

# Fuzzy Set Shape Multi-Objective Optimization Applied on Macroeconomic Research

František Huňka

University of Ostrava

Jarmila Zimmermannová

Moravien University College Olomouc

# Layout

- Introduction
- Language approximation
- Multi-Objective Optimization
- Achieved Results
- Conclusion

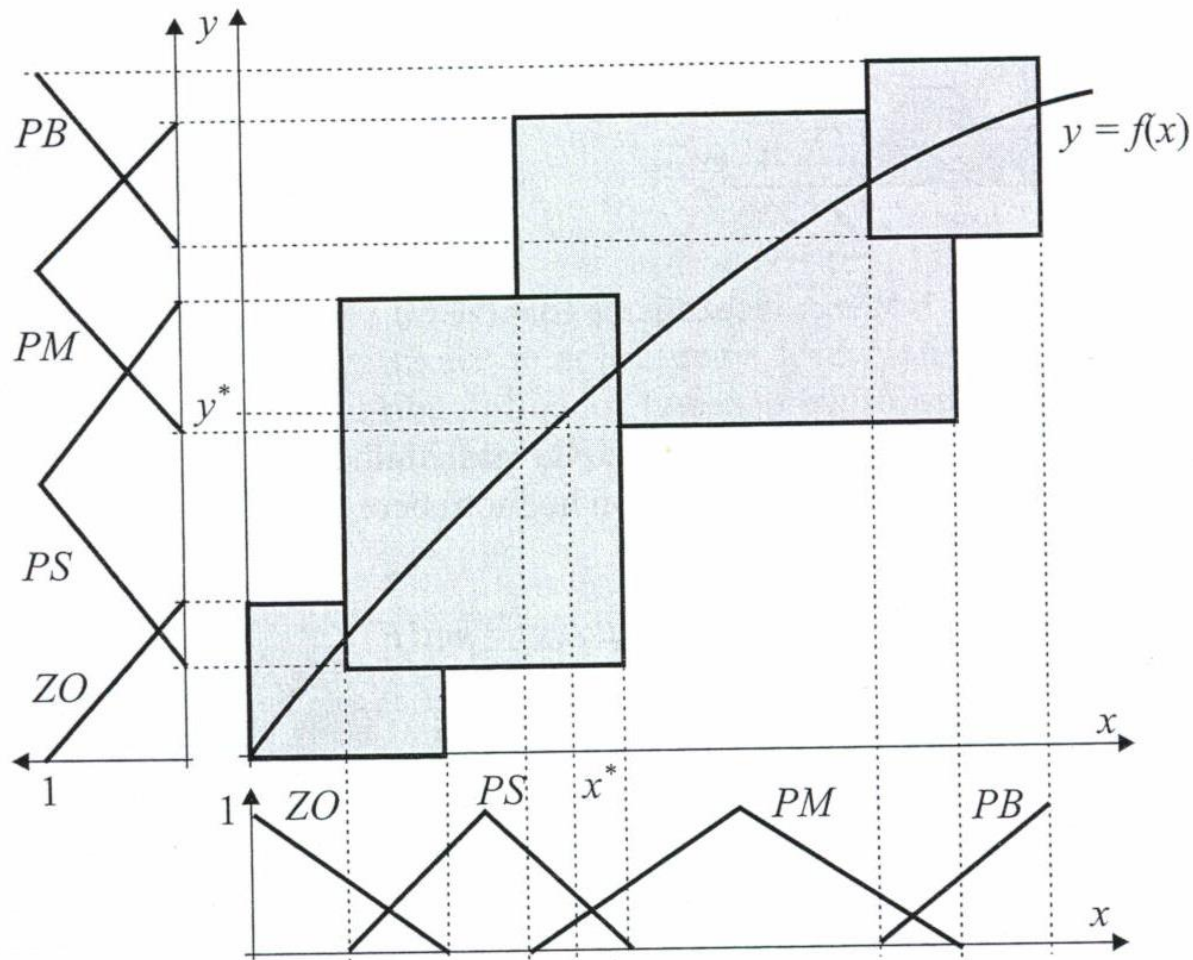
# Introduction

- Economic research of the total **greenhouse gasses emission** in the Czech Republic development and its in relation to **GDP** and **energy intensity of GDP**.
- Fuzzy approximation of these discrete measured values.

