

MathWorks **AUTOMOTIVE CONFERENCE 2024** India

19 November | Pune

Accelerating AI Adoption: From Design to Deployment in Mobility



The traction of AI in the automotive industry has been growing in recent years.

Continental uses data-driven engine temperature models for ECU development

AI for component modeling

Performing Fleet Analysis to Meet BS-VI Emission Standards at Honda

AI for algorithm dev

Automotive Research Association of India Enables Virtual Testing of ADAS Application with Real-World Simulation Scenarios

Renault Uses Deep Learning Networks to Estimate NO_x Emissions

Challenge
Design, simulate, and improve aftertreatment systems to reduce oxides of nitrogen (NO_x) emissions

Solution
Use MATLAB and Deep Learning Toolbox to model engine-out NO_x emissions using a long short-term

Bosch Develops a Single Platform for Automotive Test Data Analysis and Visualization

Challenge
Reduce the time and steps needed to process and interpret data from automotive test benches

Solution
Use MATLAB to develop and deploy a platform for analyzing and visualizing engineering data

Cummins Uses AI-Based Reduced Order Modeling to Predict Engine Performance and Emissions

Key Outcomes/Results:

- Delivery of advanced driver assistance systems functionality accelerated
- Data featuring multiple different real-world driving conditions collected
- Multiple kinds of driving scenarios simulate improve driver assistance systems

Tata Consultancy Services Develops Distributed Cloud-Based Vehicle Predictive Maintenance Solution

Tata Consultancy Services used MATLAB to create a machine learning system for vehicle predictive maintenance that distributes workloads across the cloud and edge devices. The system uses onboard models to detect faults and cloud-based models for heavy computational workloads.

Key Outcomes

- Reduced cost of cloud-based machine learning by deploying AI models to onboard computers
- Using MATLAB tools expedited the process of developing, training, and deploying models, resulting in significant time savings
- Low code tools and Diagnostic Feature Designer app enabled feature extraction and algorithm development

ML AND CLOUD FOR EV SYSTEM DEVELOPMENT

PROPOSED DATA FLOW FOR CALIBRATION

ENalyzer

ENalyzer plot showing prominence ratio (PR) vs. spike detection results. Prominence ratio is commonly used in spike data analysis

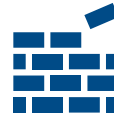
AI in Mobility



These emerging trends also has development possibilities for developers and engineers.



Core Technology
Foundation



Integration with
Legacy Systems



Deployment Challenges
& Strategies



Specialized Talents

AI in Mobility





**Jayanth Balaji
Avanashilingam**

Senior Application Engineer, MathWorks



**Koustubh
Shirke**

Senior Application Engineer, MathWorks

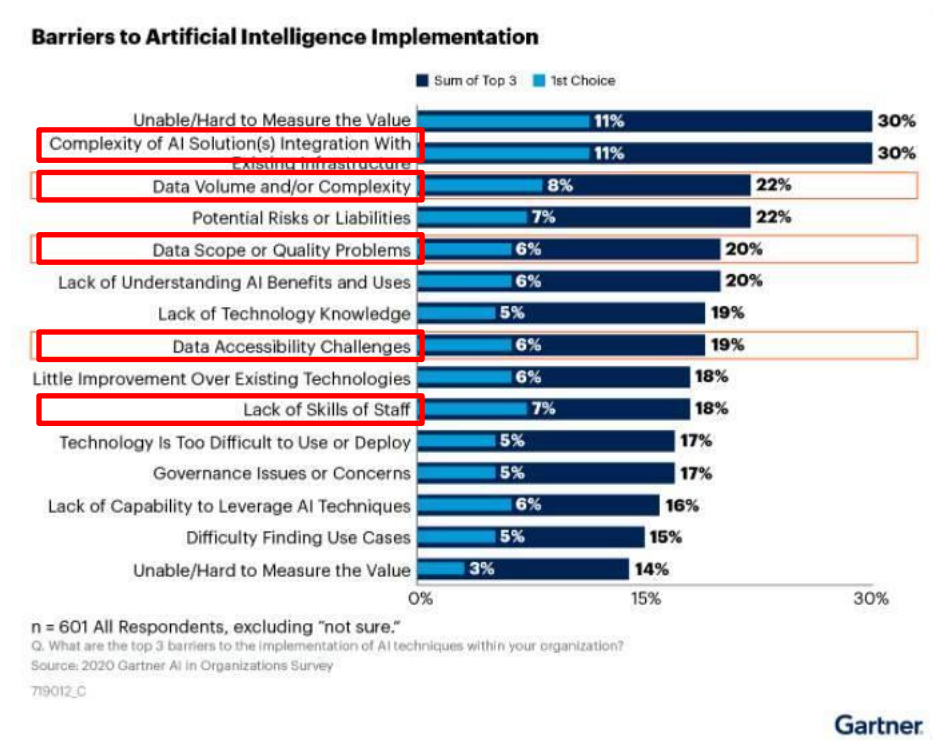


**Nikita
Pinto**

Senior AI Academic Liaison, MathWorks

Integrating AI is a priority for companies today but...

Top Barriers to AI Implementation



Top barriers to successful adoption of AI

1. Integration with existing technology
2. Data Complexity/Quality
3. Lack of Skills

n = 601

Gartner Research Circle members, excluding "unsure"

Source: 2020 Gartner AI in Organizations Survey

Q: What are the top three barrier to the implementation of AI techniques within your organization? Rank up to three.

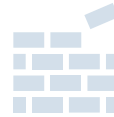
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- Source: "How to Build Knowledge Graphs That Enable AI-Driven Enterprise Applications" Gartner Research Note, <D#>, published 27 May 2020

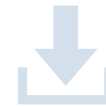
These emerging trends also has development possibilities for developers and engineers.



Core Technology Foundation



Integration with Legacy Systems



Deployment Challenges & Strategies



Industry & Academia Collaboration

Data Preparation



Data cleansing and preparation



Human insight



Simulation-generated data

AI Modeling



Model design and tuning



Hardware accelerated training



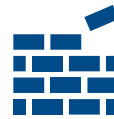
Interoperability



These emerging trends also has development possibilities for developers and engineers.



Core Technology
Foundation



Integration with
Legacy Systems




Deployment Challenges
& Strategies




Industry & Academia
Collaboration

Data Preparation

 Data cleansing and preparation

 Human insight

 Simulation-generated data

AI Modeling

 Model design and tuning

 Hardware accelerated training

 Interoperability

Simulation & Test

 Integration with complex systems

 System simulation

 System verification and validation

Deployment

 Embedded devices

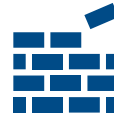
 Enterprise systems

 Edge, cloud, desktop

These emerging trends also has development possibilities for developers and engineers.



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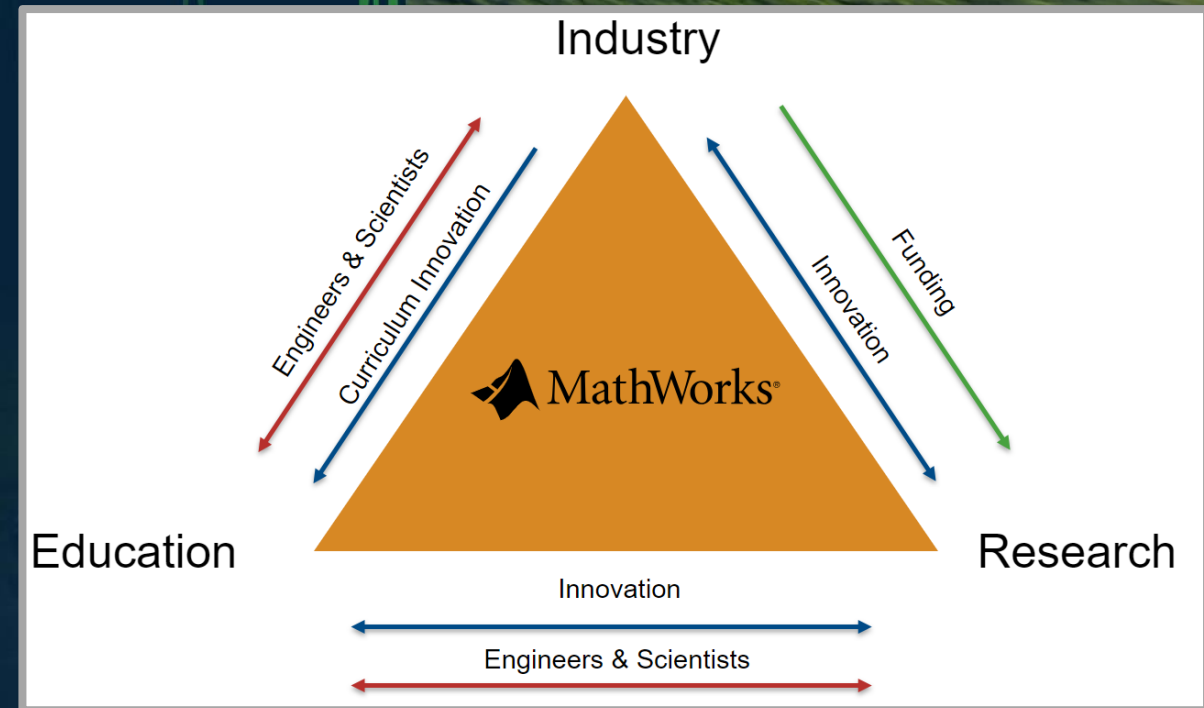
Integration with
Legacy Systems



Deployment Challenges
& Strategies



Specialized Talents-
*Industry & Academia
Collaboration*



Typical Data Driven Workflow

From data preparation to deployment



Domain Experts

From data to deployment, overseeing the entire AI workflow in MATLAB



Embedded Software Engineers

Implementing and optimizing AI models on edge hardware, collaborating seamlessly with data science teams



