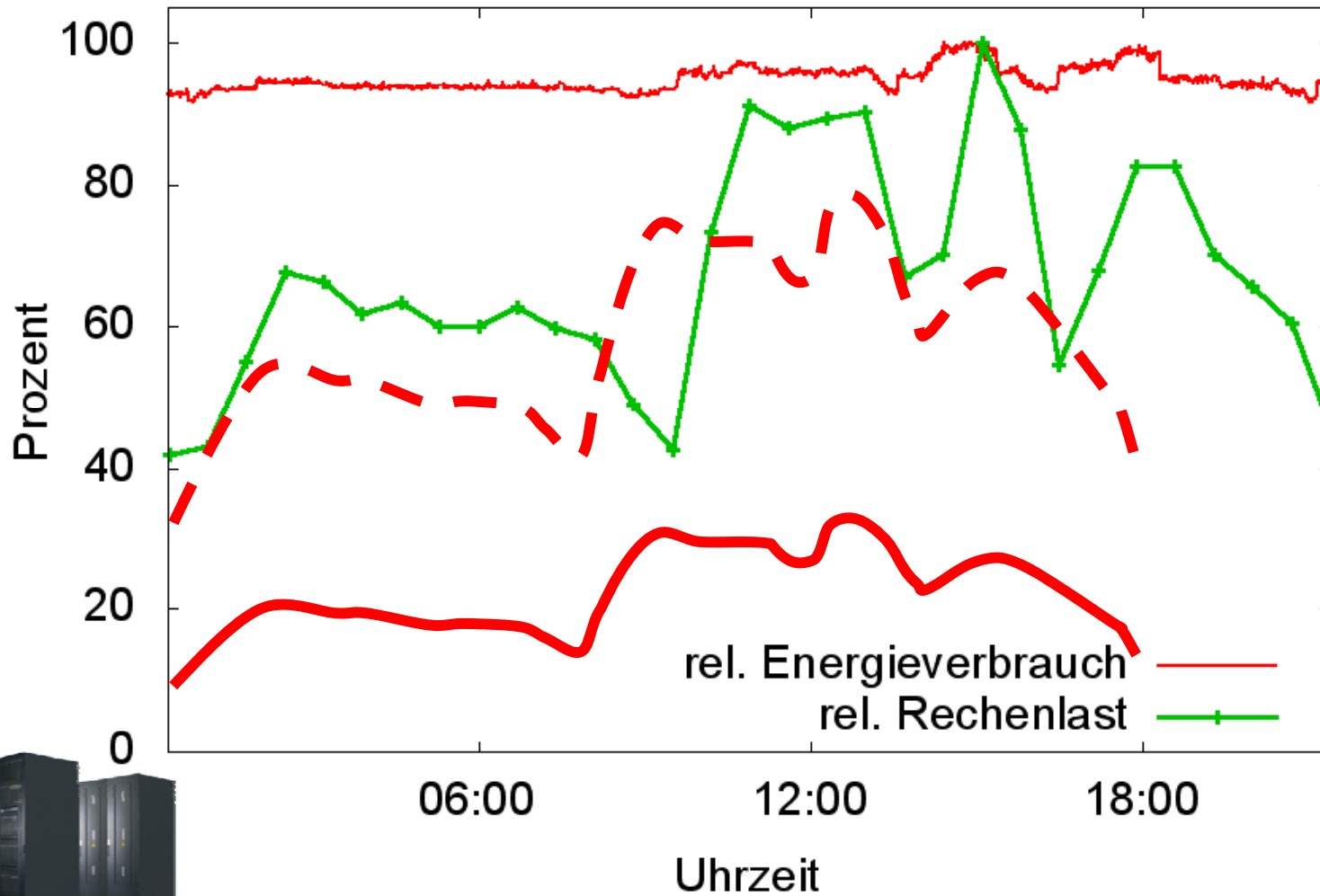


**Energy-Aware Service Execution**  
**LCN 2011, Bonn, Germany**  
**October 4, 2011**

**Waltenegus Dargie**  
**TU Dresden**  
**Chair of Computer Networks**

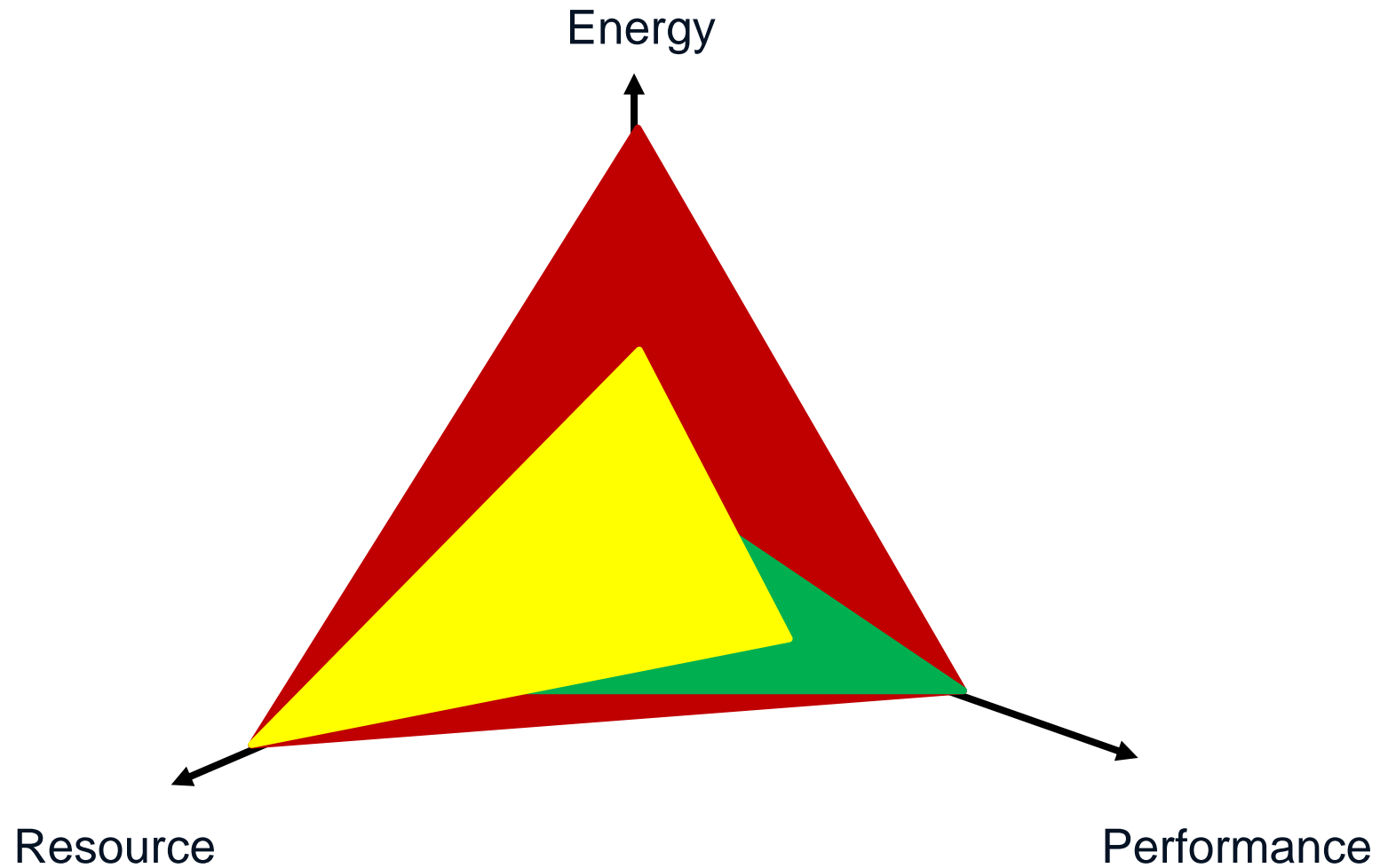
- **Motivation**
- **Related Work**
- **Proposed Architecture**
- **Quantifying the energy cost of service execution**
- **Probabilistic Models**
- **The Cost of Service Execution**
- **Open issues**
- **Conclusion**

