# **10. Fuzzy Control based on Equality Relations**

## 10.1

Problem:

Given a set of samples  $(\zeta_1,...,\zeta_n,\eta) \in X_1 \times ... \times X_n \times Y$ What is the corresponding function  $\varphi: X_1 \times ... \times X_n \rightarrow Y$ ?

Idea:

Inputs almost equal to given samples should have almost the same output value. For this equality realions can be used.

The given samples can be interpreted as a set of fuzzy rules  $R_r$ : if  $\zeta_1$  is approximately  $x_1^r$  and ... and  $\zeta_n$  is approximately  $x_n^r$  then  $\eta$  is approximately  $y^r$ .

## Example 10.2

Let  $\phi_0: X_1 \times \ldots \times X_n \rightarrow Y$  be a partial defined function and  $E_1, \ldots, E_n$ , F equality functions on  $X_1, \ldots, X_n$ .

Instead of  $\phi$  the extensional hull of the graph of  $\phi$  is computed based on an equality relation E.

$$E((x_1,...,x_n,y),(x_1',...,x_n',y')) = \min\{E_1(x_1, x_1'),..., E_n(x_n, x_n'), F(y,y')\}$$
$$\mu_{\varphi_0}(x_1',...,x_n',y') = \max_{r \in \{1,...,k\}} \left\{ \min\{E_1(x_1, x_1'),...,E_n(x_n, x_n'), F(y,y')\} \\ E_n(x_n', x_n'), F(y', y'')\} \right\}$$



## Theorem 10.3

- Let  $\mu_{x_1,...,x_n}^{\text{output}}$  a fuzzy set, that is computed by a Mamdami fuzzy controller for a datum  $(x_1,...,x_n)$  with the following knowledge base:
- The partition of a set X<sub>1</sub> is given by the singletons  $\mu_{x_i}^r$  defined by the given data  $x_1^r, \dots, x_n^r$ .
- A fuzzy set  $\mu_{x_0}$  is associated with the linguistic term approximately  $x_0$ .
- The rule basis has the rules  $R_r$ , r=1,...,k. Then (based on the notion of 10.2)  $\mu_{\varphi_0}^{(x_1,...,x_n)} = \mu_{x_1,...,x_n}^{output}$  holds.

# That is: a fuzzy controller based on similarity relations can be interpreted as a Mamdani fuzzy controller.



## **Interpolation Philosophy**

Input (d,d) Output f(d,d)if d and d<sub>i</sub> are similar and d and d<sub>j</sub> are similar then the output of f(d,d) should be similar to  $l_{ij}$ 

## Result

For input (d,d), the output should be  $\mu_{d,d}(l) = \sup_{i,j} \{\min(E_D(d,d_i), E_{\dot{D}}(\dot{d},\dot{d}_j), E_L(l,l_{ij}))\}$ 

where f(d,d) has to be obtained by defuzzification of  $\mu_{d,d}$ **Observation**: Same result as with Mamdani Fuzzy Control, Fuzzy Mandani Control is "interpolation in vague environment".



## **Reinterpretation of Mamdani Control**



### Example 10.4



c) Conclusion













#### **Example 10.7** Automatic Gear Box

VW-gear box with two modes (ECO - SPORT) in series line until 1994
Research issue since 1991: - individual adaptation of set points
- no additional sensoric

Idea: car "watches" driver and classifies driver: calm, normal, sportive (assign sport factor (0,1)) nervous (calm down driver)

Test car: - different drivers, classification by expert (passenger)

simultaneous measurement:
speed, position of accelerator pedal,
speed of accelerator pedal, kick down,
steering wheel angle, ... (14 attributes)



## **Continuously Adapting Gear Shift Schedule in VW New Beetle**





## **Continuously Adapting Gear Shift Schedule: Technical Details**

- Mamdani controller with 7 rules
- Optimized program



■ How to find suitable rules?





## Resources

1. Kruse, Gebhardt, Klawonn, Foundations of Fuzzy systems, Wiley, 1996

2. Schröder, Petersen, Klawonn, Kruse, Two Paradigms of Automotive Fuzzy Logic Applications, in M. Jamshidi et al, Applications of Fuzzy Logic, Prentice Hall 1997

3. Michels, Klawonn, Kruse, Nürnberger Fuzzy Control, Springer, 2002