Data Preparation



AI Modeling



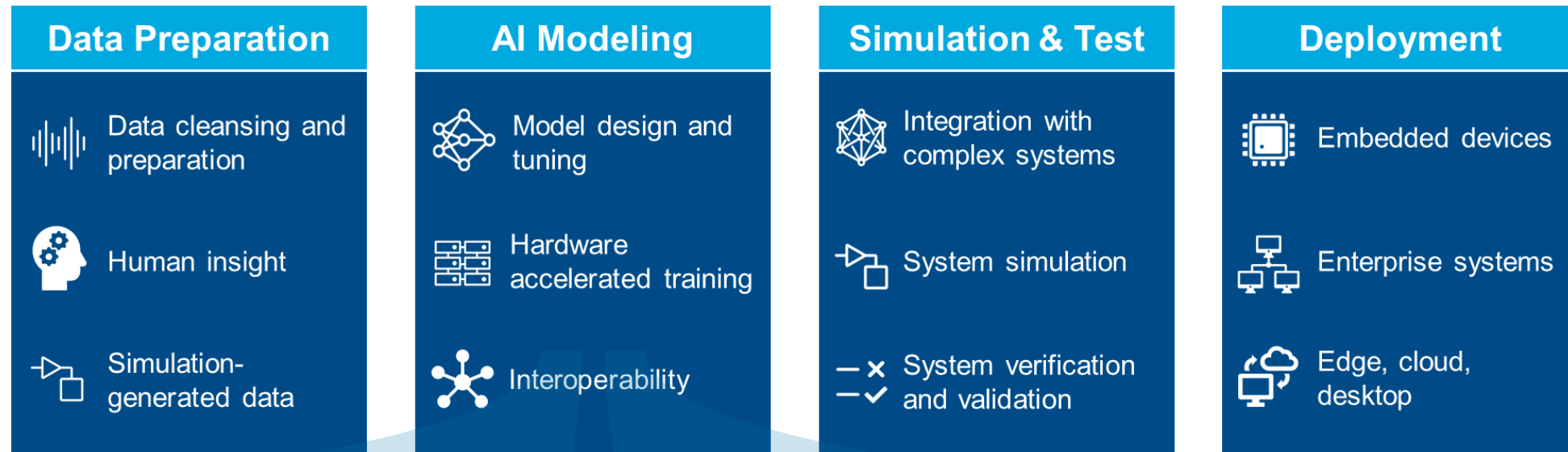
Simulation & Test



Deployment



Leveraging AI-driven Automotive Application design



AI for component modeling

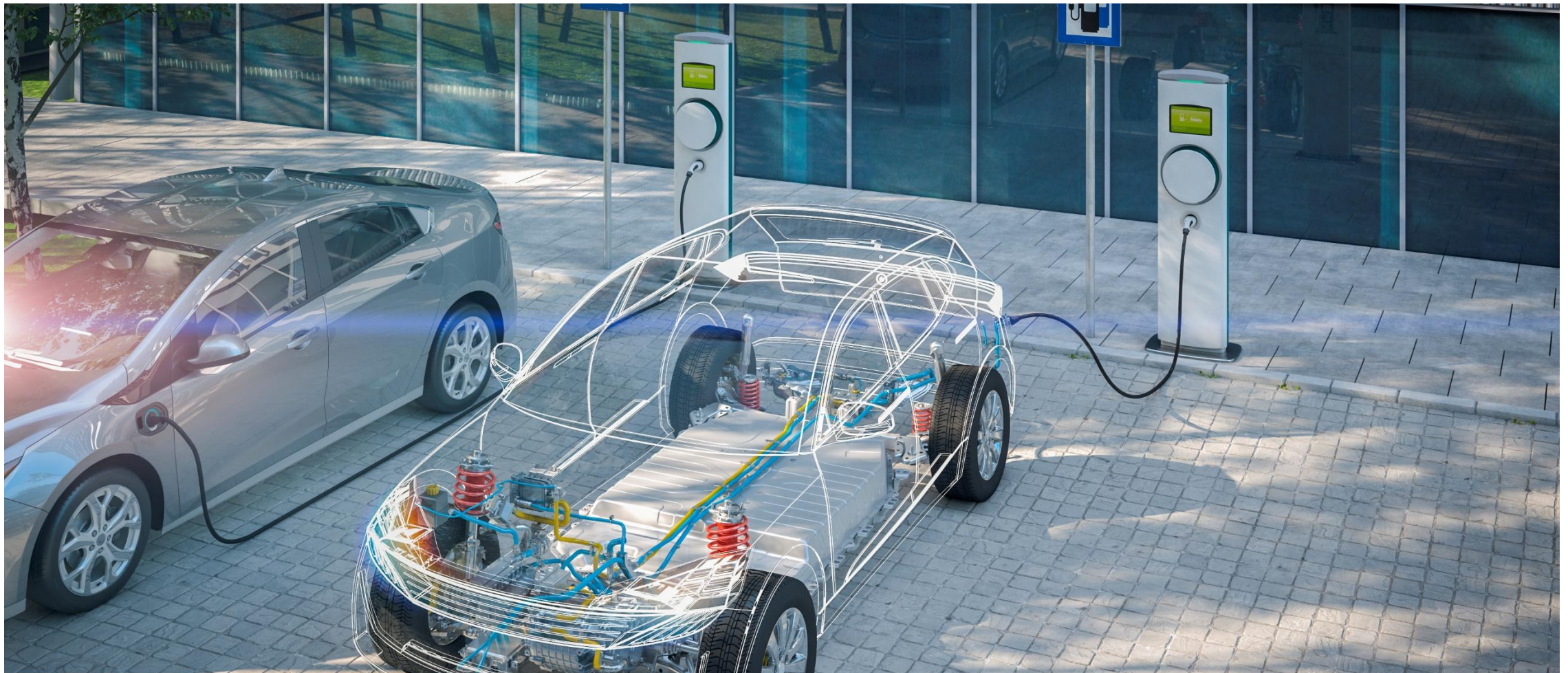
- Speeding up desktop and HIL simulations
- Modeling component dynamics from data when first-principles models cannot be obtained

AI for Algorithm development

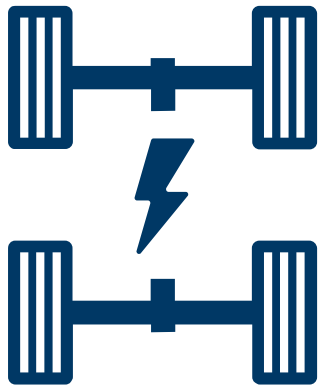
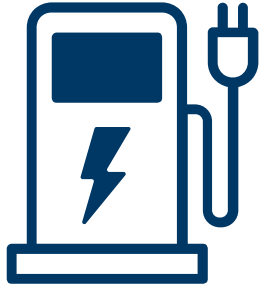
- Virtual sensor modeling
- Sensor fusion
- Object detection
- Remaining Useful Life Estimation/Predictive Maintenance

Leveraging Data Driven Application Software Development

Power Converters: Driving the Future of Electrification



Predictive Maintenance of Power Converters



**Is my machine
operating
normally?**

Anomaly Detection

I need help.

**Why is my
machine behaving
abnormally?**

**Fault Detection
(Diagnostics)**

**Phase Fault? Or Leg
Fault?**

**How much longer
can I operate my
machine?**

**Remaining Useful
Life Estimation
(Prognostics)**

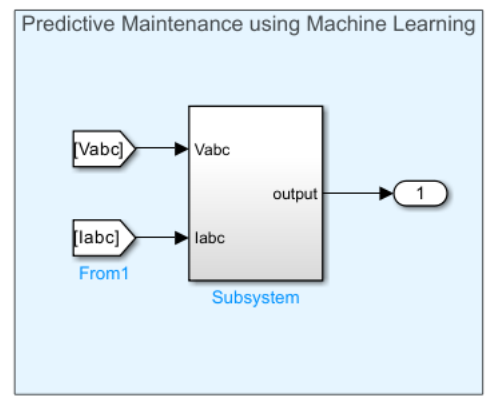
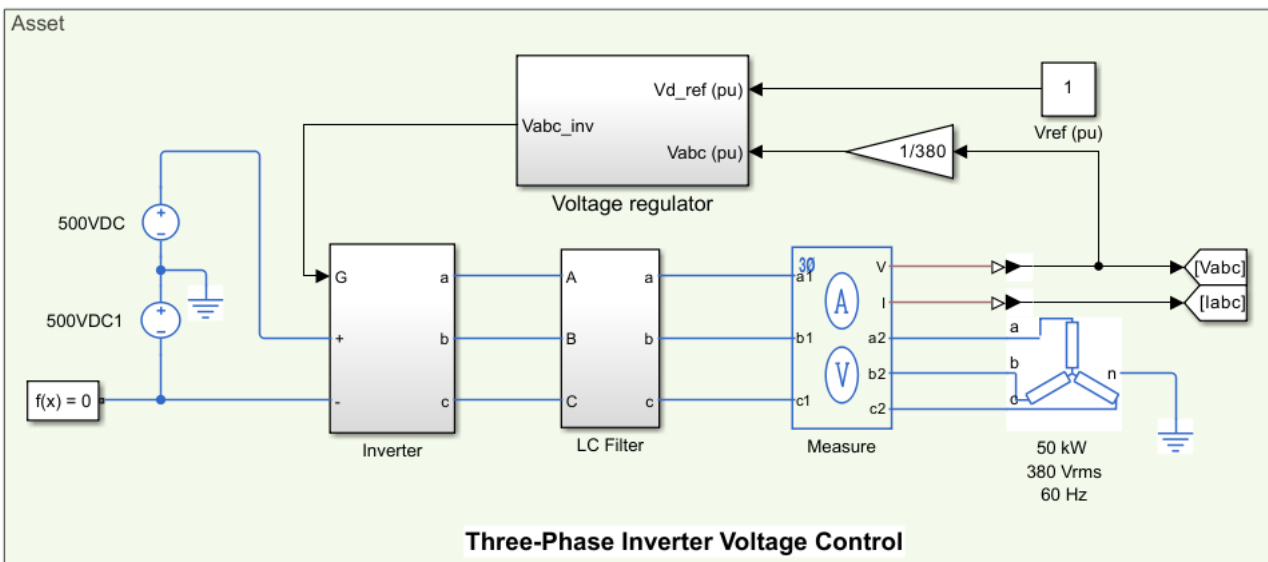
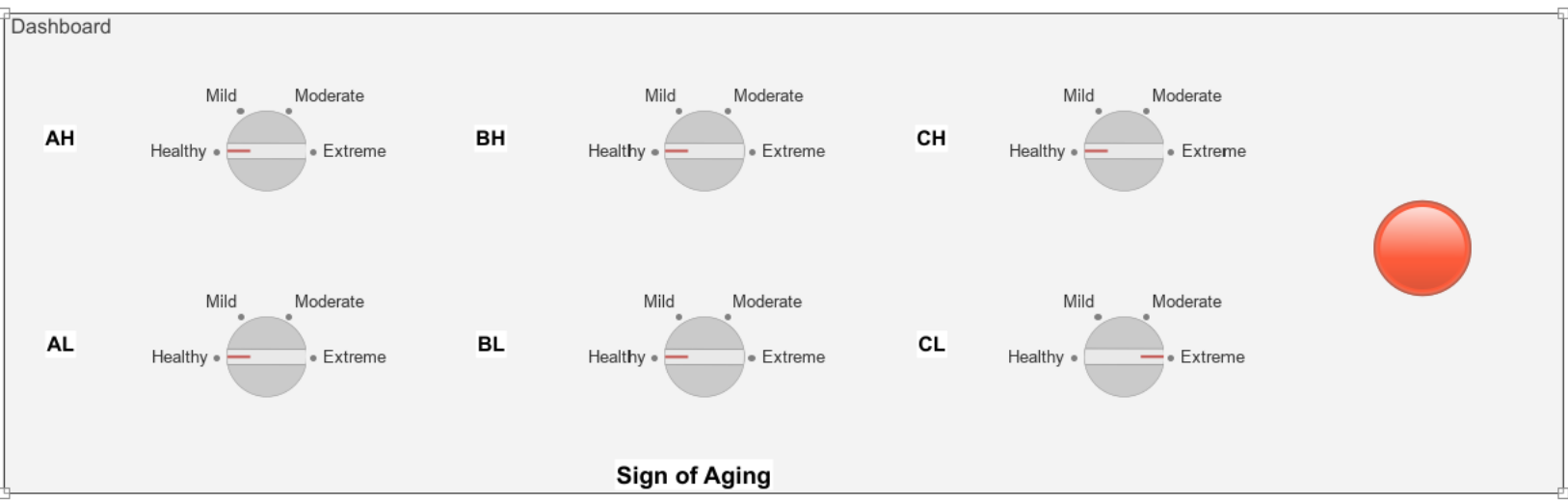
**I will shut down your
line in 15 hours.**