# Energy Proportionality



Center for Information Services and High Performance Computing, TU Dresden)  
Measurement on June 20, 2008

# Motivation



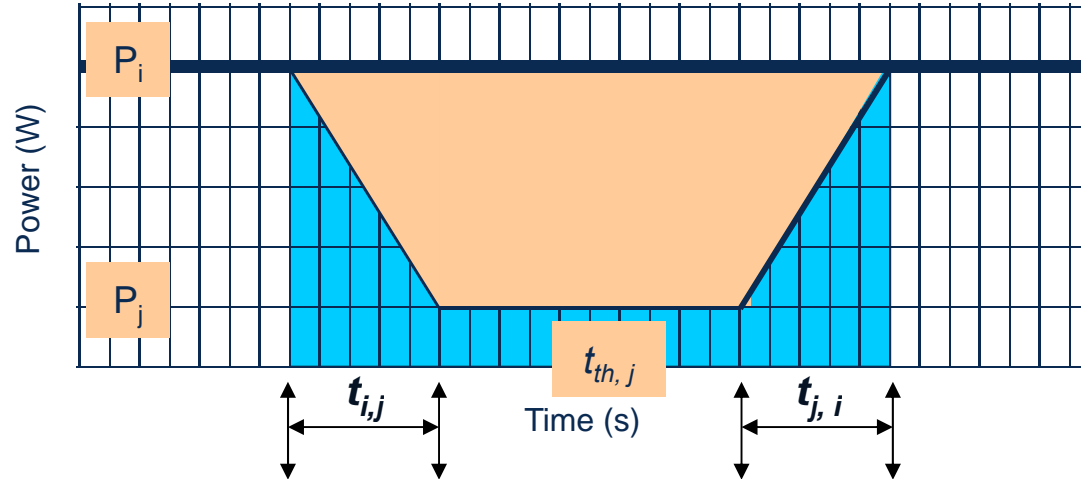
# Related Work

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- **Qualitative description of the energy consumption of hardware devices**
  - CPU, memory, high speed data busses, hard disk, communication
- **Dynamic power management algorithms**
  - Service consolidation, selective switching, dynamic voltage and frequency scaling

- **Our focus is mainly on *when* instead of *how* to undertake dynamic power management.**
- **We undertake adaptation based on *fine grained estimation* of the energy (power) consumption of individual service requests.**
  - **In other words services are being adapted instead of virtual machines**

# Related Work

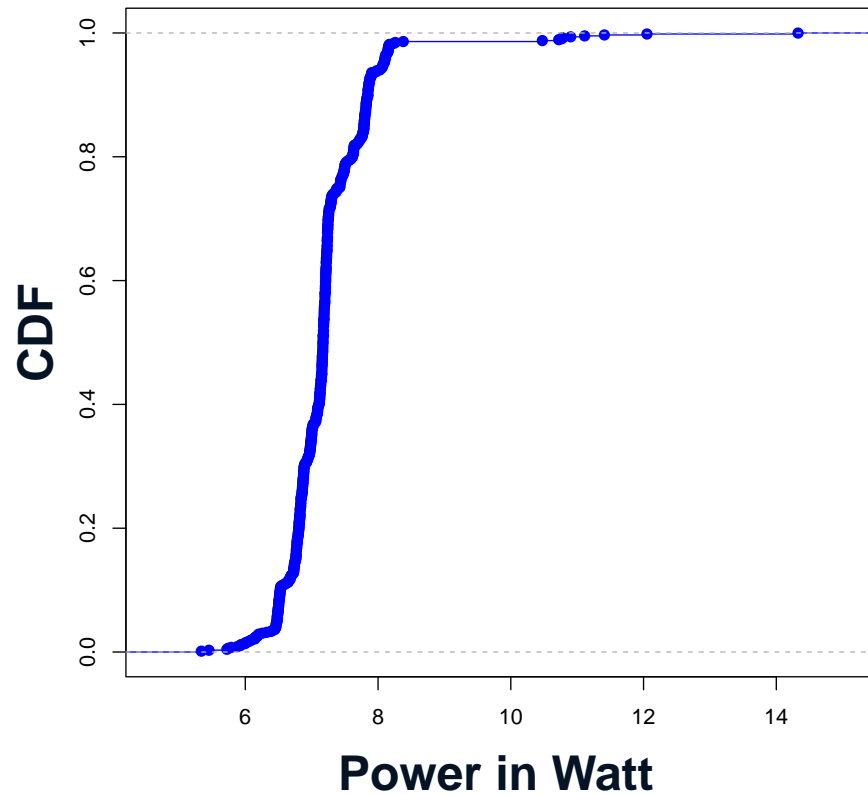


$$E_j^{saved} = P_i (t_j + t_{i,j} + t_{j,i}) - [P_{i,j} \times t_{i,j} + P_{j,i} \times t_{j,i} + P_j \times t_j]$$

