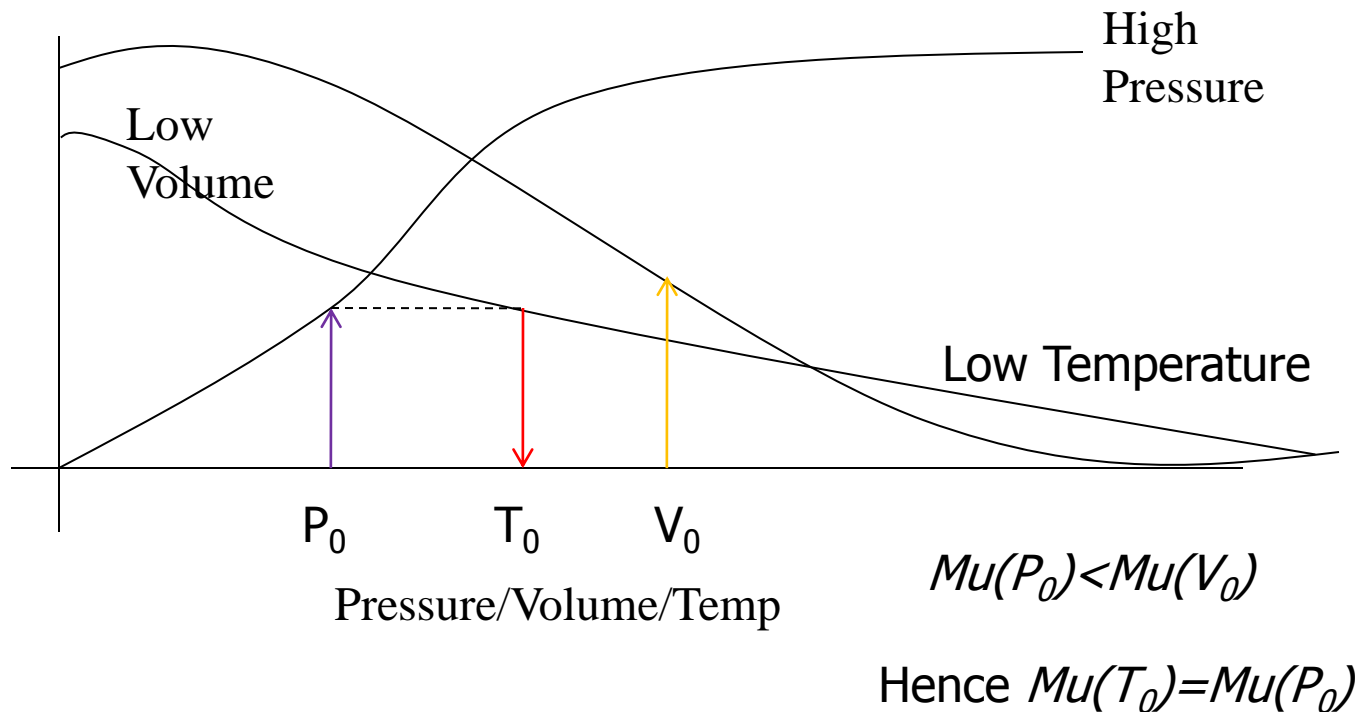
Fuzzification and Defuzzification



ANDING of Clauses on the LHS of implication

$$t(P \wedge Q) = \min(t(P), t(Q))$$

Eg: If Pressure is high AND Volume is low then make Temperature Low



Fuzzy Inferencing

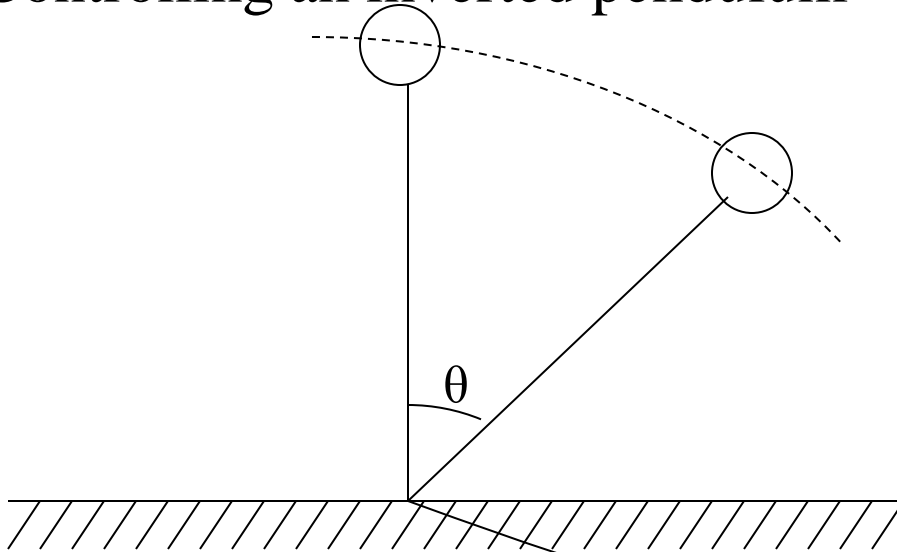
Core

The Lukasiewicz rule

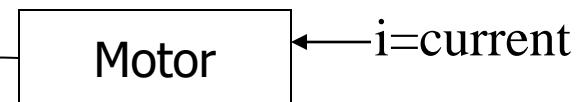
$$t(P \rightarrow Q) = \min[1, 1 + t(P) - t(Q)]$$

