

# Real-Time Scheduling for Energy Harvesting Sensor Nodes

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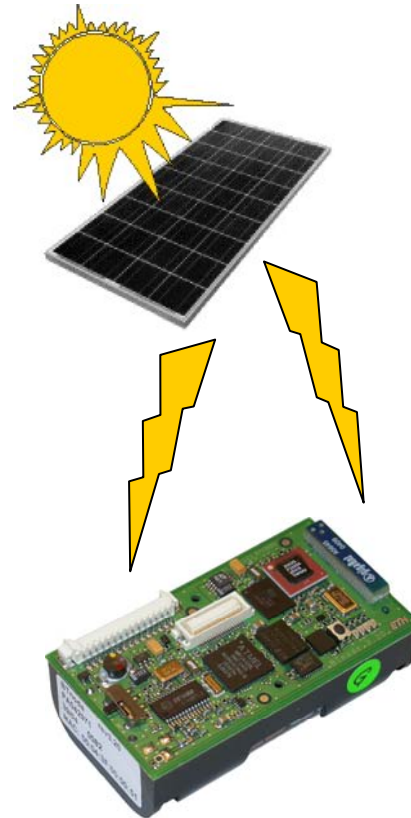
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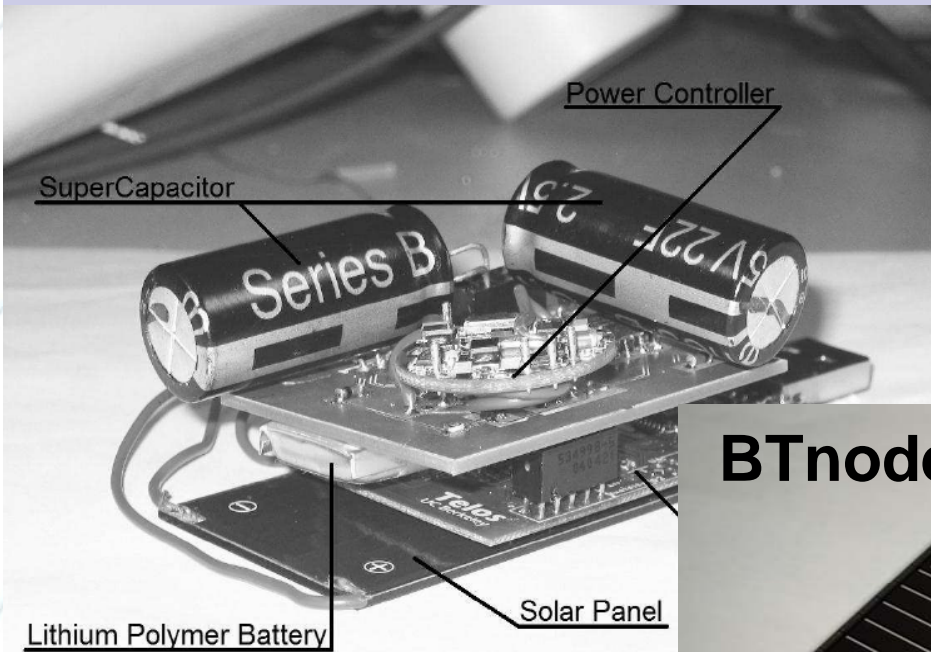
# Outline

- System Model
- Problem Statement
- Lazy Scheduling
- Admittance Test
- Simulation
- Conclusion



# Motivation

[Prometheus: Culler]



