

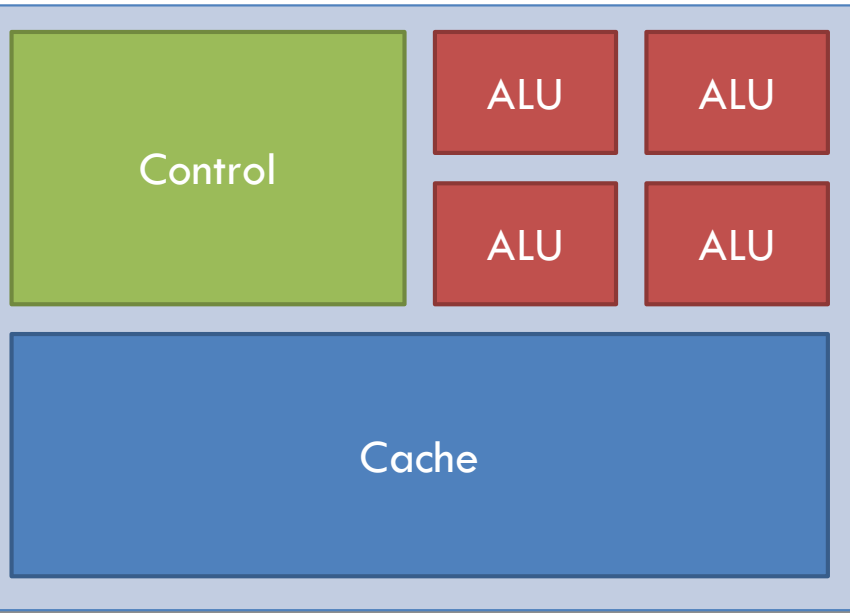
# CPU + GPU HETEROGENEOUS COMPUTING (THE LAB)

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# CPU + GPU

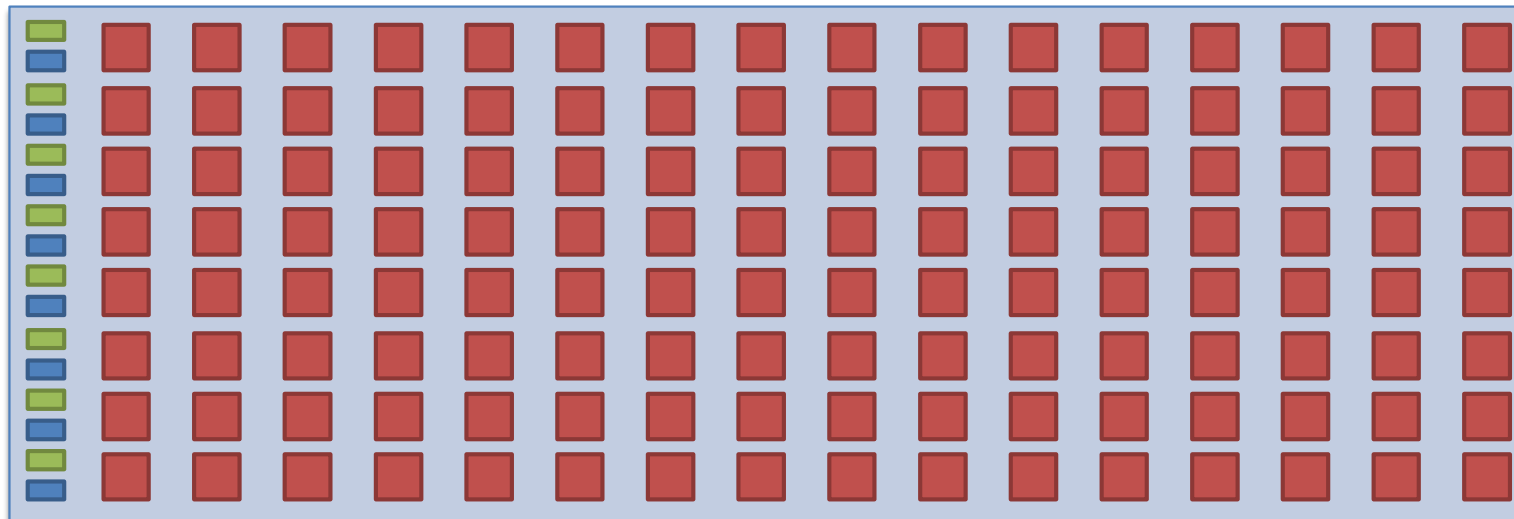


## CPU

Low latency, high flexibility.  
Excellent for irregular codes with limited parallelism.

