

### LLM ASSISTED NO-CODE HMI DEVELOPMENT FOR SAFETY-CRITICAL SYSTEMS Insights of a Short Impirical Study

Prof. Dr. Matthias Harter November 2023



## A (VERY) SHORT RÉSUMÉ

Contact information at the end of this presentation...

12.11.2023

## SHORT RÉSUMÉ

Some call it CV...



Name Prof. Dr. Matthias Harter Fields of interest / profession

- Patents and IP
- AI, AGI and humanity
- ASICs, Circuits and Systems
- Aviation, Simulators
- since 07/11 Professor for Embedded Systems and Microcomputers Hochschule RheinMain University of Applied Sciences
- 10/12 09/18 Head of the Department of Electrical Engineering and Information Technology
- 10/17 10/23 Head (founder) of new study program "Electrical and Aviation Engineering"





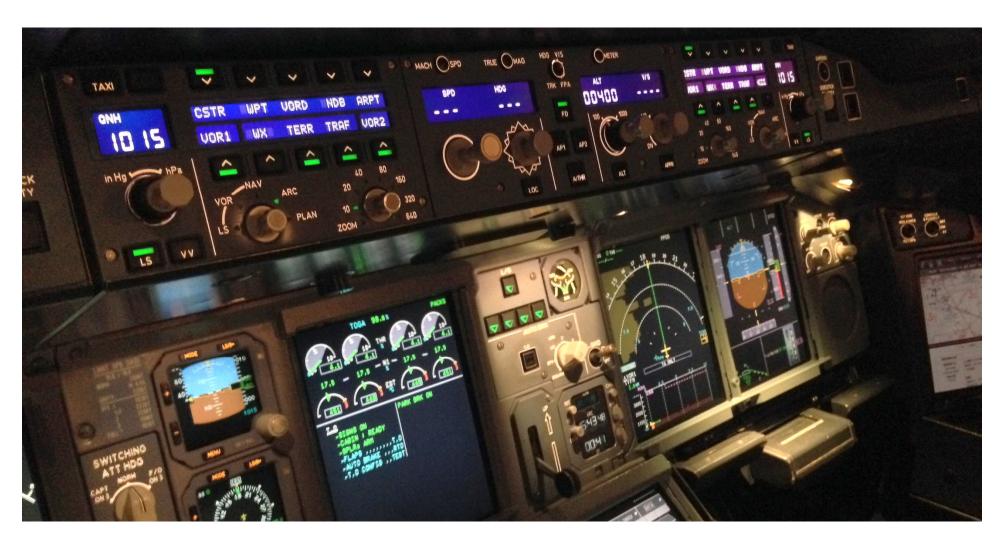


### STATE OF THE ART: EMBEDDED SOFTWARE FOR SAFETY-CRITICAL APPLICATIONS

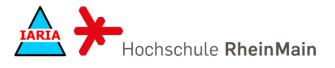
**Examples from Aviation Engineering** 

### A320 COCKPIT Safety-Critical Embedded SW development today





### CESSNA 172 (4 SEATS) Replacement of analog instruments





# DEVELOPMENT OF COCKPIT INSTRUMENTS

Scenario (example):

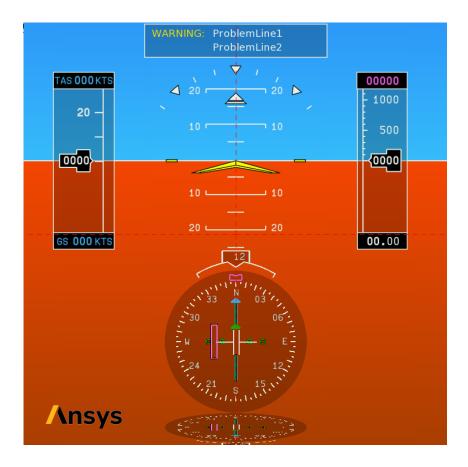
Artificial horizon used as Primary Flight Display (PFD) in an aircraft's cockpit.

