

# Predicting Power Consumption of High-Memory-Bandwidth Workloads

Norbert Schmitt

Jóakim v. Kistowski

Samuel Kounev

Chair of Software Engineering

University of Würzburg

<http://se.informatik.uni-wuerzburg.de/>

- 3% of the entire US energy consumption is estimated to be caused by data centers



**Server  
Efficiency  
Rating  
Tool**

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- High-Memory-Bandwidth Workloads are among the most power consuming applications

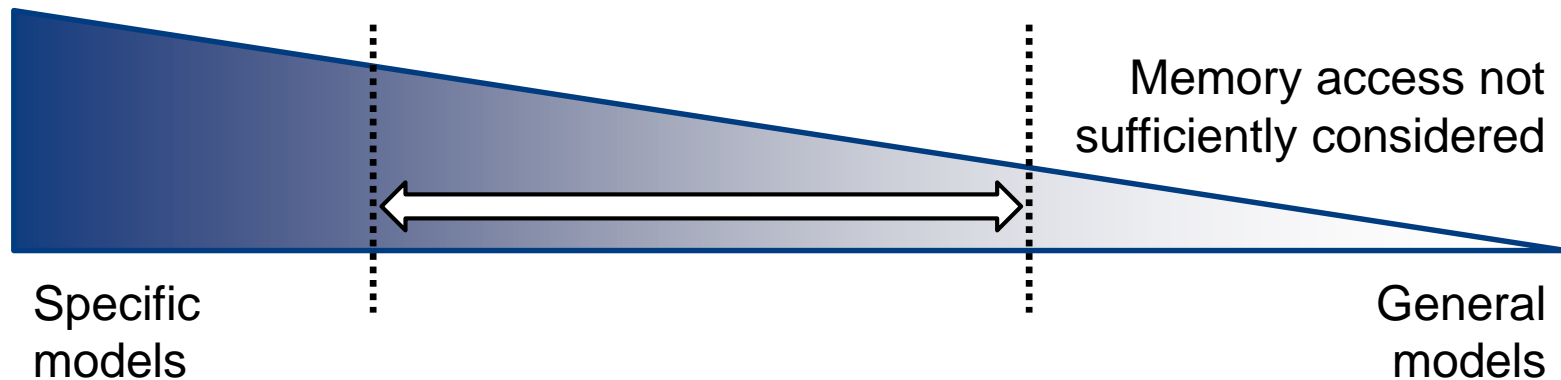
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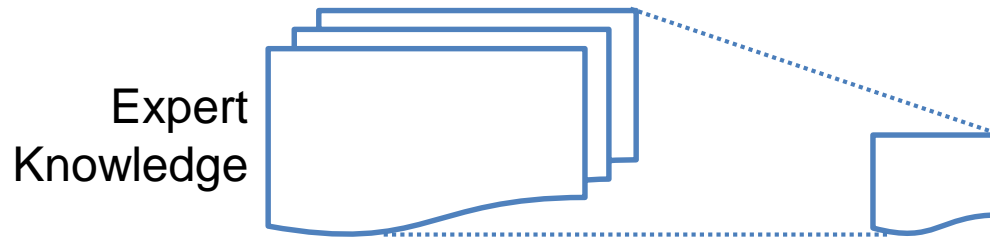
**Server  
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- High-Memory-Bandwidth Workloads are among the most power consuming applications
- Gap between detailed and general prediction models

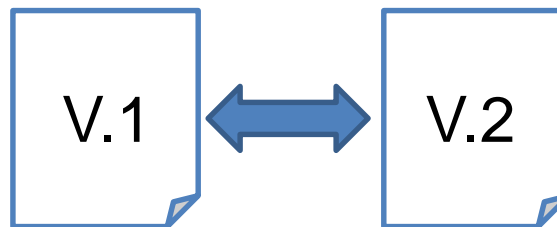
Detailed hardware  
information necessary