# Language Approximation

- A number of approximated methods:
  - least square method, Chebyshev approximation, Fourier series
- Benefits of the approximation:
  - utilizing qualified knowledge of experts
  - local sensitivity for changes due to fuzzy sets

# Language Approximation

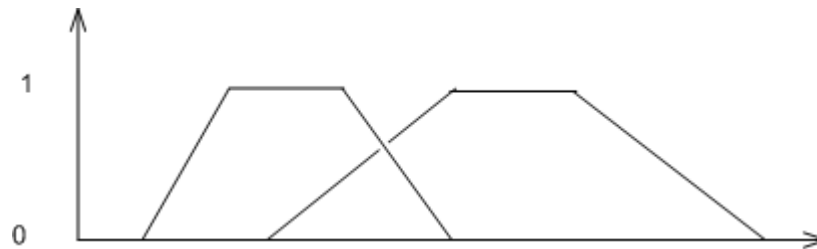


# Multi-Objective Optimization

- Optimization criteria:
  - accuracy
  - interpretability (distinguishability) of fuzzy sets
- Pareto-optimization approach
- **Weighted sum** of objective functions (accuracy, interpretability)
- Normalization

# Multi-Objective Optimization

- Interpretability index:
  - neighboring pairs of fuzzy sets crossing points  $<0,25 - 0,75>$  without penalty
  - otherwise penalty
  - crossing point of not neighboring pairs of fuzzy sets:  $(j - i)^2$



# Rule Base Construction

IF  $X$  is  $A1$  then  $Y$  is  $B1$  AND

IF  $X$  is  $A2$  then  $Y$  is  $B2$  AND

IF  $X$  is  $A3$  then  $Y$  is  $B3$  AND

IF  $X$  is  $A4$  then  $Y$  is  $B4$  AND

IF  $X$  is  $A5$  then  $Y$  is  $B3$  AND

IF  $X$  is  $A6$  then  $Y$  is  $B3$  AND

IF  $X$  is  $A7$  then  $Y$  is  $B3$  AND

IF  $X$  is  $A8$  then  $Y$  is  $B3$  AND

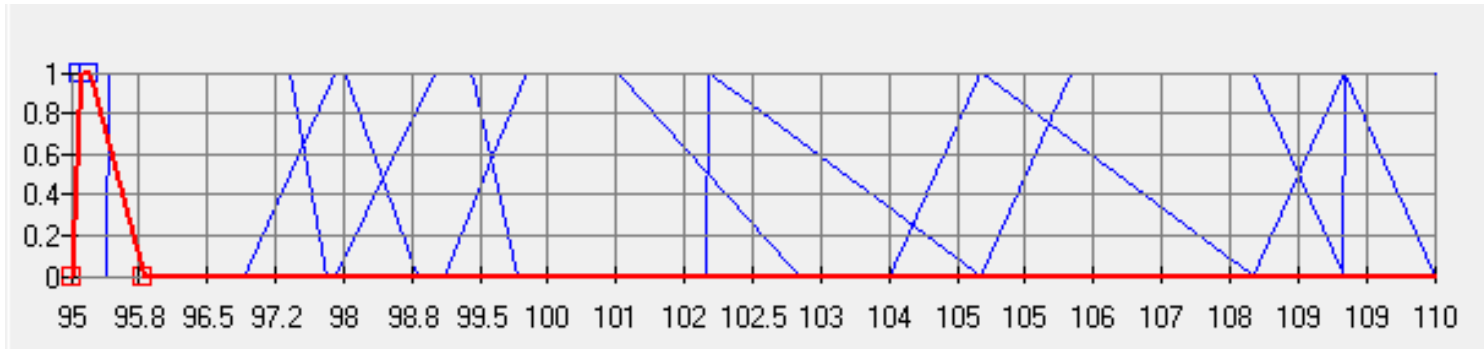
IF  $X$  is  $A9$  then  $Y$  is  $B4$  AND

