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# Fachprojekt for Embedded System: Design and Implement Your Own Embedded Systems (1)

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LS 12, TU Dortmund

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# Introduction

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- The Fachprojekt
  - Different topics related to Embedded System, Real-Time, and Machine Learning
  - Group work: 3 Students per group (8 groups in total)
  - Hand in a final report + give a presentation
- The supervisors
  - Junjie Shi and Mikail Yayla
  - Lea Schönberger, Christian Hakert, and Kuan-Hsun Chen
- Introduce yourselves for grouping (After the presentation)

# Topics

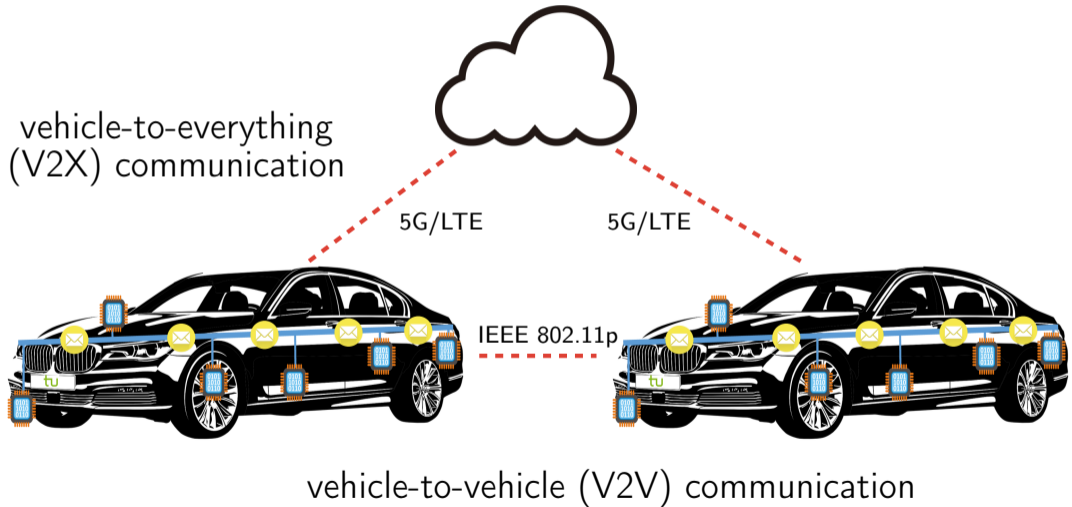
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- Simulating Security Attacks on Embedded Systems (2)
- Real-Time Scheduler Implementation on Unikraft (2)
- The Effect of Input Binarization on Neural Network Accuracy (2)
- Implementing Non-volatile Memory Error Models in PyTorch Tensor using CUDA Kernels (2)
- Implement A Multiprocessor Event-driven Simulator (1)
- Interactive Real-Time Gaming: Design a few games to demonstrate the real-time properties (2)

# Simulating Security Attacks on Embedded Systems

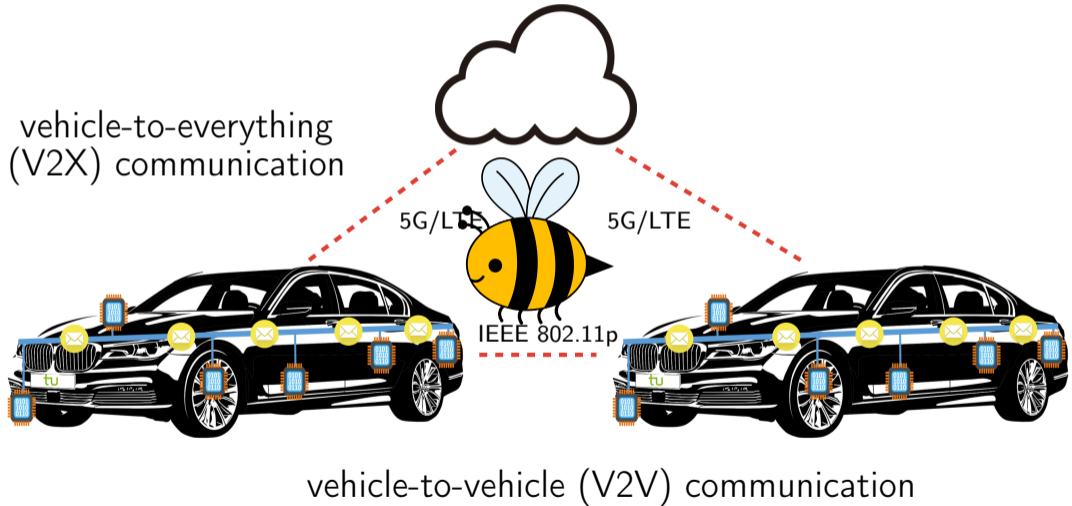
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# Motivational Example