An example

Controlling an inverted pendulum



$$\dot{\theta} = d\theta / dt = \text{angular velocity}$$



The goal: To keep the pendulum in vertical position ($\theta=0$) in dynamic equilibrium. Whenever the pendulum departs from vertical, a torque is produced by sending a current 'i'

Controlling factors for appropriate current

Angle θ , Angular velocity $\dot{\theta}$

Some intuitive rules

If θ is +ve small and $\dot{\theta}$ is -ve small

then current is zero

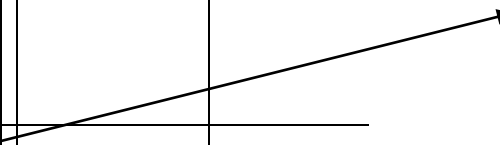
If θ is +ve small and $\dot{\theta}$ is +ve small

then current is -ve medium

Control Matrix

$\theta \backslash \dot{\theta}$	-ve med	-ve small	Zero	+ve small	+ve med	
-ve med						
-ve small		+ve med	+ve small	Zero		
Zero		+ve small	Zero	-ve small		
+ve small		Zero	-ve small	-ve med		
+ve med						

Region of interest



Each cell is a rule of the form

If θ is $\langle \rangle$ and $\dot{\theta}$ is $\langle \rangle$

then i is $\langle \rangle$

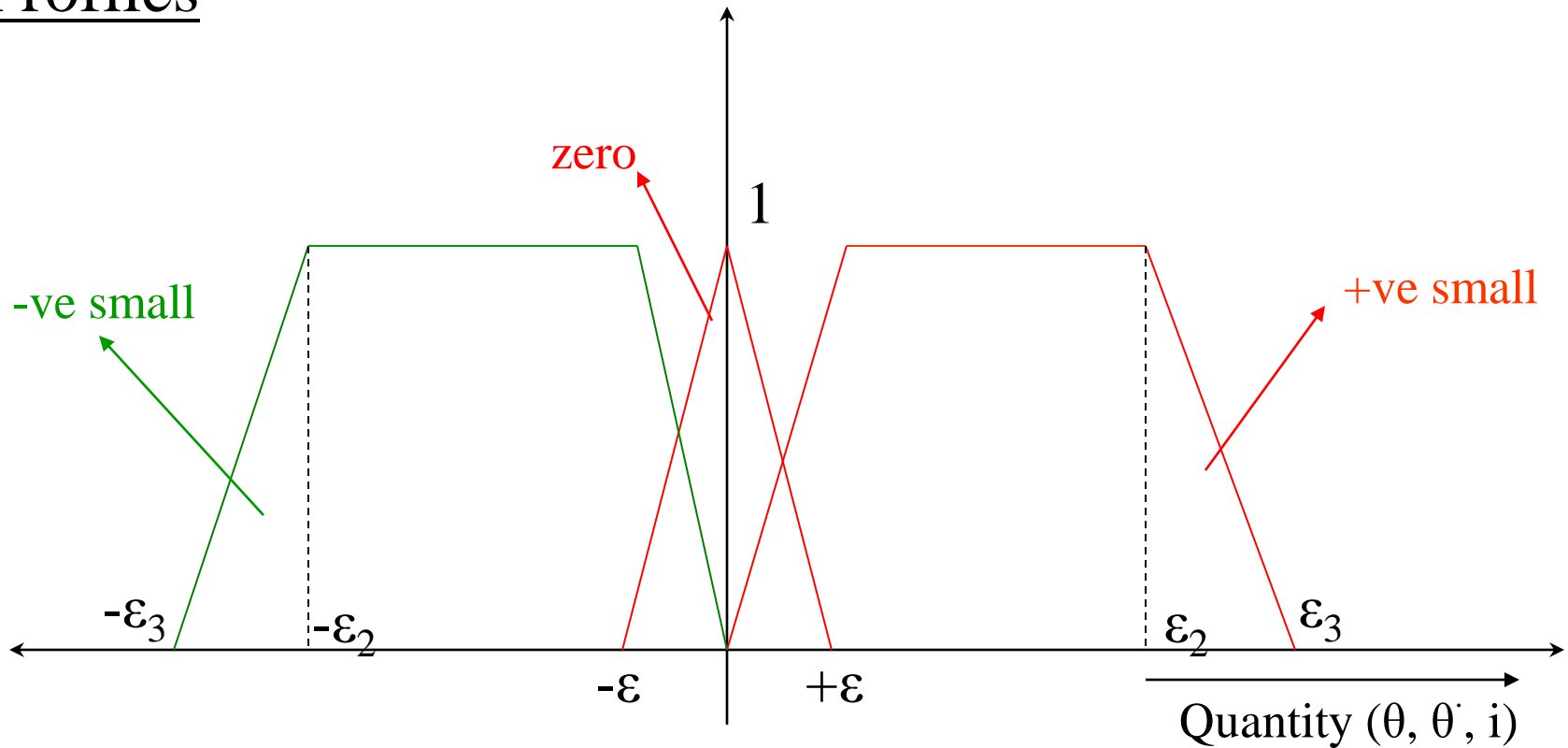
4 “Centre rules”

