



PASSION *for* TECHNOLOGY

Narzędzia Sztucznej Inteligencji

Wykład 02

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Source: <https://www.youtube.com/watch?v=cdWRo6gdOJ8>



<http://moonlander.seb.ly/>





Fuzzy Logic

To what degree is something
true or false?

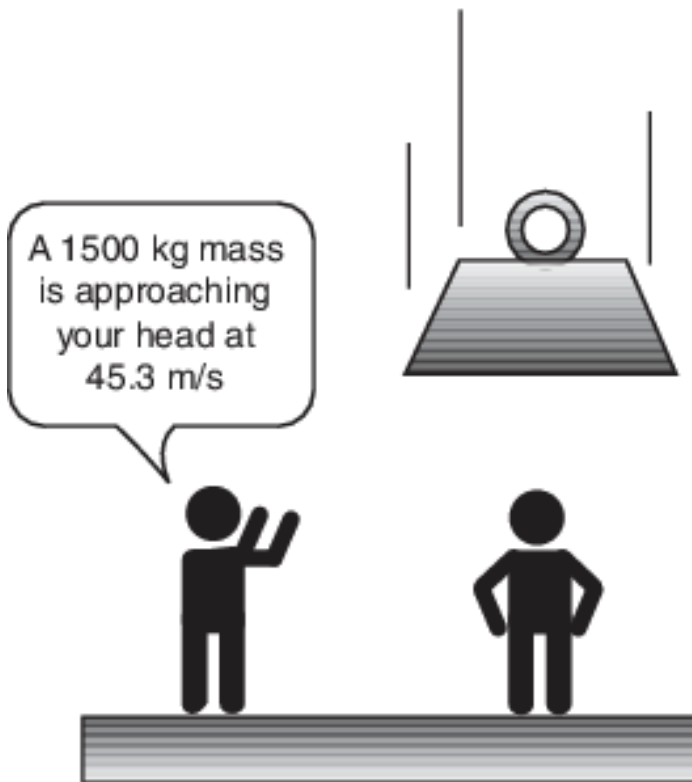


Fuzzy Logic

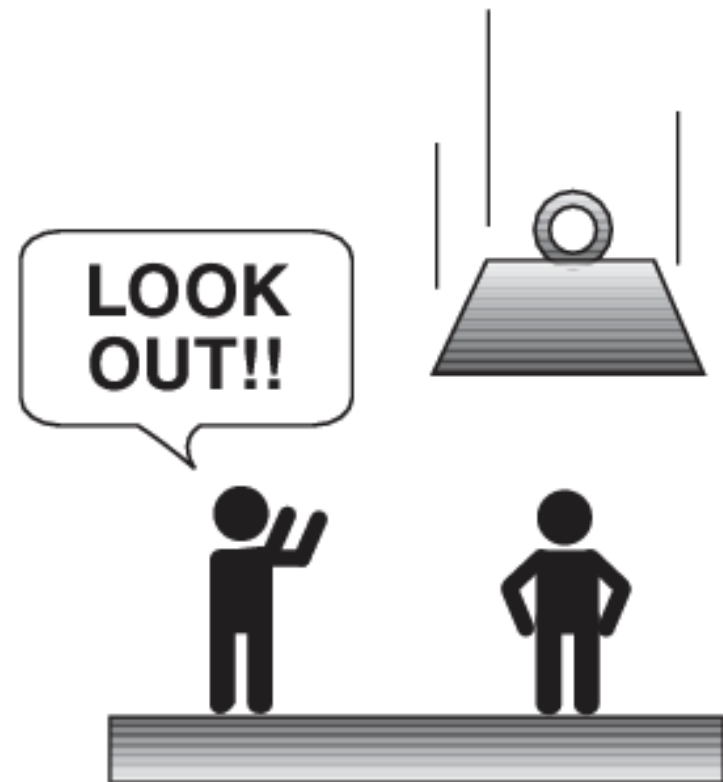
- **Flexible and easy** to implement machine learning technique
- Helps you to **mimic** the logic of **human** thought
- Logic may have **two values** which represent two possible solutions
- Highly suitable method for **uncertain** or **approximate reasoning**
- Fuzzy logic views inference as a process of **propagating elastic constraints**
- Fuzzy logic allows you to build **nonlinear** functions of **arbitrary** complexity.
- Fuzzy logic should be built with the complete **guidance of experts**

Fuzzy Logic

Precision and Significance in the Real World



Precision



Significance

Fuzzy Logic Set

Classical Set



Slow

Speed = 0



Fast

Speed = 1

Fuzzy Set



Slowest

[0.0 – 0.25]



Slow

[0.25 – 0.50]



Fast

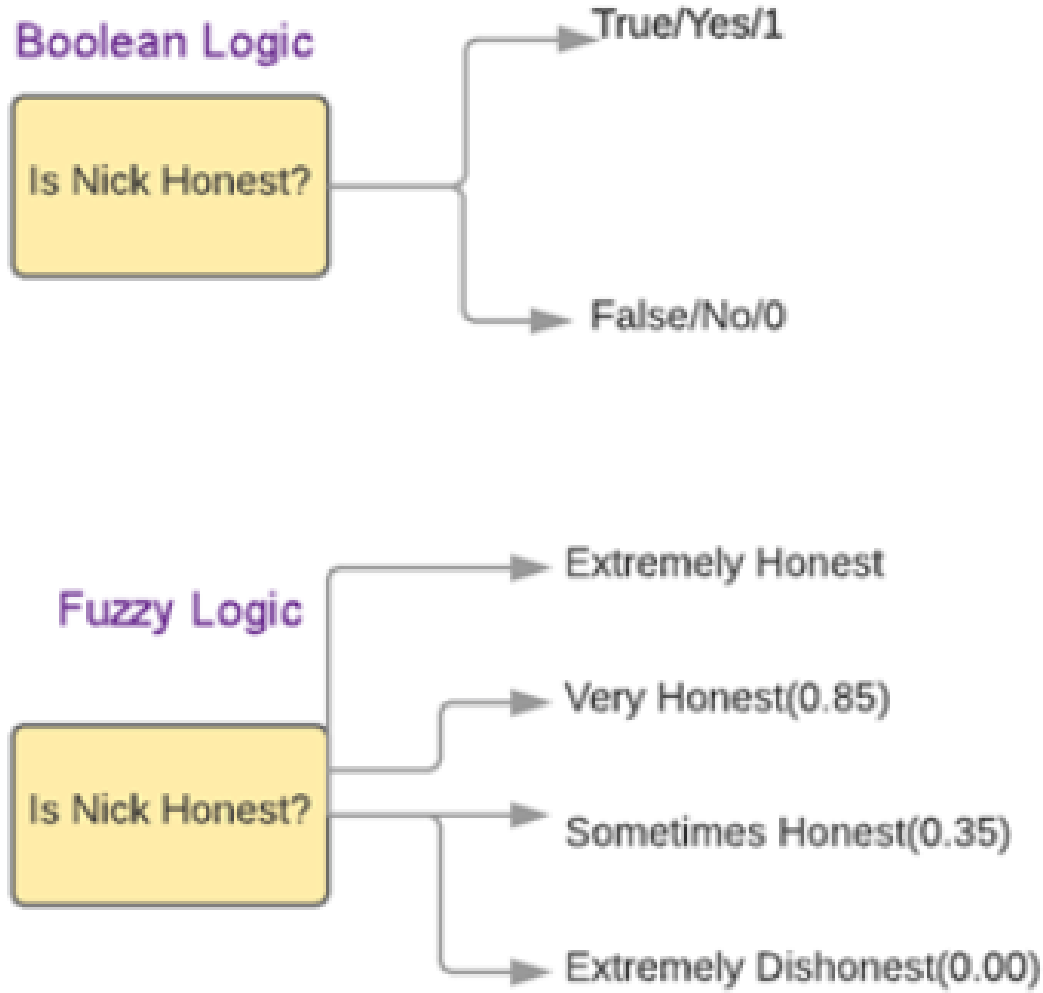
[0.50 – 0.75]