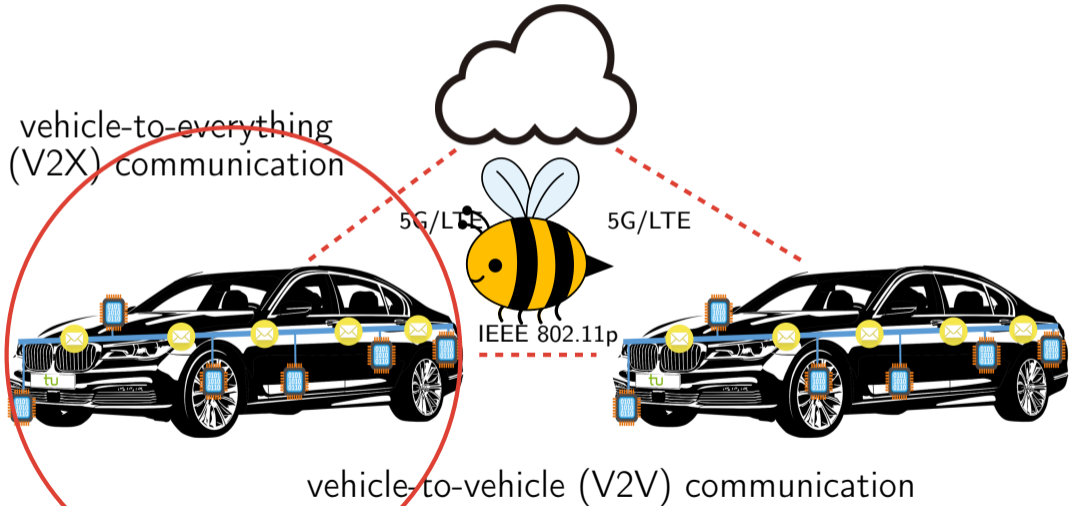


# Motivational Example

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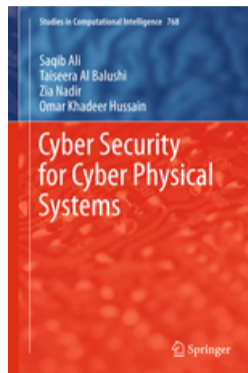
# Motivational Example



# Which threats and attacks exist?

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- denial of service attack (DOS)
- distributed denial of service attack (DDOS)
- hidden vehicle attack
- manipulation of sensor information
- privilege escalation attack
- ...





# Your Job

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- experimentally investigate the impact of different security attacks on cyber-physical systems
- choose or create a model in the robot simulator Gazebo<sup>1</sup>
- create a simple Controller Area Network (CAN) with the discrete event simulation library OMNeT++<sup>2</sup>
- connect your model and your network
- try out various security attacks, investigate their impact, document the results



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<sup>1</sup><http://gazebosim.org/>

<sup>2</sup><https://omnetpp.org/>

# Required Skills

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- knowledge of C++ (or the strong motivation to learn it)

# Real-Time Scheduler Implementation on Unikraft

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## Why real-time scheduling?

- Some systems rely on computing tasks to complete within a given time
  - Automotive and aeronautic systems
  - Flight control, emergency systems
- "If a task misses its deadline, a catastrophe happens"

# Real-Time Scheduler Implementation on Unikraft

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## Why Unikraft?

- Real-time systems are controlled by embedded system nowadays
- Unikraft is a operating system, designed for embedded systems
- Library structure makes Unikraft configurable, support many libraries and apps

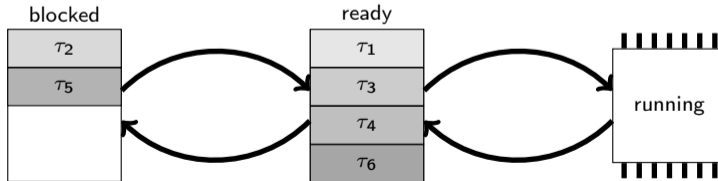
## Real-time scheduling in a nutshell

- A timer generates an interrupt every  $x$  ms
- Real-time tasks are either ready (want to compute), running (currently computing) or blocked (do not want to compute)
- At each timer tick, tasks are moved between read, running and blocked state
- The running task is chosen from the ready list according to the highest priority

# Real-Time Scheduler Implementation on Unikraft

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# Real-Time Scheduler Implementation on Unikraft

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## What to do?