1. if $\theta = = \text{Zero}$ and $\dot{\theta} = = \text{Zero}$ then $i = \text{Zero}$
2. if θ is +ve small and $\dot{\theta} = = \text{Zero}$ then i is -ve small
3. if θ is -ve small and $\dot{\theta} = = \text{Zero}$ then i is +ve small
4. if $\theta = = \text{Zero}$ and $\dot{\theta}$ is +ve small then i is -ve small
5. if $\theta = = \text{Zero}$ and $\dot{\theta}$ is -ve small then i is +ve small

Linguistic variables

1. Zero
2. +ve small
3. -ve small

Profiles

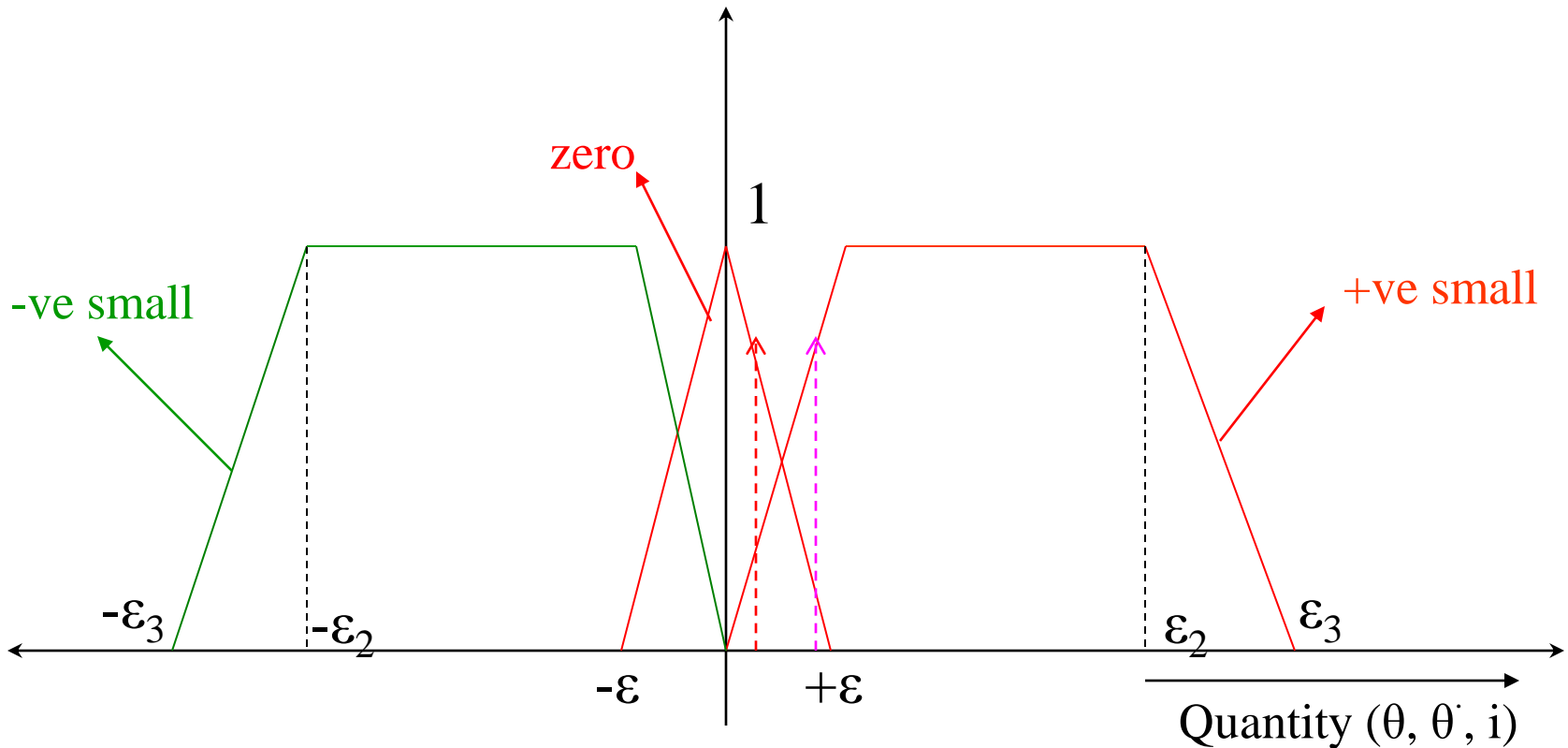


Inference procedure

1. Read actual numerical values of θ and θ'
2. Get the corresponding μ values μ_{Zero} , $\mu_{(+ve \text{ small})}$, $\mu_{(-ve \text{ small})}$. This is called FUZZIFICATION
3. For different rules, get the fuzzy i values from the R.H.S of the rules.
4. "Collate" by some method and get ONE current value. This is called DEFUZZIFICATION
5. Result is one numerical value of i .