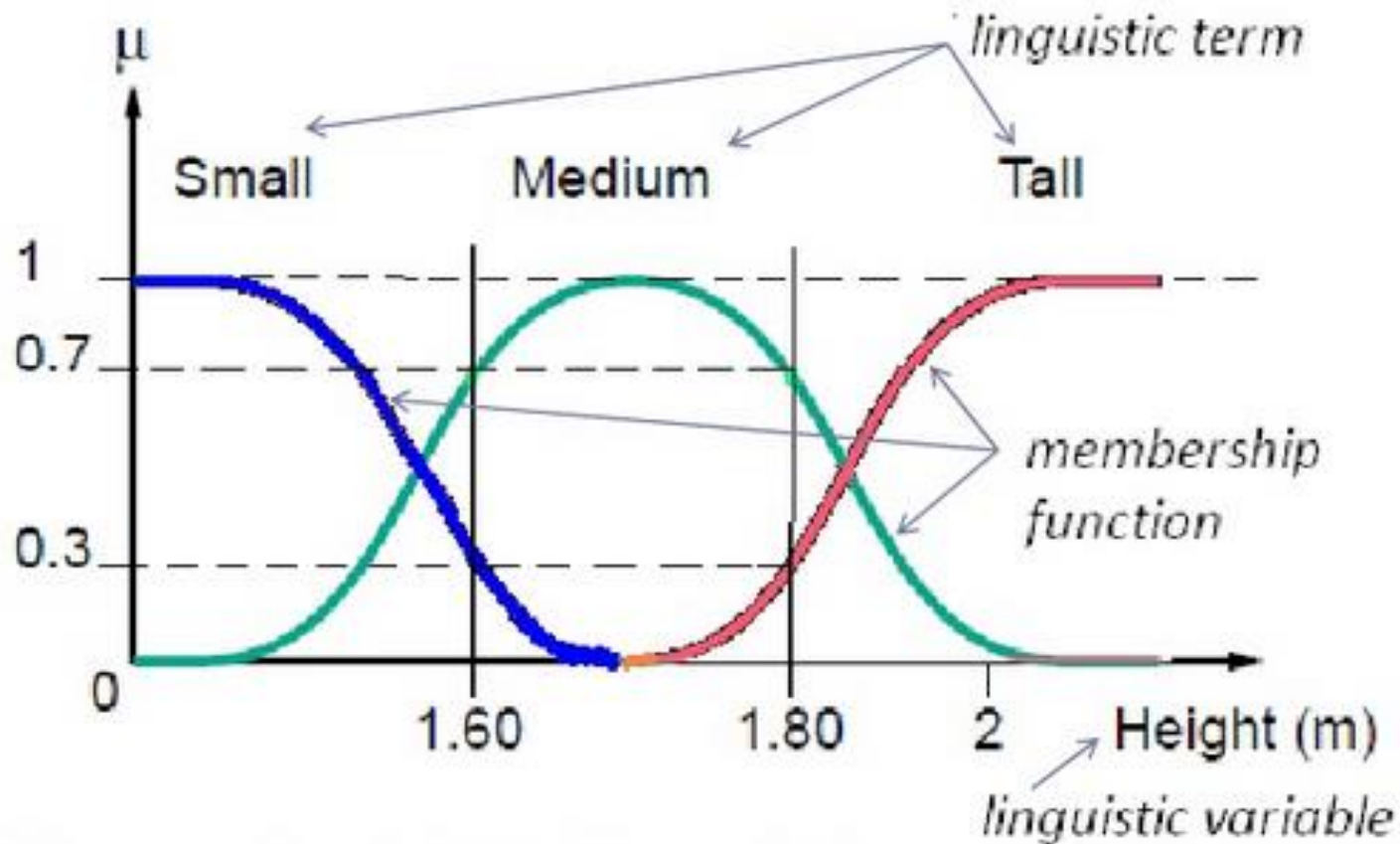
Fastest

[0.75 – 1.00]

Fuzzy Logic Set

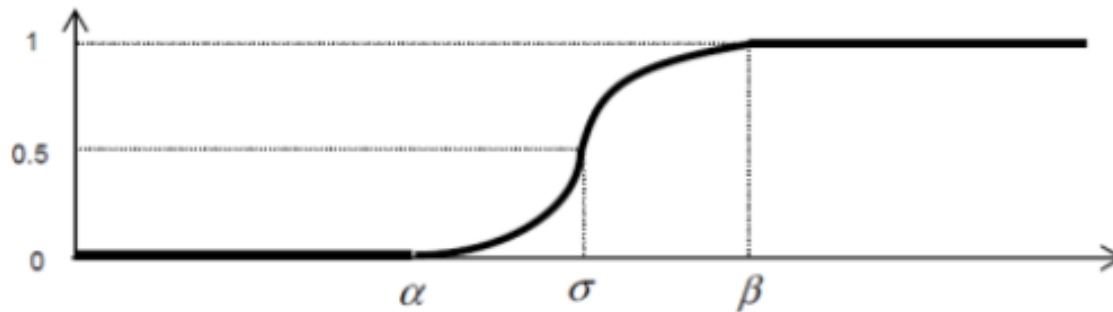


Membership Functions



Membership Functions

$$S(x, \alpha, \sigma, \beta) = \left\{ \begin{array}{ll} 0 & \text{for } x \leq \alpha \\ 2 \left(\frac{x - \alpha}{\beta - \alpha} \right)^2 & \text{for } \alpha < x \leq \sigma \\ 1 - 2 \left(\frac{x - \beta}{\beta - \alpha} \right)^2 & \text{for } \sigma < x \leq \beta \\ 1 & \text{for } x > \beta \end{array} \right\}$$



Source:

https://www.researchgate.net/publication/279916783_Development_of_Intelligent_Traffic_Light_System_Based_On_Congestion_Estimation_Using_Fuzzy_Logic

Membership Functions

$$\Gamma(x, \alpha, \beta) = \begin{cases} 0 & \text{for } x < \alpha \\ \left(\frac{x - \alpha}{\beta - \alpha} \right) & \text{for } \alpha \leq x \leq \beta \\ 1 & \text{for } x > \beta \end{cases}$$

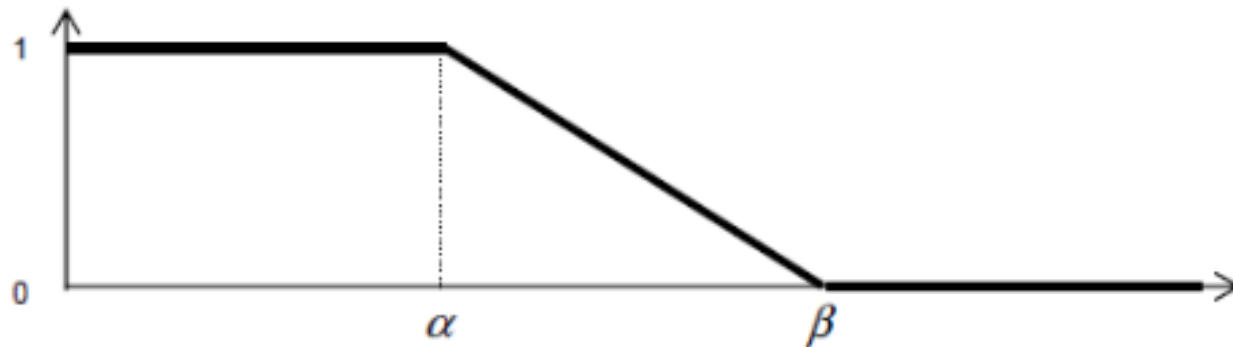


Source:

https://www.researchgate.net/publication/279916783_Development_of_Intelligent_Traffic_Light_System_Based_On_Congestion_Estimation_Using_Fuzzy_Logic

Membership Functions

$$L(x, \alpha, \beta) = \left\{ \begin{array}{ll} 1 & \text{for } x < \alpha \\ \left(\frac{\beta - x}{\beta - \alpha} \right) & \text{for } \alpha \leq x \leq \beta \\ 0 & \text{for } x > \beta \end{array} \right\}$$

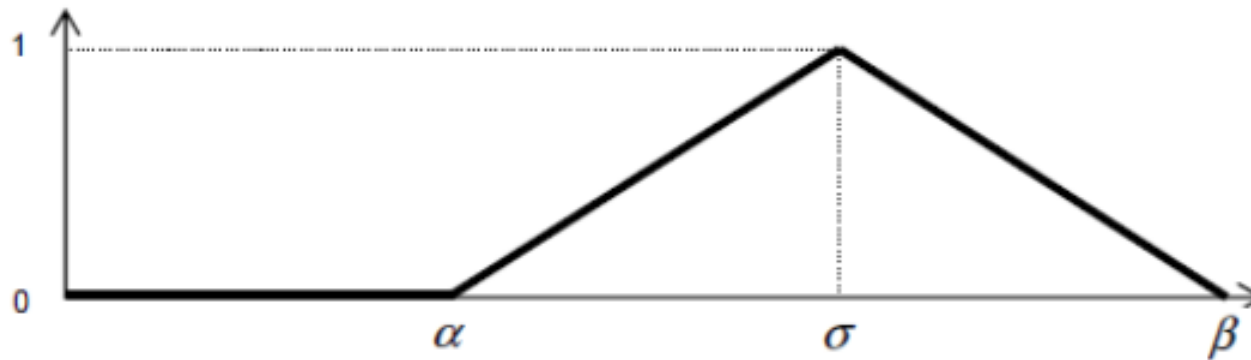


Source:

https://www.researchgate.net/publication/279916783_Development_of_Intelligent_Traffic_Light_System_Based_On_Congestion_Estimation_Using_Fuzzy_Logic

Membership Functions

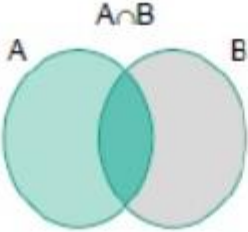
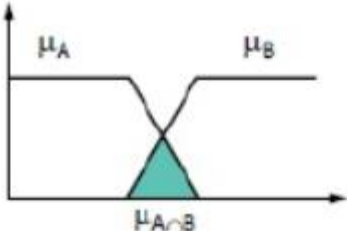
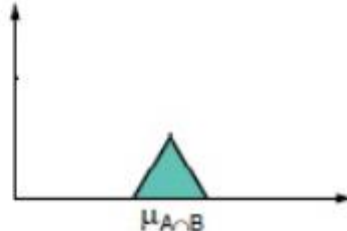
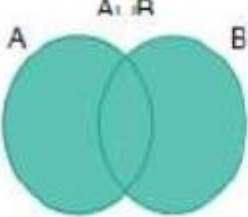
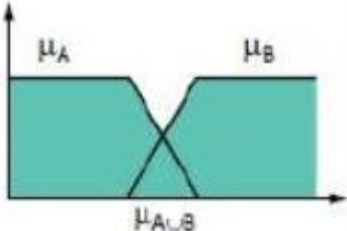
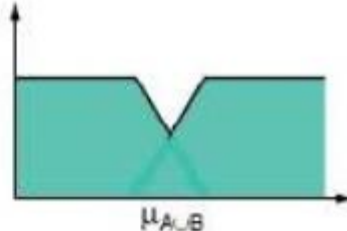
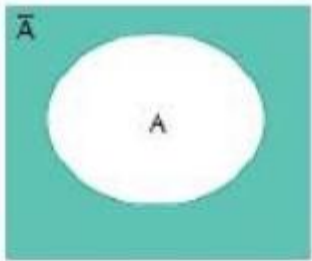
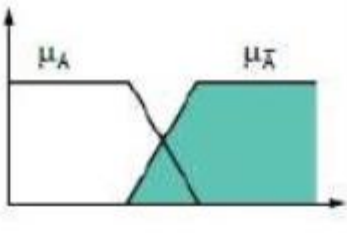
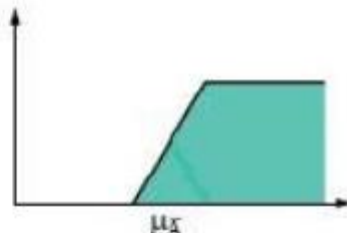
$$A(x, \alpha, \sigma, \beta) = \left\{ \begin{array}{ll} 0 & \text{for } x < \alpha \\ \left(\frac{x - \alpha}{\sigma - \alpha} \right) & \text{for } \alpha \leq x \leq \sigma \\ \left(\frac{\beta - x}{\beta - \sigma} \right) & \text{for } \sigma < x \leq \beta \\ 0 & \text{for } x > \beta \end{array} \right\}$$