### State of the art:

Automation of the development process with certified tools, e.g., Ansys SCADE

- Visual part specified as graphical models based on OpenGL primitives
- Usage of pre-defined widgets (fast!)
- Functionality as SysML models
- SW code is *generated* from models, (almost) no hand-written source code

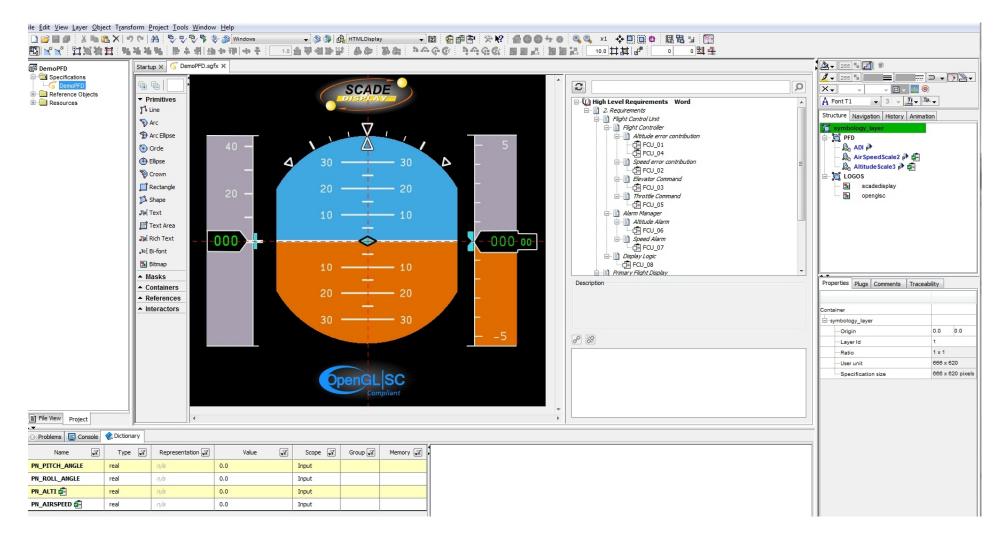
=> Safety-critical! Can AI assist? How?



### ANSYS SCADE



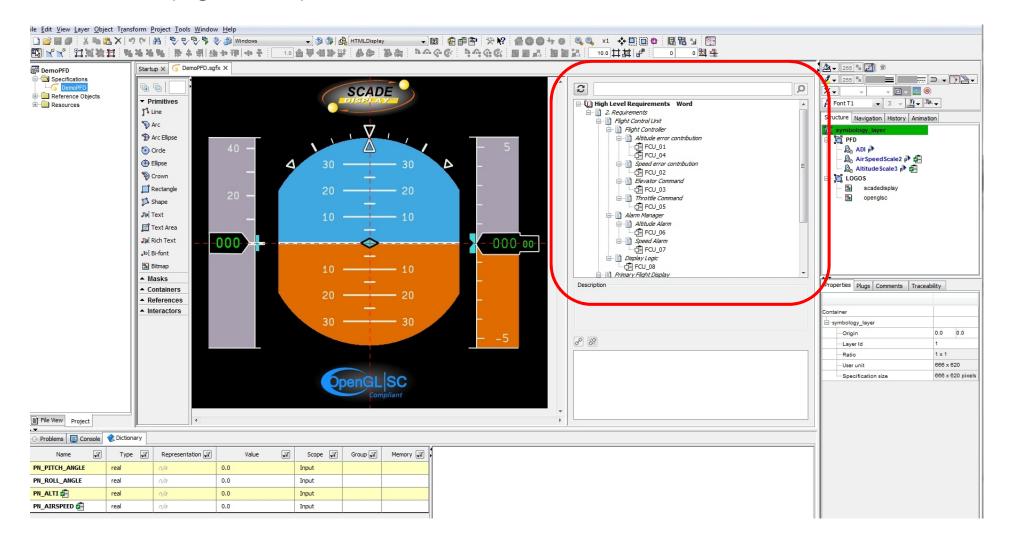
Certified tool, used by Airbus, Boeing, etc. for Model Based Systems Engineering (MBSE)



### "IN THE BEGINNING WAS THE WORD"



Requirements written in natural language are perfect for LLMs (e.g., GPT-4)





### SCENARIO FOR THE FUTURE

How realistic (how wise) is it to use AI in safety-critical applications?

### FUTURE:

Graphical and functional model, with interface to Model Based Systems Engineering (MBSE) tool

Requirements written in natural language are fed into LLM (e.g., GPT-4).

Step 1

LLM generates API calls for the development tool to create and connect the instances of the graphical and functional model of the embedded SW.

Alternative: LLM generates models directly in native file format (e.g., XML) of MBSE tool

Models are transferred into internal representation by development tool.

Step 2

Models are analyzed and edited by human engineer in the development tool, only when necessary (human-in-the-loop policy).

C/Ada source code is generated automatically by code generator (e.g., KCG).