Rules Involved

- if θ is Zero and $d\theta/dt$ is Zero then i is Zero
- if θ is Zero and $d\theta/dt$ is +ve small then i is -ve small
- if θ is +ve small and $d\theta/dt$ is Zero then i is -ve small
- if θ +ve small and $d\theta/dt$ is +ve small then i is -ve medium



Fuzzification

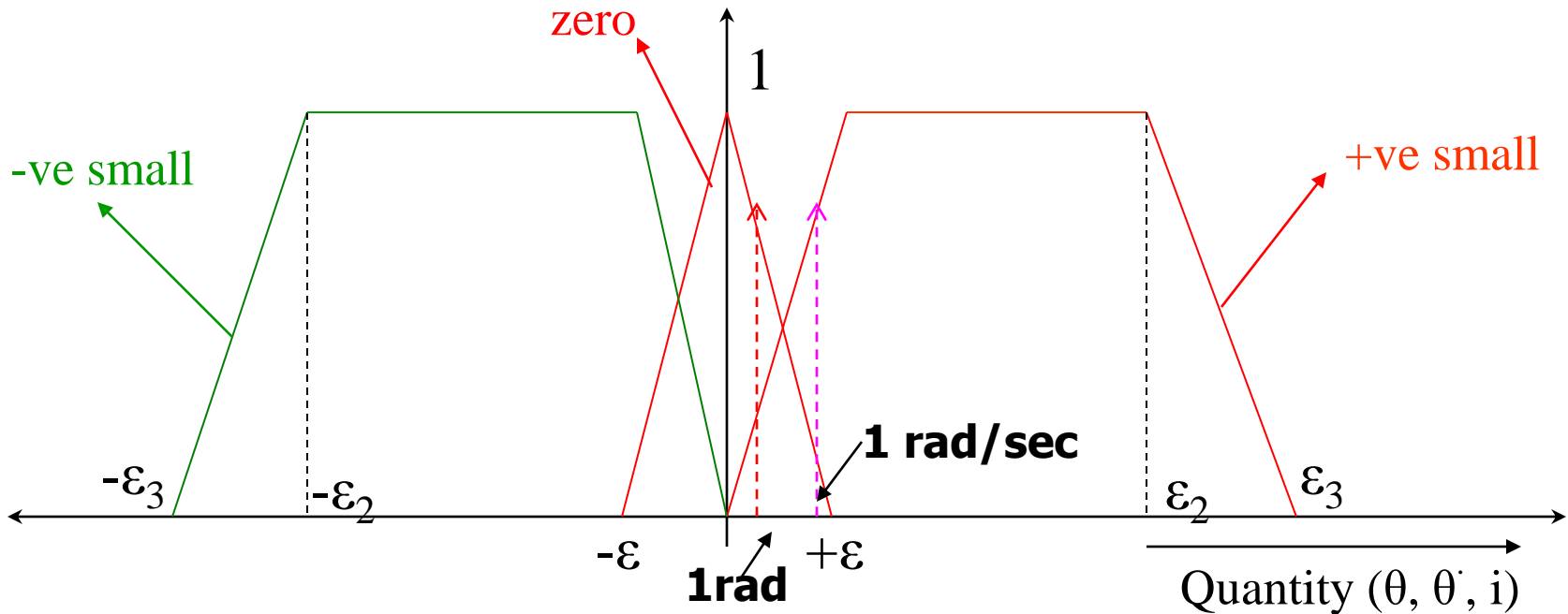
Suppose θ is 1 radian and $d\theta/dt$ is 1 rad/sec

$\mu_{\text{zero}}(\theta = 1) = 0.8$ (say)

$\mu_{\text{+ve-small}}(\theta = 1) = 0.4$ (say)

$\mu_{\text{zero}}(d\theta/dt = 1) = 0.3$ (say)

$\mu_{\text{+ve-small}}(d\theta/dt = 1) = 0.7$ (say)



