

FUNDAMENTALS OF ENERGY MANAGEMENT DEVELOPMENT AS PART OF HYBRID AND ELECTRIC VEHICLE RESEARCH IN THE VEHICLE TECHNOLOGY DEPARTMENT OF KECSKEMET COLLEGE

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Basic research for the development of hybrid and electric vehicles

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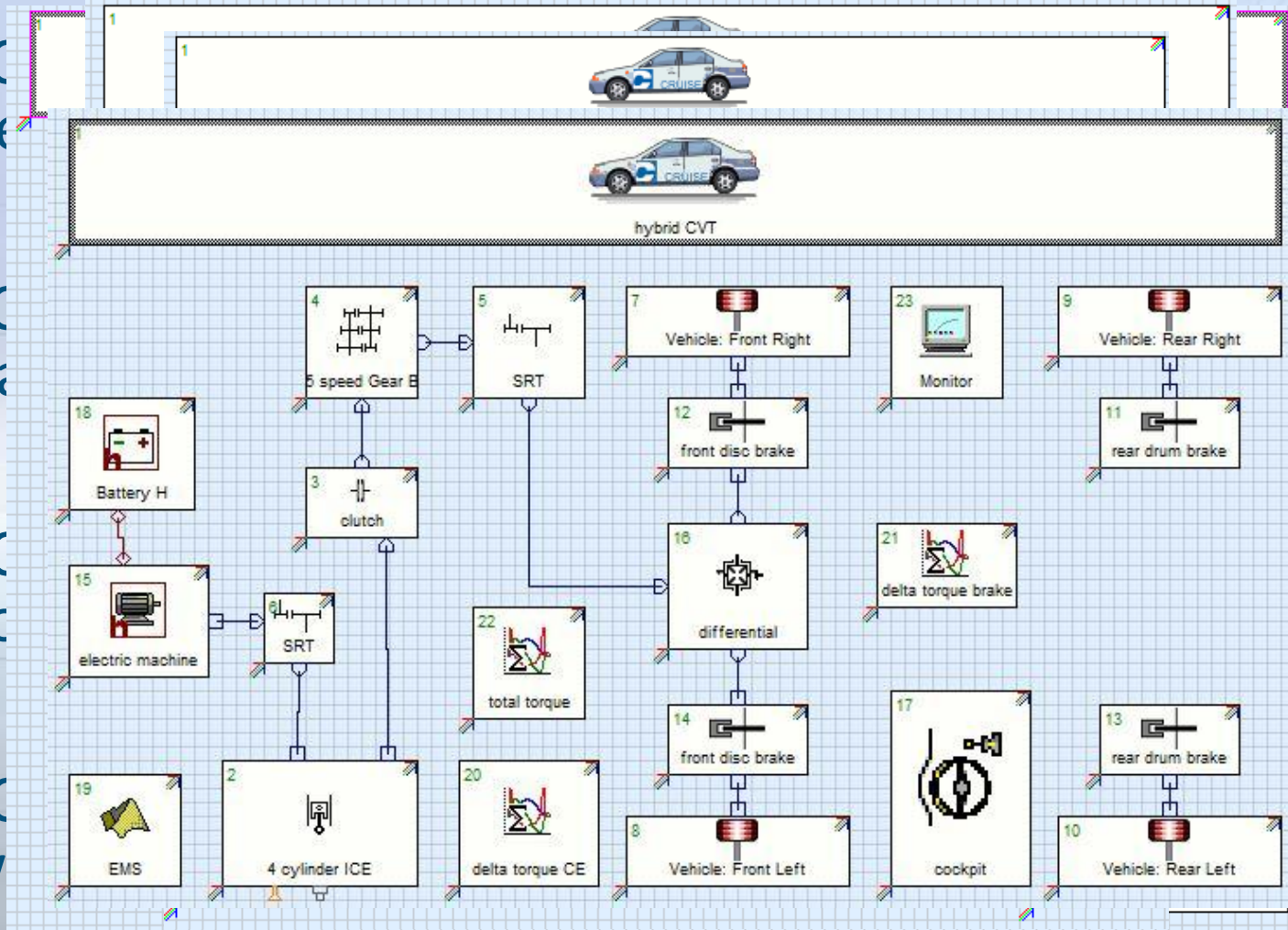
Project Overview

1. Project Planning
2. Vehicle specification, hybrid drive-train concept
3. Analysis of hybrid drive-train concepts, concept decision
4. Detailed analysis of hybrid drive-train
5. Research on energy-management
6. Comparison of developed controllers
7. Research on predictive algorithms on energy-management
8. Project finish

HYBRID CONCEPTS

The analyzed Concepts – AVL CRUISE environment

- „C... be...“
- „C... R...“
- „C... C...“
- „C... W...“



as

e

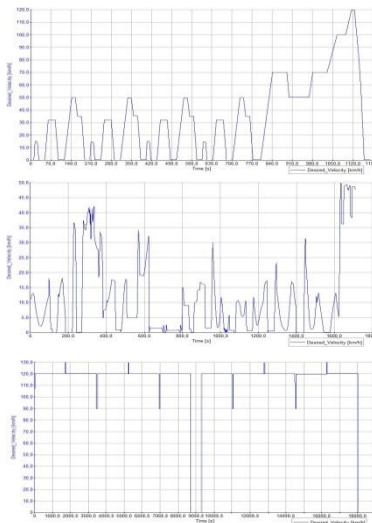
Choosing the best concept – decision matrix

Subjective Properties

Average weighted sum of:	C0	C1	C2	C3
- cost properties	30	33	27	25
- complexity properties	16	19	5	15
- weight properties	4	3	2	4
- flexibility properties	2	4	1	2
- dynamic properties	3	12	9	3
- comfort properties	26	14	25	25
Total Weighted Sum	93	92	71	83

Objective Properties

		Concepts						
		Properties	Weight	C0	C1	C2	C3	
Objective Properties	NEDC	Electric consumption	2	4	1	2	3	
		Fossil fuel consumption	2	1	4	3	2	
		CO Emission	2	3	4	2	1	
		HC Emission	2	2	4	3	1	
		NO _x Emission	2	1	4	3	2	
	Weighted sum of NEDC			22	34	26	18	
	C	HTDC	Electric consumption	4	4	1	2	3
			Fossil fuel consumption	4	1	4	3	2
			CO Emission	4	3	4	2	1
			HC Emission	4	3	4	2	1
NO _x Emission			4	2	4	3	1	
Weighted sum of HTDC			52	68	48	32		
LDDC	LDDC	Electric consumption	1	4	2	1	3	
		Fossil fuel consumption	1	4	1	3	2	
		CO Emission	1	4	1	2	3	
		HC Emission	1	3	4	1	2	
		NO _x Emission	1	3	4	1	2	
Weighted sum of LDDC			18	12	8	12		
Total weighted Sum:			92	114	82	62		



