

#### Modelling and Optimizing Complex Heterogeneous Architecture

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# Outline

- Overview of the MOCHA project
- Modelling of the system a digital-twining approach
- Key research questions we plan to address





## MOCHA – Background

- The applications, resources and architectures of realtime embedded systems are becoming ever more complex to understand, control and maintain.
- Traditional (static) methods are difficult to apply in heterogeneous MPSoC as:
  - Increased complexity in software design.
  - Difficulties in modelling, scheduling and analyzing the system.
- · Systems are hard to optimise
  - To understand how the software executes on the platform.
  - To design the MPSoC and then schedule / allocate the software.
- This has led the research into:
  - > building high-level models of systems.
  - > developing dynamic policies based on statistical models.





# System Modelling - a digital-twinning approach

- Realistic and configurable simulation.
- Supports varies of hardware/scheduler configurations.
- Supports large-scale evaluation and design space exploration.
- Profiling and data analysis for real systems.
- Allows the digital twin to be validated and refined.
- Delivers appropriate understanding of the systems so large-scale evaluations are representative



(\*) Picture from: https://job-wizards.com/en/digital-twins-doubling-the-potential-for-innovation

# MOCHA – Research vision

Our vision is to develop a set of statistical models and adaptive methods that can be applied to all layers (from application to platform) of a MPSoC system.

- 1. Application A high-validity digital twin for the timing aspects of a complex MPSoC systems built upon
  - Systematically profile the real system based on the significant factors.
  - Establish valid statistical models of the system.
  - A high-speed and configurable simulator for generic heterogeneous architectures.



## MOCHA – Research vision

Our vision is to develop a set of statistical models and adaptive methods that can be applied to all layers (from application to platform) of a MPSoC system.

- 2. Resource management Better control of systems execution and improved performance
  - Feedback-based task scheduling and allocation methods.
  - Configurable system policies, including the management of hardware resources, e.g., cache locking and scratch bad allocation.
  - Controlling back pressure of work coming into the main processors.



3. *Platform* – Later use the models for design space exploration of the platform itself

# MOCHA – Challenges

- Building realistic execution models with partial/limited information.
  - The scale of the studied system can be very large (millions lines of codes) with numerous execution scenarios.
  - Some information of the system from industrial partners is strictly confidential due to protection of intellectual properties and thus cannot be fully accessed.
- Refining the predicted models and the techniques to reflect all execution scenarios.
  - The predicted models are constructed based on limited information and cannot reflect the general case without further refinement.
- Producing error tolerant systems that can deal with inevitable differences between the models and the real systems
  - The predicted models may still behave differently from the actual system in corner cases and special situations.

## MOCHA – Challenges

- Building realistic execution models with limited information.
  - ✓ Choosing an appropriate abstraction level.
  - $\checkmark$  Identifying the most influential factors from the observations.
- Refining the predicted models and the techniques to reflect all execution scenarios.
  ✓ Identifying the key differences in the influential factors under different execution scenarios.
- Producing error tolerant systems that can deal with inevitable differences between the model and the real system
  - $\checkmark$  Understanding the trends in behaviour.
  - ✓ Identifying problematic/anomaly cases that might occur.
  - $\checkmark$  Determining the mitigation strategies to avoid faulty cases.

# System Modelling - a digital-twinning approach

- 1. Simulate and model actual application using profiling tools, and then create the digital twin.
- 2. Ensure the digital twin is valid with changing input workloads.
  - (Worst-Case) Execution Time models.
  - Cache (and memory) models.
- 3. Extend the digital twin to support multi-core scheduling with shared cache and memory.
  - Upgraded models with inter-thread/core effects.
- 4. Validate the digital twin against a real target.
  - Reproduce the scheduling and timing behavior.



#### **Open Research Questions**

- Scheduling and allocation of software task to caches / scratchpads and cores again well established.
- Design space exploration as part of MPSoC design are also well understood
  - *Robustness* How to assess the effect of inaccuracies and uncertain operational contexts on the models?
  - Sensitivities How to understand the sensitivities so the design can be made robust and the impact of errors understood?
  - *Predictability* How to assess the predictability of systems?
  - Scalability How to perform design space exploration for large numbers of configurations and scenarios?

# **Open Research Questions**

- Digital Twins (DT) is a well-established practice but what are the challenges around timing.
  - Acceptability What information can we realistically be expected to extract from a real system?
  - Accuracy What does it mean for a simulator to be accurate?
    - This very much depends on the questions to be answered with DT.
  - *Efficiency* What is the right level of abstraction for the model and the right type of feedback?
  - Success Is a successful solution one where the model has similar accuracy with less data (types and quantity) at a higher level of abstraction?
- Note
  - Some colleagues would not define the presented work as a DT as the changes to resource management are offline.
  - Do we have a shared definition of what a DT is?



#### Thank you for your attention!

The MOCHA Research Group