- Hardware implementation
  - Setup the timer interrupt
  - Implement the context switch
- Scheduler implementation
  - Keep tasks in data structures
  - Move them on every tick between the lists
  - Choose according to priority
- Task Scheduler interface
  - Tasks may be created, started, stopped
  - Tasks may want to go to sleep

# Real-Time Scheduler Implementation on Unikraft

## What to do?

- Hardware implementation
  - Setup the timer interrupt
  - Implement the context switch
- Scheduler implementation
  - **we only implement a minimal real-time scheduler**
  - **NO advanced functions like mutexes, semaphores, ...**
  - **NO early completion, yielding, ...**
- Task Scheduler interface
  - Tasks may be created, started, stopped
  - Tasks may want to go to sleep

**DON'T PANIC**



# Implement NVM Error Models in PyTorch Tensor using CUDA Kernels

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## Why NVM as main memory?

- DRAM is reaching a plateau
- NVMs use no power during idle time and retain information, no refreshes needed
- NVM performance/cost is getting closer to DRAM

## The NVM-OMA Project: NVM as both main memory and storage

- OMA-OS
- NVM error models and application level error tolerance

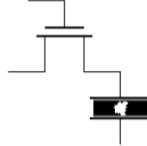
# Emerging NVMs: Introduction

FeFET



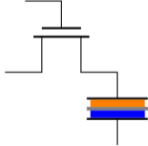
- State: Permanent polarisation in ferroelectric
- Polarization reversed by external electric field

RRAM



- Form/reset defects in material
- More current can flow when defect formed

STT-RAM



- State: Spin orientation of electrons in magnetic layer
- Change orientation by spin polarization

PCM



- Material state amorphous or crystalline
- Applying heat changes state and resistance

# Bit Errors in Emerging NVMs

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## Emerging NVMs have bit errors

- FeFET: High temperature  $\rightarrow p_{01} = 2.1\%$  and  $p_{10} = 1.1\%$  (Amrouch, 2020)
- RRAM: Low power programming setting  $\rightarrow 3.3\%$  (Hirtzlin et al., 2019)
- STT-RAM: Lower programming energy  $\rightarrow$  higher bit error rate (Hirtzlin et al., 2019)
- MLC-PCM: Resistance drift  $\rightarrow$  after  $t_d$ , cell drifts to other programming state (Papandreou et al., 2010)

## Bit error tolerant applications

- Error tolerant applications have lower requirements on memory
- Some algorithms can be optimized for error tolerance (Artificial Neural Networks)

# PyTorch and CUDA GPU Kernels

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## PyTorch

- Open source machine learning library (primarily developed by FAIR)
- Tensor computing like in Numpy, but with extensive use of GPU
- Deep neural network tools
- Used by a large fraction of researchers that work with neural networks

## Nvidia CUDA Kernels

- PyTorch relies on CUDA for parallel computing tasks
- CUDA is a parallel computing model and framework for parallel computing
- For orchestrating the processing of parallel workloads with CUDA kernels

# Implement NVM Error Models in PyTorch Tensor using CUDA Kernels

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## Tasks and goals

- Goal: Provide a collection of efficient NVM bit error model implementations in PyTorch Tensor
- Conduct literature review on error models of different NVMs
- Prepare a simulation framework, in which bit flips are injected according to the bit error models into PyTorch tensors, using custom CUDA kernels