		Concept 0	Concept 1	Concept 2	Concept 3
NEDC	IM	5,16 [kWh]	IM 0,00 [kWh]	IM 6,41 [kWh]	IM 3,95 [kWh]
	EM	0,00 [kWh]	EM 0,97 [kWh]	EM 0,46 [kWh]	EM 0,03 [kWh]
	ZE	5,16 [kWh]	ZE 0,97 [kWh]	ZE 6,87 [kWh]	ZE 3,98 [kWh]
	NOx	0,04 [g]	NOx 0,0001 [g]	NOx 0,11 [g]	NOx 0,04 [g]
	CO	0,13 [g]	CO 0,0002 [g]	CO 0,27 [g]	CO 0,09 [g]
HC	0,02 [g]	HC 0,0001 [g]	HC 0,04 [g]	HC 0,01 [g]	
HTDC	IM	5,12 [kWh]	IM 0,00 [kWh]	IM 1,32 [kWh]	IM 4,07 [kWh]
	EM	0,00 [kWh]	EM 0,31 [kWh]	EM 0,19 [kWh]	EM 0,03 [kWh]
	ZE	5,12 [kWh]	ZE 0,31 [kWh]	ZE 1,51 [kWh]	ZE 4,1 [kWh]
	NOx	0,01 [g]	NOx 0,0009 [g]	NOx 0,01 [g]	NOx 0,027 [g]
	CO	0,10 [g]	CO 0,0021 [g]	CO 0,02 [g]	CO 0,068 [g]
HC	0,02 [g]	HC 0,0011 [g]	HC 0,00 [g]	HC 0,008 [g]	
LDDC	IM	231,79 [kWh]	IM 500,14 [kWh]	IM 714,78 [kWh]	IM 431,69 [kWh]
	EM	0,00 [kWh]	EM 0,29 [kWh]	EM 0,55 [kWh]	EM 0,03 [kWh]
	ZE	231,79 [kWh]	ZE 500,43 [kWh]	ZE 715,33 [kWh]	ZE 431,72 [kWh]
	NOx	4,37 [g]	NOx 3,92 [g]	NOx 7,39 [g]	NOx 5,03 [g]
	CO	7,36 [g]	CO 22,52 [g]	CO 19,86 [g]	CO 7,99 [g]
HC	0,92 [g]	HC 0,87 [g]	HC 1,48 [g]	HC 0,95 [g]	

CONCEPT ANALYSIS

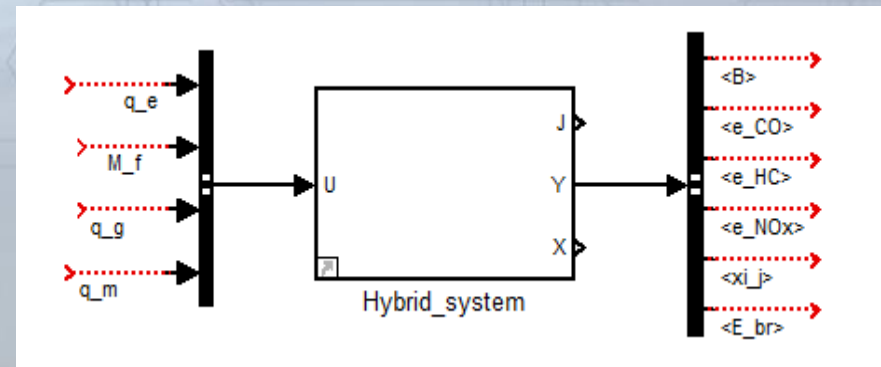
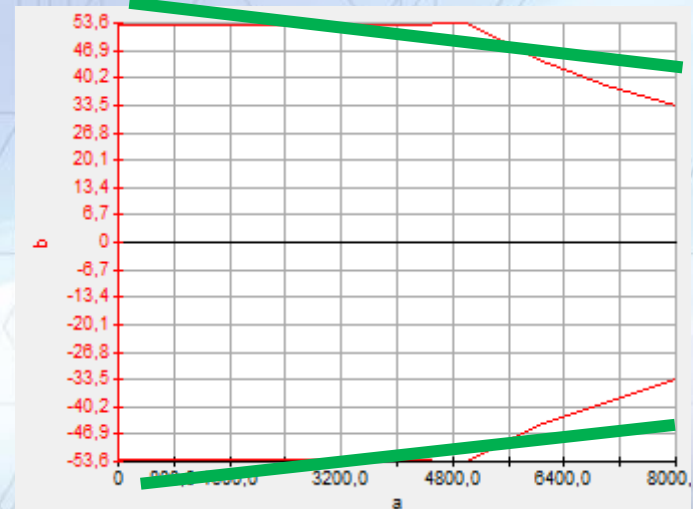
Simplified model, Validation

Simplified model

- The chosen concept was deeper analyzed
 - AVL CRUISE environment
 - Sensitivity study
 - More test cycles
- Also for controller design a simplified model was created

Simplified model in Simulink

- Linear characteristics,
- Input – power demand (q_e, q_m, q_g)
- States - Vehicle speed, Battery SOC, RE rpm
- Output – Fossile/Electr. consumption, emissions, vehicle acceleration
- Simulink environment



Simplified model in Simulink

$$v_j = k \cdot \int \frac{M_e - M_l}{\hat{\Theta}} dt$$

$$\omega_{mg} = \int \frac{M_m - M_g - M_v}{\Theta_{mg}} dt$$

$$E_b = E_{b0} + \int P_g \cdot dt - \int P_e \cdot dt$$

$$M_e = \min \left(M_e^{max} \cdot q_e \cdot \left(1 - a \cdot \frac{v_j}{k} \right), \frac{U_e \cdot I_e^{lim} \cdot k}{v_j} \right)$$

$$M_l = \frac{C \cdot v_j^2}{k} + \frac{D \cdot v_j}{k} + M_{l0} + M_f$$

$$M_m = q_m \cdot M_m^{max}$$

$$M_g = M_g^{max} \cdot q_g \cdot (1 - b \cdot \omega_{mg})$$

$$M_v = d \cdot \omega_{mg} + M_{v0}$$

$$P_e = I_e \cdot U_e \quad I_e = \min \left(\left(\frac{M_e \cdot v_j}{U_e \cdot k} \right), I_e^{lim} \right)$$