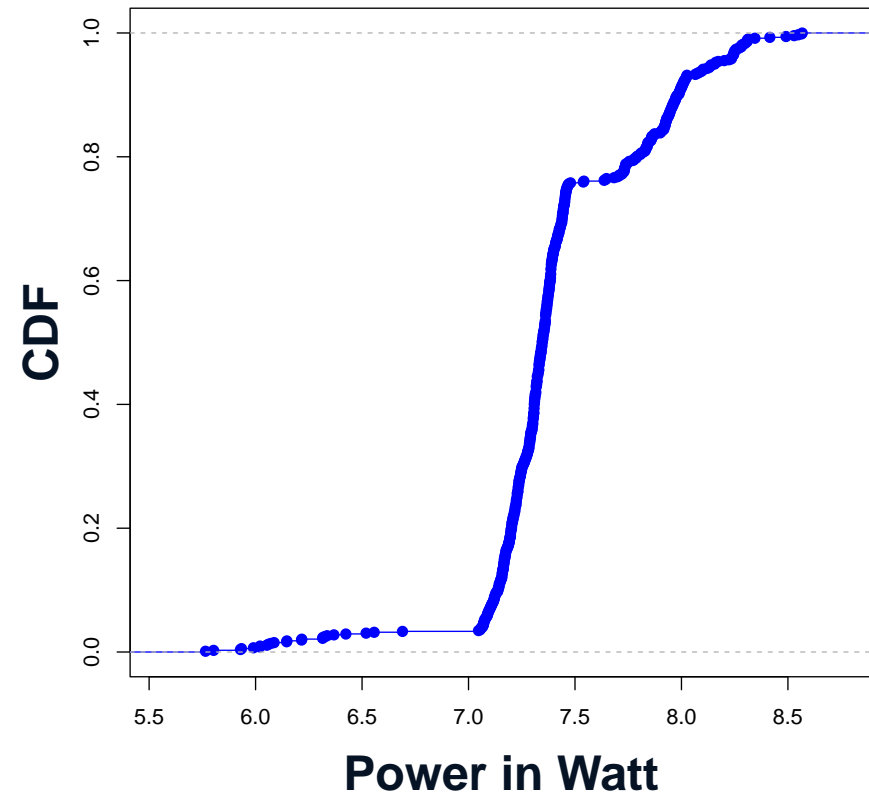
$$t_{th,j} \geq \max \left( 0, \frac{(P_i - P_{i,j}) t_{j,i}}{(P_j - P_i)} \right)$$