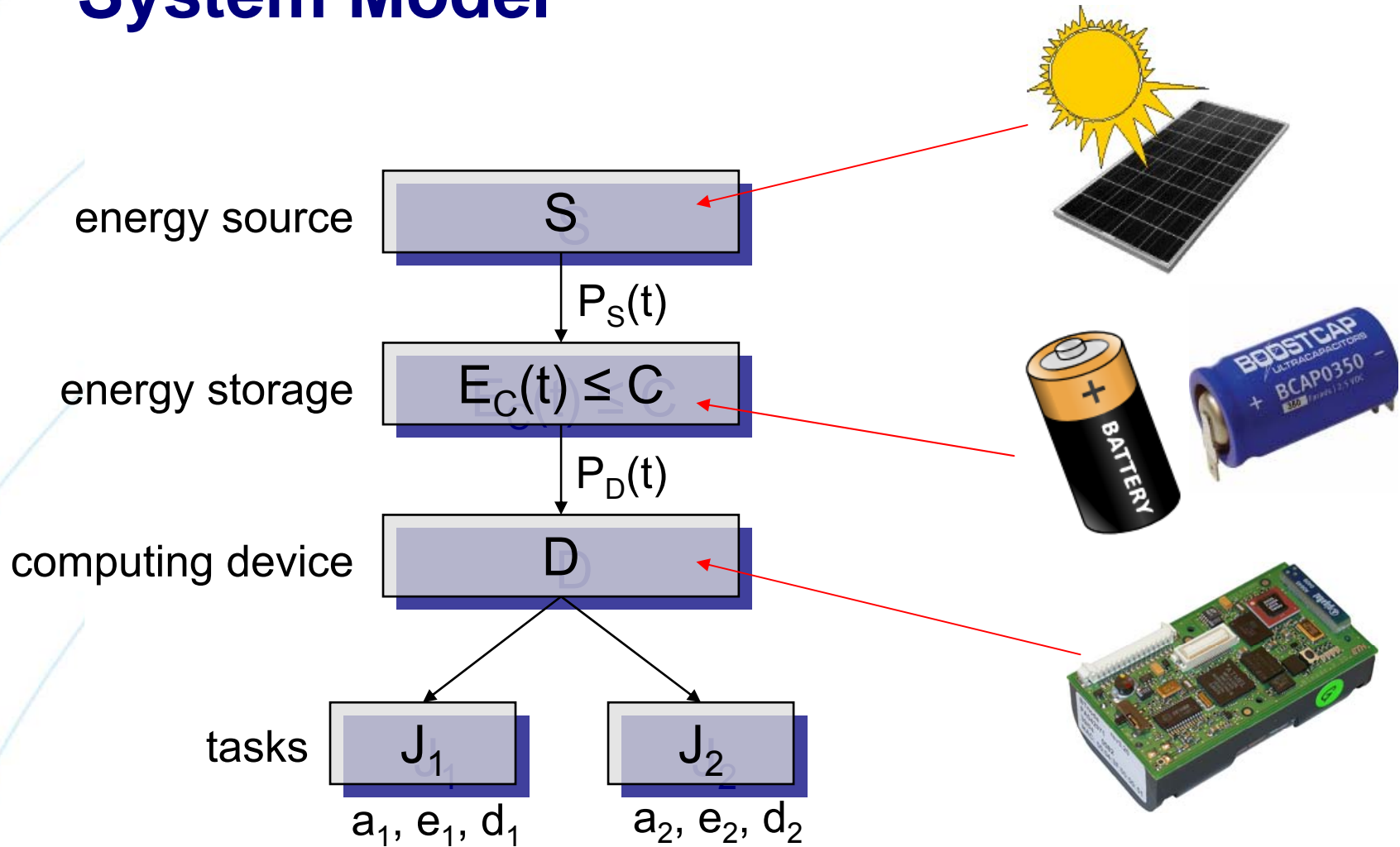
[Heliomote: Srivastava]