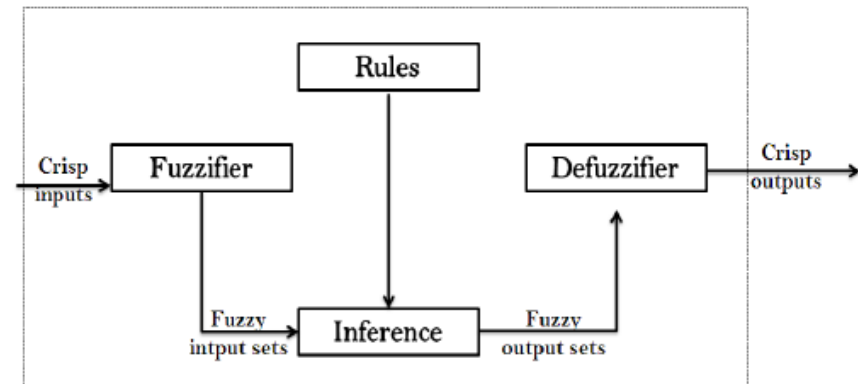
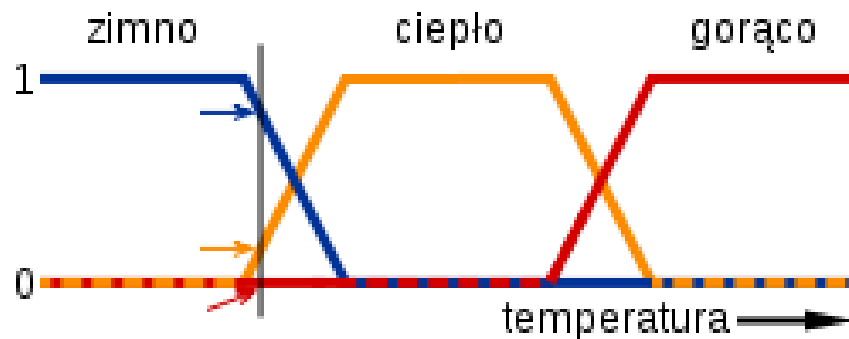
Source:

https://www.researchgate.net/publication/279916783_Development_of_Intelligent_Traffic_Light_System_Based_On_Congestion_Estimation_Using_Fuzzy_Logic

Fuzzy Logic Operation

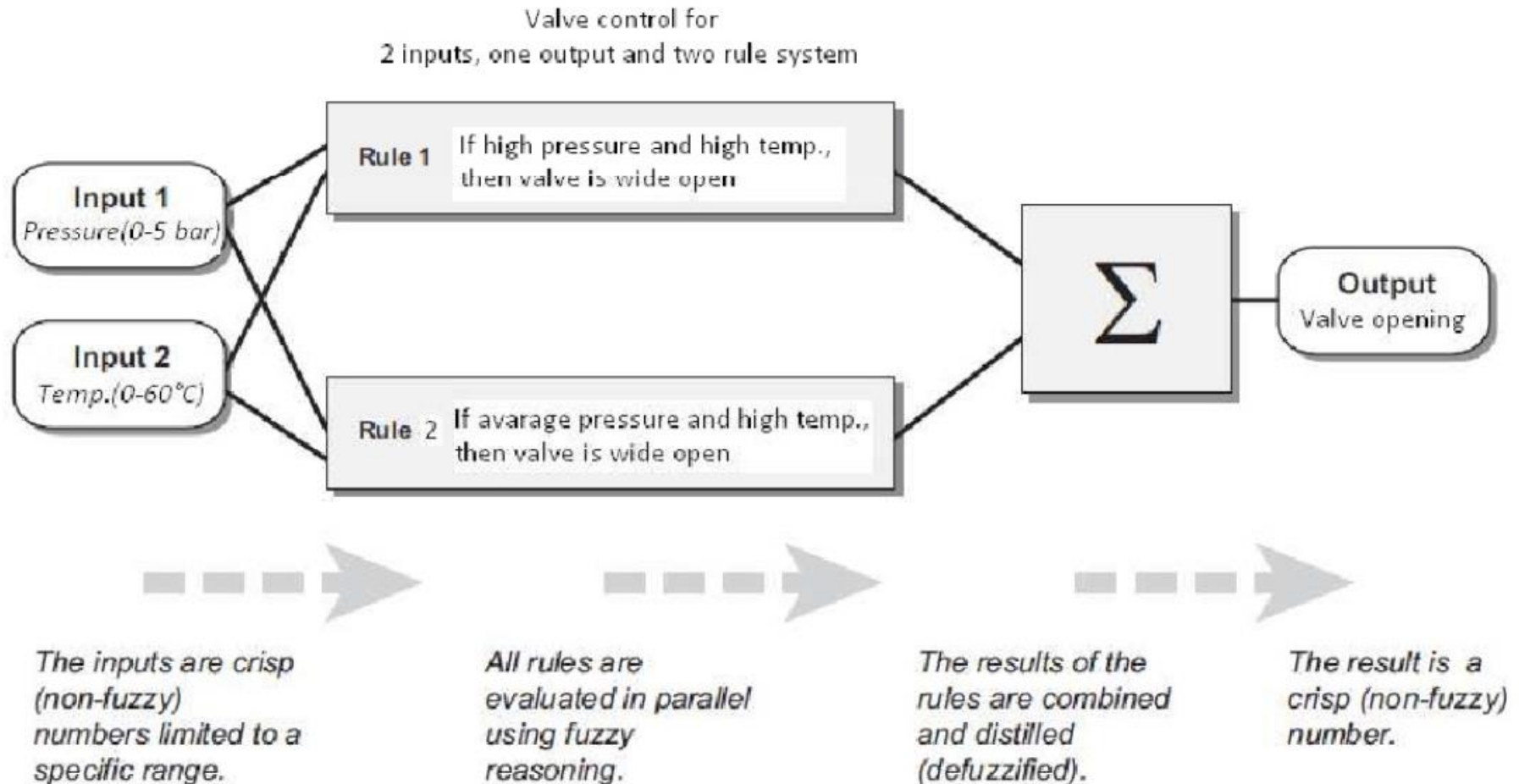
		ZADEH operator	Logic operation		
Intersection		$\mu_{A \cap B} = \text{MIN}(\mu_A, \mu_B)$	AND		
Union		$\mu_{A \cup B} = \text{MAX}(\mu_A, \mu_B)$	OR		
Negation		$\mu_{\bar{A}} = 1 - \mu_A$	NOT		

Fuzzy Logic

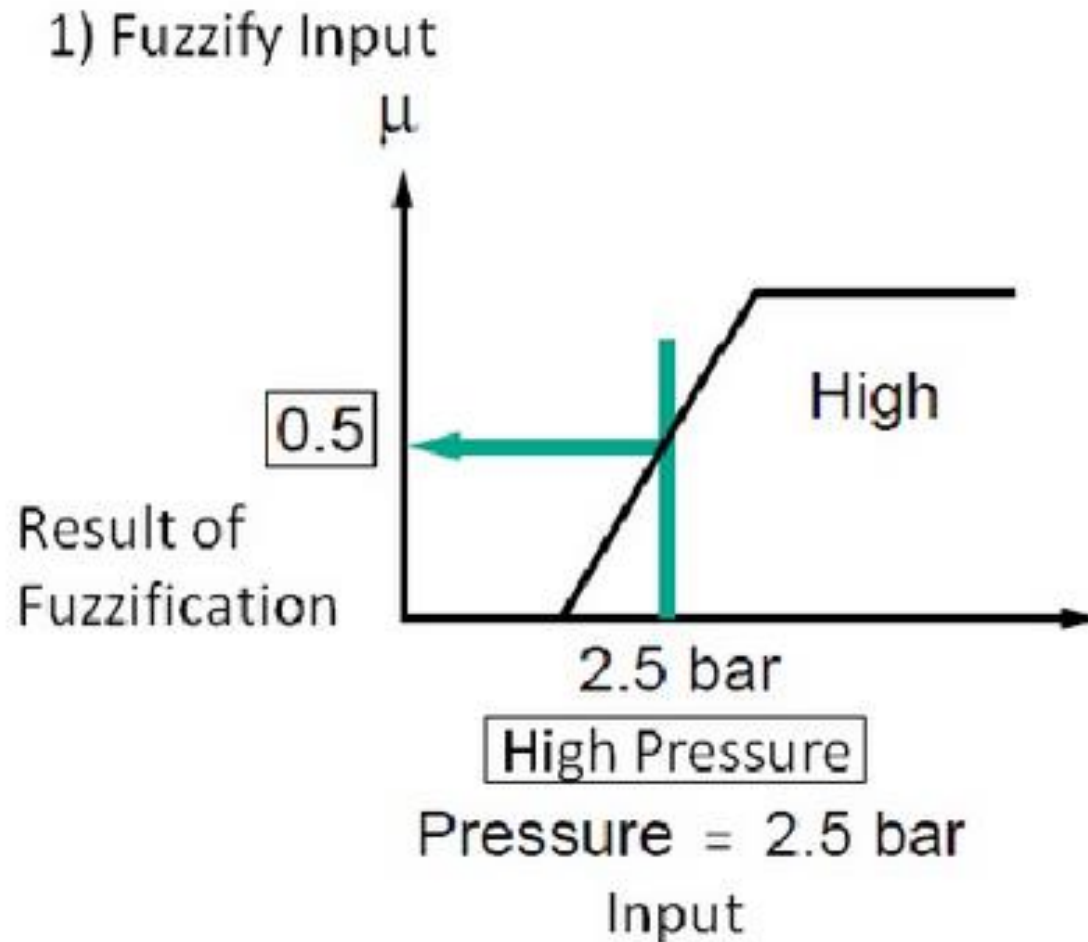


```
IF temperature IS very cold THEN fan_speed is stopped
IF temperature IS cold THEN fan_speed is slow
IF temperature IS warm THEN fan_speed is moderate
IF temperature IS hot THEN fan_speed is high
```