- Accurate power prediction with as less expert knowledge as possible

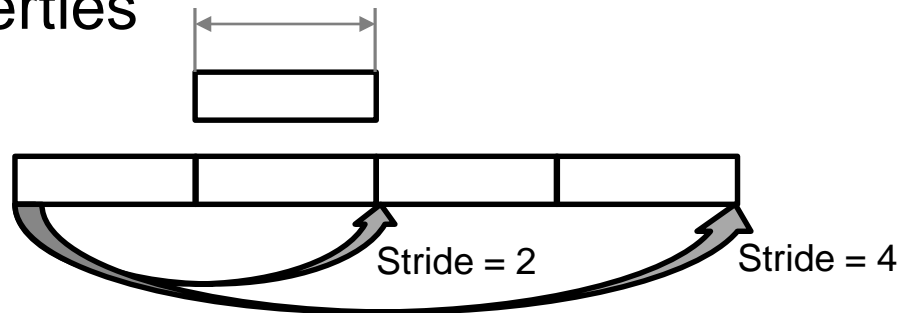


- Relative comparison of two different software versions without expert knowledge



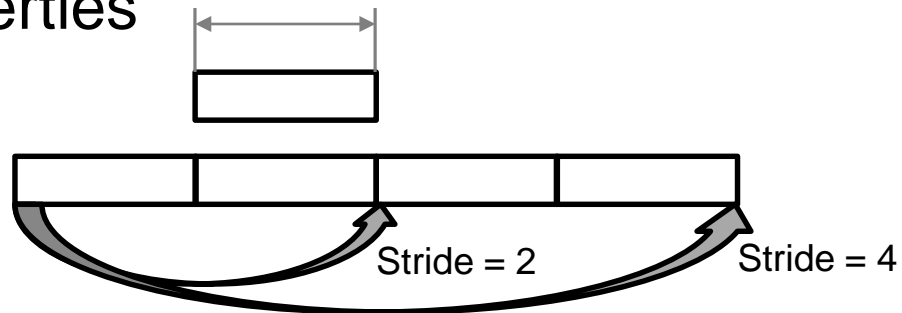
- We propose a model based on memory access software properties

- Datasize
- Stride

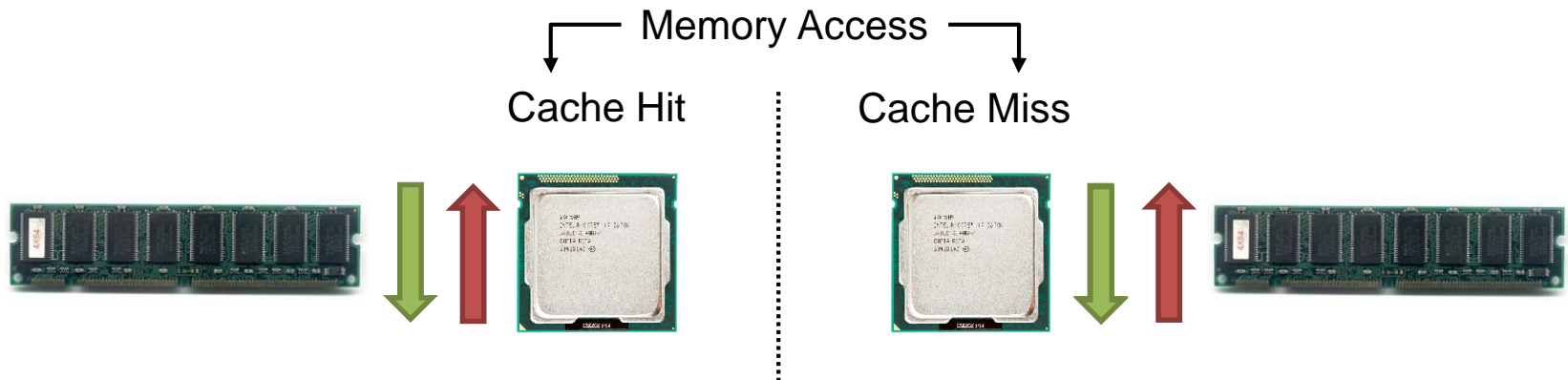


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- Assumption: Larger data types and bigger steps in data traversal cause lower CPU power consumption