$$P_g = I_g \cdot U_e$$

$$I_e^{lim} = I_g + I_b^{max}$$

$$I_g = \frac{M_g}{U_e} \cdot \omega_{mg}$$

$$I_b^{max} = R \cdot E_b$$

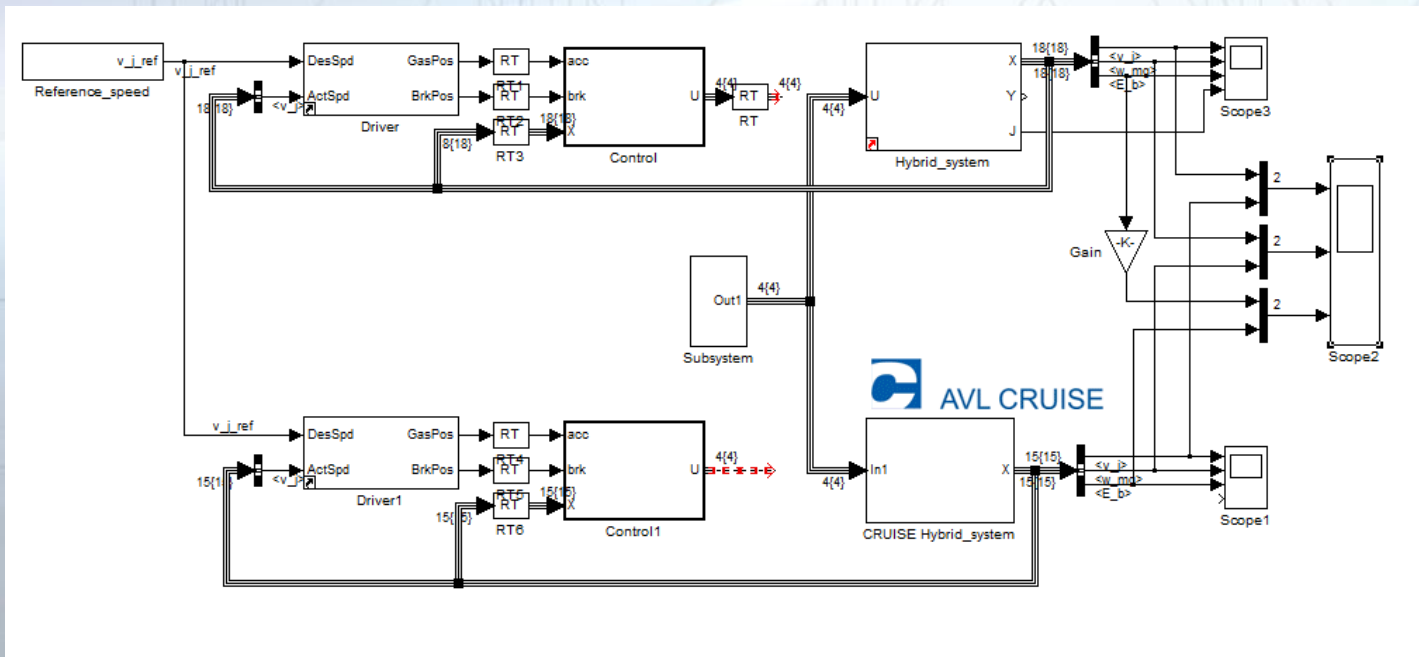
$$\mathbf{u} = [q_e \quad q_m \quad q_g]$$

$$\mathbf{x} = [v_j \quad \omega_{mg} \quad E_b]$$

$$\mathbf{y} = [B \quad e_{CO} \quad e_{HC} \quad e_{NOx} \quad \xi_j \quad E_{br}]$$

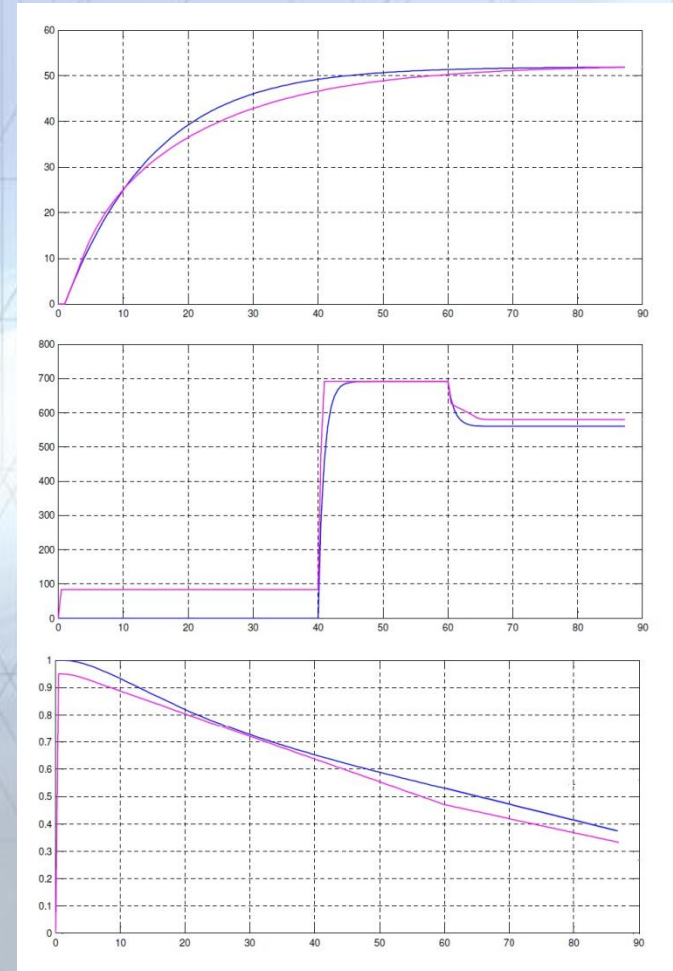
Simplified model in Simulink

- The simplified model was compared to the more detailed one created in CRUISE
- For the comparison, the CRUISE and Simulink environments had to be merged.



Simplified model in Simulink

- Comparing the behavior of the two models
 - Vehicle speed
 - RE rpm
 - Battery SOC
- The simplified model follows the CRUISE model within the allowed error



ENERGY MANAGEMENT STRATEGIES

Energy Management controllers

- 4 Controller logics are investigated that are based on
 - Neural networks
 - Fuzzy logic rules
 - Genetic algorithms
 - State machine
- To compare the performance of the different controllers a „Cost function” had to be created

The cost function

- It has to be formed such as
 - Smaller value is better
 - It punishes the high value of
 - Emissions, fossil fuel consumption
 - Electric energy consumption
 - Lack of dynamics

Cost function

- The chosen cost function is basically an integral average:

$$J = \frac{1}{T} \int \sqrt{f_1 \cdot \left(\frac{B}{B^{\max}} \right)^2 + f_2 \cdot \left(\frac{e_{CO}}{e_{CO}^{\max}} \right)^2 + f_3 \cdot \left(\frac{e_{HC}}{e_{HC}^{\max}} \right)^2 + f_4 \cdot \left(\frac{e_{NOx}}{e_{NOx}^{\max}} \right)^2 + f_5 \cdot \left(\frac{\xi_j}{\xi_j^{\max}} \right)^2 + f_6 \cdot \left(\frac{E_{br}}{E_{br}^{\max}} \right)^2} dt$$

- Where:
 - f_i – weighting constants, /sum(f_i)=1/
 - B – Fossil fuel consumption
 - $e_{CO,HC,NOx}$ – Emission values
 - ξ – Vehicle dynamic behavior error
 - E_{br} – Electric energy consumption
- $^{\max}$ – the maximum possible value of the given variable