Fuzzy Inference



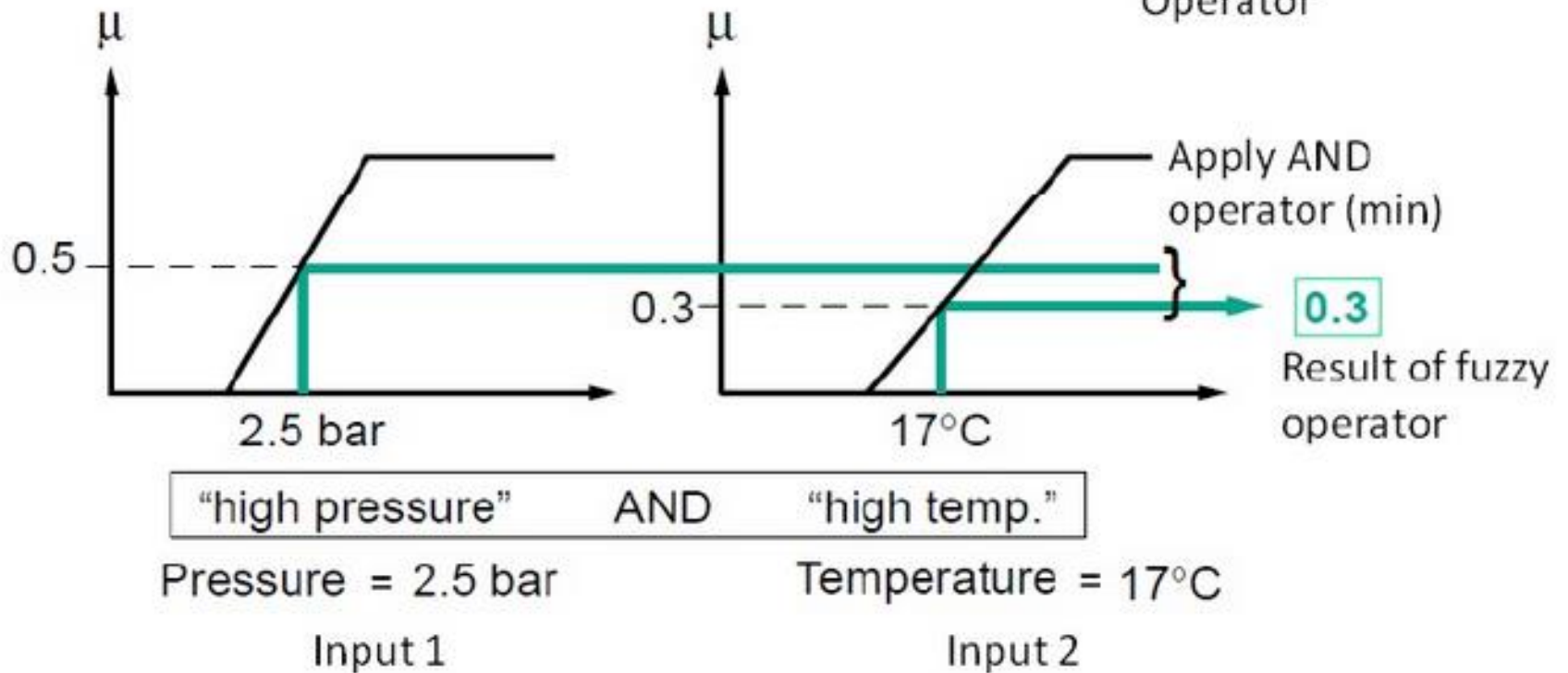
Step 1: Fuzzify Input (Fuzzification)