IF  $X$  is  $A10$  then  $Y$  is  $B5$

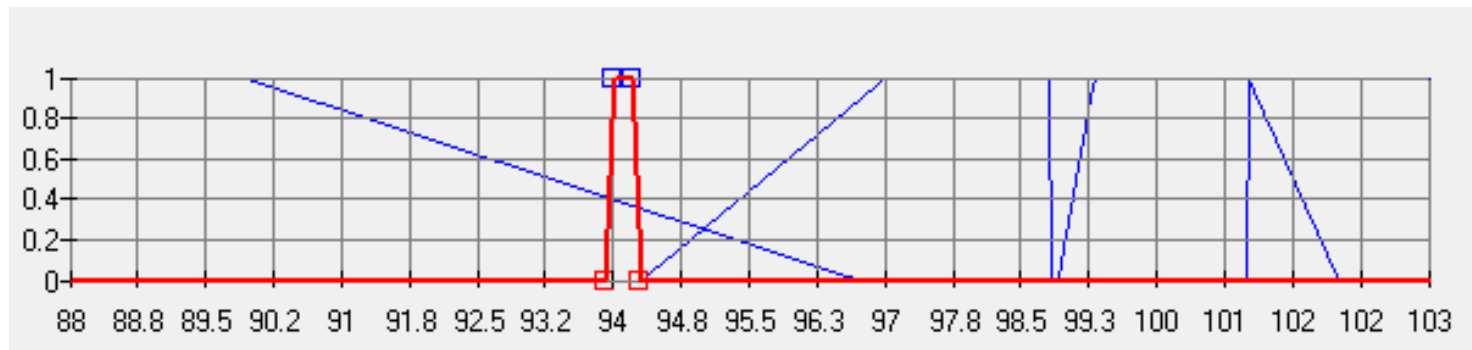
- Weighted sum of objective functions: 0,3 – accuracy; 0,7 - interpretability