ENERGY MANAGEMENT — NEURAL NETWORKS

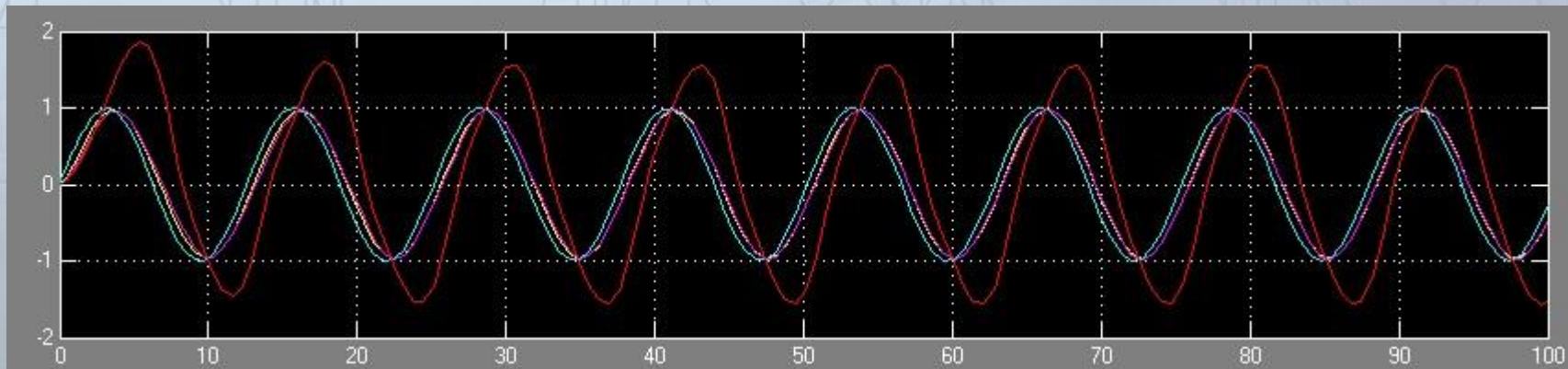
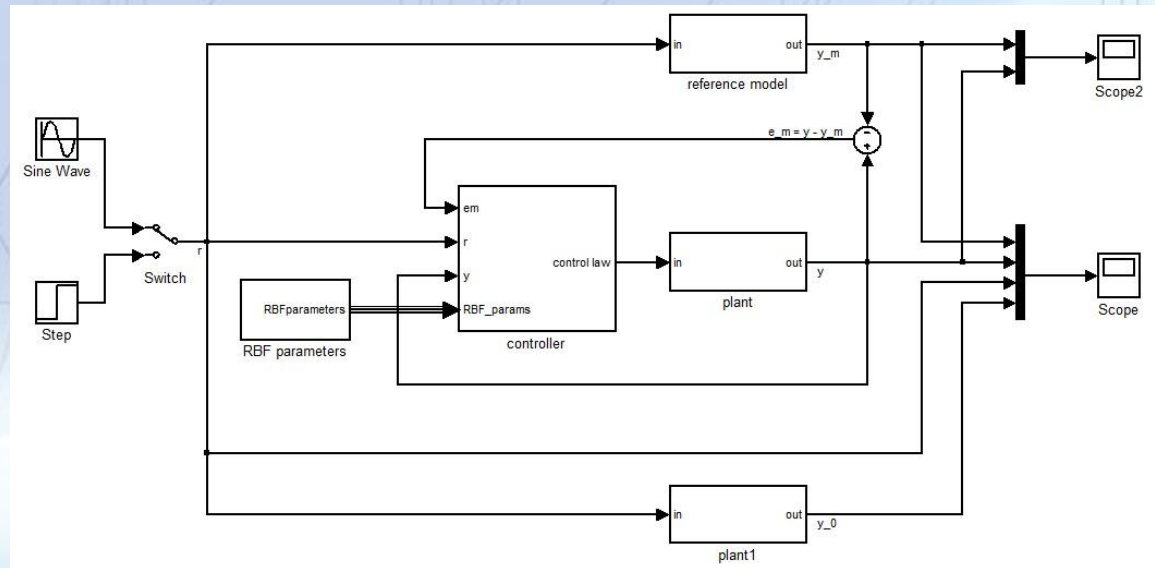
Dr. István Pintér

Neural Network Background

- NN are widely used for handling nonlinearities in physical systems.
 - Keeping an ICE air/fuel rate at optimum level
 - Minimize fuel consumption at a given battery SOC level
- In control, they can be used for reference model following. This model can be created
 - By learning of the NN
 - By experts, using technical knowledge
- In our case
 - The used NN method is, Radial Base Function (RBF) method
 - The reference model is given by expert

Using Neural Network for Energy management

- RBF-MRAC controller implementation in MATLAB-ban, 4th Runge-Kutta
- MATLAB/Simulink block



Using Neural Network for Energy management

- The RBF method with expert created reference model has great advantages but also there are some challenges too
 - No good support in Simulink environment,
 - Small number of MIMO system usecases
 - It's performance greatly depend on the reference model

ENERGY MANAGEMENT — GENETIC ALGORITHM

Dr. Norbert Csík

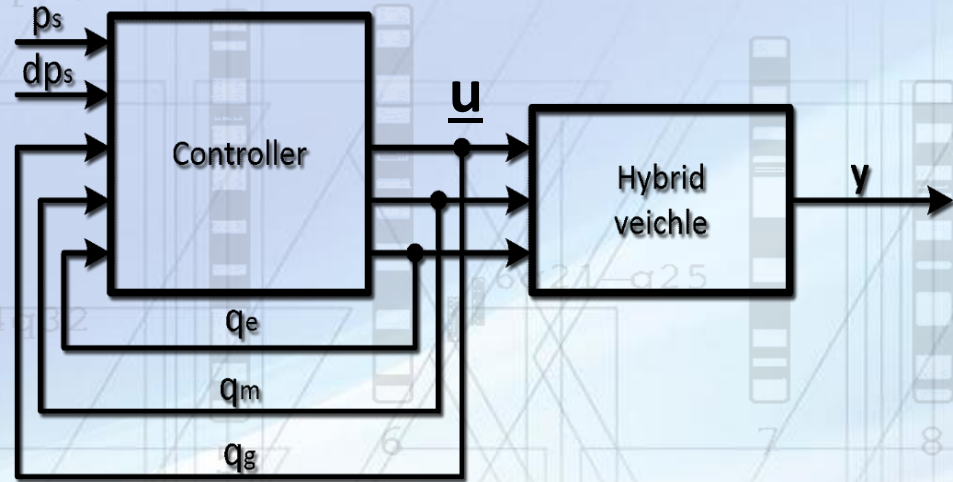
Using evolution algorithm for Energy management

- Advantages
 - Robust searching features
 - Pre-knowledge from the problem is not needed
 - Efficient working in extreme cases (deficient, infinite, discrete searching space, etc.)
 - It is able to give a set of solutions
- Disadvantages
 - Search for global optima
 - The speed of evolution cycle depends on problem-oriented calculations
 - It gives just an approximation, without terminating conditions there is no final state.
 - Usually for efficient working hybridization needed.
 - Choosing suitable polymorphic chromosome structure usually hard

Chromosome design

Input (\underline{x}) is:

The control output signals (\underline{u}), the state of pedal (p_s) and the signed changing state of pedal (dps).