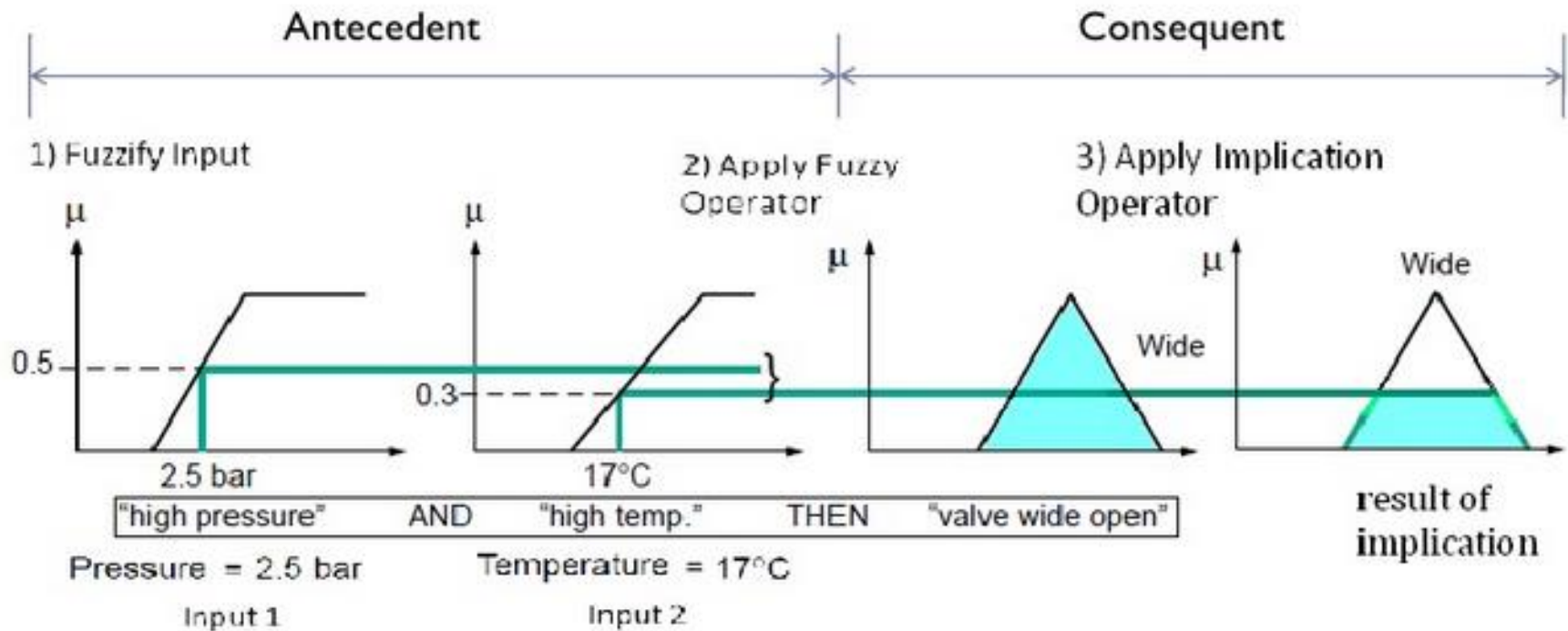
Step 2: Apply Fuzzy Operator

1) Fuzzify Input

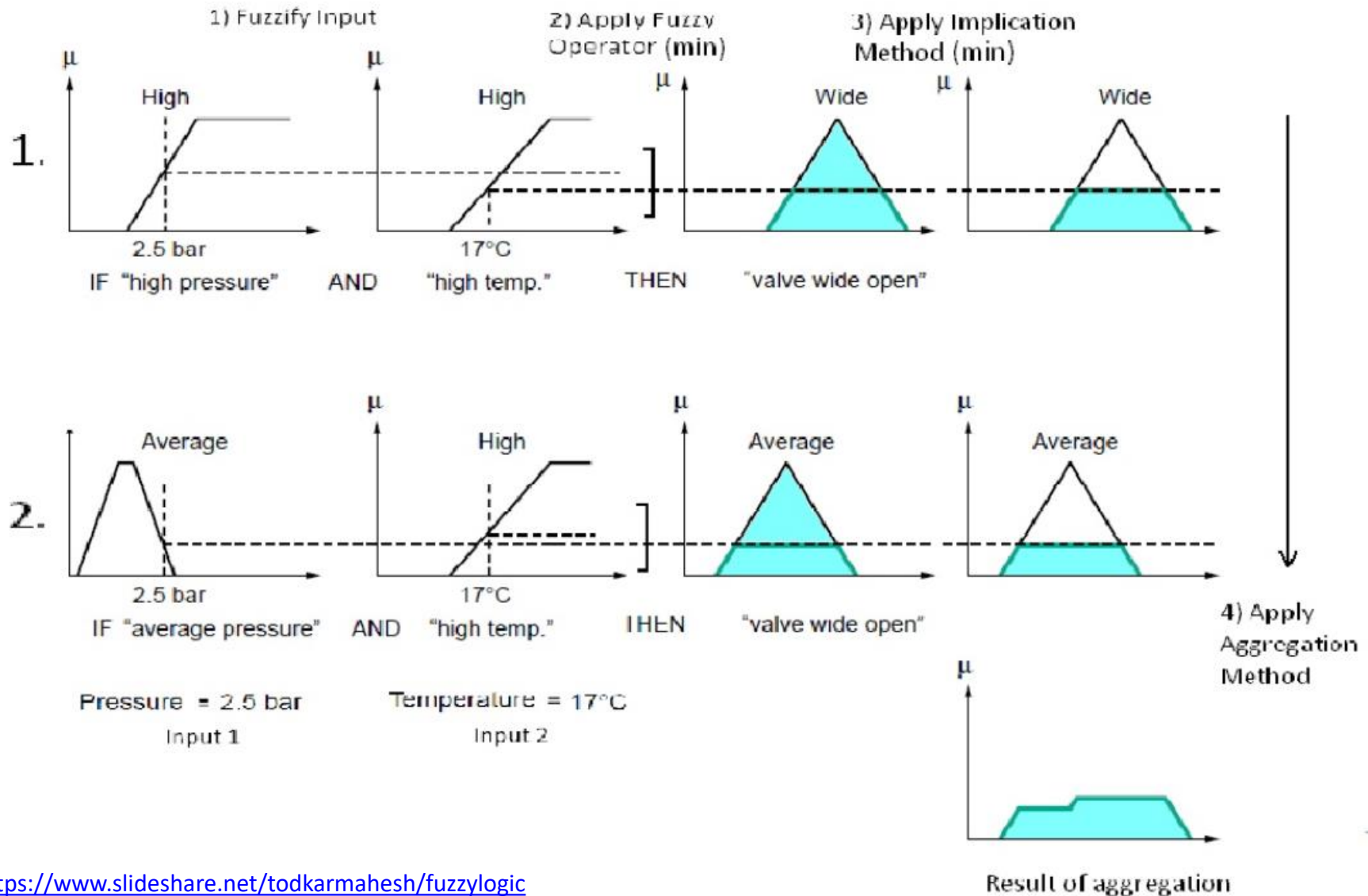
2) Apply Fuzzy Operator



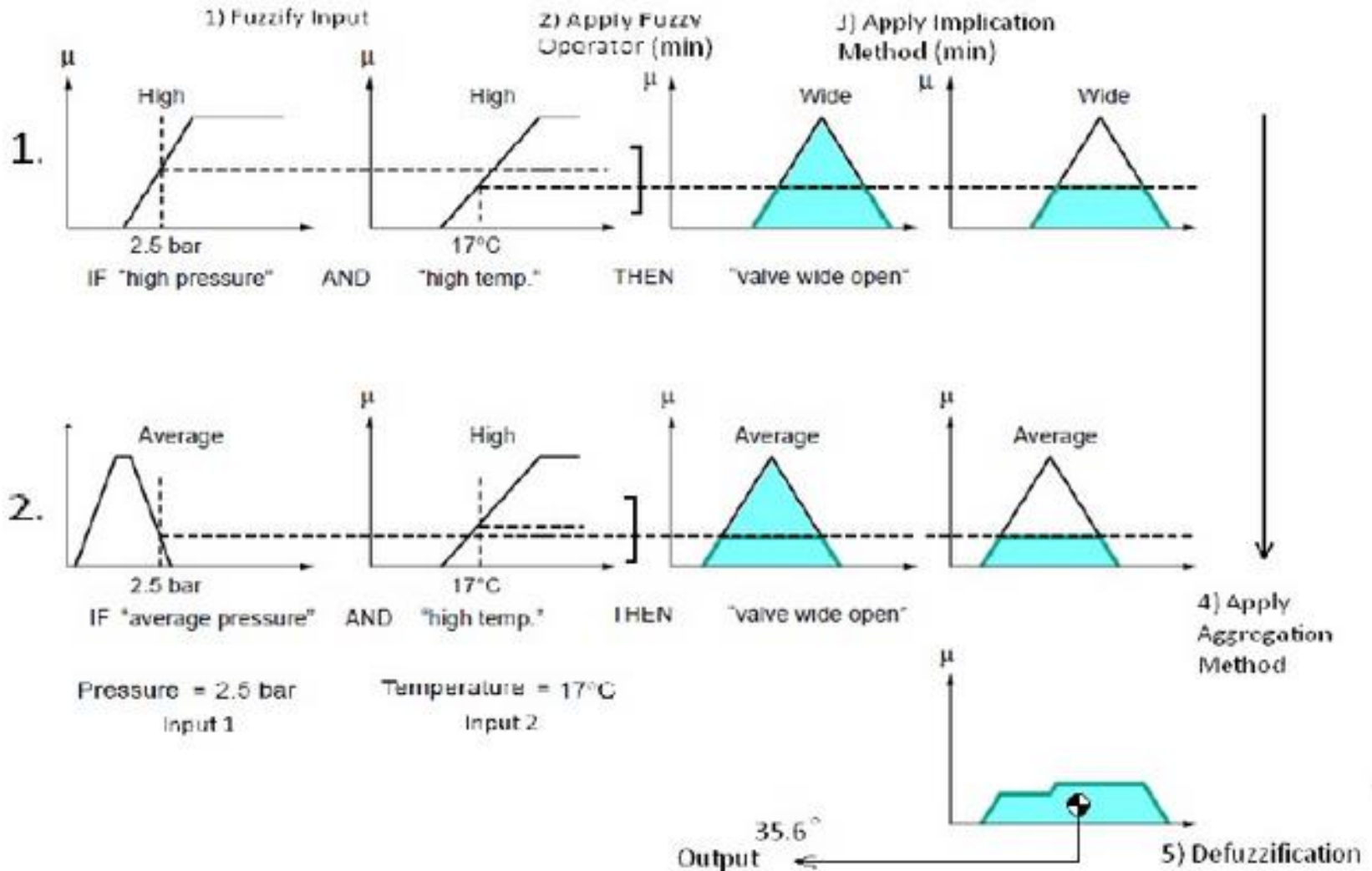
Step 3: Apply Implication Method



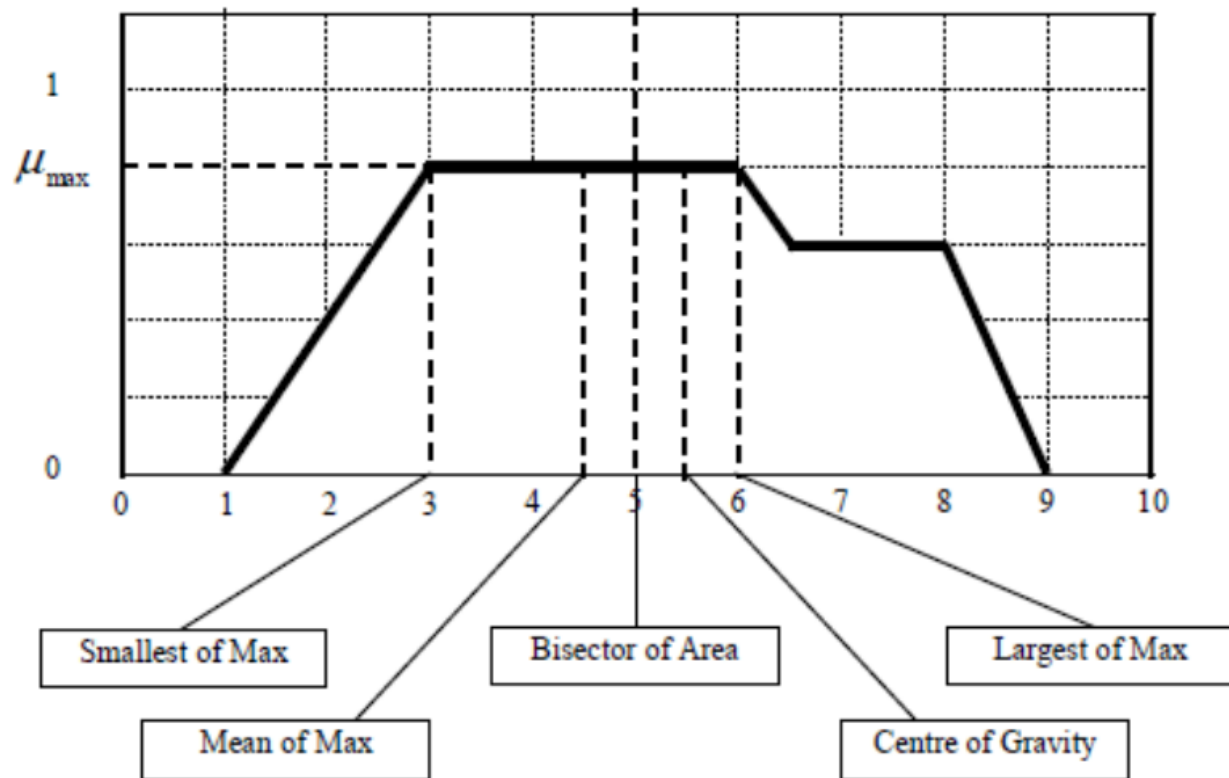
Step 4: Aggregate All Outputs



Fuzzy Inference



Defuzzification method



Source:

https://www.researchgate.net/publication/279916783_Development_of_Intelligent_Traffic_Light_System_Based_On_Congestion_Estimation_Using_Fuzzy_Logic

Fuzzy Logic Example

At Restaurants

Wait staff	15% - 20% of the total bill before taxes (Note: some restaurants now suggest tipping after taxes because servers themselves tip out on the after tax amount).
Wine served with dinner	The safe recommendation is to tip 15-20% of the total bill, including alcohol, even for expensive bottles of wine. However, we've seen some restaurants say it's OK to tip around 10% for expensive wines.
Bartenders	15% - 20% of the tab; or, \$1 for beer or wine, \$2 for mixed drinks. Ideally, pay your bar tab before leaving for your table.
Order at front	If you order at the front and food is delivered to your table, it depends. If, once you've ordered, the seating and decor compare with a standard, sit-down restaurant, tip 5%-10%. If the food is delivered to your table only as a convenience, tipping is not necessary.