Source code is compiled into binary (executable) for adaption by Real-Time-OS (RTOS)

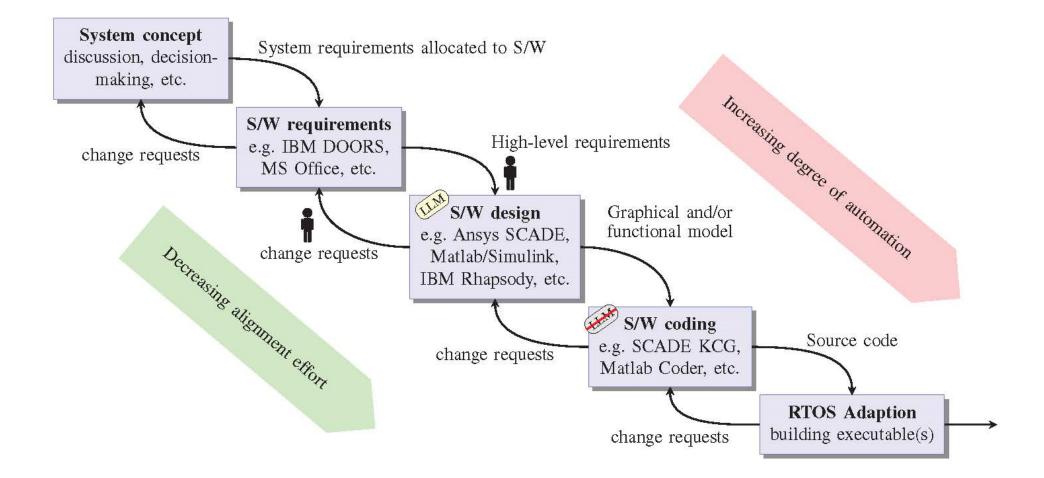
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### V-MODEL OF DEVELOPMENT PROCESS Crucial: Usage of LLM (AI) in which step?







### METHODOLOGY FOR EVALUATION

Evaluation of the capabilities of current LLMs for a limited test case

### TODAY: LIMITATIONS

Step 1

Limited to graphical model, without direct (automatic)

interface to development tool editor

Requirements written in natural language are fed into LLM (e.g., GPT-4).

LLM generates code (e.g., Python, TikZ/LaTeX) for the **graphical models** of the embedded SW only.

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Code is executed by interpreter and graphical models displayed.

Graphical models are analyzed and transferred into development tool editor manually by human engineer. C/Ada source code is generated automatically by code generator (e.g., KCG).

Source code is compiled into binary (executable) for adaption by Real-Time-OS (RTOS)

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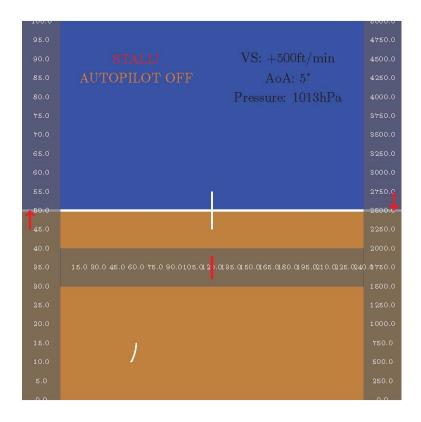


Step 2

### RESULTS: REQUIREMENTS 1...9 AND GPT-4 Variant (1 of 14) of the visual model, generated using TikZ / LaTeX code from GPT-4



- 1. General Layout & Dimensions:
- The PFD shall have a rectangular aspect
- ratio suitable for installation in standard cockpit instrument panels.
- The sky and earth shall be perfectly aligned at the horizon line.
- The horizon line shall be centered horizontally on the PFD, and its vertical placement shall adjust based on the aircraft's pitch angle.
- 2. Color and Appearance:
- The PFD shall represent the sky in blue.
- The PFD shall represent the earth in brown.
- The horizon line shall be a distinct, bold white line for easy visibility against both the sky and earth backdrops.

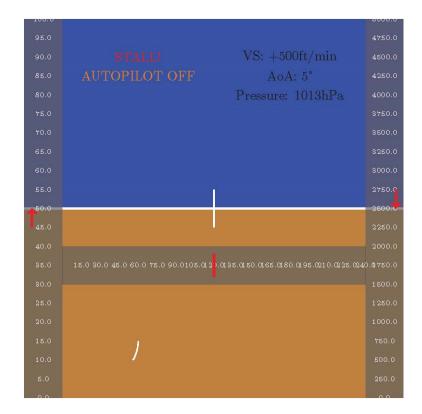


# RESULTS: REQUIREMENTS 1...9 AND GPT-4



#### 3. ... 7. omitted for clarity

- 8. Additional Flight Information:
- The PFD shall display other pertinent flight data such as vertical speed, angle of attack, and barometric pressure.
- This information should be arranged in a manner that does not clutter the primary attitude information.
- 9. Warning and Caution Indicators:
- The PFD shall have provisions for displaying warning (red) and caution (amber) indications for critical flight parameters, such as stall warnings or autopilot disengagement.