The control outputs are derived from the power-products of input signals. The parameters of this approximation produce the matrix of chromosome.

$$u_{i=1,2,3} = \sum_{j=1}^N \left(A_{j0} \cdot \prod_{k=0}^4 (x_{jk} - B_{jk})^{C_{jk}} \right)$$

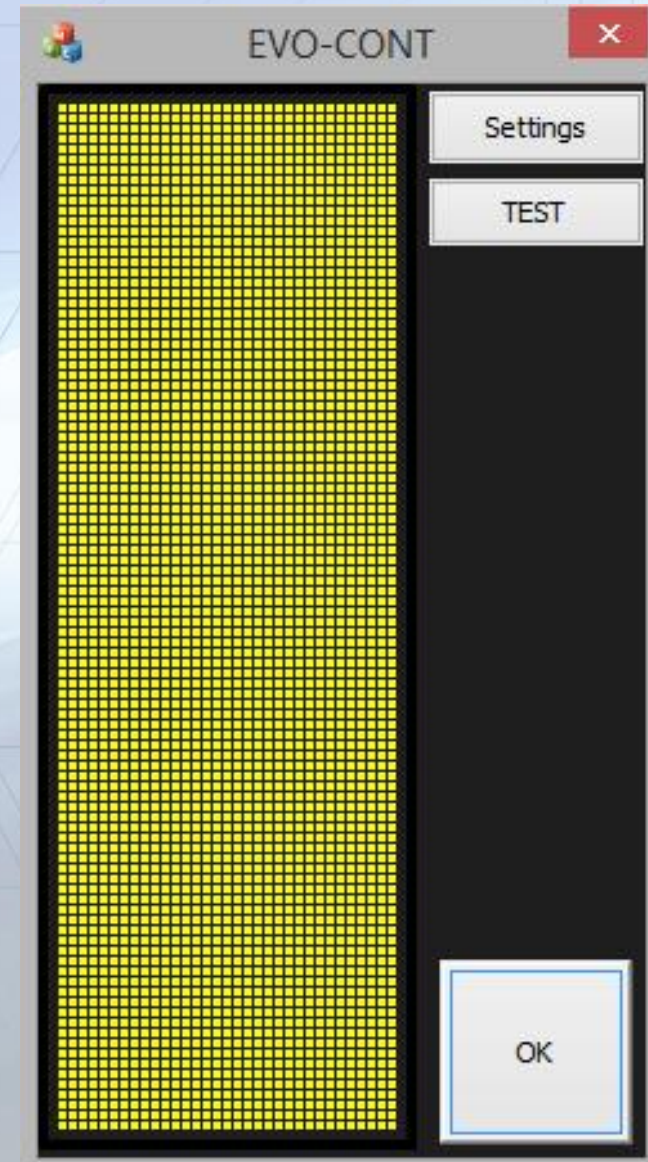
A_{00}	B_{00}	C_{00}	B_{04}	C_{04}
A_{10}	B_{10}	C_{10}	B_{14}	C_{14}
⋮	⋮	⋮	⋮	⋮	⋮
A_{N0}	B_{N0}	C_{N0}	B_{N4}	C_{N4}

Other features

- Visual C/C++ MFC technology
- Simple GUI
- One lifestage, one population, 12 entity
- Self-controlling inner mechanism:
 - Using predisposition in chromosomes
 - Terminating conditions based on the age of the best entity

Expectations

- Robust searching features
- Avoidance of early convergence
- Strong evolution rate
- Stop after 10^5 - 10^6 step near optimum