At Cafes

Tip jar	Optional. Leave 5%-10% for good service or complicated orders, especially if the staff is hired and is more dependent on tips.
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At Fine Dining

Parking Attendant	Usually \$1-\$3
Coatroom Attendant	Usually \$1 per coat
Wait staff	15%-20% of the pre-tax bill (Note: some restaurants now suggest tipping after taxes because servers themselves tip out on the after tax amount).
Wine steward or sommelier	For personal service from the wine steward, you may tip 10% of the wine bill.
Restroom Attendant	Usually .50-\$1

Other (including delivery)

Pizza Delivery	At least \$1, 15% for normal service, more during rain, snow or other poor weather.
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Fuzzy Logic Example

Antecedents (Inputs)

❑ Service

Universe (ie, crisp value range) How good was the service of the waitress, on a scale of 1 to 10?

Fuzzy set (ie, fuzzy value range): poor, acceptable, amazing

❑ Food quality

Universe: How tasty was the food, on a scale of 1 to 10?

Fuzzy set: bad, decent, great

Fuzzy Logic Example

❑ Consequents (Outputs)

tip

Universe: How much should we tip, on a scale of 0% to 25%

Fuzzy set: low, medium, high

❑ Rules

IF the service was good or the food quality was good, THEN the tip will be high.

IF the service was average, THEN the tip will be medium.

IF the service was poor and the food quality was poor THEN the tip will be low.

❑ Usage

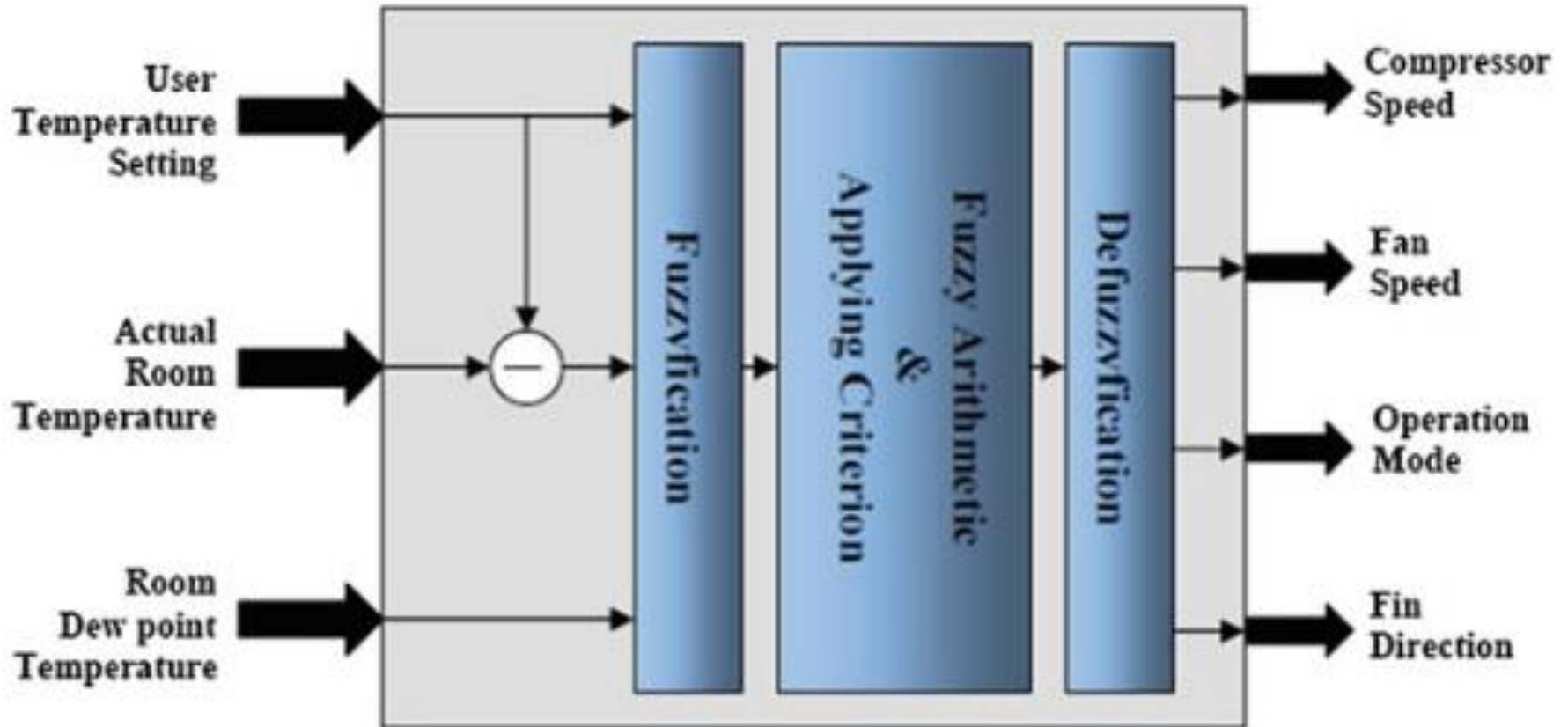
If I tell this controller that I rated:

the service as 9.8, and the quality as 6.5,

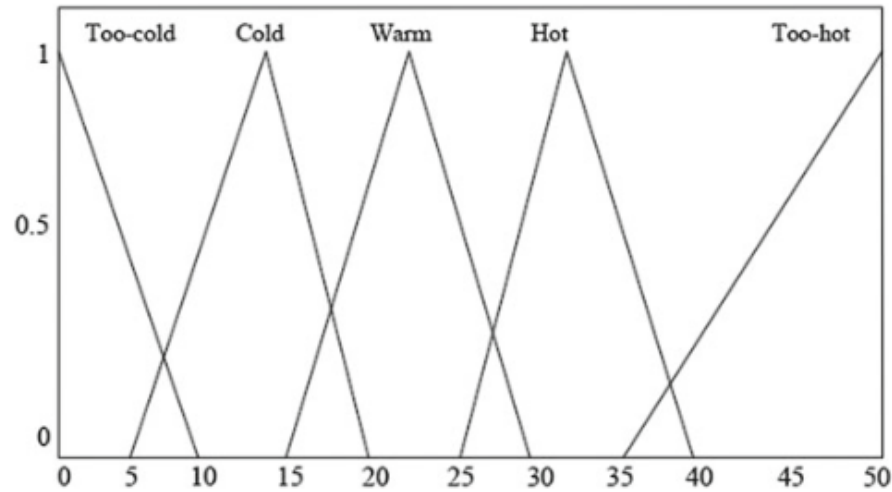
it would recommend I leave:

a 20.2% tip.

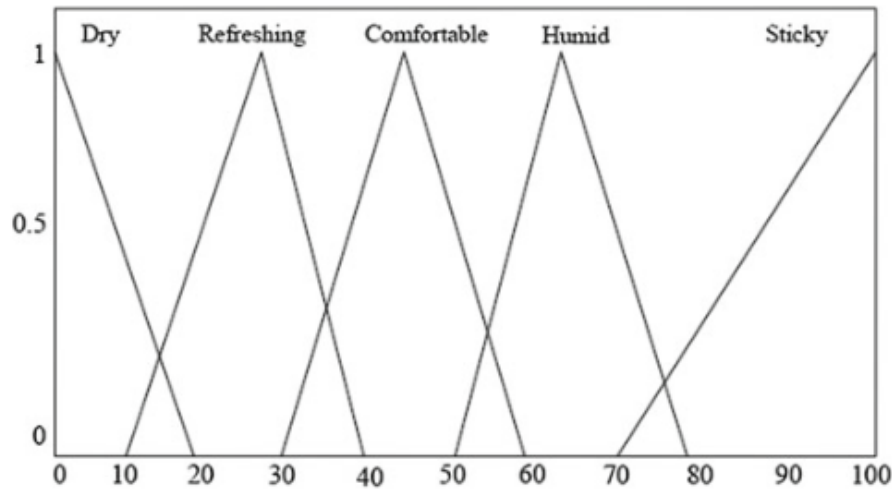
Air Conditioning System with Fuzzy Logic