Fuzzification

Suppose θ is 1 radian and $d\theta/dt$ is 1 rad/sec

$$\mu_{\text{zero}}(\theta = 1) = 0.8 \text{ (say)}$$

$$\mu_{\text{+ve-small}}(\theta = 1) = 0.4 \text{ (say)}$$

$$\mu_{\text{zero}}(d\theta/dt = 1) = 0.3 \text{ (say)}$$

$$\mu_{\text{+ve-small}}(d\theta/dt = 1) = 0.7 \text{ (say)}$$

if θ is Zero and $d\theta/dt$ is Zero then i is Zero

$$\min(0.8, 0.3) = 0.3$$

$$\text{hence } \mu_{\text{zero}}(i) = 0.3$$

if θ is Zero and $d\theta/dt$ is +ve small then i is -ve small

$$\min(0.8, 0.7) = 0.7$$

$$\text{hence } \mu_{\text{-ve-small}}(i) = 0.7$$

if θ is +ve small and $d\theta/dt$ is Zero then i is -ve small

$$\min(0.4, 0.3) = 0.3$$

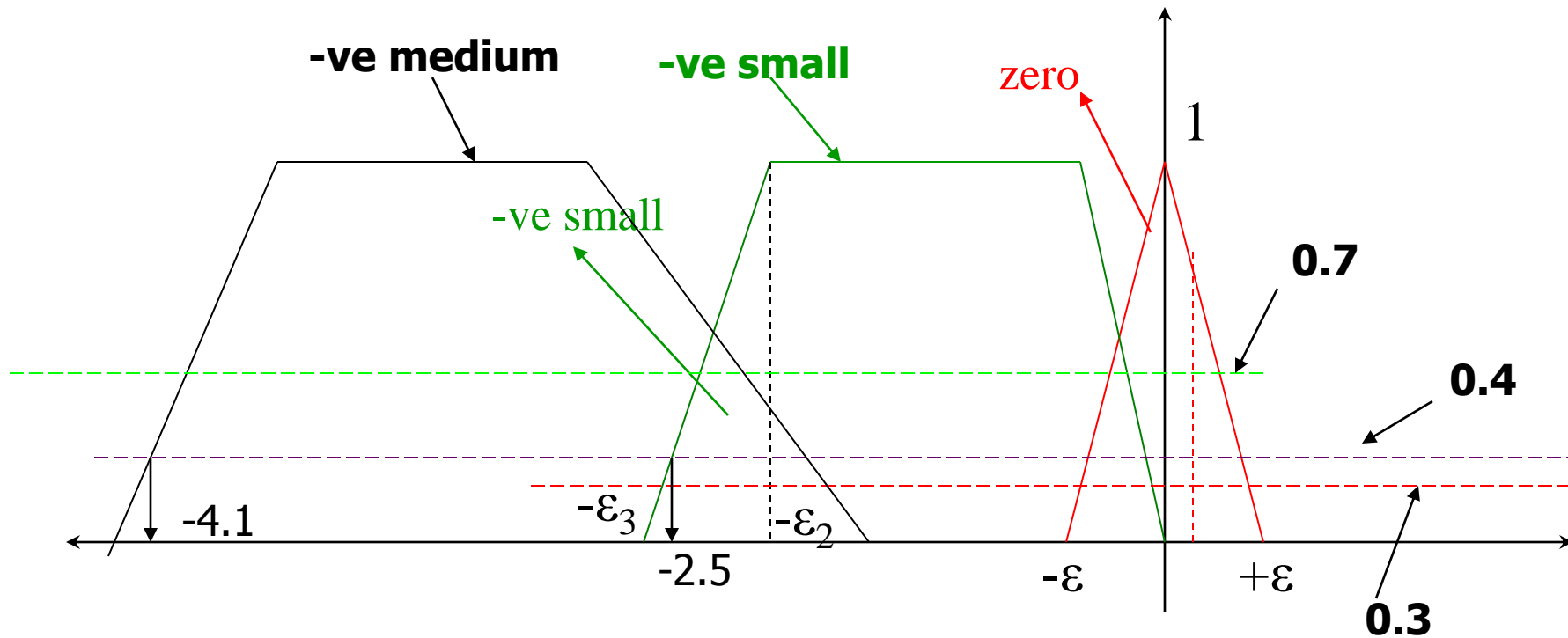
$$\text{hence } \mu_{\text{-ve-small}}(i) = 0.3$$