Test_3Ph_Inverter_Predictions * - Simulink

SIMULATION DEBUG MODELING FORMAT APPS

+ New Open Save Print FILE
 Library Browser Log Signals Add Viewer Signal Table PREPARE
 Stop Time: 0.095 Normal Fast Restart Step Back Run Step Forward Stop SIMULATE
 Data Inspector Logic Analyzer Bird's-Eye Scope Simulation Manager REVIEW RESULTS

Test_3Ph_Inverter_Predictions



Daihatsu Uses AI to Classify Engine Sounds

Challenge

Develop an AI solution that can judge the level of engine knocking sound, which only skilled workers could judge

Solution

Create classification models and easy-to-use interface with MATLAB, making it possible to examine features multiple times

Key Outcomes

- Performed knocking sound analysis with the same accuracy as skilled workers
- Increased AI expertise through MATLAB training
- Promoted visualization of AI and increased awareness of AI



Daihatsu used AI to identify knocking sounds from its engines.

“Although we tried other programming languages, it was hard to implement. We decided to use MATLAB, which allows us to easily import the necessary data by dragging and dropping, and we could easily see the result by ourselves.”

- Takuya Kumagae, Daihatsu Motor Co., Ltd.

Challenges in AI Model Development

Accuracy

- Balancing precision with real-world applicability

Development Time

- Time to market

Effective Testing

- Ensuring reliable model behavior

Compatibility

- Integration with the production systems

Maintainability

- Efficient model updating

Robustness

- Maintaining consistent performance in diverse situation

Latency

- Meeting real-time processing

Hands-on learning: IIT Madras and HAW Hamburg



MATLAB and Simulink Challenge Projects



Dr. V Krishna Teja Mantri (He/Him) • 1st
Tyre & Vehicle dynamics, JK Tyres | Adjunct Faculty, IIT Madras
2w • Edited

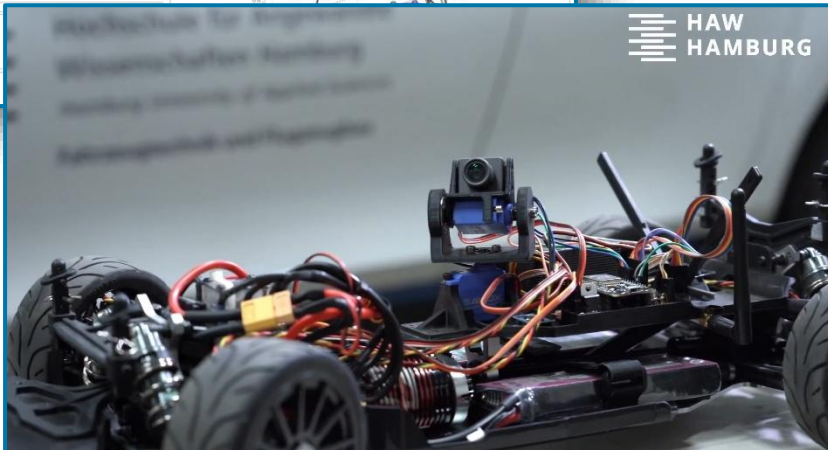
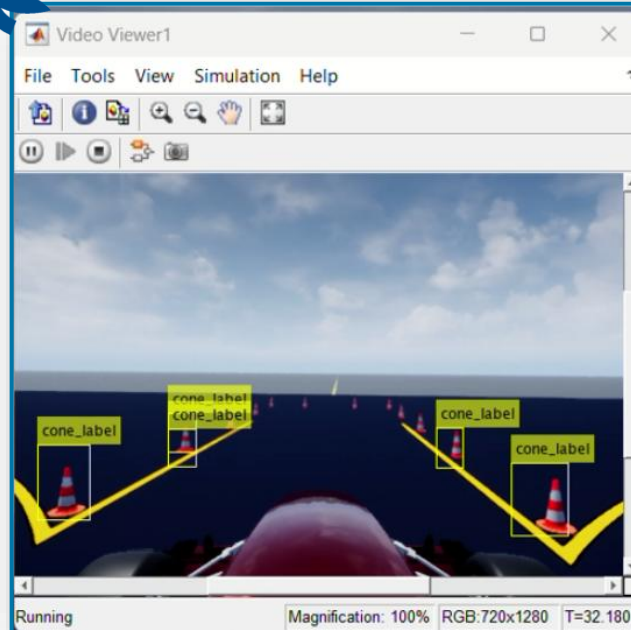
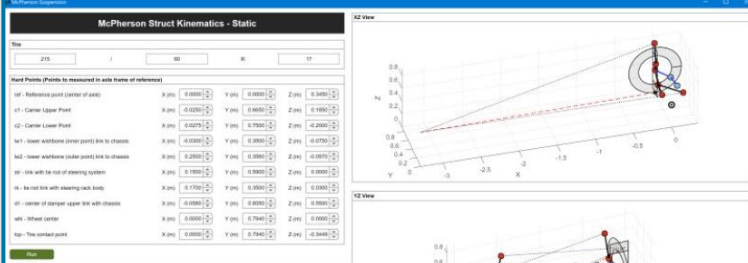
Hey Automotive Enthusiasts!

Ever wondered about so many buzz words in suspension tuning that makes your vehicle ride and handling smooth...

Here is a simple #MATLAB app that I created during my university days for quickly visualising McPherson suspension and calculating some important metrics. The app can be downloaded from Mathworks FileExchange <https://lnkd.in/gNfudcN6>

Feel free to customise as needed!
Share your insights on suspension optimization and tuning experiences...

#AutomotiveEngineering #vehicledynamics #engineering #design #vehicledesign #students #formulastudent #modelling #simulation



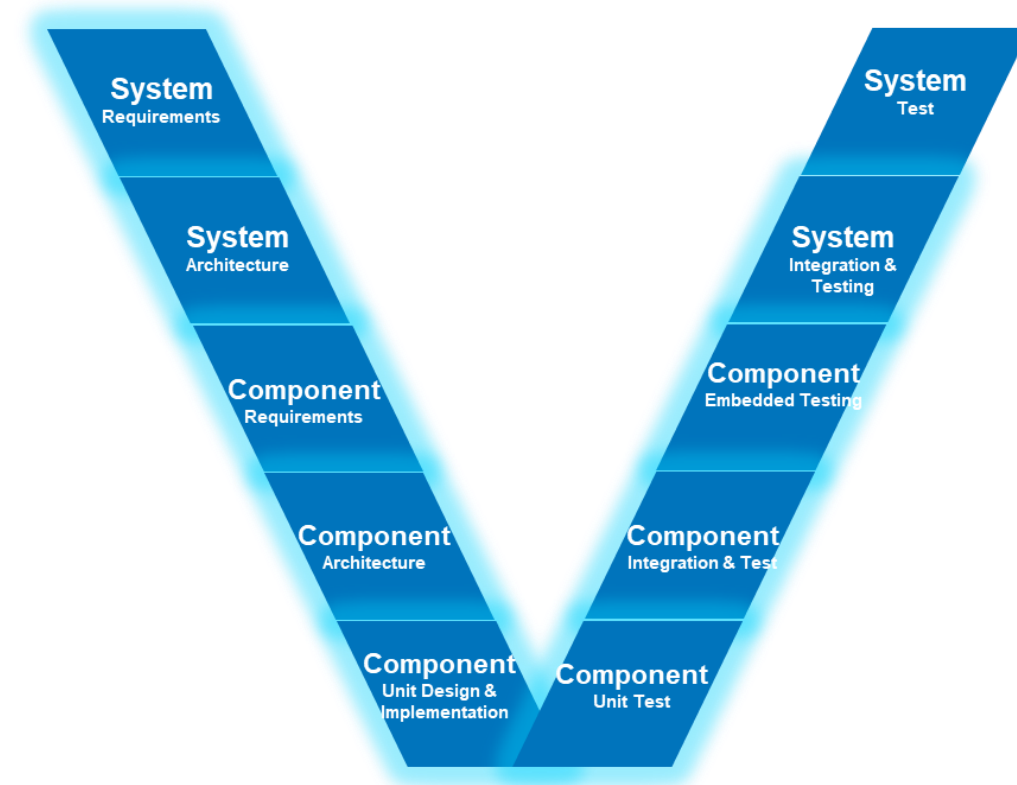
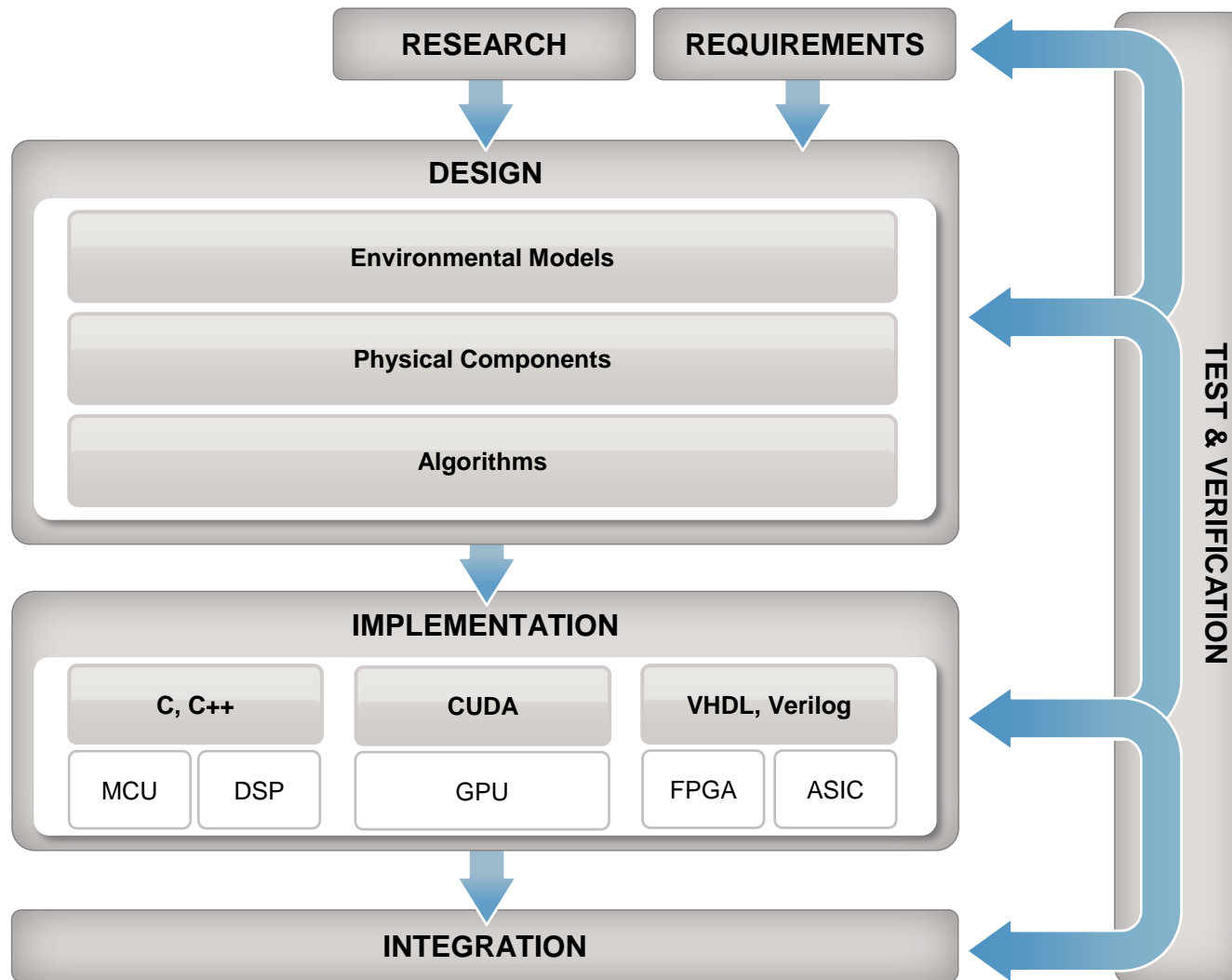
Student competitions – TUM at the Indy Autonomous Challenge