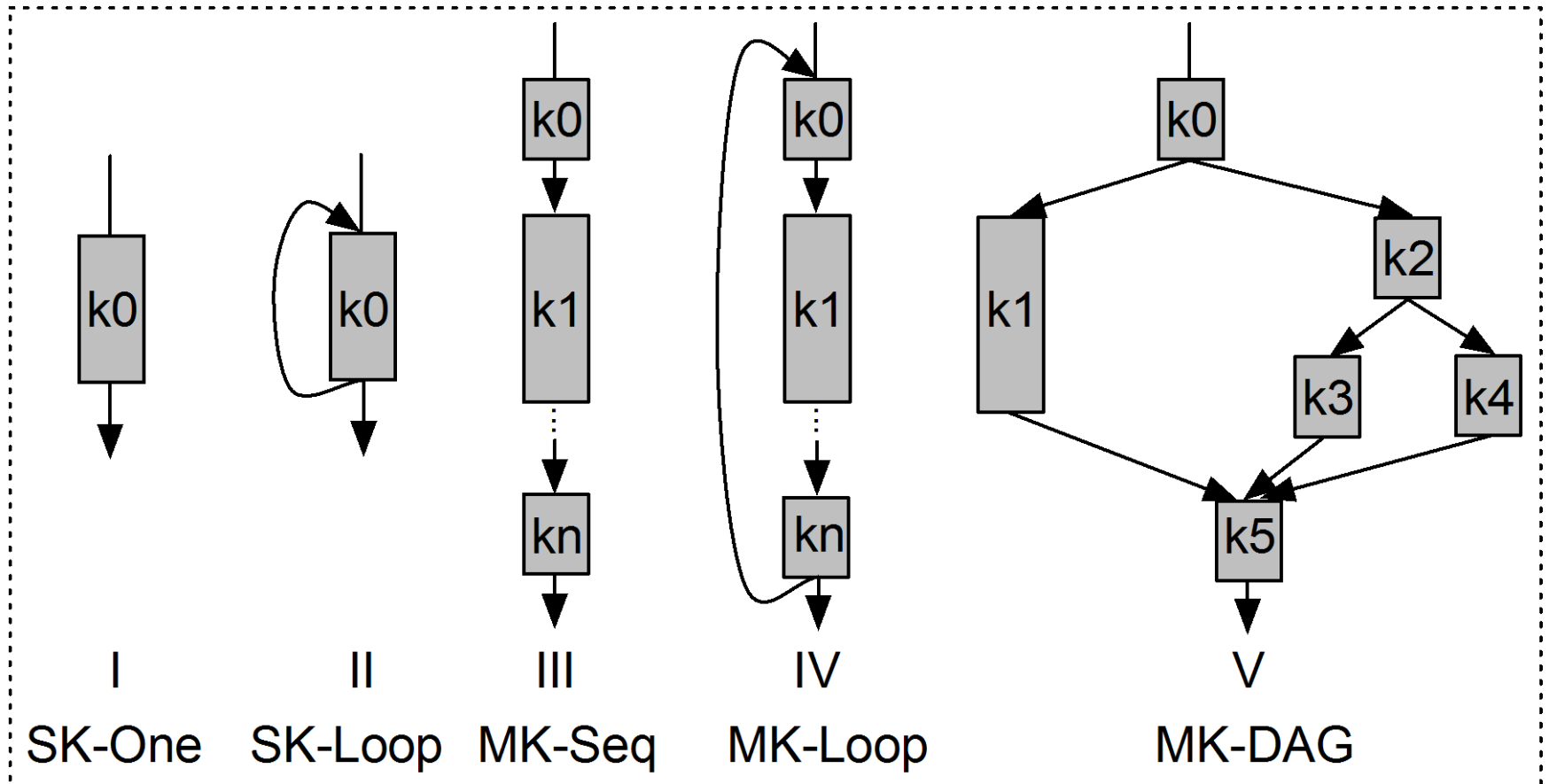
## GPU

High throughput.  
Excellent for massively parallel workloads.



# Workload

- DAG (directed acyclic graph) of “kernels”





# Two main challenges

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- How to **program** the workload in a “user-friendly” and “heterogeneity-friendly” way
  - ▣ Unified programming models ?
  - ▣ Low- or high-level ?
  - ▣ ...
- How to **split** the work between the different processors
  - ▣ Static
  - ▣ Dynamic
  - ▣ Hybrid ... ?

# (1) Heterogeneous Computing PMs

High productivity; not all applications are easy to implement.

Domain and/or application specific. Focus on: productivity and performance

**OpenACC, OpenMP 4.0**  
**OmpSS, StarPU, ...**  
**HPL**

**HyGraph,**  
**Cashmere,**  
**GlassWing**

Generic

Specific

**OpenCL**  
**OpenMP+CUDA**

**TOTEM**

The most common atm. Useful for performance, more difficult to use in practice

High level  
Low level

Domain specific, focus on performance. More difficult to use.

# Heterogeneous Computing today

Limited applicability.  
Low overhead => high performance

Not interesting,  
given that static &  
run-time based  
systems exist.

Qilin, Insieme, SKMD,  
**Glinda**, ...

Sporadic attempts  
and light runtime  
systems

Static

Dynamic

Only **Glinda**, only for  
pipeline-like DAGs.

Run-time based systems:  
**StarPU**  
**OmpSS**  
**HyGraph**

Improved applicability, but  
remains limited.  
Low overhead => high  
performance

High Applicability,  
potentially high  
overhead

Multi-kernel  
(complex) DAG

Single  
kernel

# The lab

- Three application (classes)
  - ▣ Single-kernel: matrix multiplication
  - ▣ Multi-kernel: image processing pipeline
  - ▣ Domain-specific: graph processing
  
- Given code templates
  - ▣ Fill in the blanks
  - ▣ Compare & improve
  - ▣ Reflect

# Practicalities

My email:  
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- Where ?
  - ▣ DAS5 (<http://www.cs.vu.nl/das5/>)
    - Ask me for \*temporary\* accounts
- What ?
  - ▣ Code + basic report
- When ?
  - ▣ Deadlines given earlier
- What if ...
  - ▣ “I want my own project?” – OK on a case-by-case basis
  - ▣ “I don’t know programming?” – it will be difficult