if θ +ve small and $d\theta/dt$ is +ve small then i is -ve medium

$$\min(0.4, 0.7) = 0.4$$

$$\text{hence } \mu_{\text{-ve-medium}}(i) = 0.4$$

Finding i



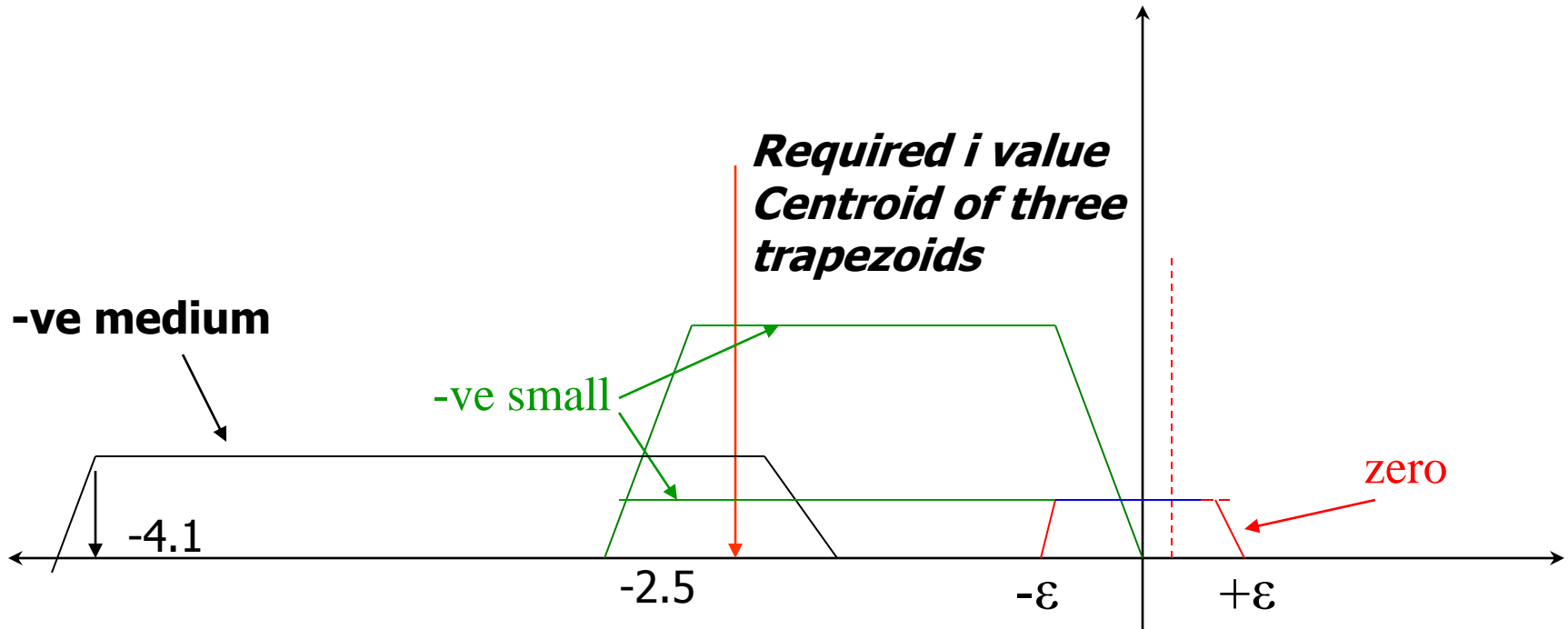
Possible candidates:

$i=0.5$ and -0.5 from the "zero" profile and $\mu=0.3$

$i=-0.1$ and -2.5 from the "-ve-small" profile and $\mu=0.3$

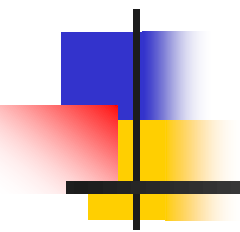
$i=-1.7$ and -4.1 from the "-ve-small" profile and $\mu=0.3$

Defuzzification: Finding i by the *centroid* method



Possible candidates:

i is the x -coord of the centroid of the areas given by the **blue trapezium**, the **green trapeziums** and the **black trapezium**



Propositional Calculus and Puzzles

Propositions

- Stand for facts/assertions
- Declarative statements
 - As opposed to interrogative statements (questions) or imperative statements (request, order)

Operators

AND (\wedge), *OR* (\vee), *NOT* (\neg), *IMPLICATION* (\Rightarrow)

- \Rightarrow and \neg form a minimal set (can express other operations)
- Prove it.

Tautologies are formulae whose truth value is always T, whatever the assignment is

Model

In propositional calculus any formula with n propositions has 2^n models (assignments)

- Tautologies evaluate to T in all models.

Examples:

$$1) \quad P \vee \neg P$$

$$2) \quad \neg(P \wedge Q) \Leftrightarrow (\neg P \vee \neg Q)$$

.e Morgan with AND

Semantic Tree/Tableau method of proving tautology

Start with the negation of the formula

$$\neg[\neg(P \wedge Q) \Rightarrow (\neg P \vee \neg Q)] \quad - \alpha \text{ - formula}$$