## RESULTS: REQUIREMENTS 1...9 AND GPT-4

Same requirements: Variant with 84% fulfillment

### Requirements **not** met:

- 6. Heading Indicator:
- ...
- The current heading shall be indicated by a fixed pointer or triangle, with the tape/rose rotating behind it.
- 7. Turn Coordinator:
- The PFD shall incorporate a turn coordinator, represented by a curved line or other suitable graphical representation, to show the rate and direction of turn.
- 8. Additional Flight Information:
- The PFD shall display other pertinent flight data such as vertical speed, angle of attack, and barometric pressure.





### RESULTS FOR ALL 9 REQUIREMENTS Only GPT-4 and GPT-3.5 succeeded



# of correctable

- GPT-4 always generated error-free code
- GPT-3.5 generated correctable code
- Other LLMs tested not ready for integration

Not to be confused: Code generated by LLM vs. Code generated by KCG

fulfillment code variantes code variants GPT-4 14 of 14 N/A Min. 37% Median 74% Max. 100% **GPT-3.5** 7 of 8 Min. 16% 1 of 8<sup>a</sup> Median 39% Max. 68% CodeLlama 0% 0 of 2<sup>b</sup> 0 of 2<sup>b</sup> StarChat 0% 0 of 2<sup>c</sup> 0 of 2° CodeGen2.5 0 of 2<sup>c</sup> 0 of 2° 0%

# of error-free

Footnote:

LLM

<sup>a</sup> contained errors that GPT-3.5 corrected after being instructed

<sup>b</sup> code output ended after approx. 5000 characters

Degree of

<sup>c</sup> timeout after several minutes without any output

## RESULTS FOR REQUIREMENTS 1 TO 5

CodeLlama now produced code



- CodeLlma generated model for shorted list of requirements due to restricted context window
- Other LLMs tested still not usable

LLM	Degree of fulfillment	# of error-free code variantes	# of correctable code variants
GPT-4	100%	8 of 8	N/A
GPT-3.5	Min. 64% Median 85% Max. 96%	4 of 4	N/A
CodeLlama	Min. 14% Median 29% Max. 86%	0 of 6	6 of 6 <sup>a</sup>
StarChat	0%	0 of 2 <sup>b</sup>	0 of 2 <sup>b</sup>
CodeGen2.5	0%	0 of 2 <sup>b</sup>	0 of 2 <sup>b</sup>

Footnote:

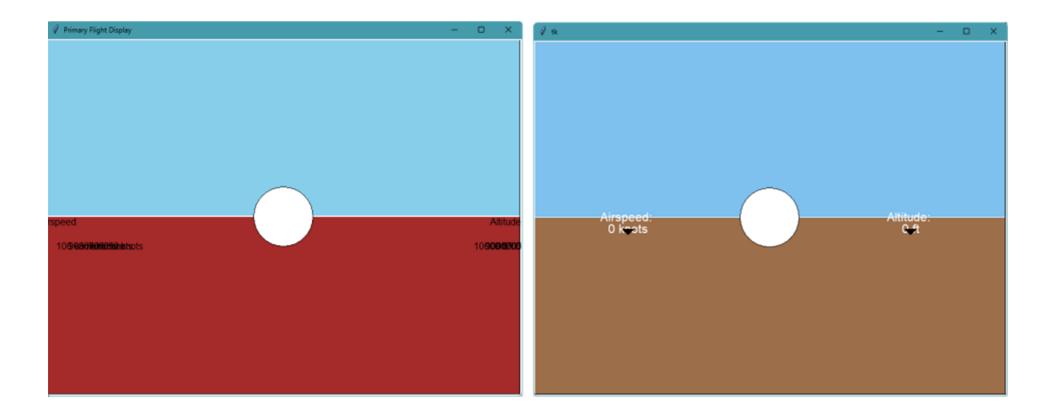
<sup>a</sup> repeatedly the same error using Qt (code could be corrected manually)

<sup>b</sup> timeout after several minutes without any output

### CODELLAMA VARIANTS



Best results (57% and 86% fulfillment) for shorted list of requirements (requirements 1...5)





### CONCLUSION

LLMs / AI can assist human engineers, but should never replace them completely

### SCENARIO Al acting as assistant to engineering teams



Challenge / Risk: What if the assistant (AI) becomes

more experienced, efficient and

reliable than the human team?

- $\Rightarrow$  get rid of human-in-the-loop policy?
- ⇒ humans only for high-level requirements?





### **REFERENCES AND CONTACT INFORMATION**

Comments and discussion always welcome!

### SELECTED REFERENCES

Full list: see paper



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### THANK YOU FOR LISTENING



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