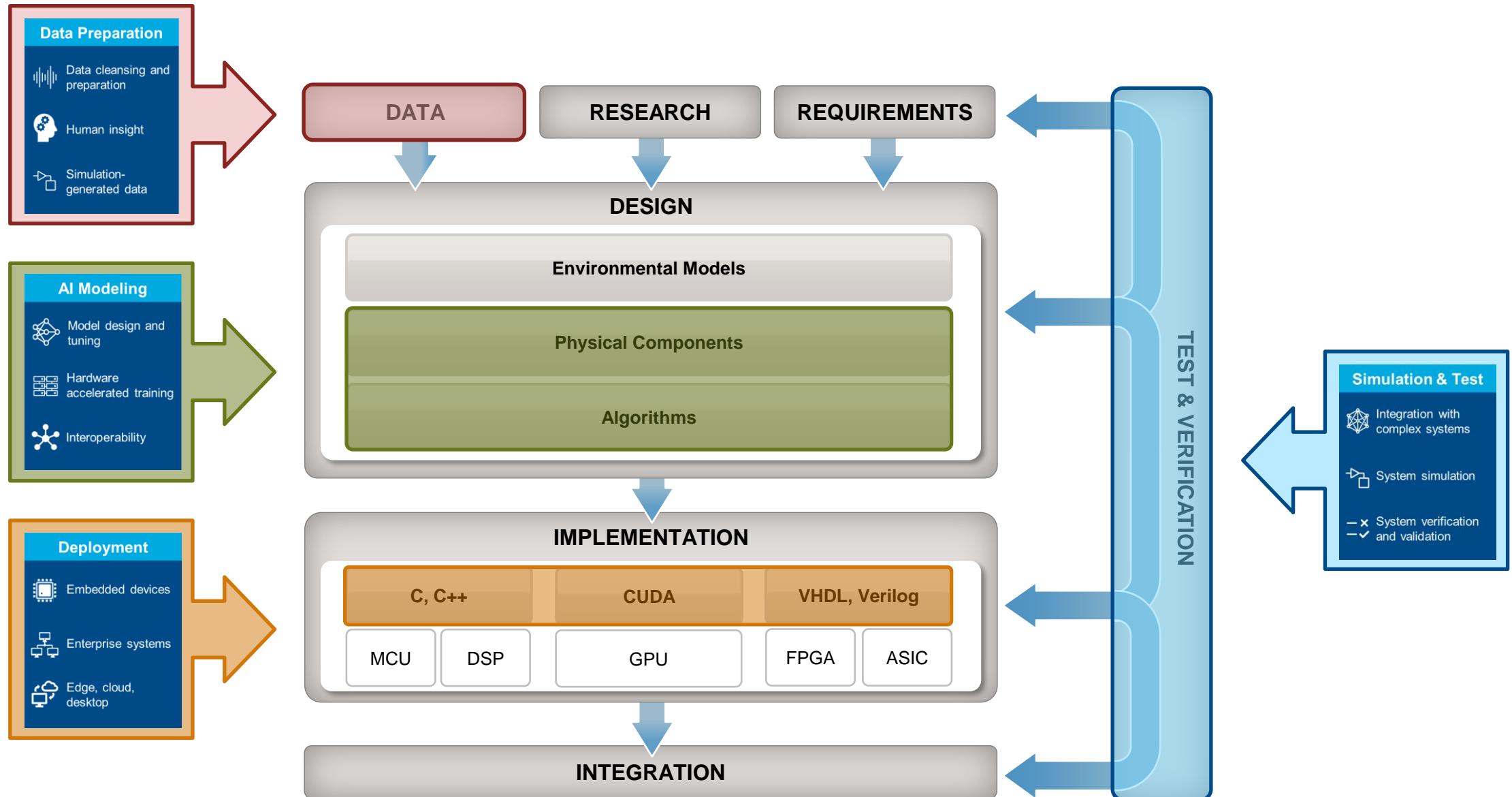


Audience Question

Application Development workflow with Model-Based Design



Integrating AI in Model-Based Design



Use AI to improve engine control unit development efficiency

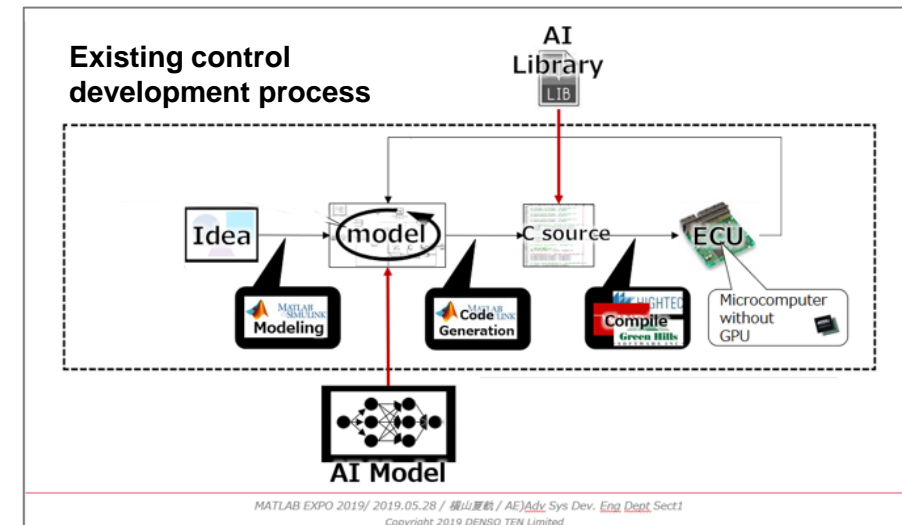
DENSO TEN

- Used Deep Learning to formulate a model for complex vehicle control issues
- Applied model-based development to integrate AI model into existing control model
- Developed a pathway to c-code generation for ECU implementation



“A model-based development workflow is essential in order to use AI for control ECUs. Combining the existing control model and the AI model enables us to establish a simulation environment and accelerate product development.”

- *Natsuki Yokoyama, Denso Ten*

Model-Based Development Workflow



Verification and Validation of AI Model

	 Model-Based Design	 AI Models
Verification	Correctness of Algorithm Ensuring algorithms represent the intended physical or logical system accurately	Verifying model training aligns with intended objectives. <div style="display: flex; justify-content: space-around;"> <div style="background-color: #004a60; color: white; padding: 5px;">Explainability</div> <div style="background-color: #004a60; color: white; padding: 5px;">Rigor & Trust</div> </div>
	Chances of Error Errors stem from incorrect logic, parameter values, or design mistake.	Errors may arise from data quality, hyperparameters, or learning process
Validation	Purpose Ensure the system performs as intended under real-world scenarios	Ensure the AI model generalizes well to unseen data and meets real world requirements. <div style="display: flex; justify-content: space-around;"> <div style="background-color: #004a60; color: white; padding: 5px;">Robustness</div> <div style="background-color: #004a60; color: white; padding: 5px;">Real – World scenarios</div> </div>
	Testing Scenarios Relies on diverse and representative datasets for validation	Uses predefined scenarios based on design requirements and physical constraints

Developing Onboard SOH Estimation Using DVA and ICA for LFP Batteries

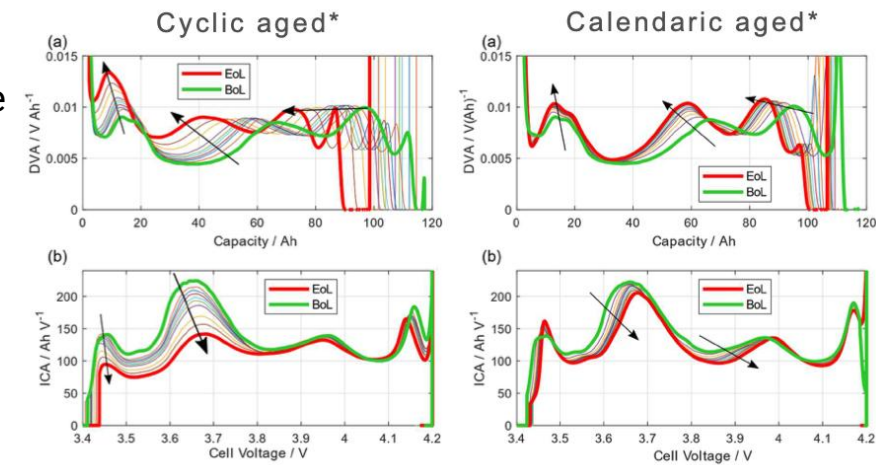


Challenge

Li-ion Batteries suffer from a variety of degradation mechanisms that lead to either capacity fade or power fade. Techniques like Incremental Capacity Analysis and Differential Voltage Analysis can be used to estimate DQ and DV curves but inferring battery State of Health (SOH) from these curves still requires domain expertise.