# Transition Cost (Power)

Transition Power: Motherboard: 12V

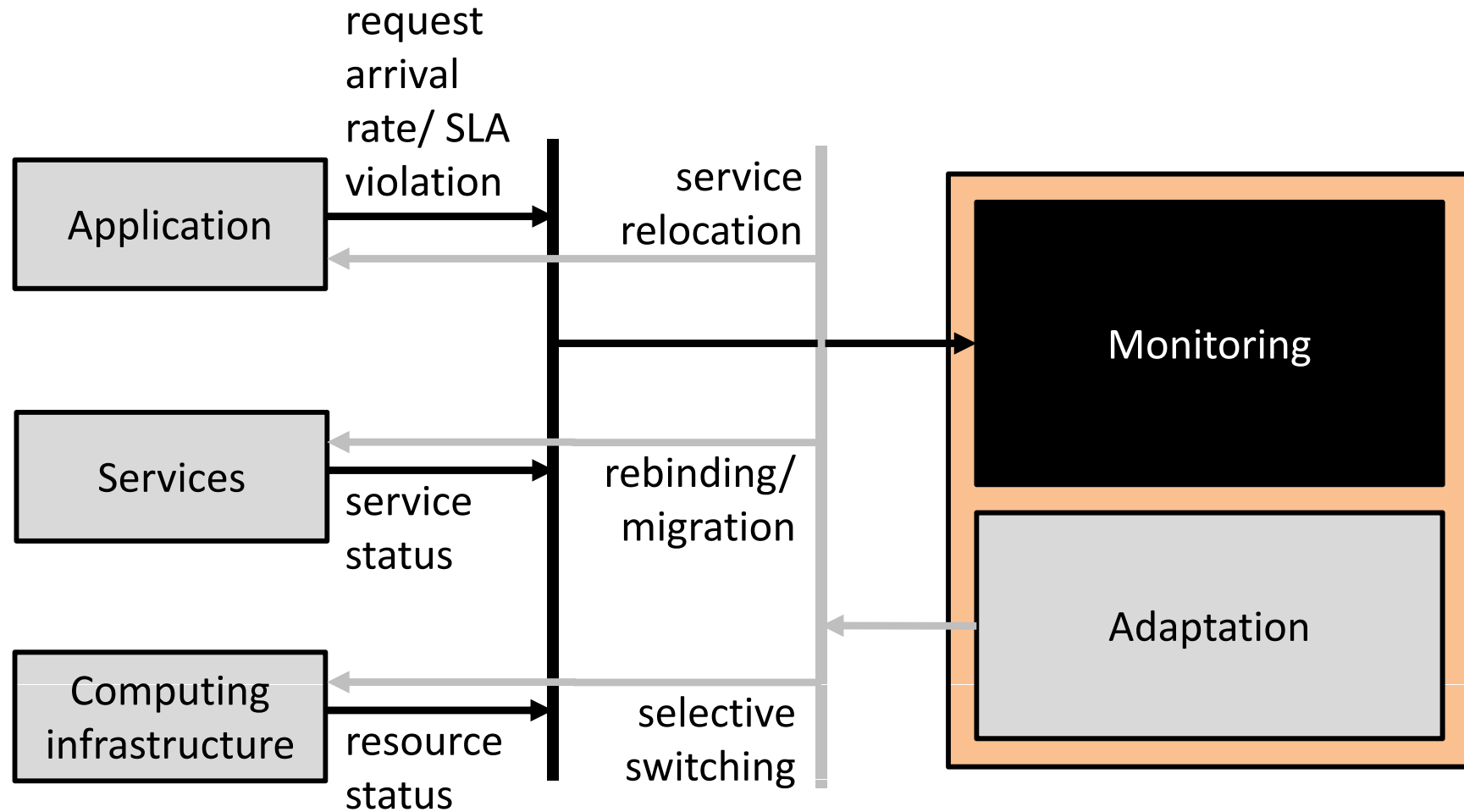


Transition Power: CPU

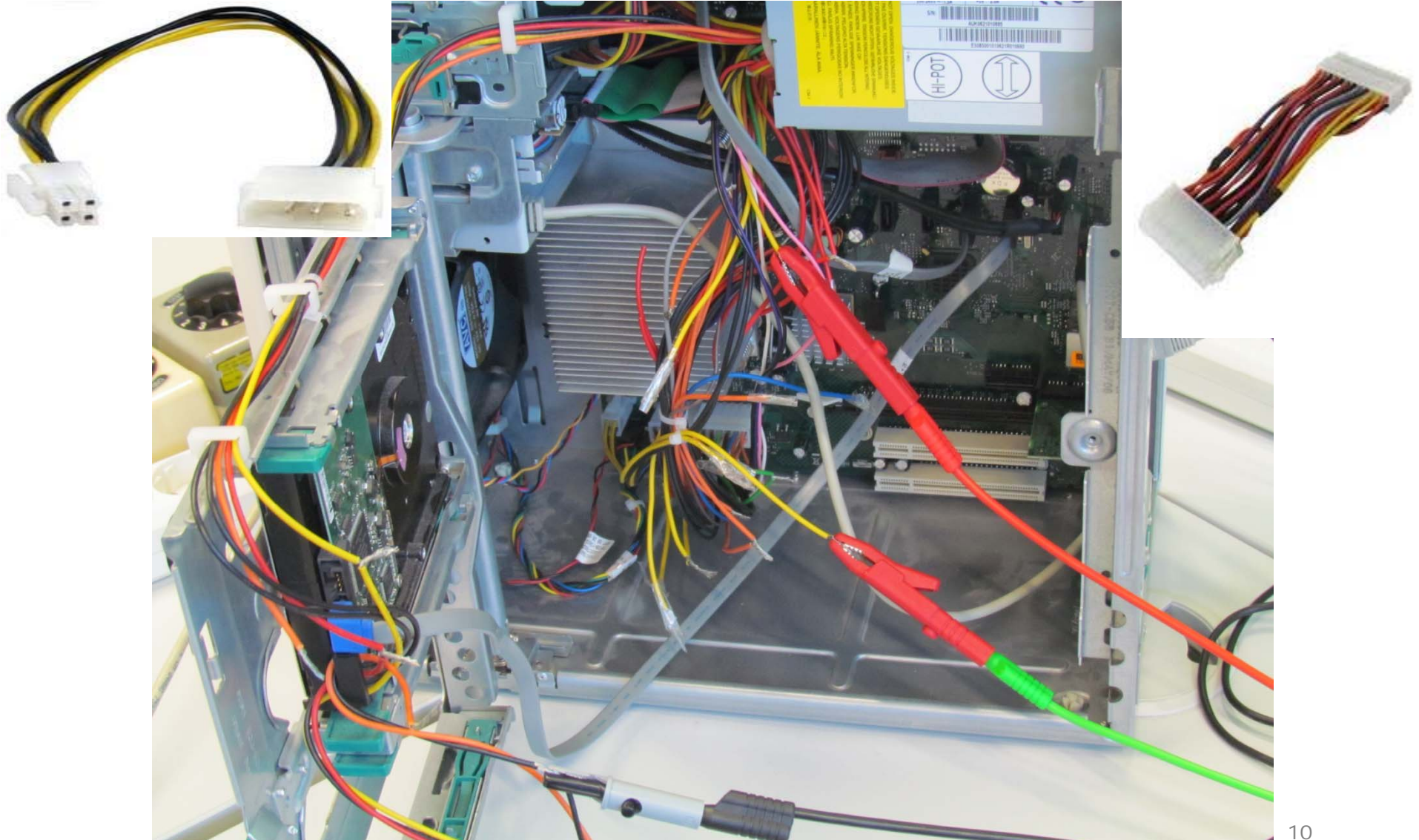