# Achieved Results

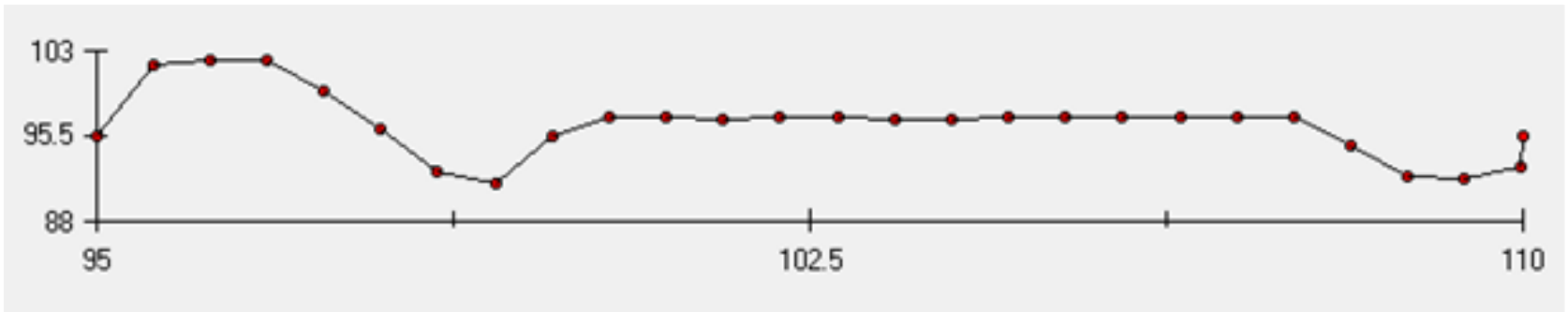


Antecedent axis of the total greenhouses emission after optimization



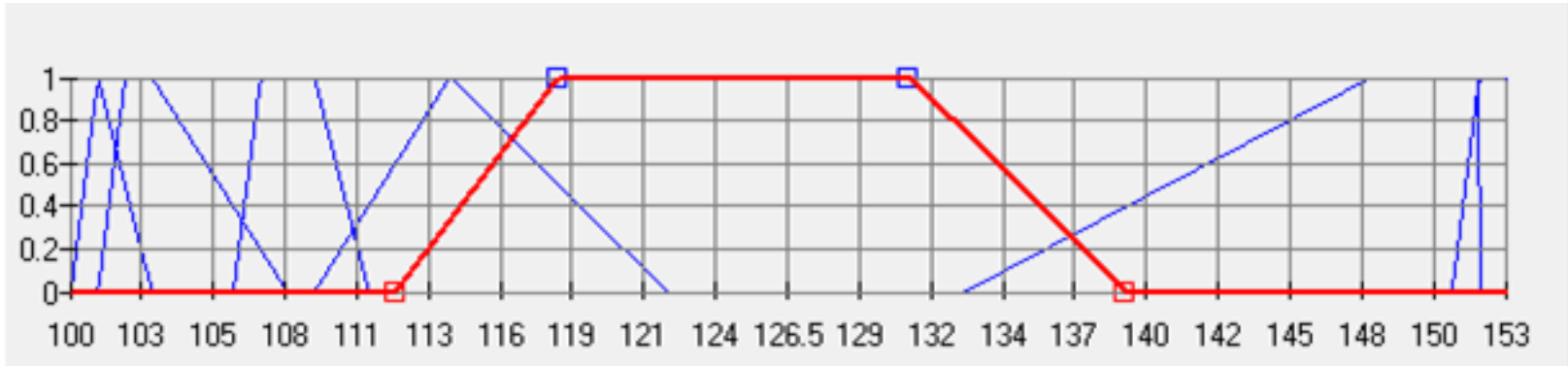
Consequent axis of the total greenhouse gasses after optimization

# Achieved Results

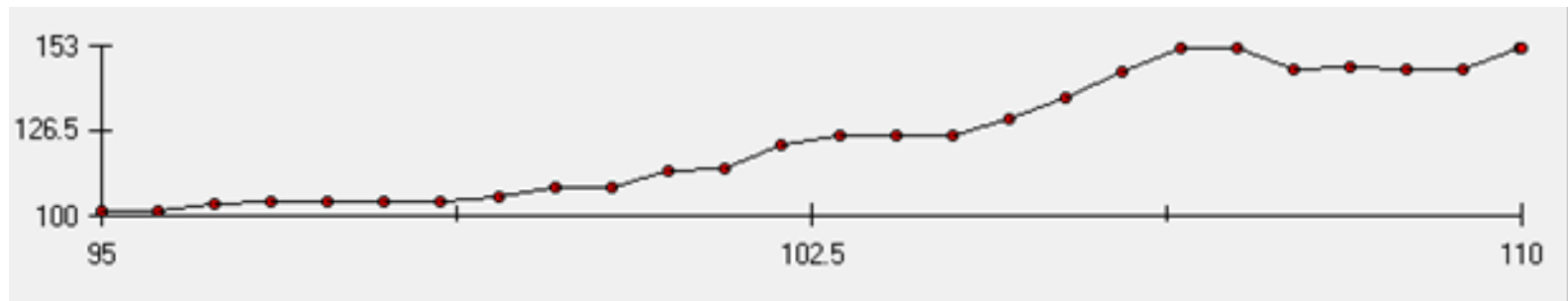


A course of approximated function representing total greenhouse gasses emissions

# Achieved Results



Consequent axis of GDP after optimization



A course of approximated function representing the development of GDP

# Conclusion

- Language approximation proves to be **sensitive to local changes** owing to classical approaches.
- Weighted sum of objective functions proved to be suitable approach to optimization.
- Achieved results are promising for future research.