- We want to predict

- Total system power:  $pwr(sys)$

- CPU power:  $pwr(CPU)$

- Memory power can be derived through

$$pwr(mem) = pwr(sys) - pwr(CPU) - pwr(idle)$$

$$pwr(CPU) = pwr_{min}(CPU) + (pwr_{max}(CPU) - pwr_{min}(CPU)) * p$$

$$pwr(sys) = pwr_{min}(sys) + (pwr_{max}(sys) - pwr_{min}(sys)) * p$$

$$p = \frac{datasize * stride}{cachesize} * inverseprefetcheraccuracy$$

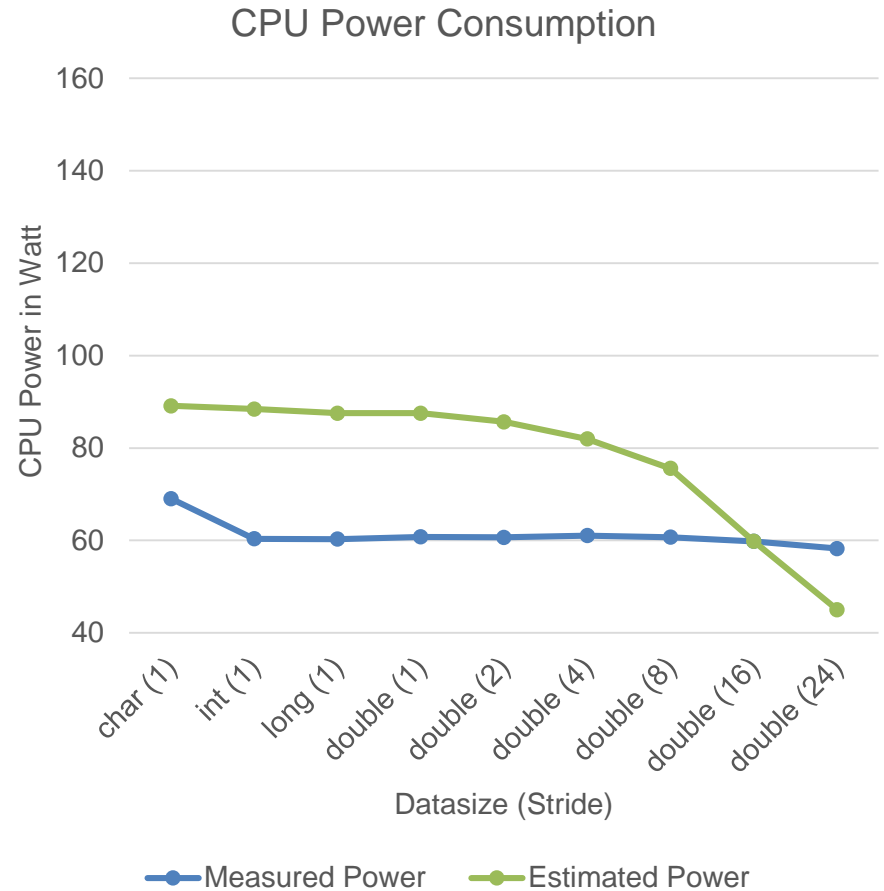
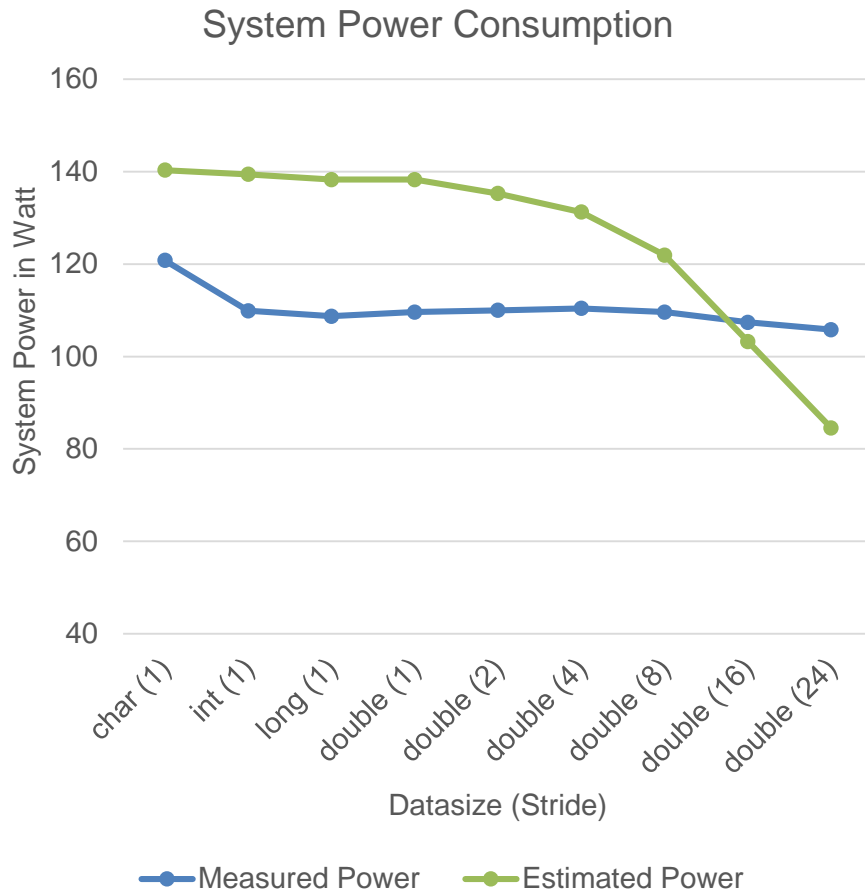
- One hardware parameter needed for  $p$  allows for