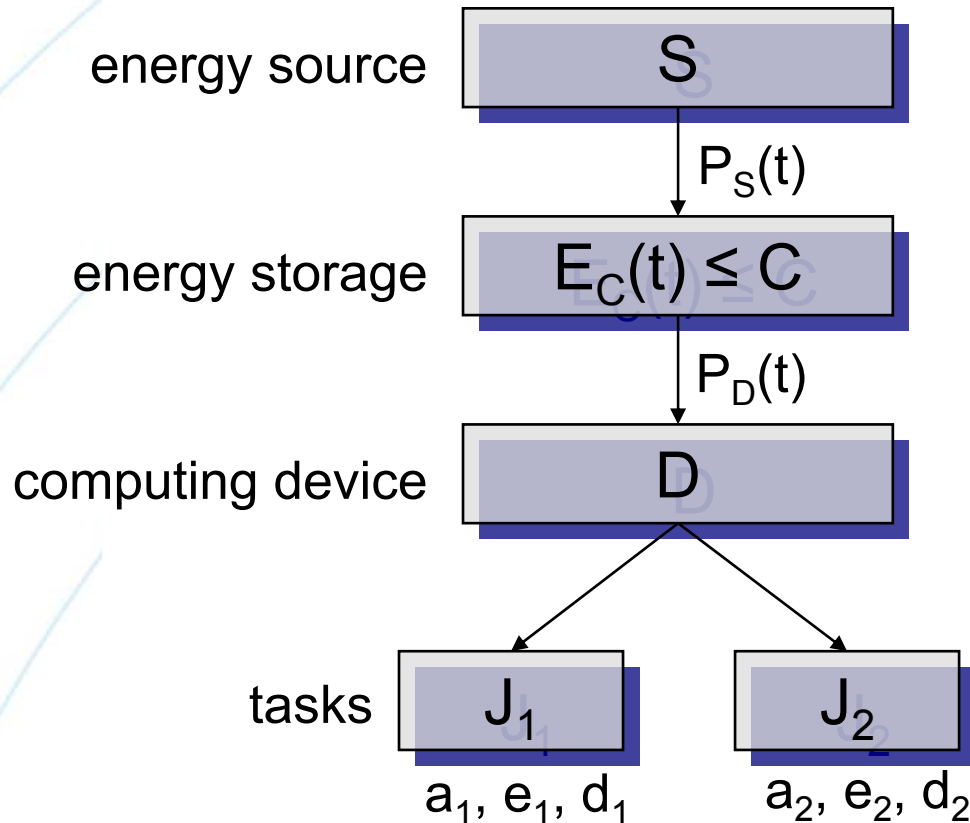
BTnode



# System Model



# System Model



## Task $J_i$

- can be preempted
- arrives at time  $a_i$
- has deadline  $d_i$
- needs total energy  $e_i$  to complete
- can consume power  $0 \leq P_D(t) \leq P_{max}$
- therefore, needs time  $w_i \geq \frac{e_i}{P_{max}}$

# Problem Statement

- Determine an ***optimal on-line scheduling*** algorithm:

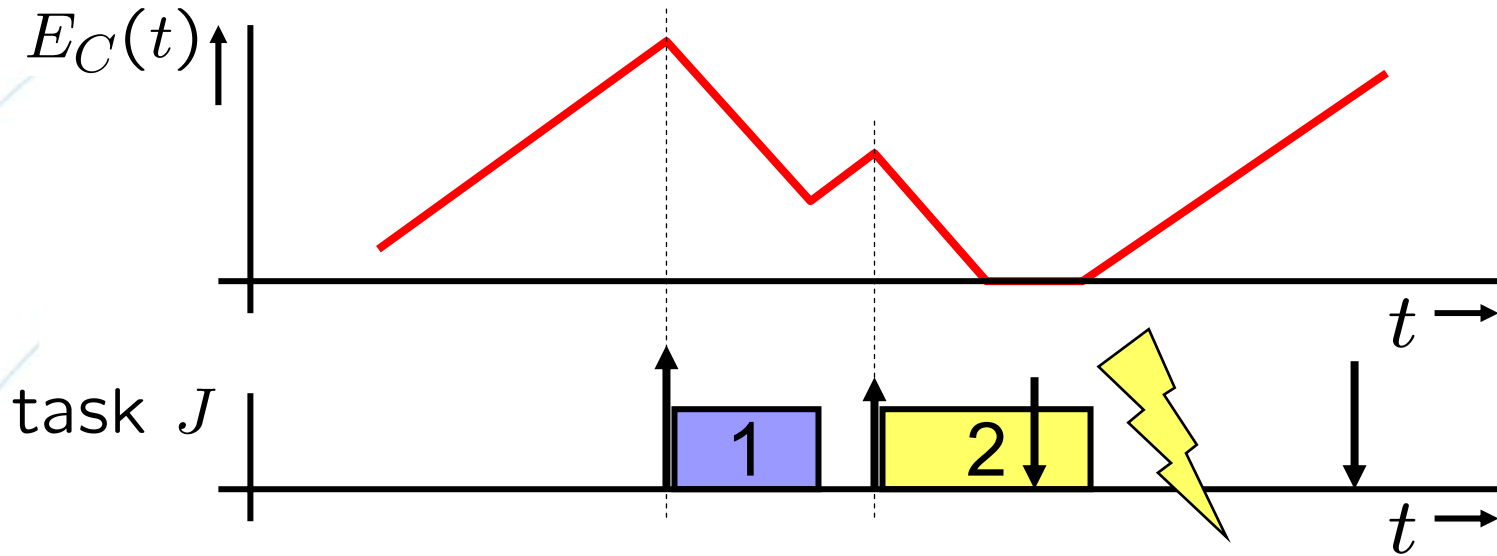
If the task set is schedulable, it determines a feasible schedule.