$$\neg(P \wedge Q) \quad - \beta \text{ - formula}$$

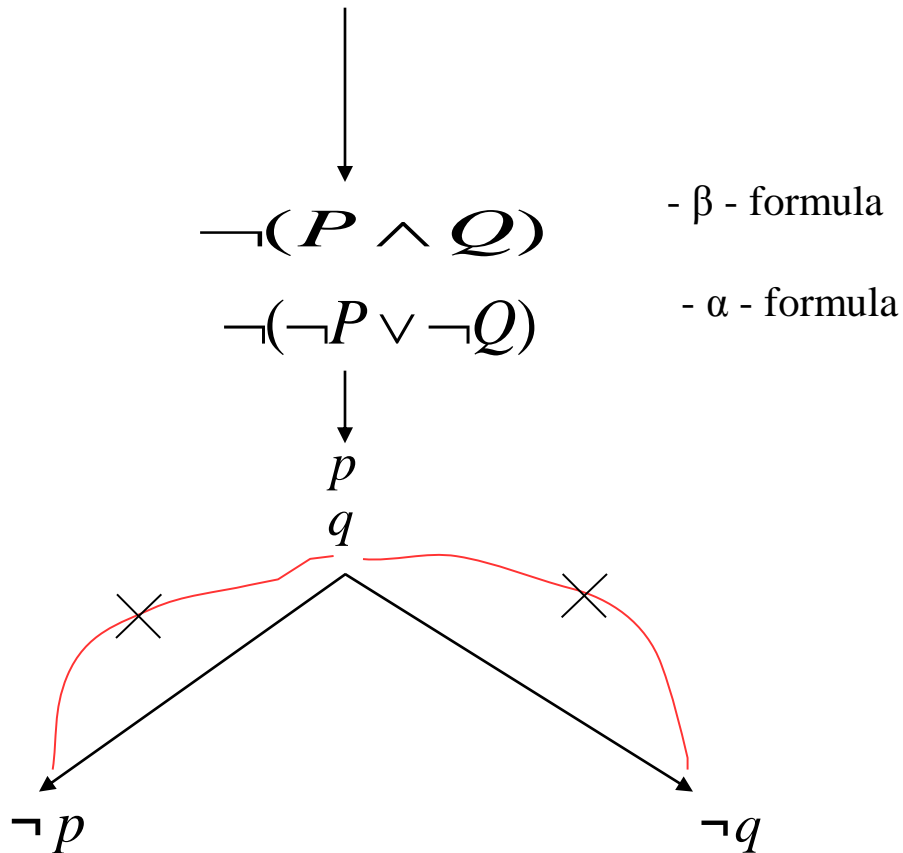
$$\neg(\neg P \vee \neg Q) \quad - \alpha \text{ - formula}$$

p

q

$\neg p$

$\neg q$



Example 2:

$$\neg[A \wedge (B \vee C) \Rightarrow (A \wedge B) \vee (A \wedge C)]$$

(α - formula)

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

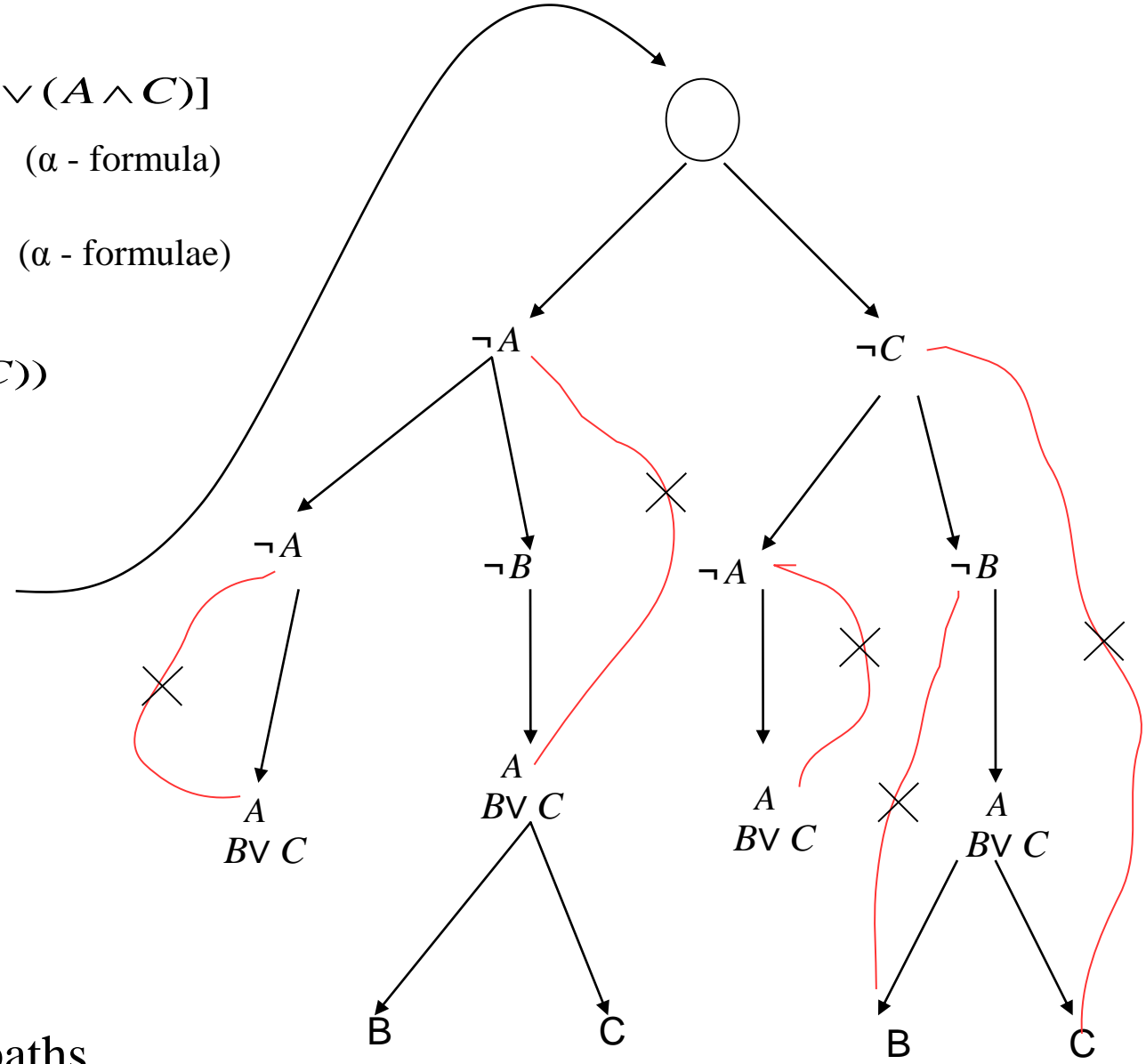
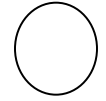
(α - formulae)