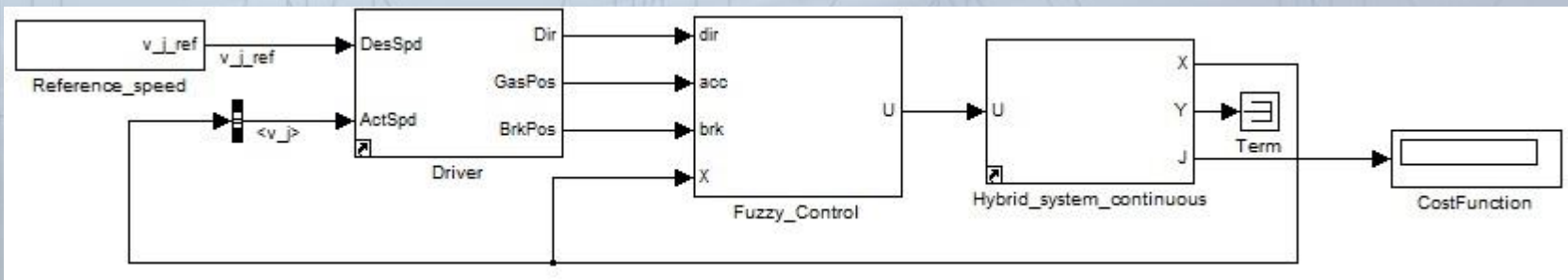


ENERGY MANAGEMENT — FUZZY LOGIC

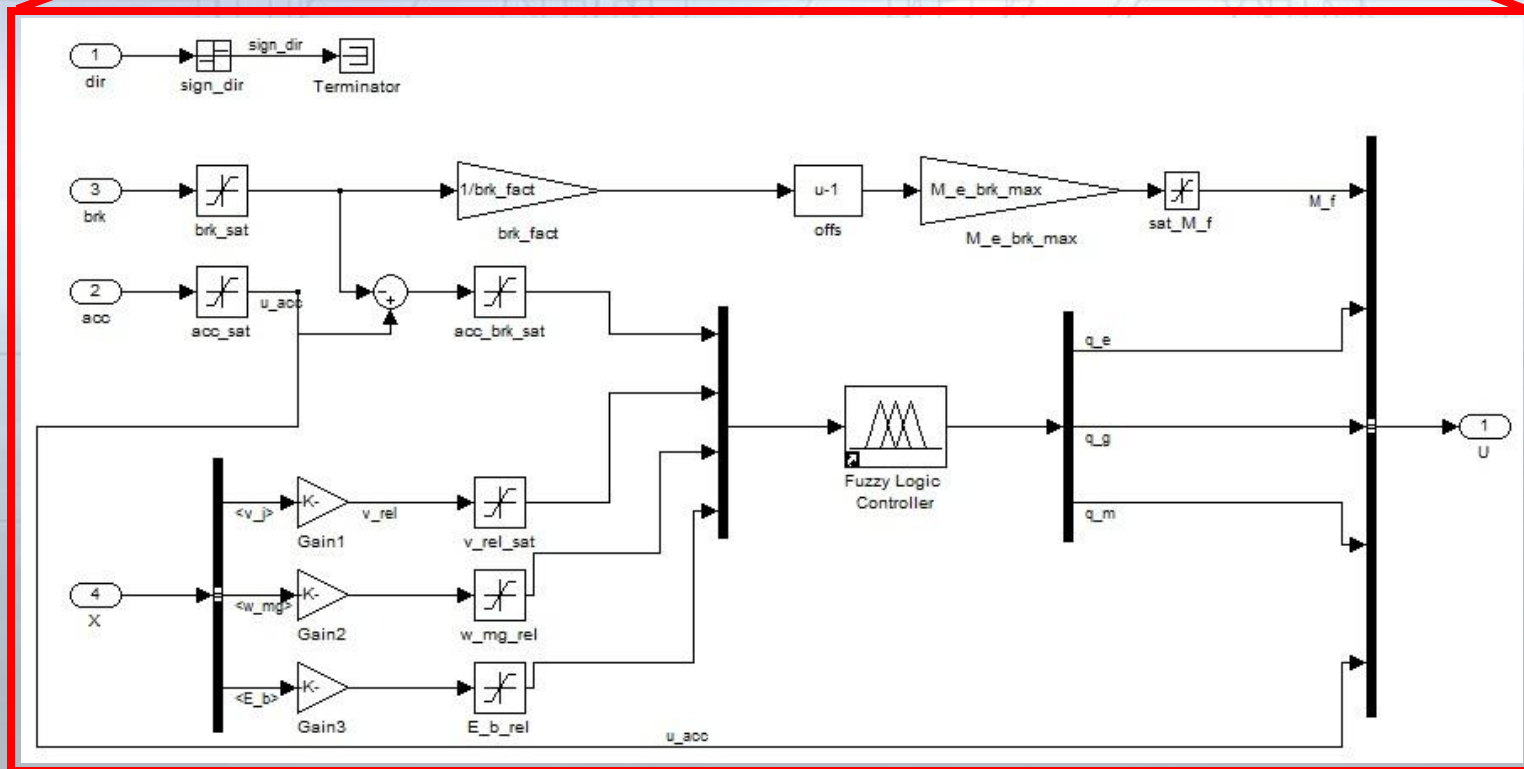
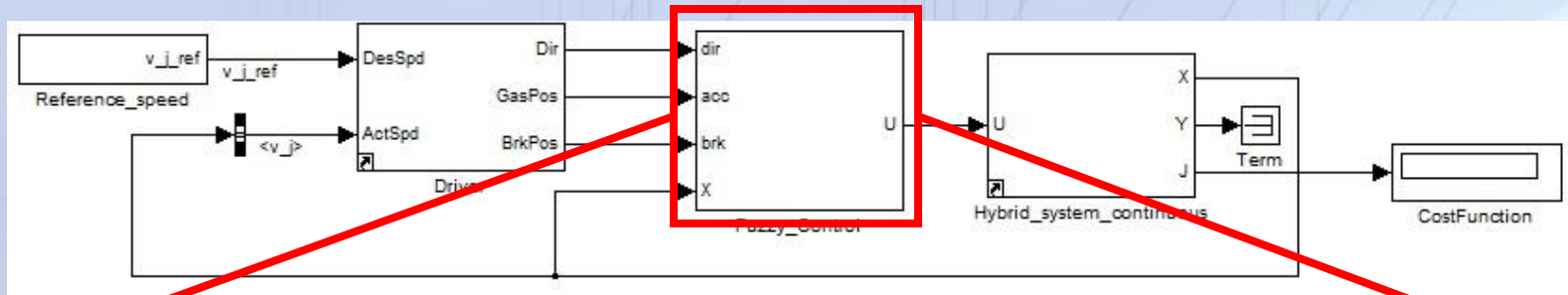
Dr. Zsolt Csaba Johanyák

Fuzzy logic based energy management control of hybrid vehicle

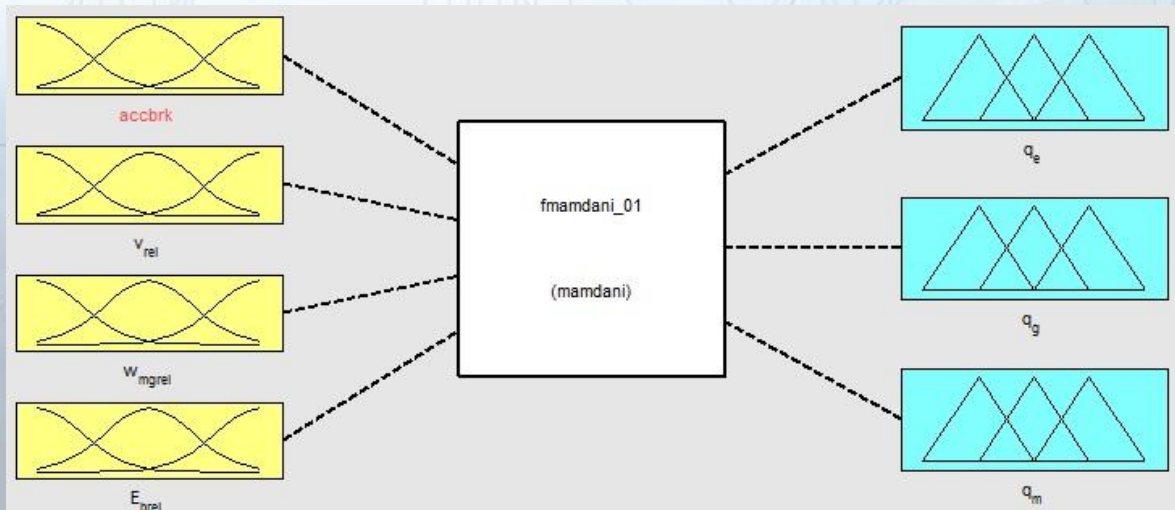
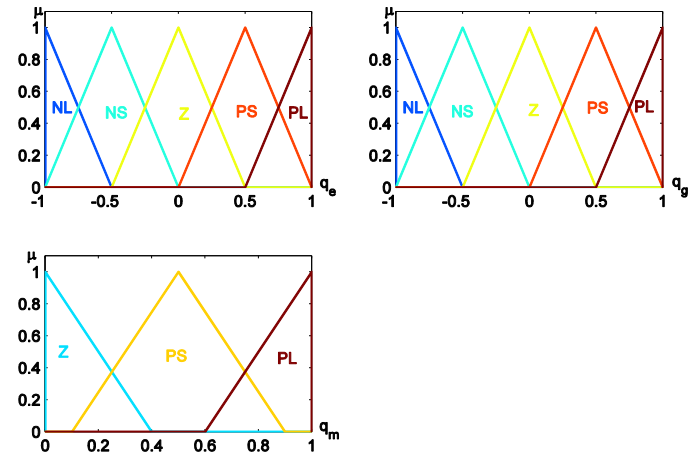
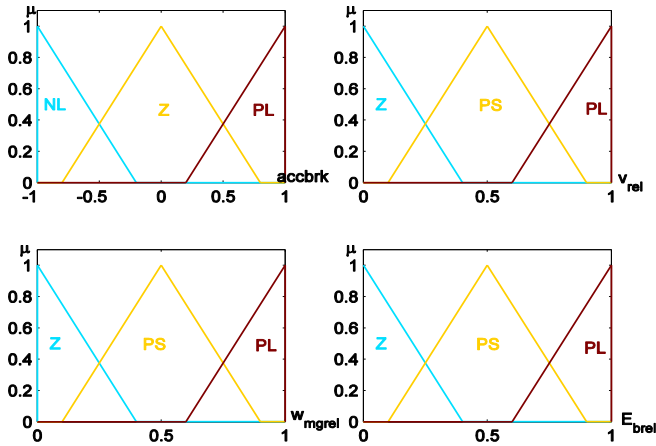
- Inputs and outputs
- Preprocessing operations
- Postprocessing operations
- Operational characteristics of the fuzzy system
- Input and output membership functions
- Initial (rough) rule base
- Performance evaluation
- Tuning of the fuzzy system's parameters