# The Effect of Input Binarization on Neural Network Accuracy

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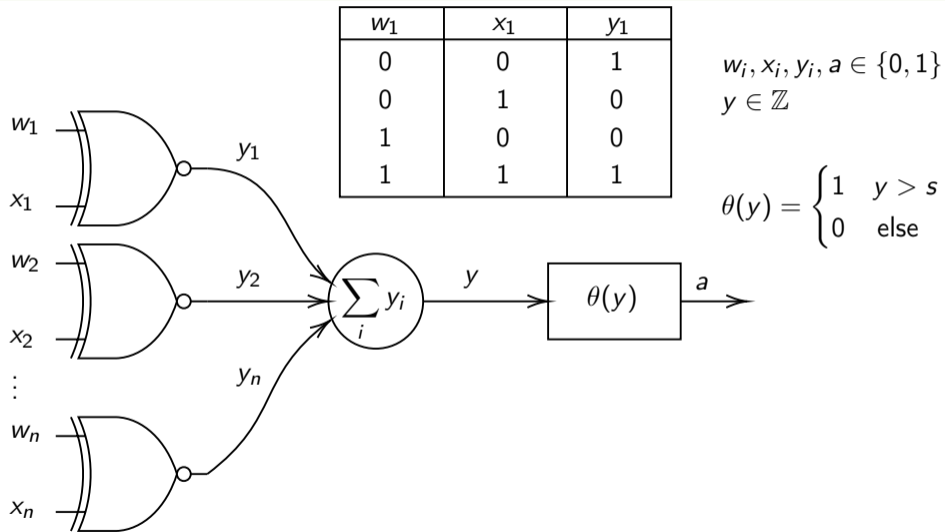
## Artificial neural networks

- Broadly applied in numerous fields
- In ES and CPS, NNs are deployed on resource-constrained devices, such as battery-powered and mobile systems
- Managing the resource demand of NNs is a challenge, especially the memory (too many weights)

## Efficient NNs

- Quantization and binarization of weights
- Convolutions become XNOR operations
- Realization in hardware is simple and efficient
- What about the first layer ?

# Binarized Neural Networks: Basics (Hubara et al., 2016)



# For XNOR in First Layer, Input Binarization is Needed

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## Tasks and goals

- Goal: Create an overview of different binarization techniques and their corresponding effects on NN accuracy
- Binarization algorithms for the input (stochastic, otsu, thresholding, ...)
- Datasets (MNIST, Fashion, CIFAR10, SVHN, ...)
- Prepare own training and evaluation scripts, NN models, and input binarization methods

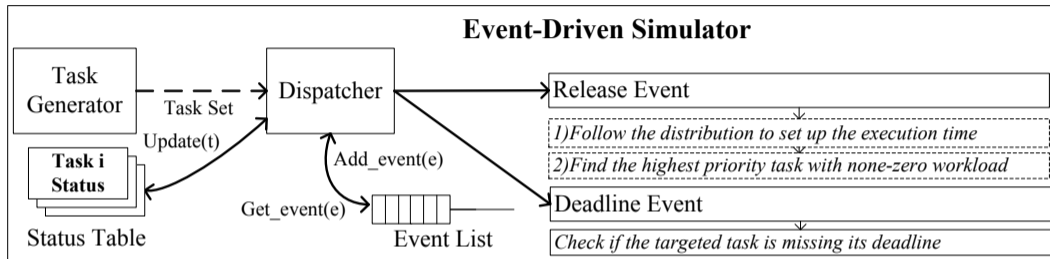


# Implement A Multiprocessor Event-driven Simulator

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- Timeliness is an important feature for many embedded systems.
- Simulate deadline miss rate for a specific sporadic real-time task under fixed-priority preemptive scheduling.
- Consider randomly generated task sets with an execution behavior that simulates jobs that are subjected to soft errors incurred by hardware transient faults under a given fault rate.

# Implement A Multiprocessor Event-driven Simulator



- based on Python2.7
- Only support uni-processor environment
- two basic events, i.e., release and deadline

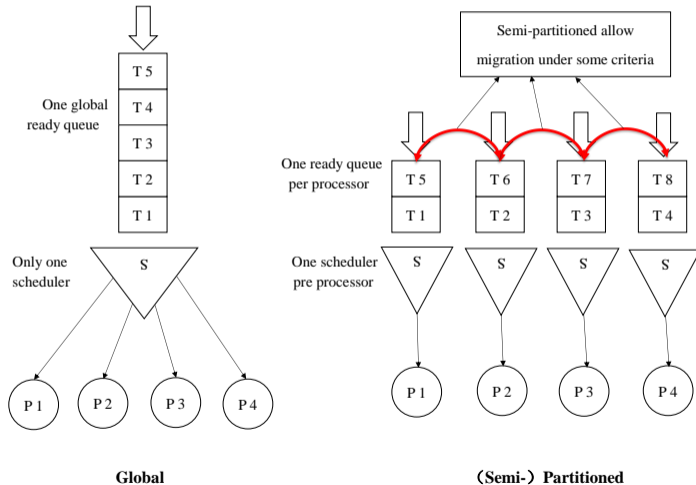
# Implement A Multiprocessor Event-driven Simulator

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- Task Generator: Outputs a set of generated tasks under a given utilization value.
- Dispatcher: It checks if the number of released jobs from the targeted task is equal to the targeted number. If not, it continues to dispatch the next event from the event list.
- Event List: This linked list keeps track of the following events in the simulated task system. When a new event is inserted by another release event, the events in the list are sorted by their future occurring time.
- Status Table: It records the number of deadline misses, the number of released jobs, and the remaining work- load for each unfinished job of a task.