- Construct an ***admittance test***:

Determine, whether a set of event streams with a given characteristic is schedulable.

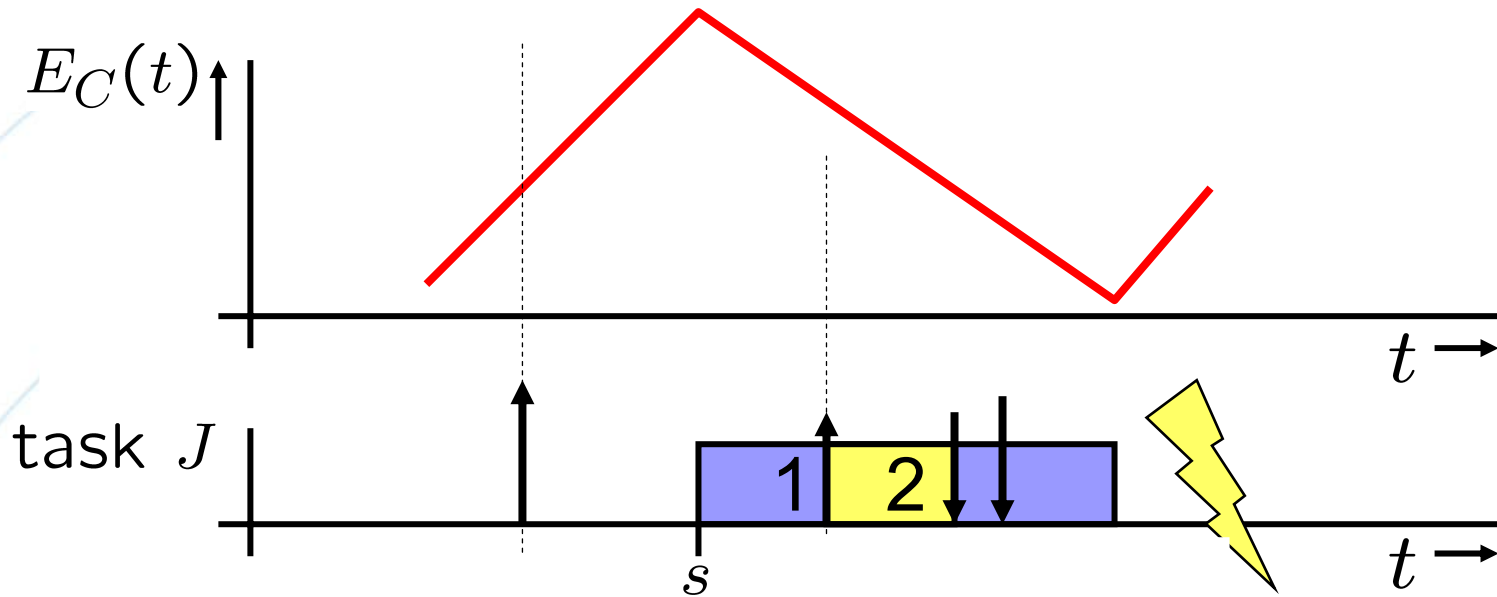
Nothing known so far ...