Using Fuzzy logic algorithm for Energy management



Antecedent and consequent partitions



Initial Rule base

- 81 rules

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37. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is Z) and (E_{bre} is Z) then (q_e is Z)(q_g is PL)(q_m is PL) (1)
38. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is Z) and (E_{bre} is PS) then (q_e is PS)(q_g is Z)(q_m is Z) (1)
39. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is Z) and (E_{bre} is PL) then (q_e is PS)(q_g is Z)(q_m is Z) (1)
40. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is PS) and (E_{bre} is Z) then (q_e is Z)(q_g is PL)(q_m is PL) (1)
41. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is PS) and (E_{bre} is PS) then (q_e is PS)(q_g is Z)(q_m is Z) (1)
42. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is PS) and (E_{bre} is PL) then (q_e is PS)(q_g is Z)(q_m is Z) (1)
43. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is PL) and (E_{bre} is Z) then (q_e is Z)(q_g is PL)(q_m is PL) (1)
44. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is PL) and (E_{bre} is PS) then (q_e is PS)(q_g is Z)(q_m is Z) (1)
45. If (accbrk is PL) and (v_{rel} is PS) and (w_{mgrel} is PL) and (E_{bre} is PL) then (q_e is PS)(q_g is Z)(q_m is Z) (1)
  
```

If	and	and	and	Then
accbrk is	v_{rel} is	w_{mgrel} is	E_{bre} is	q_e is
NL	Z	Z	Z	NL
Z	PS	PS	PS	NS
PL	PL	PL	PL	Z
none	none	none	none	PS