Air Conditioning System with Fuzzy Logic



Temperature membership functions



Humidity membership functions

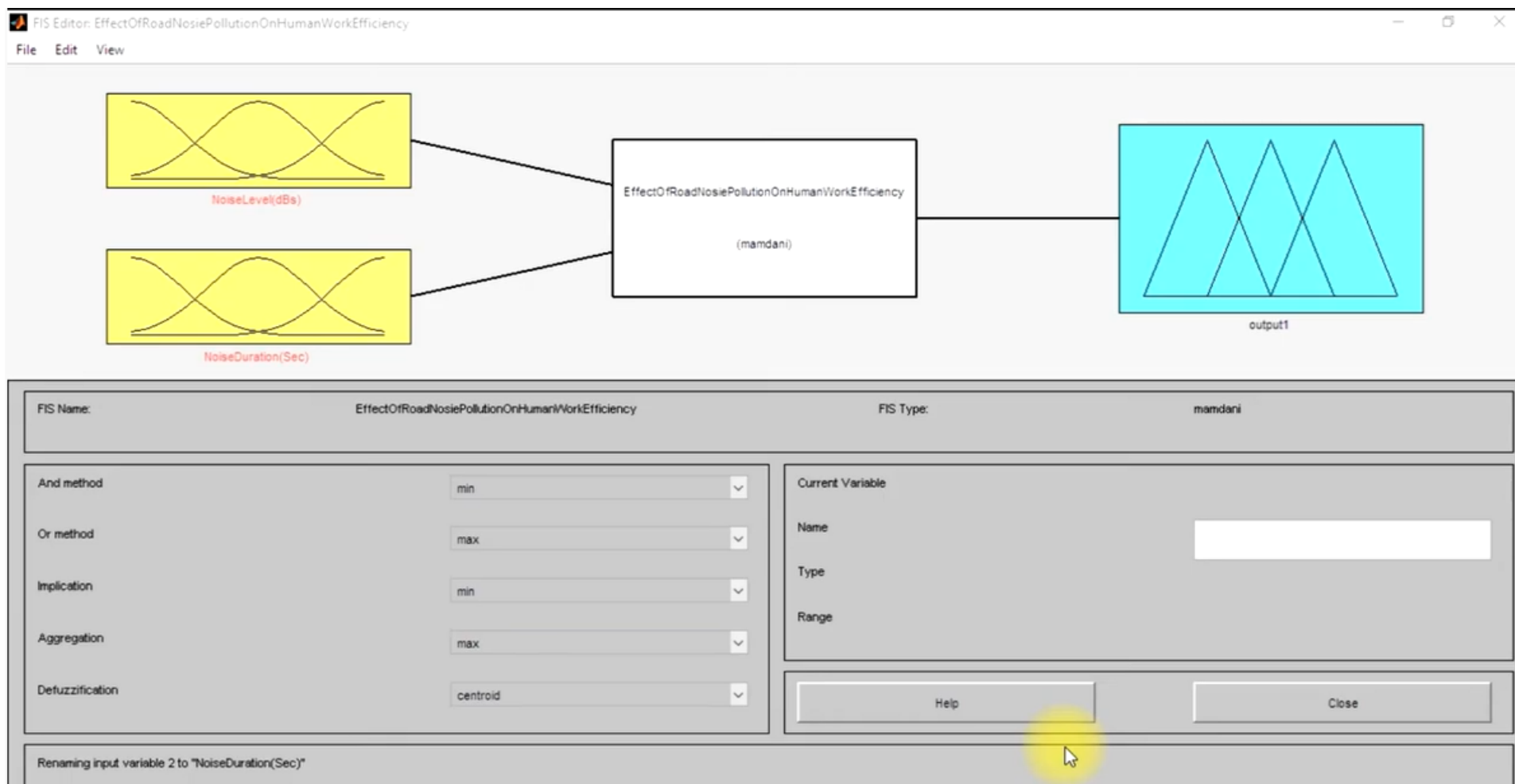
Source: <https://www.guru99.com/what-is-fuzzy-logic.html#10>

Air Conditioning System with Fuzzy Logic

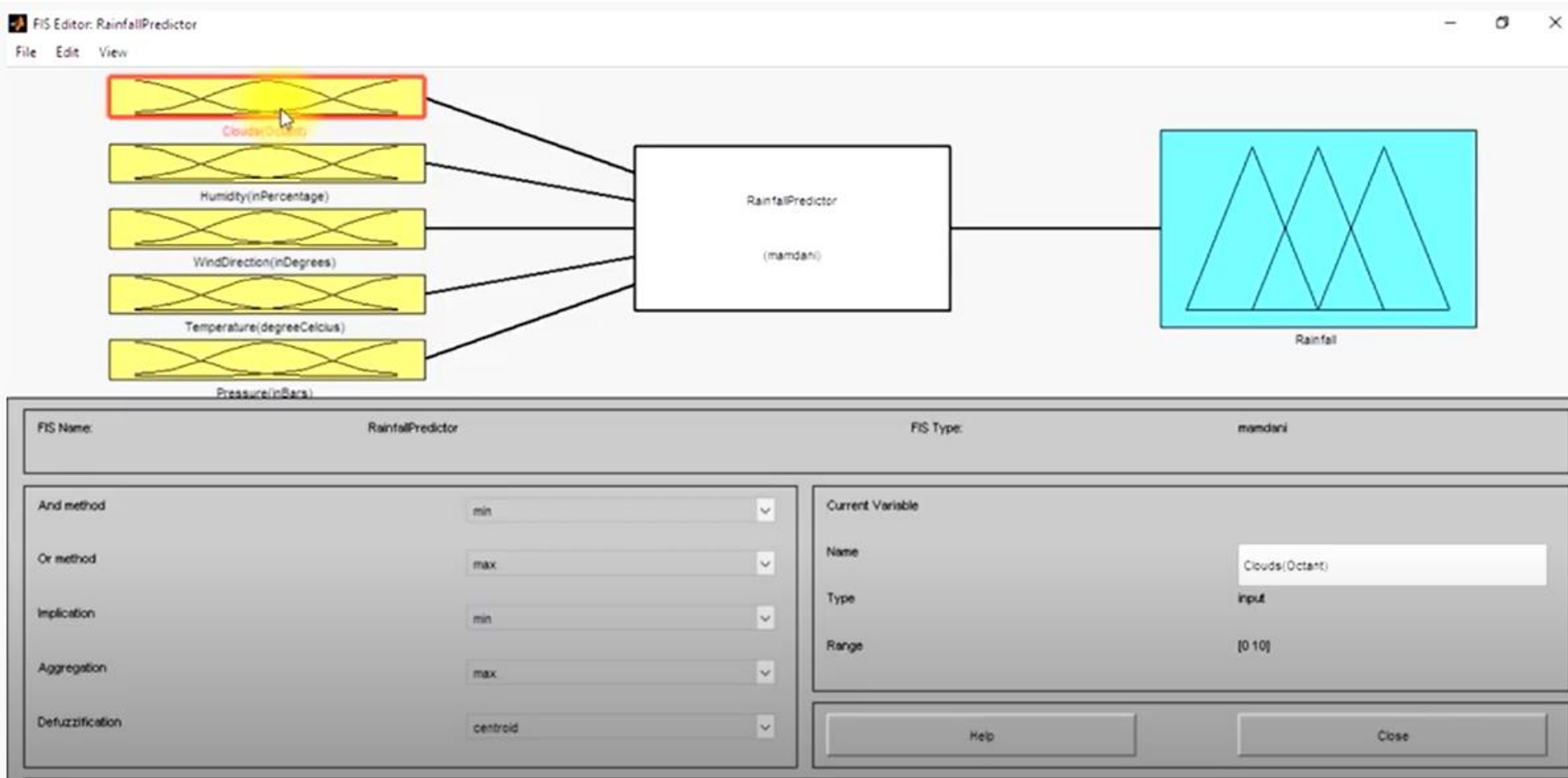
Rules	Input		Output			
	Temperature	Humidity	Compressor speed	Fin direction	Fan speed	Operation mode
1	Too cold	Dry	Off	Away	Off	AC
2	Too cold	Refreshing	Off	Away	Off	AC
3	Too cold	Comfortable	Off	Away	Off	AC
4	Too cold	Humid	Off	Away	Very low	AC
5	Too cold	Sticky	Very low	Towards	Low	Dehumidifier
6	Cold	Dry	Off	Away	Off	AC
7	Cold	Refreshing	Off	Away	Off	AC
8	Cold	Comfortable	Very low	Away	Very low	AC
9	Cold	Humid	Very low	Towards	Low	AC
10	Cold	Sticky	Low	Towards	Low	Dehumidifier
11	Warm	Dry	Very low	Away	Very low	AC
12	Warm	Refreshing	Very low	Away	Very low	AC
13	Warm	Comfortable	Low	Away	Low	AC
14	Warm	Humid	Medium	Towards	Medium	Dehumidifier
15	Warm	Sticky	Medium	Towards	Medium	Dehumidifier
16	Hot	Dry	Low	Away	Low	AC
17	Hot	Refreshing	Medium	Away	Medium	AC
18	Hot	Comfortable	Medium	Towards	Medium	AC
19	Hot	Humid	Fast	Towards	Fast	Dehumidifier
20	Hot	Sticky	Fast	Towards	Fast	Dehumidifier
21	Too hot	Dry	Medium	Away	Medium	AC
22	Too hot	Refreshing	Medium	Towards	Medium	AC
23	Too hot	Comfortable	Fast	Towards	Fast	Dehumidifier
24	Too hot	Humid	Fast	Towards	Fast	Dehumidifier
25	Too hot	Sticky	Fast	Towards	Fast	Dehumidifier