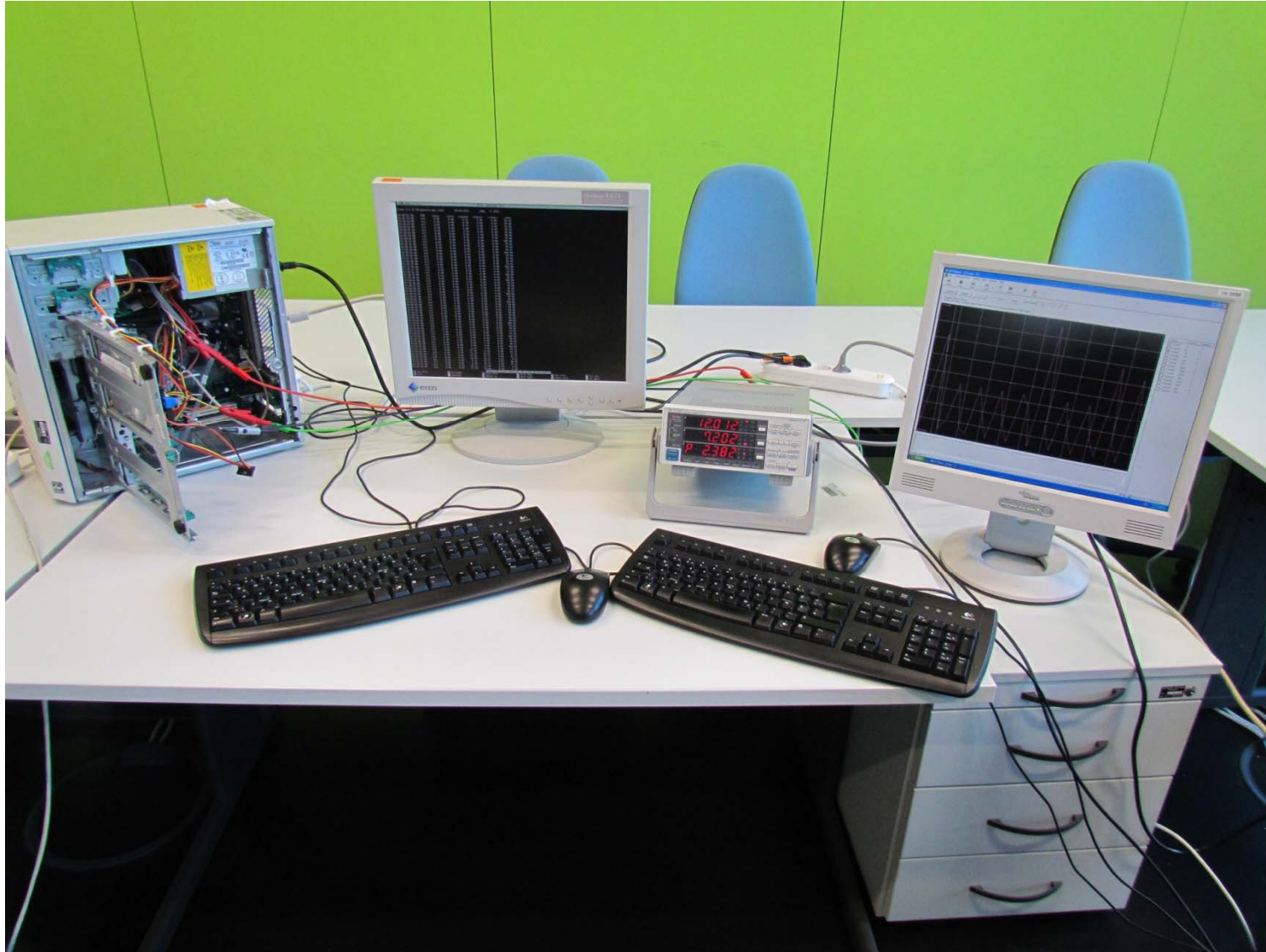
# Proposed Architecture



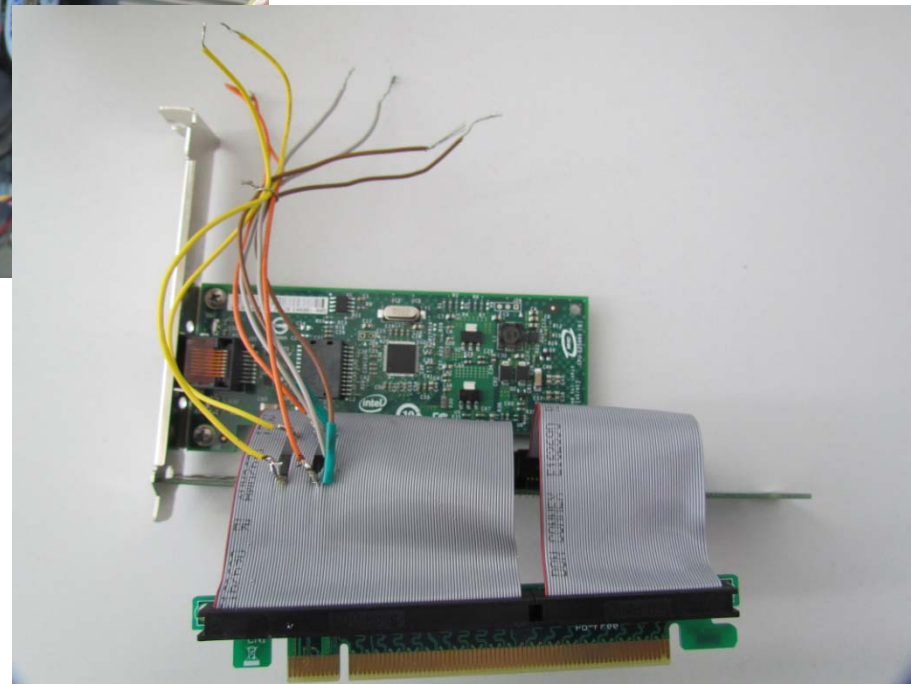
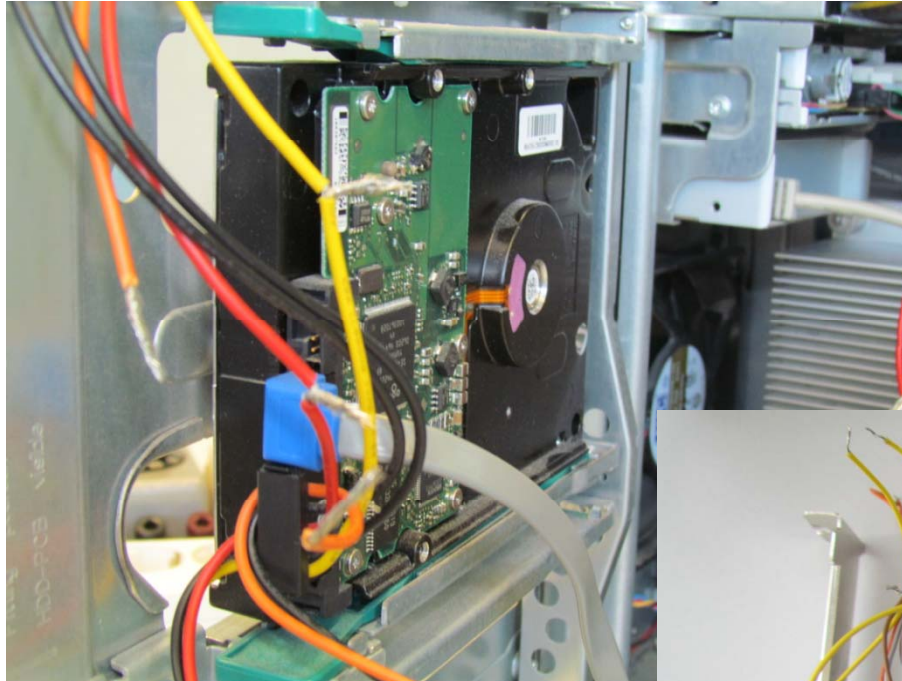
# Measurement Setting