Solution

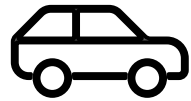
Gotion used MATLAB to develop feature extraction methods that detect the most important features in DQ and DV curves, then trained a linear regression model that correlates these features with capacity fade. This regression model was then used alongside temperature data in a 2-D look-up table that estimates SOH. The solution was implemented in Simulink for testing, requirements validation, and certification.



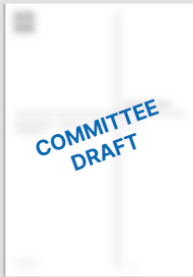
Benefits of using MATLAB and Simulink

- Easy data analysis for visualization and identification of key trends in battery aging
- Built-in tools to extract meaningful features from differential voltage curves (peak detection)
- V-diagram workflow support including requirements management, automatic code generation, and ISO 26262/IEC 61508 certification

There is an increased focus in government regulation and certification efforts



Automotive



ISO/CD PAS 8800

Road Vehicles — Safety and artificial intelligence

Under development

A draft is being reviewed by the committee.



Aerospace

WIP 2023-06-26



Process Standard for Development and Certification/Approval of Aeronautical Safety-Related Products Implementing AI ARP6983

This document discusses guidelines for the development of Aircraft Systems leveraging AI capabilities, taking into account the overall aircraft operating environment and functions. This includes validation of requirements and verification of the design implementation for certification and product assurance and guidelines with the assessment of safety. It provides practices for showing compliance with the regulations and serves to assist a company in developing and meeting its own internal standards by considering the guidelines herein.



Medical Devices

← [Software as a Medical Device \(SaMD\)](#)

Artificial Intelligence and Machine Learning in Software as a Medical Device

May 13, 2024 update: 191 Artificial Intelligence and Machine Learning (AI/ML)-Enabled Medical Devices were added to the list below. With this update, the FDA has authorized 882 AI/ML-enabled medical devices. Of those newly added to the list, 151 are devices with final decision dates between August 1, 2023, and March 31, 2024, and 40 are devices from prior periods identified through a further refinement of methods used to generate this list.

European Parliament

2019-2024



TEXTS ADOPTED

P9_TA(2024)0138

Artificial Intelligence Act

European Parliament legislative resolution of 13 March 2024 on the proposal for a regulation of the European Parliament and of the Council on laying down harmonised rules on Artificial Intelligence (Artificial Intelligence Act) and amending certain Union Legislative Acts (COM(2021)0206 – C9-0146/2021 – 2021/0106(COD))

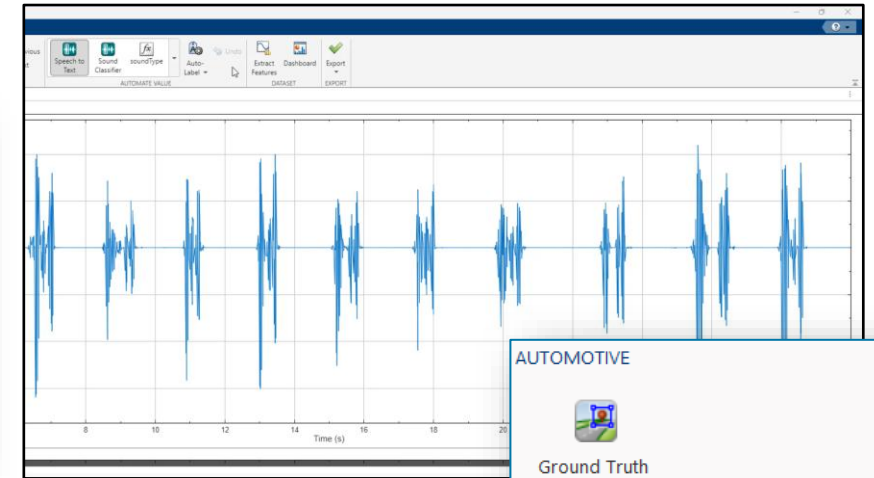


Requirements and Data Management

Define Requirements for end-to-end AI workflows

Summary	Implemented	Verified
Battery SOC data temperature: -10 degrees C		
Battery SOC data temperature: 0 degrees C		
Battery SOC data temperature: 10 degrees C		
Battery SOC data temperature: 25 degrees C		
Data Justifications		

Automate Data Labeling



AUTOMOTIVE

Ground Truth Labeler

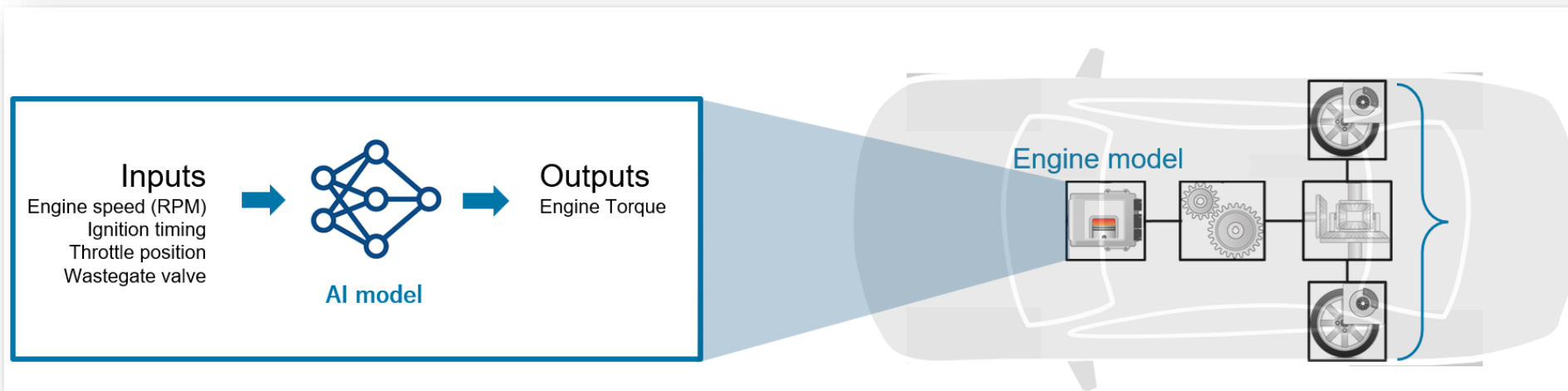
SIGNAL PROCESSING AND COMMUNICATIONS

Audio Labeler Signal Labeler

IMAGE PROCESSING AND COMPUTER VISION

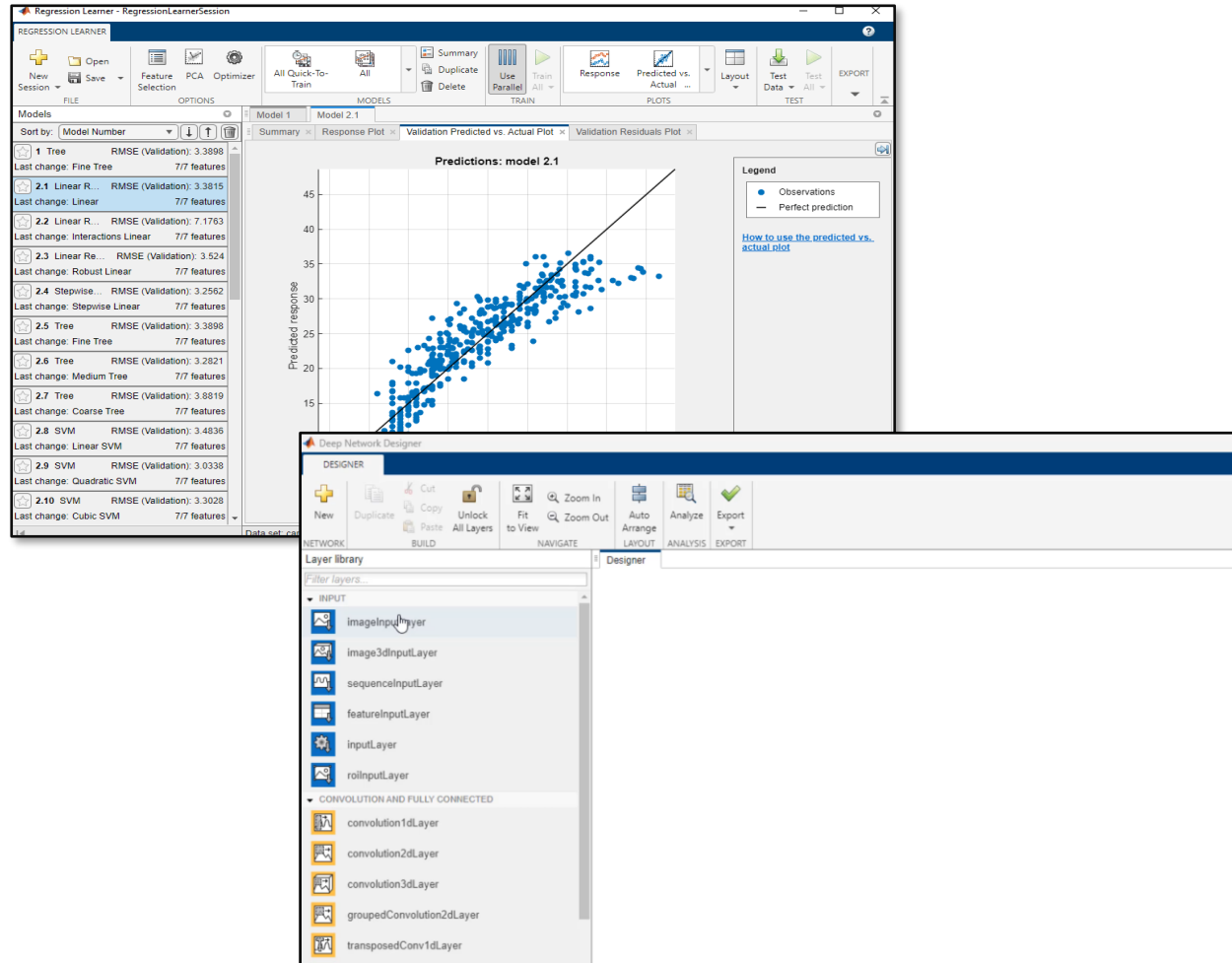
Image Labeler Lidar Labeler Video Labeler

Generate data for AI models (e.g. using ROM)