<input type="checkbox"/> not	<input type="checkbox"/> not	<input type="checkbox"/> not	<input type="checkbox"/> not	<input type="checkbox"/> not

Connection: or and

Weight:

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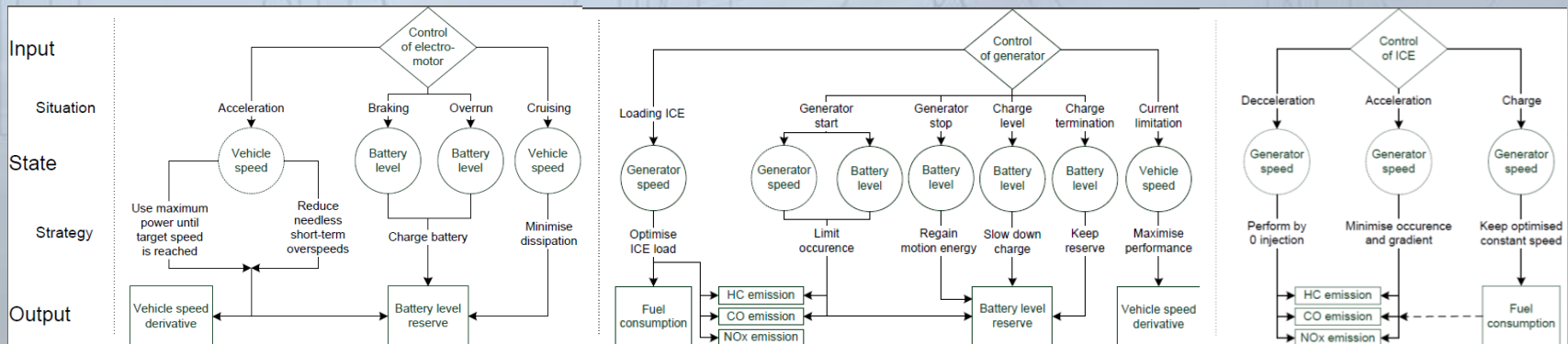
ENERGY MANAGEMENT — STATE MACHINE

Dr. Levente Balogh

State machine based energy management control of hybrid vehicle

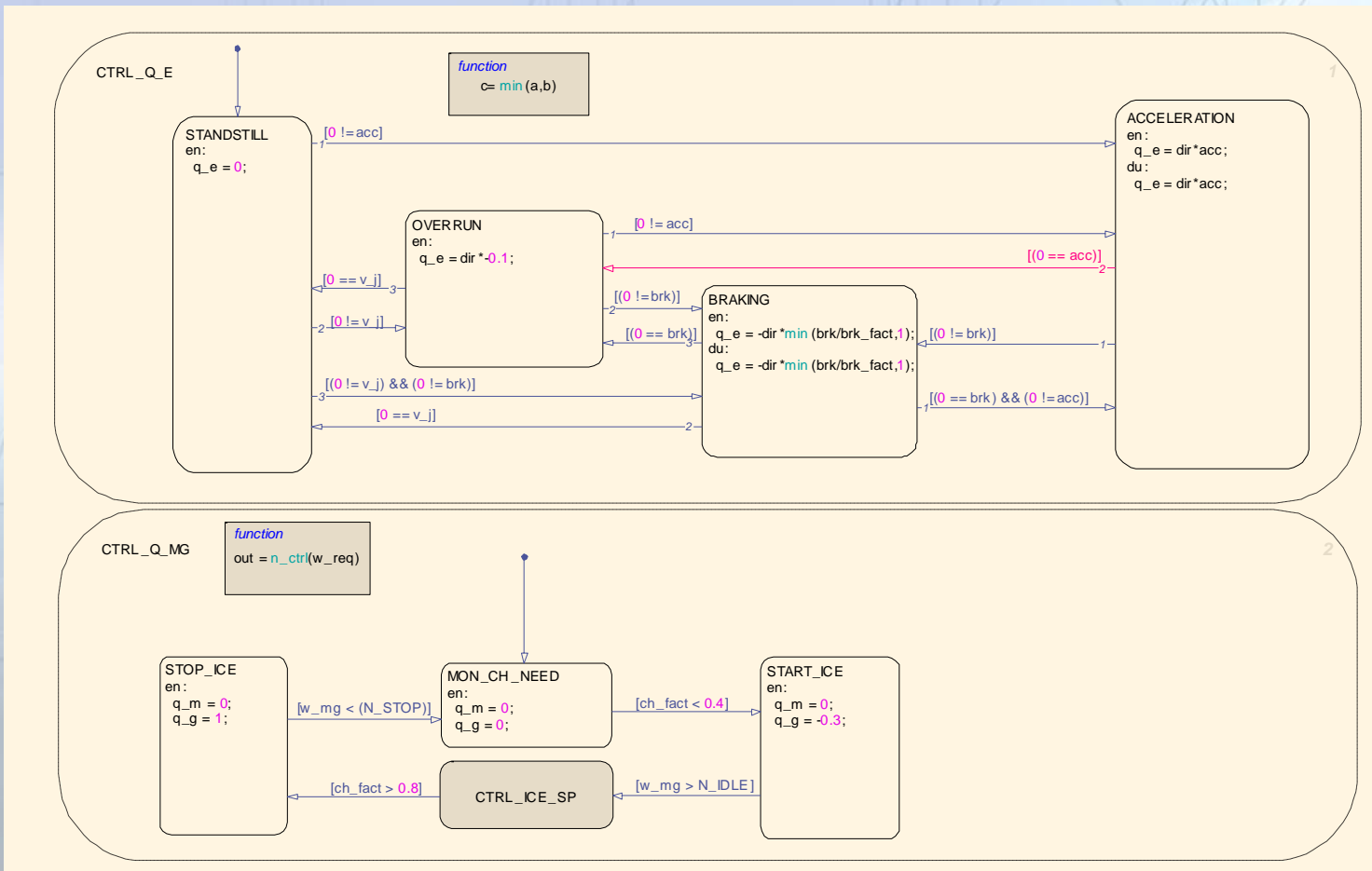
Design

- Method steps of controller design:
 - Definition of control strategies based on vehicle model inputs, state variables and optimisation outputs
 - Design of state machine based on strategies:
 - Definition of controller states
 - Assignment of control outputs related to states
 - Definition of possible state transitions
 - Evaluation of transition conditions



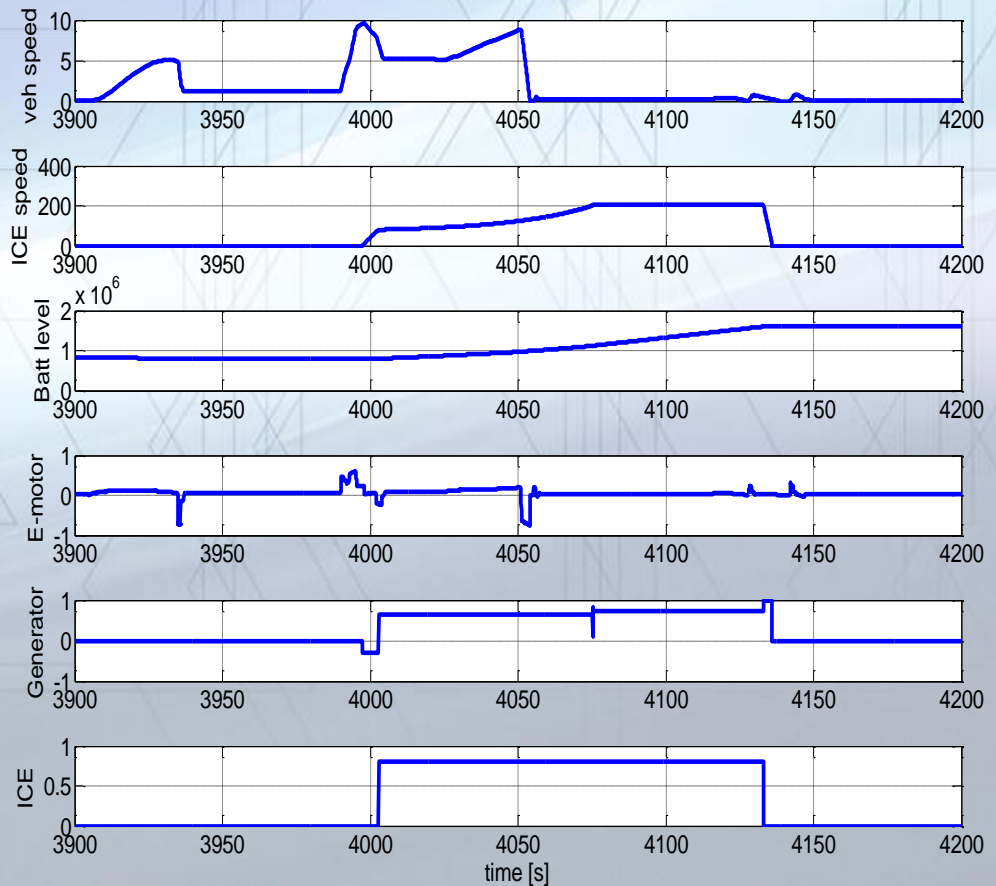
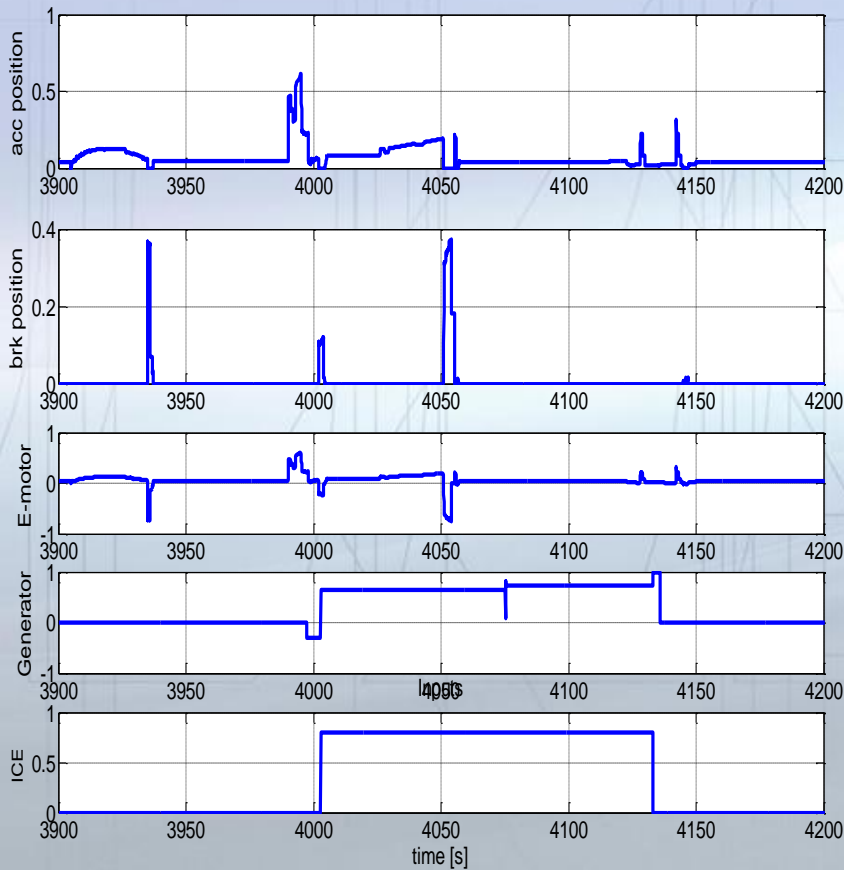
State machine based energy management control of hybrid vehicle

Implementation



State machine based energy management control of hybrid vehicle

Verification



THANK YOU FOR YOUR ATTENTION.

Gergely Bári

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COOPERATION BETWEEN HIGHER EDUCATION, RESEARCH INSTITUTES AND AUTOMOTIVE INDUSTRY

TÁMOP-4.1.1.C-12/1/KONV-2012-0002

BASIC RESEARCH FOR THE DEVELOPMENT OF HYBRID AND ELECTRIC VEHICLES

TÁMOP-4.2.2.A-11/1/KONV-2012-0012

"SMARTER TRANSPORT" - IT FOR CO-OPERATIVE TRANSPORT SYSTEM

TÁMOP-4.2.2.C-11/1/KONV-2012-0012

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