Source: <https://www.guru99.com/what-is-fuzzy-logic.html#10>

Road Noise Pollution Estimation

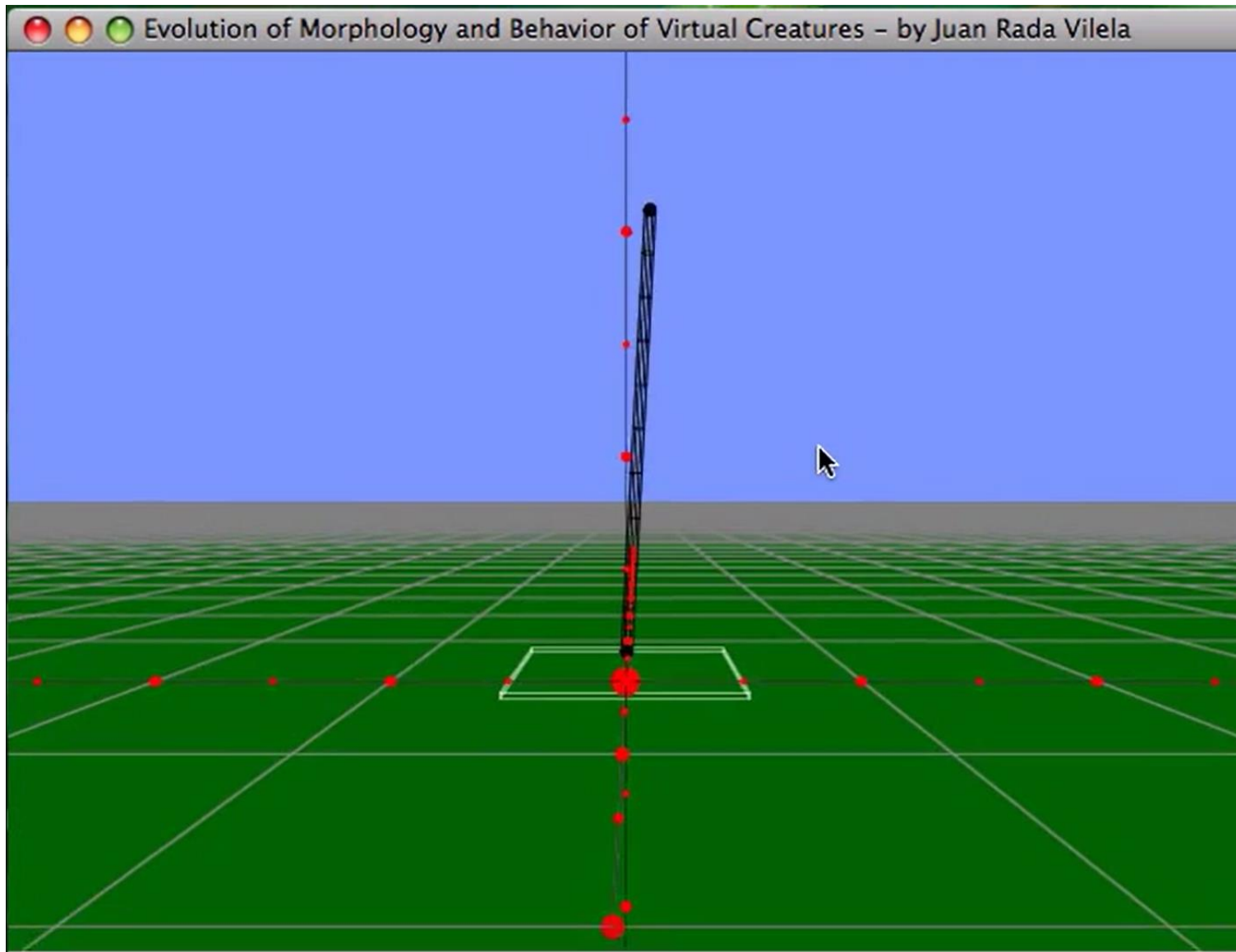


Rainfall prediction



Source: <https://www.youtube.com/watch?v=h-PekWwPR-k>

Fuzzy Logic Controller of 3D Pole Balancing



Source: <http://www.fuzzylite.com/>

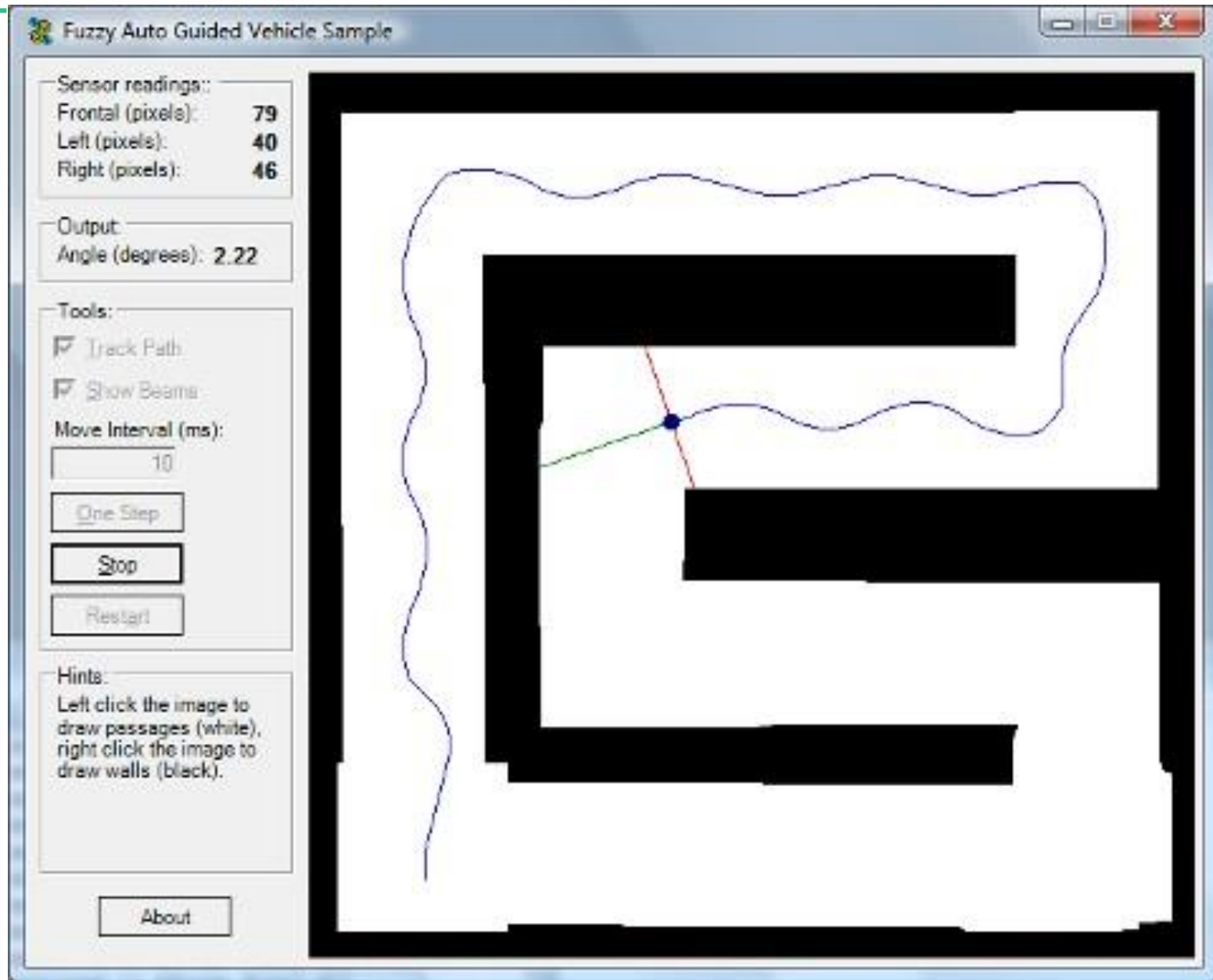
Fuzzy Logic Example

Fuzzy Logic 4-Stage Inverted Pendulum



Source: <https://www.youtube.com/watch?v=zoWsFyhRnE8>

Fuzzy Logic Demo



Fuzzy Logic Example Library

Python

<https://github.com/scikit-fuzzy/scikit-fuzzy>



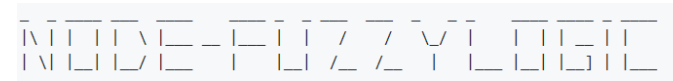
Java

<http://jfuzzylogic.sourceforge.net/html/fcl.html>

jFuzzyLogic

JavaScript:

<https://github.com/sebs/node-fuzzylogic>



C++

<https://fuzzylite.com/cpp/>



C#

http://www.aforgenet.com/framework/samples/fuzzy_sets.html

AForge.NET
FRAMEWORK

Advantages of Fuzzy Logic System

- ❑ The structure of Fuzzy Logic Systems is **easy** and **understandable**
- ❑ Fuzzy logic is **widely used** for commercial and practical purposes
- ❑ It helps you to **control machines** and consumer products
- ❑ It may not offer **accurate reasoning**, but the only **acceptable reasoning**
- ❑ It helps you to deal with the **uncertainty** in engineering
- ❑ Mostly **robust** as **no precise inputs required**
- ❑ It can be programmed to in the situation when **feedback sensor stops working**
- ❑ It can easily be **modified** to improve or **alter** system performance
- ❑ **Inexpensive sensors** can be used which helps you to keep the overall system cost and complexity low
- ❑ It provides a most effective solution to **complex issues**



Advantages of Fuzzy Logic System

- ❑ Fuzzy logic **is not always accurate**, so the results are perceived based on assumption, so it may not be widely accepted.
- ❑ Fuzzy systems **don't have the capability of machine learning** as well as neural network **type pattern recognition**
- ❑ **Validation and verification** of a fuzzy knowledge-based system needs extensive testing with hardware
- ❑ Setting exact, fuzzy rules and, membership functions is a **difficult task**
- ❑ Some fuzzy logic is **confused with probability theory** and the terms



Reading materials

- ❑ <https://web.archive.org/web/20061205114153/http://blog.peltarion.com/2006/10/25/fuzzy-math-part-1-the-theory>
- ❑ <https://www.researchgate.net/publication/278031775> The Basics of Fuzzy Logic A Tutorial Review
- ❑ <https://www.researchgate.net/publication/236157468> Air Conditioning System with Fuzzy Logic and Neuro-Fuzzy Algorithm