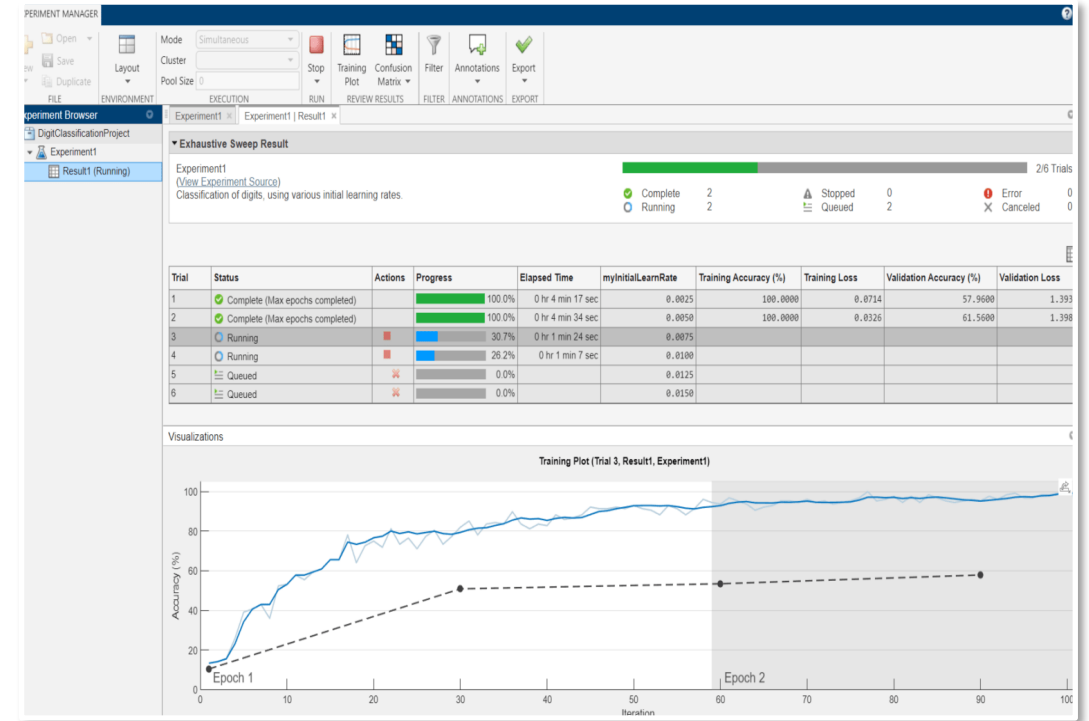


Learning Process - AI Modeling, Hyperparameters & Experimentation

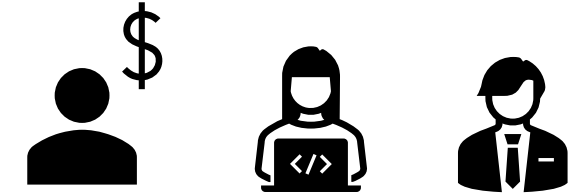
Design & Train Deep Learning, Machine Learning models



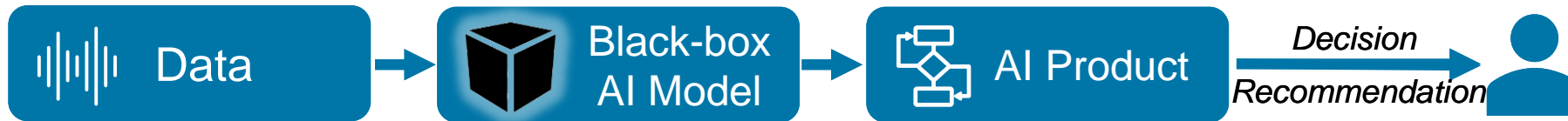
Experiment over models, hyperparameters



Explainability of AI components



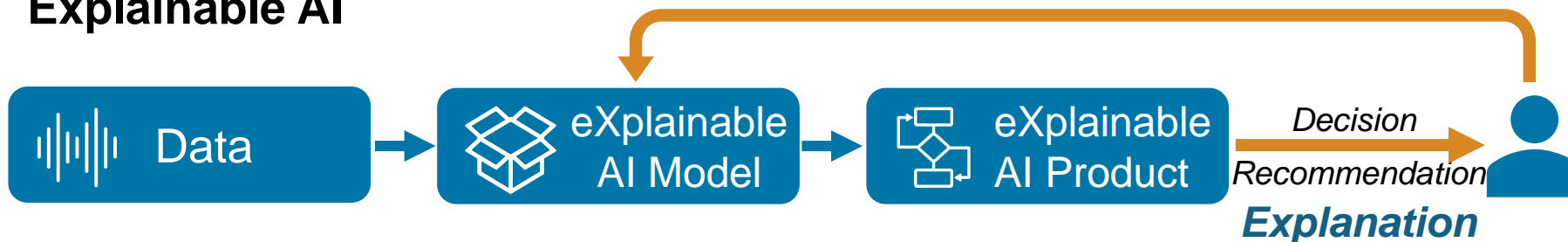
Unexplainable AI



- Why did you do that?
- Why did you not do that?
- When do you succeed or fail?
- When can I trust you?
- How do I correct an error?

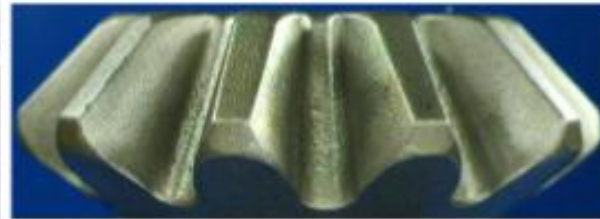
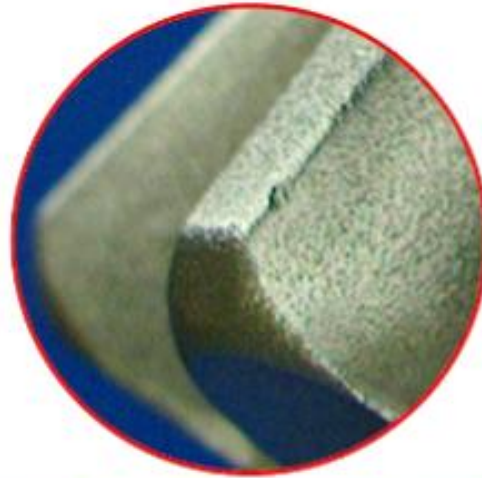


Explainable AI



- I understand why
- I understand why not
- I know why you succeed or fail
- I know when to trust you
- I know why you erred

Musashi Seimitsu Industry Uses Deep Learning for Visual Inspection of Automotive Parts

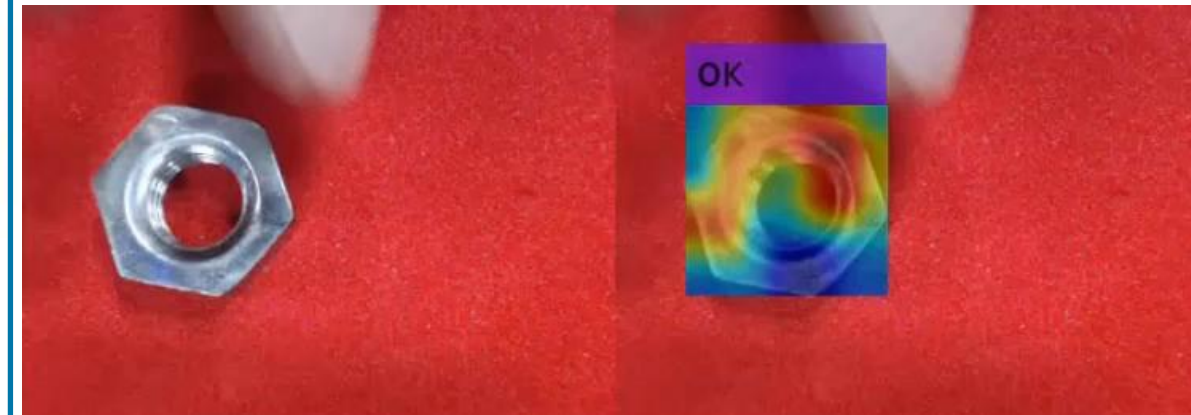


“ Using camera connection, preprocessing, and various pretrained models in MATLAB enabled us to work on the entire workflow. Through discussions with consultants, our team gained many tips for solving problems, growing the skills of our engineers. ”

How XAI was used:

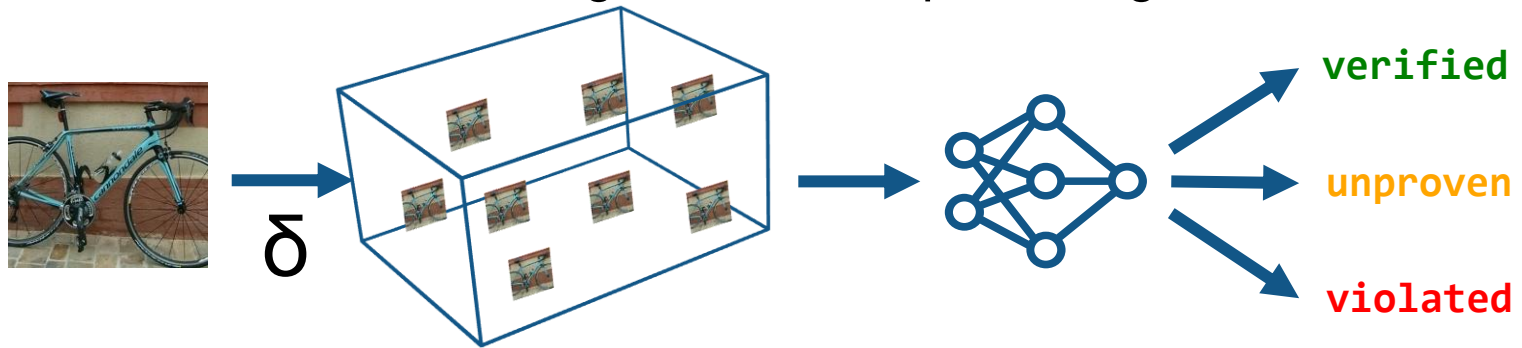
Estimate and visualize the defect area using Class Activation Mapping

Class Activation Mapping

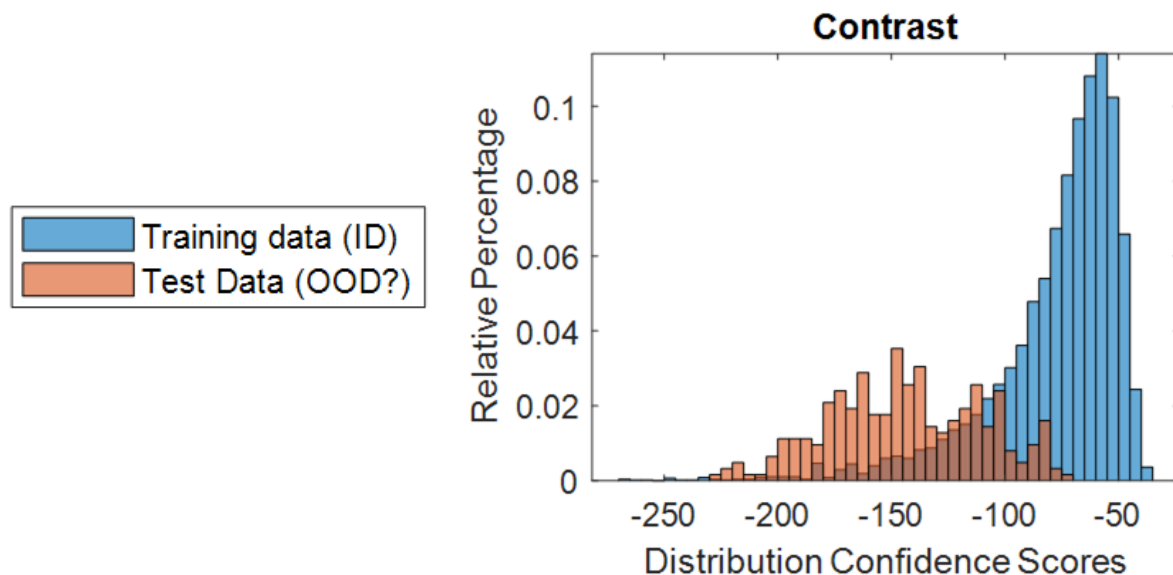


Robustness and Out of Distribution Detection

Is the AI model robust against small input changes?



