



# Project A2

## Algorithmic aspects of learning methods in embedded systems

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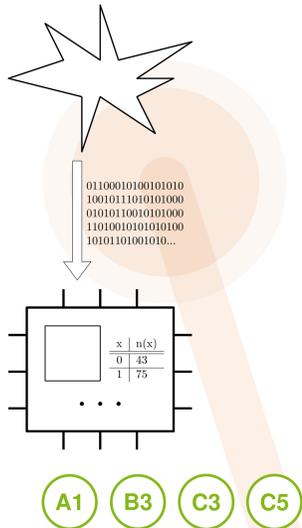
Problem

### Streaming Algorithms

Often in continuous settings

- ▶ Big Data (Volume, Velocity)
- ▶ Little resources (Memory, CPU)

Maintain up-to-date model

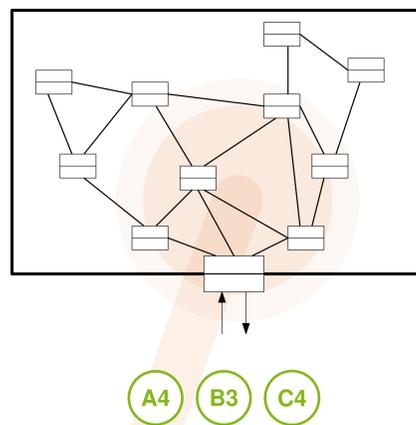


### Distributed Algorithms

Often in larger amounts

- ▶ Big Data (Volume, Variety)
- ▶ No centrality

Establish central model



### Energy Consumption

Power consumption as most important design constraint for computer systems

- ▶ Embedded systems and servers

Embedded systems

- ▶ Battery life
- ▶ Ubiquitous computing (sensors)

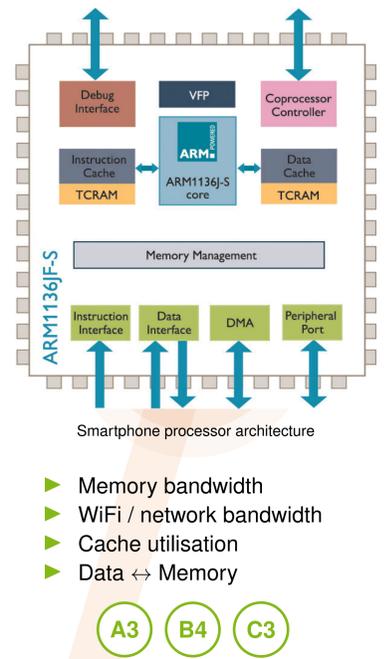


Servers / chip design

- ▶ High transistor densities cause excessive heat
- Specialised circuits (data-parallel units, SFUs)
- Power-off parts of the chip (dark silicon)



### Computation and Communication Architecture



Planned Research

### Merge & Reduce Paradigm

Applicable in streaming and distributed settings

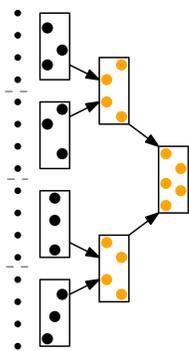
- ▶ Use of M&R dependent on problem, not input
- ▶ E.g.  $k$ -median,  $k$ -means

(Coresets for) logistic regression

- ▶ Rules out strongly sublinear space → no streaming
- ▶ Strategy: Make reasonable assumptions on the input

(Coresets in) distributed settings

- ▶ Input may (need to) have certain properties
- ▶ Subsets (on nodes) may not → Establish properties by exchanging points?



### Efficient Use of Communication Resources

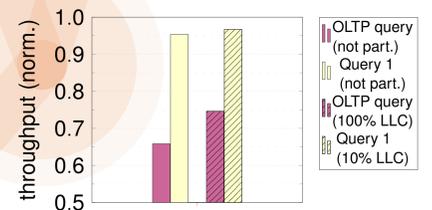
Balance demands for communication resources

- ▶ Avoid spending energy for underutilised resources (e.g. frequency scaling)
- ▶ Devise resources only when there is a gain (E.g. can the algorithm benefit from higher bandwidth?)
- ▶ Lower execution times (static power)

Example: Cache partitioning

[Noll et al., ICDE'18]:

- ▶ Partition cache for concurrent workloads
- ▶ Avoid mutual negative effects between cache polluters and cache beneficiaries
- Improve cache utilisation



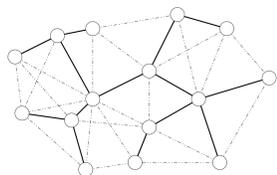
Partitioning reduces side-effects

How can we improve energy-efficiency with regard to different aspects of communication architectures (e.g. network, data placement) ?

### Distributed Algorithms and Energy Consumption

Find efficient data summary trees in networks (e.g. WSNs)

- ▶ Various spanning tree and clustering algorithms available
- ▶ Empirical results, no (theoretical) energy model so far



Strategy: Use task graph scheduling techniques

- ▶ Task graph  $\rightsquigarrow$  Merge & Reduce tree
- ▶ Costs measure from Bingham and Greenstreet 2008:  $ET^\alpha = dist^{\alpha+1}$

### Streaming Algorithms and Computation Architecture

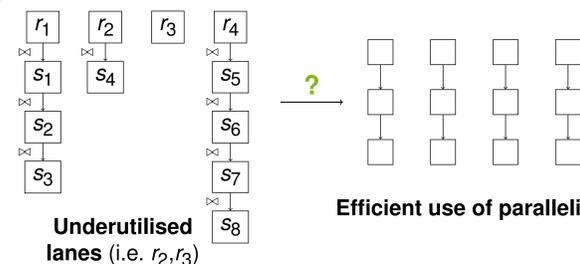
Analyse algorithms adaptability in resource utilisation/demand

- ▶ Cache size (constants in  $\mathcal{O}$ -notation) → Cache allocation
- ▶ Single/special purpose processing units

### Data-parallel Computation Architectures

Skewed distributions cause control flow divergence → inefficiency

Example: join skew for  $R \bowtie S$  with 4 parallel lanes



### Communication Architectures for Merge & Reduce

Resource-aware architectures

- ▶ Merge-phase: Communication/bandwidth hungry
- ▶ Reduce-phase: Compute hungry

Strategy: Devise architecture along resource demands