# Implement A Multiprocessor Event-driven Simulator

Schedule algorithms for multi-processor real-time systems:



# Implement A Multiprocessor Event-driven Simulator

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What you have to do:

- Convert the python version from 2.7 to 3.6
- Extend the uni-processor environment to multiprocessor environment
- Support different type of multiprocessor schedule algorithms

# Interactive Real-Time Gaming

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Design game(s) based on FreeRTOS emulator to demonstrate the real-time properties.

- FreeRTOS:
  - Tiny, power-saving kernel
  - Support 40+ architectures, i.e., RISC-V and ARMv8-M
  - Modular libraries
  - IoT Reference Integrations
  - MIT licensed, free for teaching
- Emulator:
  - hardware or software that enables one computer system (host) to behave like another computer system (guest)
  - enables the host system to run software or devices designed for the guest system

# Interactive Real-Time Gaming

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## FreeRTOS Emulator:

- An implementation of POSIX based FreeRTOS with the combination of SDL2 graphics. Aimed at providing an x86 emulation solution for teaching FreeRTOS to students without the need of embedded hardware
- Based on the FreeRTOS (V5.X) simulator developed by William Davy. Updated to use FreeRTOS V9.0.0
- More details can be found in: <https://github.com/alxhoff/FreeRTOS-Emulator>

# Interactive Real-Time Gaming

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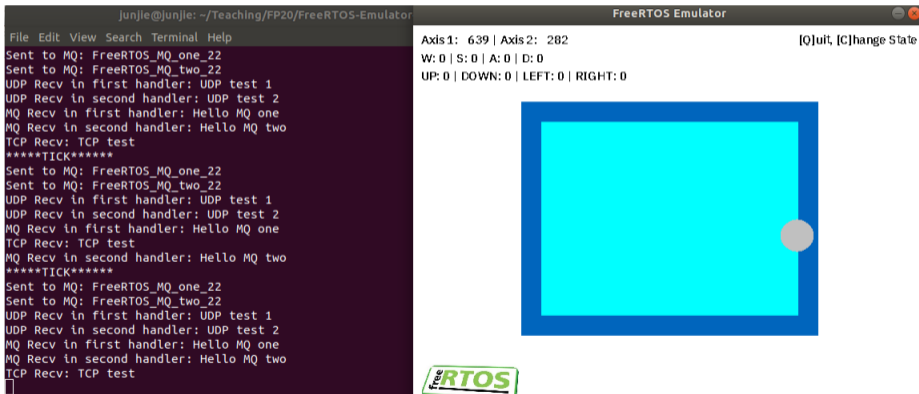
Examples:



# Interactive Real-Time Gaming

## Examples:

- Demo




The screenshot displays the FreeRTOS Emulator interface. On the left is a terminal window with a dark background and white text, showing a sequence of network and system events. On the right is a game window with a white background, featuring a cyan square with a blue border and a grey circle on its right side. The emulator's title bar and menu bar are visible at the top.

```
Junjie@Junjie: ~/Teaching/FP20/FreeRTOS-Emulator FreeRTOS Emulator
File Edit View Search Terminal Help
Sent to MQ: FreeRTOS_MQ_one_22
Sent to MQ: FreeRTOS_MQ_two_22
UDP Recv in first handler: UDP test 1
UDP Recv in second handler: UDP test 2
MQ Recv in first handler: Hello MQ one
MQ Recv in second handler: Hello MQ two
TCP Recv: TCP test
*****TICK*****
Sent to MQ: FreeRTOS_MQ_one_22
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TCP Recv: TCP test
```

Axis1: 639 | Axis2: 282  
W: 0 | S: 0 | A: 0 | D: 0  
UP: 0 | DOWN: 0 | LEFT: 0 | RIGHT: 0

[Q]uit, [C]hange State



# Interactive Real-Time Gaming

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Examples:

- Demo
- Pong Game