Can the AI model reliably detect unknown samples?

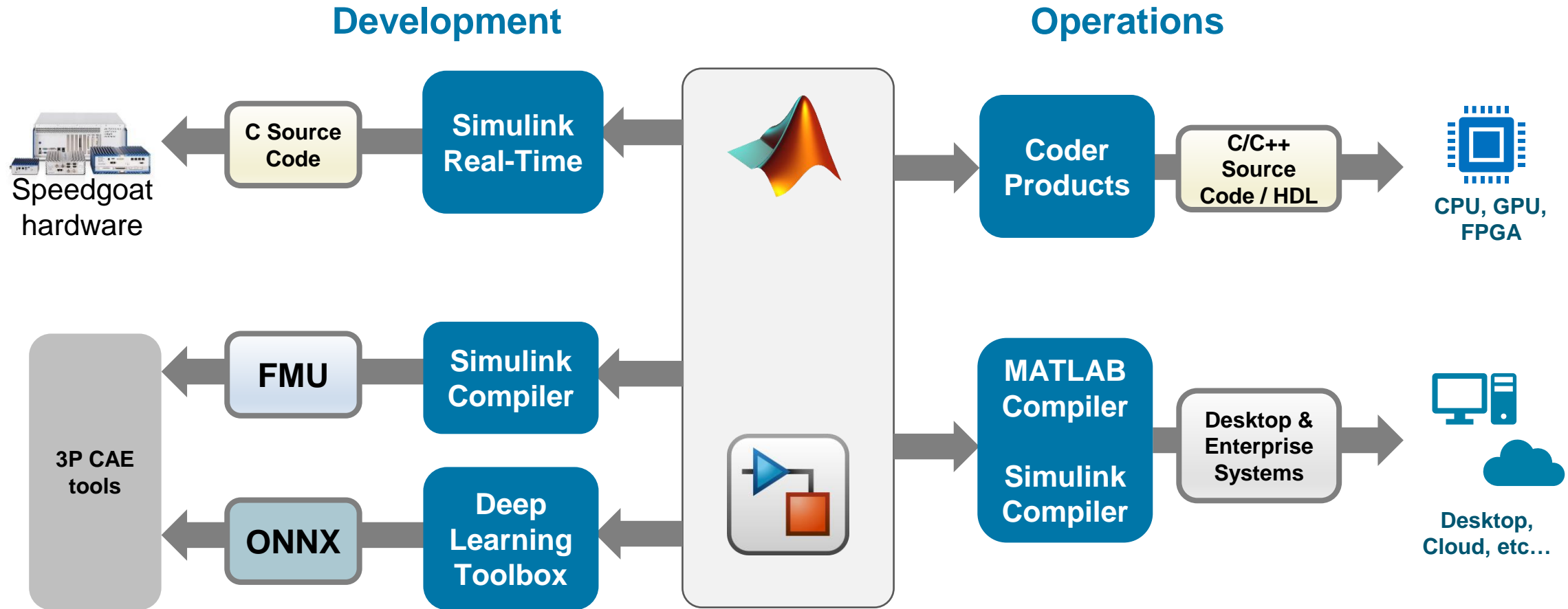


Deep Learning Toolbox Verification Library

by MathWorks Deep Learning Toolbox Team **STAFF**

Verify and test robustness of deep learning networks

Deploy to your choice of embedded hardware, or integrate with a variety of platforms in the cloud



Operationalize Embedded AI with On-Device Learning



Domain Experts

From data to deployment, overseeing the entire AI workflow in MATLAB



Embedded Software Engineers

Implementing and optimizing AI models on edge hardware, collaborating seamlessly with data science teams



Data Preparation



AI Modeling



Simulation & Test



Deployment



Workflow for Embedded AI



Data Preparation



AI Modeling



Simulation & Test



Deployment



Keeps Learning

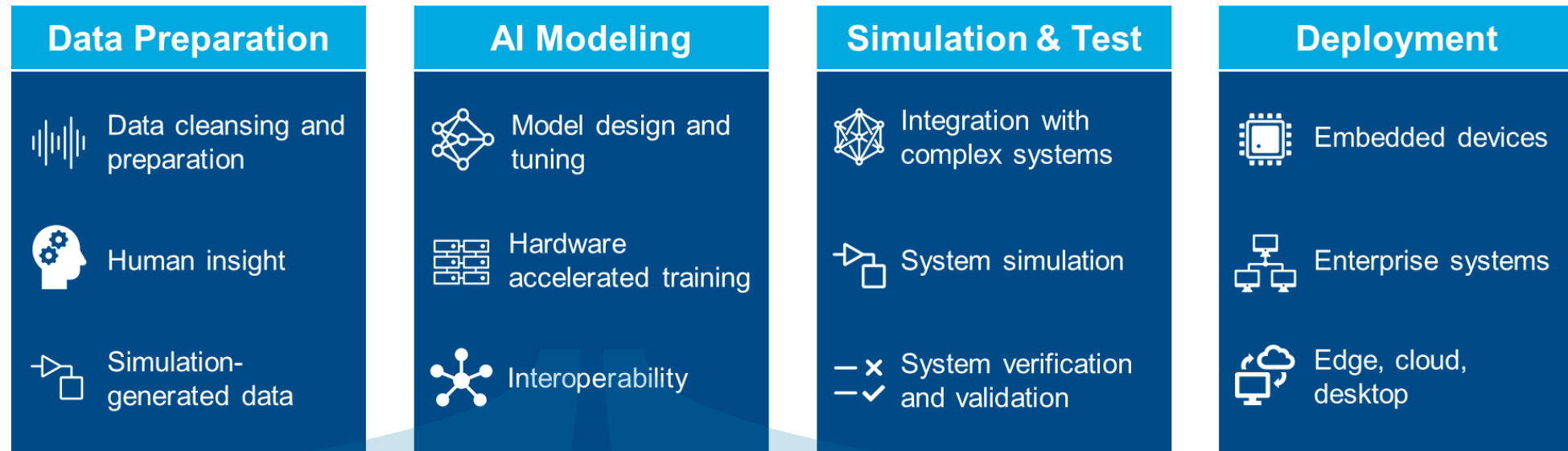


Incremental Learning Blocks



Workflow for On-Device Learning

Leveraging AI-driven Automotive Application design



AI for component modeling

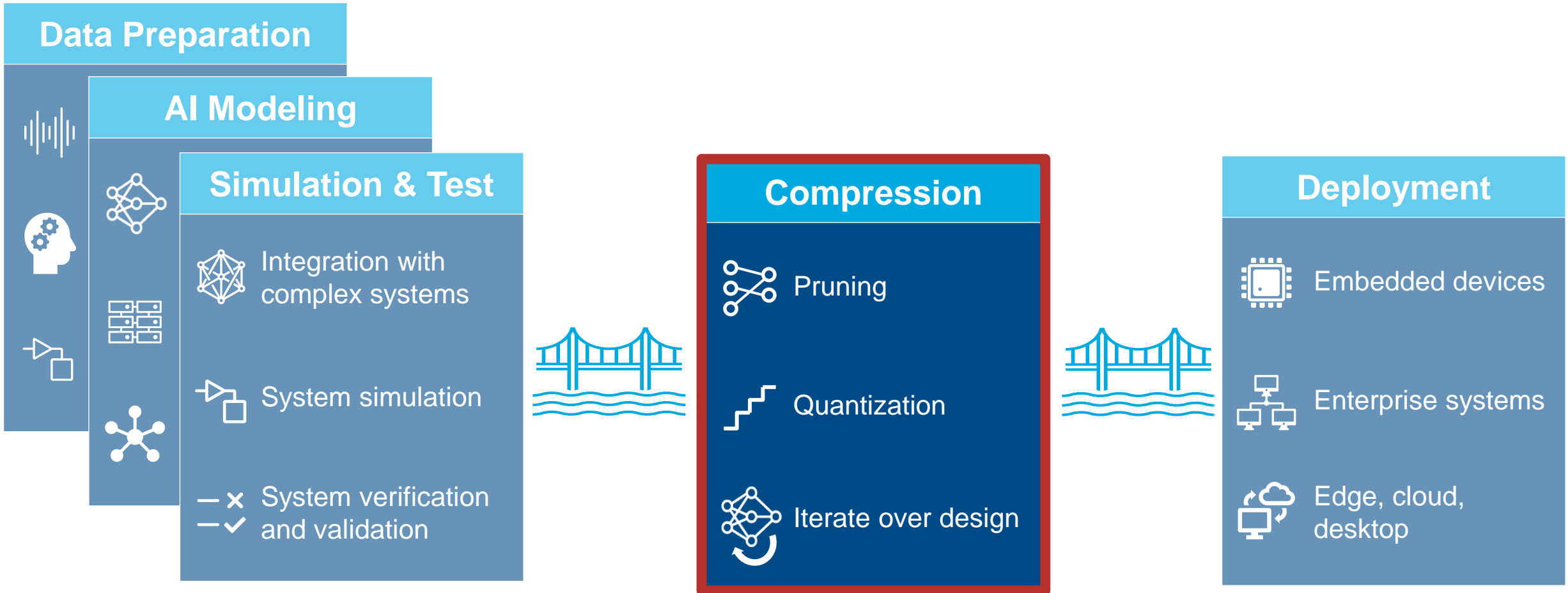
- Speeding up desktop and HIL simulations
- Modeling component dynamics from data when first-principles models cannot be obtained