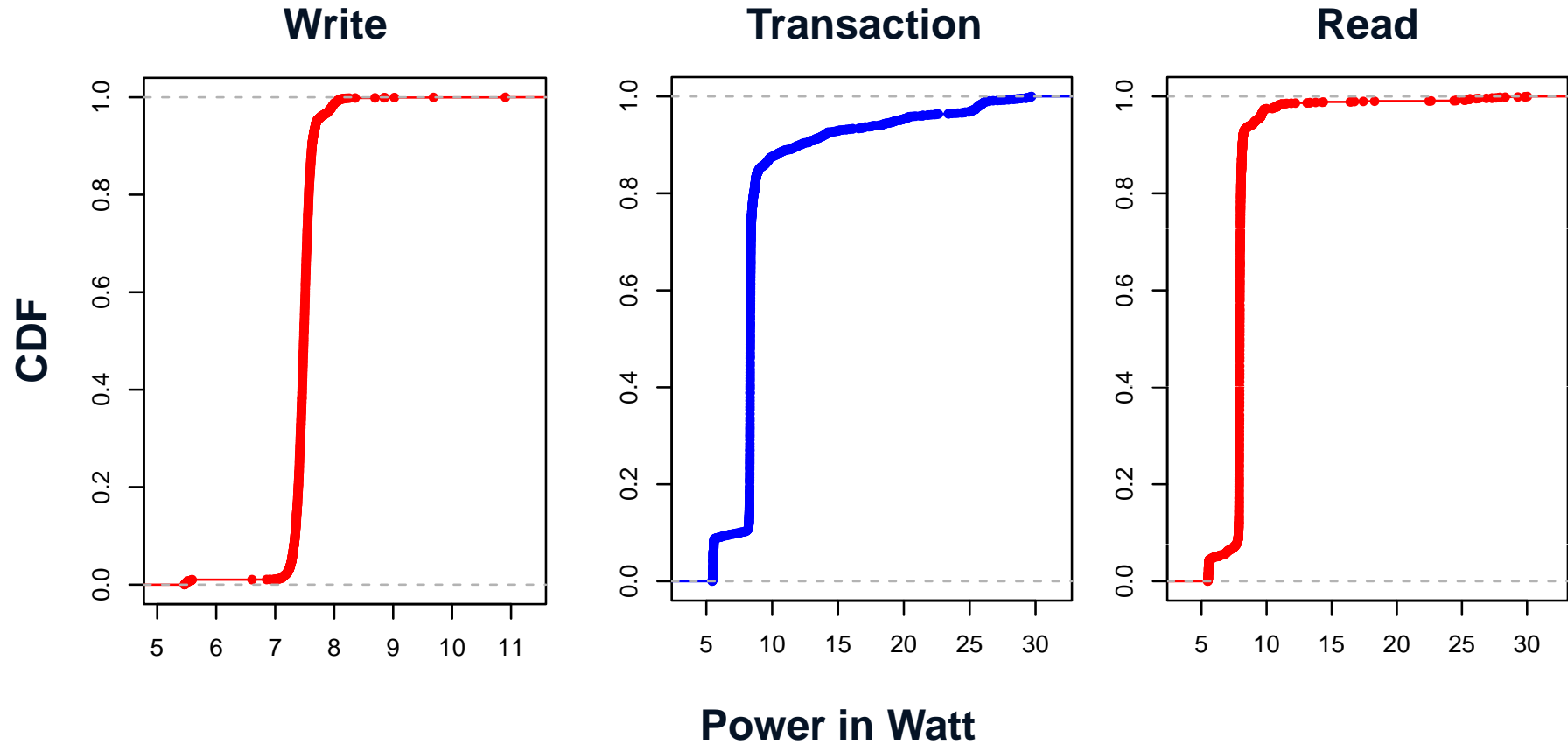
# Measurement Setting



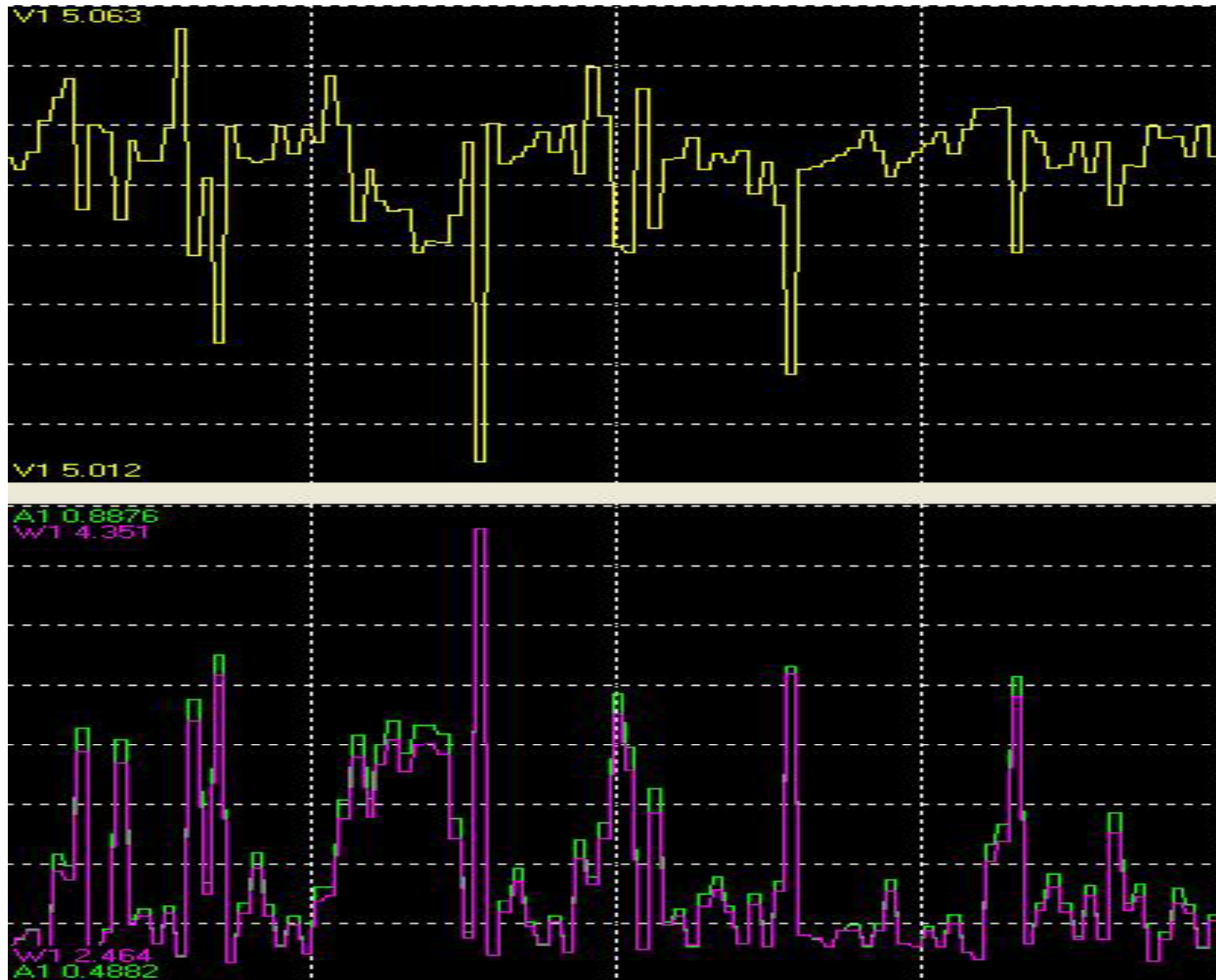
# Measurement Setting



# Execution Cost (Power)

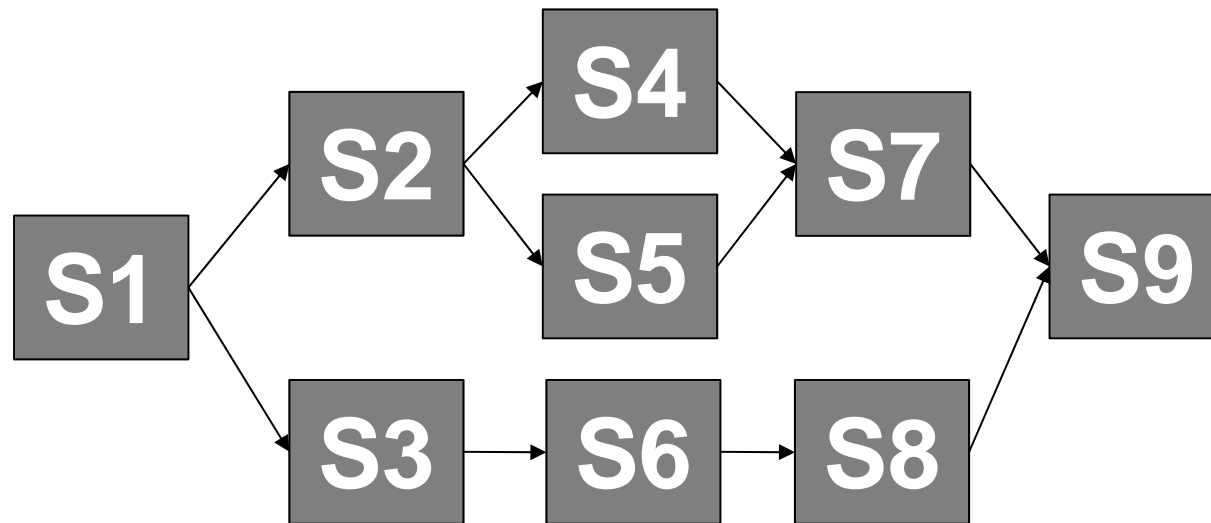


# Power Supply Efficiency



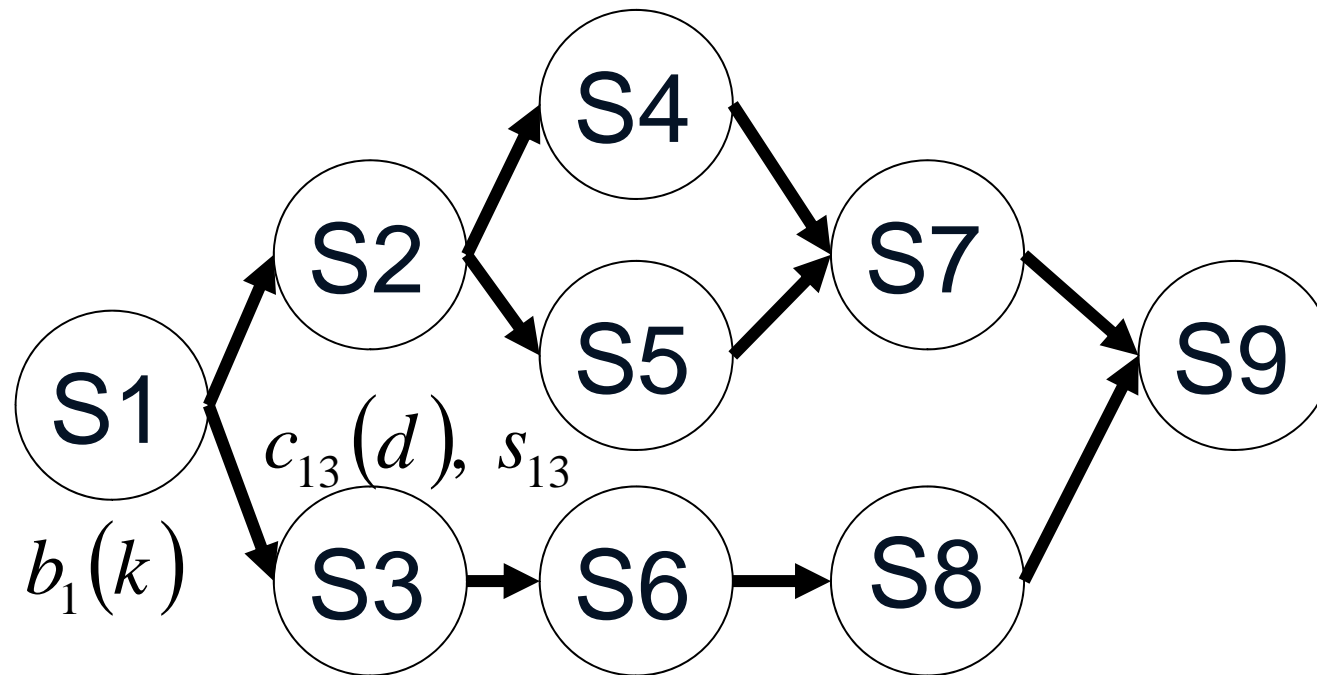
- **Understanding the way contemporary applications are built offers a new insight into application based energy management**
- **Consider what a simple request to a YouTube application involves:**
  - Search operation
  - Request related filter
  - Context related filter
  - Video streaming
  - Images and their descriptions
  - Ranked comments

# Execution Dependency





# Execution Model



# Execution Cost

$$b_j(k) = P(\text{computation cost} \leq k/s_j, r)$$

The probability that the computation level of service  $s_j$  is  $k$ , given a request class,  $r$

$$A = \{s_{ij}\} = P[s_{ij} | r, \lambda] = \begin{bmatrix} s_{11} & s_{12} & \dots & s_{1n} \\ s_{21} & s_{22} & \dots & s_{2n} \\ \vdots & & & \\ s_{n1} & s_{n2} & \dots & s_{nn} \end{bmatrix}$$

The probability that a communication between service  $i$  and  $j$  exists, given a request class,  $r$ , and the model  $\lambda$

$$c_{ij}(d) = P(\text{data size} \leq d | s_{ij}, r)$$

The probability that  $d$  amount of data is exchanged between service  $s_i$  and  $s_j$  given that a communication exists between service  $i$  and  $j$