- Compare relative results if hardware specific parameters are replaced with standard values

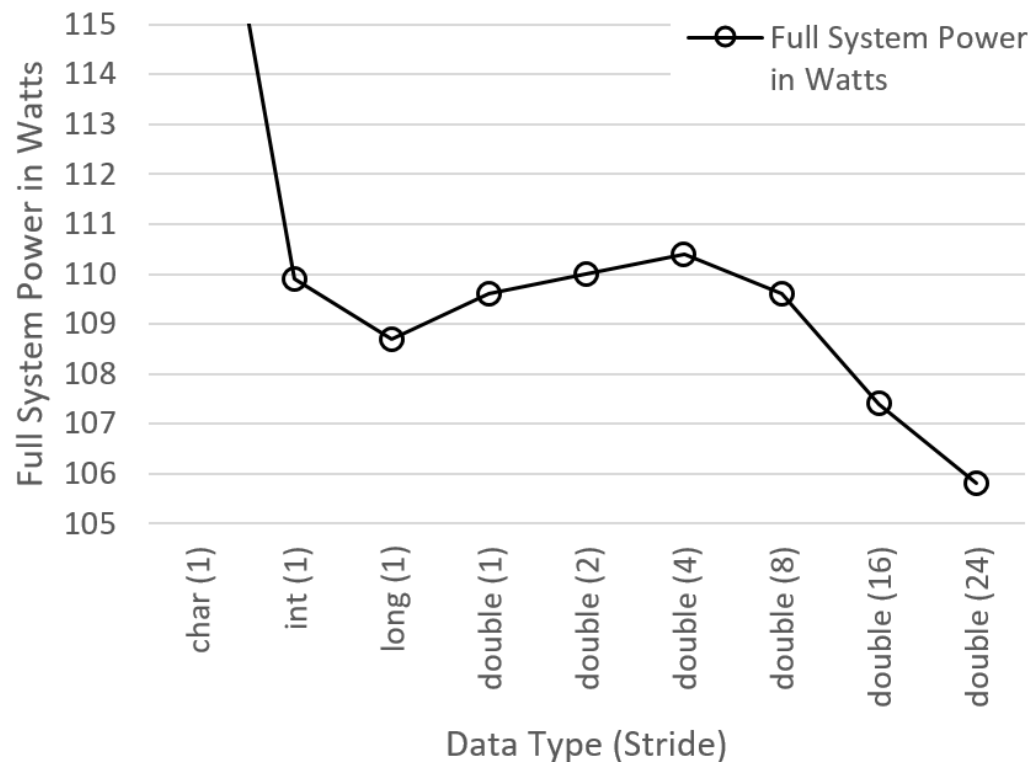
- Predict absolute power consumption when hardware parameters are selected



- Comparison of measured and estimated CPU and System power consumption



- Power consumption is not monotonically decreasing as expected
- Power consumption is decreasing when cache line size is exceeded (`double(8)`)



- We want to develop a new simple model that is aimed at bridging the gap between system specific models and generic models
- Allowing software developers to predict the relative change of power consumption
- Predict power consumption of high-bandwidth workloads with minimum expertise

# Questions?

[norbert.schmitt@uni-wuerzburg.de](mailto:norbert.schmitt@uni-wuerzburg.de)