AI for Algorithm development

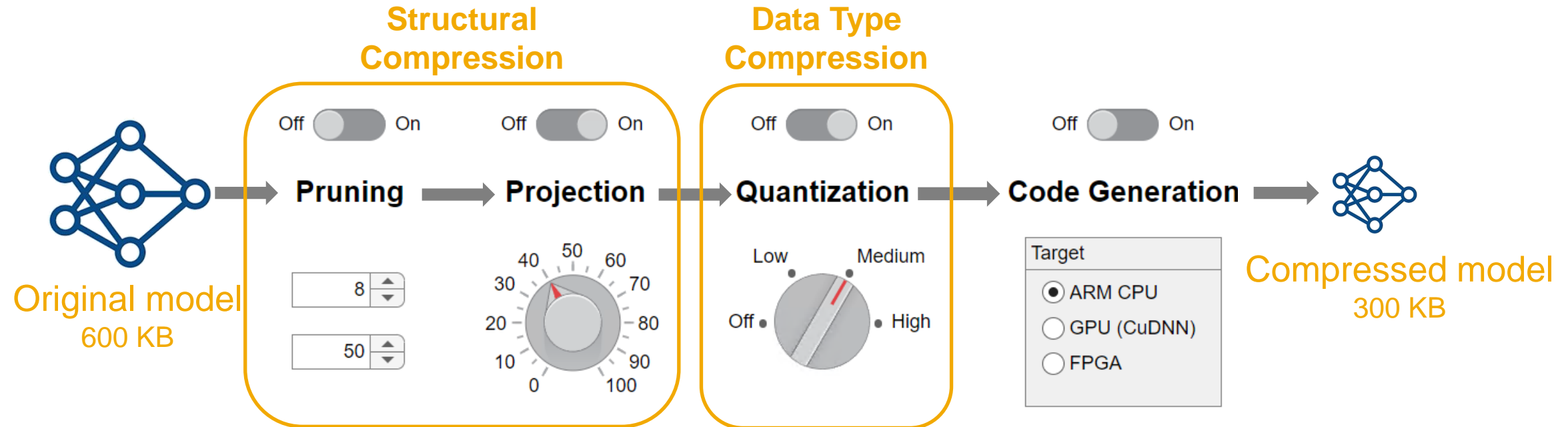
- Virtual sensor modeling
- Sensor fusion
- Object detection
- Remaining Useful Life Estimation/Predictive Maintenance

Leveraging Data Driven Application Software Development

Model compression can bridge the gap between AI modelling and embedded deployment



Reduce model footprint and accelerate inference of DL models for deployment to the edge



*“original [network] was 40MB, was told needed to be **less than 10MB to fit.**”*



*“model is 600kb and want to **reduce it to 300kb.** if I'm not fitting it in, I don't have a working solution”*

Challenges in AI Model Development

Accuracy

- Learning Verification
- Hyper parameter tuning

Development Time

- Streamlined AI Workflow – 4 bucket

Effective Testing

- AI V&V

Compatibility

- Integrated AI with MBD & Deployment portfolio

Maintainability

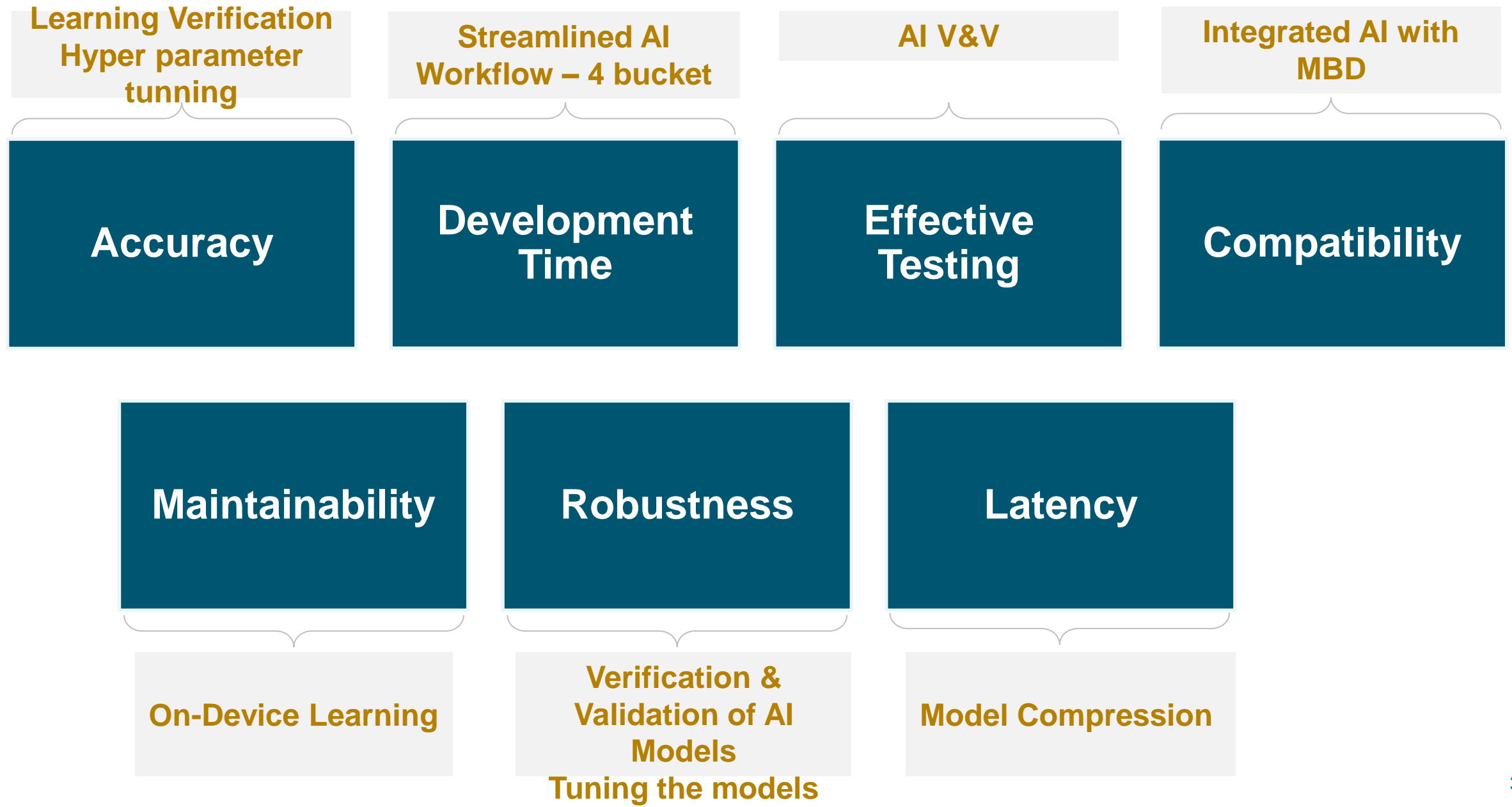
- On-Device Learning

Robustness

- Verification & Validation of AI Models
- Tuning the models

Latency

- Model Compression



Industry-Academia initiatives



Continental

1,698,549 followers

1mo • 🌐

+ Follow

At Continental, we believe in the power of partnerships to shape the future of mobility. Our collaboration with [Amrita Vishwa Vidyapeetham](#) and [MathWorks](#) reflects our commitment to bridging the gap between academia and industry, ensuring that future engineers are equipped with both cutting-edge knowledge and industry readiness.

Through the Automotive Systems and Layered Architecture course, students gain exposure to advanced automotive technologies such as [#AUTOSAR](#), a critical standard in the [#industry](#). By combining academic expertise with Continental's industry insights, we are creating an environment where students can develop the skills needed to address real-world challenges in automotive engineering.

This [#partnership](#) is not just about [#education](#) —it's about creating future-ready professionals who will lead the way in innovation. We are proud to support initiatives like this that empower the next generation, preparing them for the dynamic demands of the [#automotive](#) world.

[#Collaboration](#) and [#innovation](#) are smarter, safer [#future](#) for mobility at

[#ContinentalIndia](#) [#India](#) [#bangalore](#)

Bosch and National Institute of Technology Calicut Collaborate on EV Course to Prepare Students for Industry

Challenge

Address the shortage of automotive engineers with system engineering skills

Solution

Jointly create a new undergraduate course in model-based system engineering as part of a collaboration between academia and industry

Results

- Months of on-the-job training eliminated
- Enrollment increased by 250%
- 90%+ positive feedback received



Pradeep Kumar of Bosch India lighting the ceremonial lamp with Dr. Sivaji Chakravorti of NIT Calicut before signing the agreement.

"The collaboration between NIT Calicut, MathWorks, and Bosch narrowed the gap between academia and industry, producing an electric vehicle system engineering course that has been both well received by our students and highly useful for them as well."
- Dr. Kumaravel Sundaramoorthy, NIT Calicut

Upcoming course on SDV

Course Outcomes:

By the end of this course, students will be able to:

1. Understand the architecture and evolution of software-defined vehicles and their role in the automotive industry.
2. Analyze the components, systems, and communication protocols central to software-defined vehicles.
3. Apply software development and validation techniques specific to automotive applications.
4. Explore trends and emerging technologies shaping the future of software-defined vehicles.

Module 1: Introduction to Software-Defined Vehicles

Definition, significance, SDVs - Evolution, automotive technology, software-centric systems - Software-defined architecture - vehicle design, functionality

Module 2: Fundamentals of SDV Architecture and Components

SDV architecture, embedded systems, ECUs - Software platforms, methodologies, SDVs - Software development lifecycle (SDLC) - automotive engineering

Module 3: Communication, Connectivity, and ADAS in SDVs

V2V, V2I, V2X communication - In-vehicle networking, CAN, Ethernet - Advanced Driver Assistance Systems (ADAS) - key features - autonomous driving

Module 4: Software Development, Validation, and Future Trends

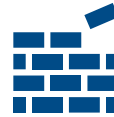
Software development, validation, testing, simulation, ISO 26262 - Case studies, practical implementations - Future trends, OTA updates, cloud-based platforms and Role of AI in SDVs

Key Summary...



Core Technology Foundation

Automotive software development **steadily incorporates AI**, focusing on **security, safety, resources, and business necessities.**



Integration with Legacy Systems

AI-based development can **seamlessly integrate into the traditional Model-Based design workflow.**

AI Model verification majorly focuses on **explainability, rigor, trust, and robustness.**



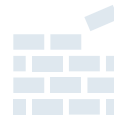
Deployment Challenges & Strategies

Various deployment options exist, but users must understand hardware limitations. Techniques are available to reduce the footprint, and "**on-device learning**" allows learning on the deployed hardware.



Industry & Academia Collaboration

Collaboration between academia and industry is **evolving to address existing challenges and bridge gaps** and can utilize multiple resources that are readily available.

Key Summary...Core Technology
FoundationIntegration with
Legacy SystemsDeployment Challenges
& StrategiesIndustry & Academia
Collaboration

Why not..! Start building your automotive software with AI models

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We are open to collaborate and support in your journey



Audience Question