# Execution Cost (Energy)

$$PE_j(r) = \sum_{k=1}^K b_j(k) E_j(k)$$

$$PE(r) = \sum_{j=1}^n PE_j(r)$$

The expected  
processing cost

$$CE_{ij}(r) = s_{ij} \sum_{d=1}^D c_{ij}(d) E_{ij}(d)$$

$$CE(r) = \sum_{i=1}^n \sum_{j=1}^n CE_{ij}(r)$$

The expected  
communication cost

# Execution Cost (Energy)

$$PE_j(r) = \sum_{k=1}^K b_j(k) E_j(k)$$

$$PE(r) = \sum_{j=1}^n PE_j(r)$$

The expected  
processing cost

~~$$CE_{ij}(r) = s_{ij} \sum_{d=1}^D c_{ij}(d) E_{ij}(d)$$~~

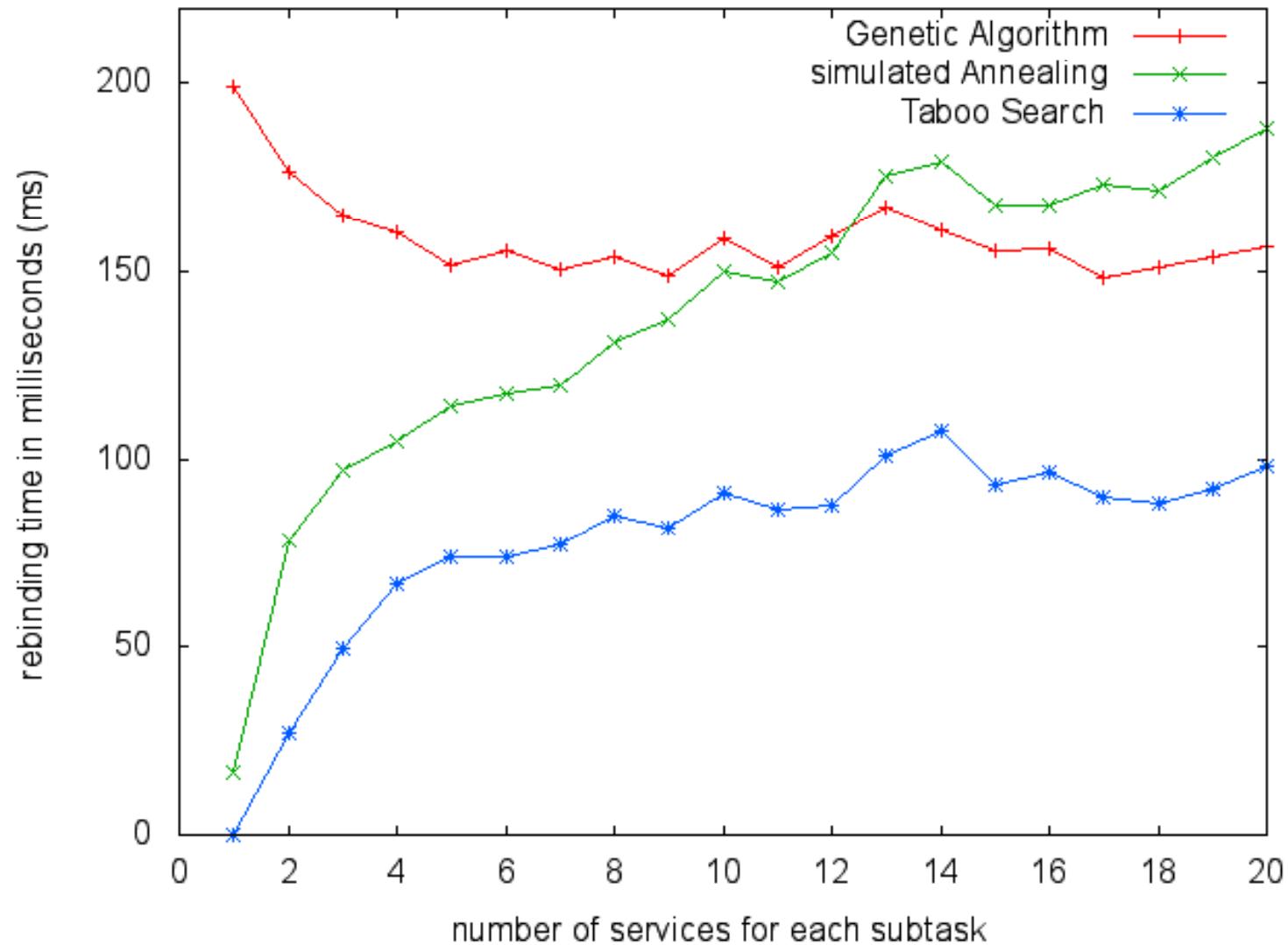
~~$$CE(r) = \sum_{i=1}^n \sum_{j=1}^n CE_{ij}(r)$$~~

The expected  
communication cost

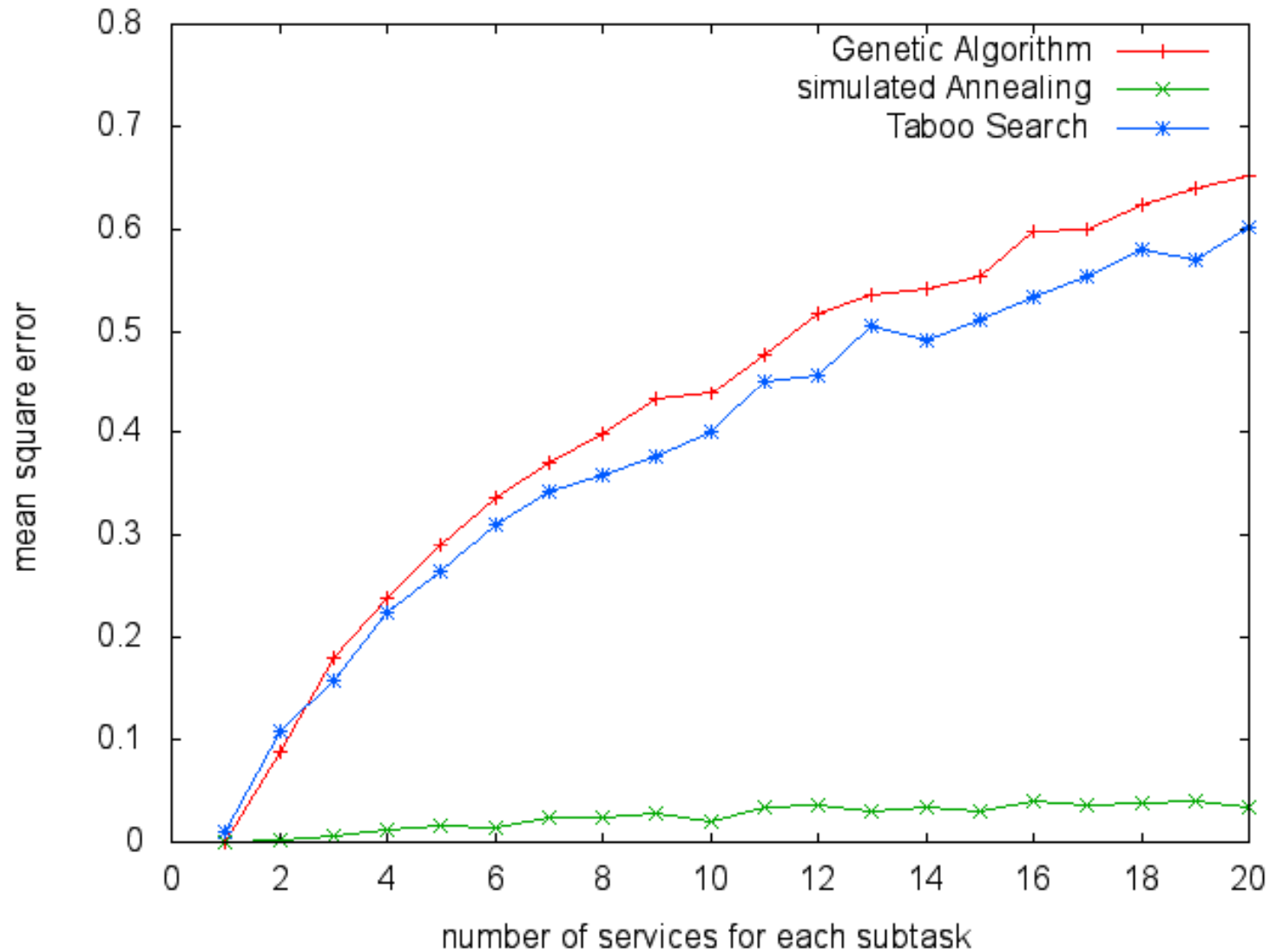
# Execution Cost (Delay)



# Execution Cost (Delay)



# Execution Cost (Delay)



# Conclusion

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- **The energy consumption of servers or their subsystems (CPU, disk, network, etc.) is never deterministic.**
- **Probabilistic adaptation strategies enable greater flexibility of trade-off between performance and energy consumption**
- **We believe that understanding the dependency between distributed services can be useful to design DPM strategies**
- **The cost of adaptation is not properly studied so far and needs further investigation.**



**Thanks for Listening**