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

$$\neg(A \wedge B)$$

$$\neg(A \wedge C)$$

(β - formulae)



Contradictions in all paths

A puzzle

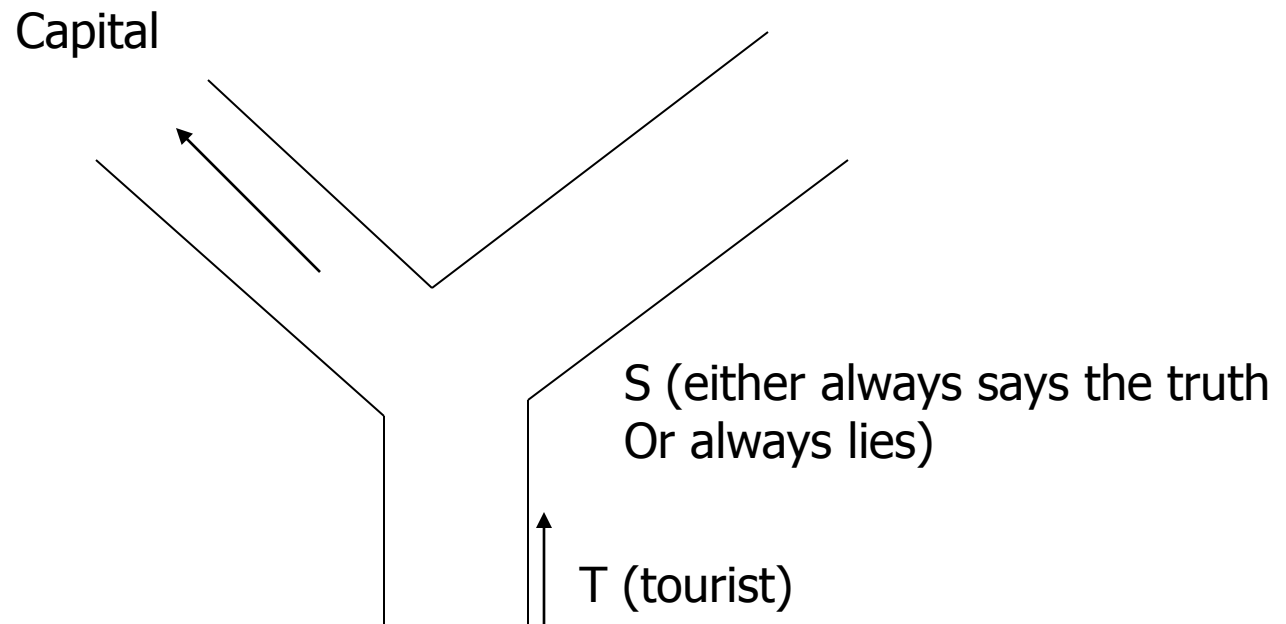
(Zohar Manna, Mathematical Theory of Computation, 1974)

From Propositional Calculus

Tourist in a country of truth-sayers and liars

- Facts and Rules: In a certain country, people **either always** speak the truth **or always** lie. A tourist T comes to a junction in the country and finds an inhabitant S of the country standing there. One of the roads at the junction leads to the capital of the country and the other does not. S can be asked only **yes/no** questions.
- Question: What **single** yes/no question can T ask of S, so that the direction of the capital is revealed?

Diagrammatic representation



Deciding the Propositions: a very difficult step- needs human intelligence

- P: Left road leads to capital
- Q: S always speaks the truth

Meta Question: What question should the tourist ask

- The **form** of the question
- Very difficult: needs human intelligence
- The tourist should ask
 - ***Is R true?***
 - ***The answer is "yes" if and only if the left road leads to the capital***
 - ***The structure of R to be found as a function of P and Q***

A more mechanical part: use of truth table

P	Q	S's Answer	R
T	T	Yes	T
T	F	Yes	F
F	T	No	F
F	F	No	T

Get form of R: quite mechanical

- From the truth table
 - ***R is of the form $(P \text{ x-nor } Q)$ or $(P \equiv Q)$***

Get R in English/Hindi/Hebrew...

- Natural Language Generation: non-trivial
- The question the tourist will ask is
 - ***Is it true that the left road leads to the capital if and only if you speak the truth?***
- Exercise: A more well known form of this question asked by the tourist uses the X-OR operator instead of the X-Nor. What changes do you have to incorporate to the solution, to get that answer?