# Problem Statement - EDF



Greedy scheduling is not suited.

# Problem Statement - ALAP



ALAP does not work either.  
And what happens if the energy storage is full?



# Lazy Scheduling Algorithm

optimal starting time  $s_i$

$$s_i = d_i - \frac{\min(E_C(a_i) + E_S(a_i, d_i), C + E_S(s_i, d_i))}{P_{max}}$$

**Rule 1:** All tasks with  $s_i \leq t$  are processed with EDF scheduling using  $P_{max}$ .

**Rule 2:** If there is no task with  $s_i \leq t$  and the energy storage is full, all incoming power  $P_S(t)$  is assigned to the task with the currently earliest deadline.



# Optimality of Lazy Scheduling Algorithm

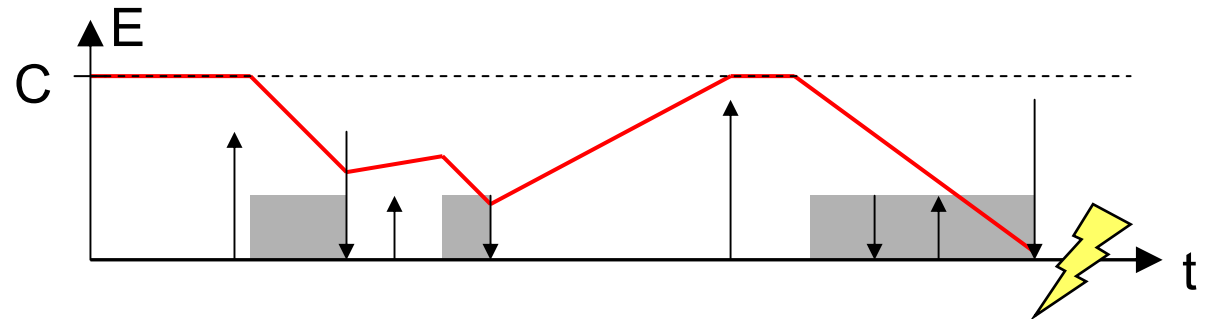
## Theorem:

If the Lazy Scheduling Algorithm LSA cannot schedule a given set of tasks, then no other scheduling algorithm can schedule it.



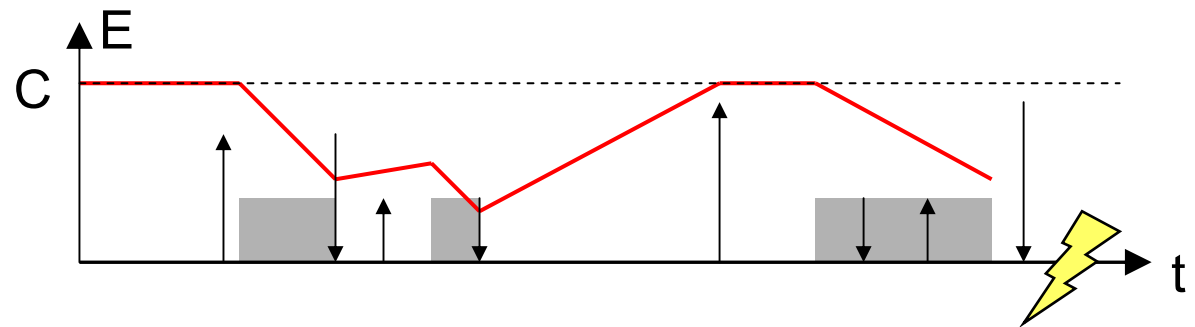
# Sketch of Proof

**Energy-  
Constrained**



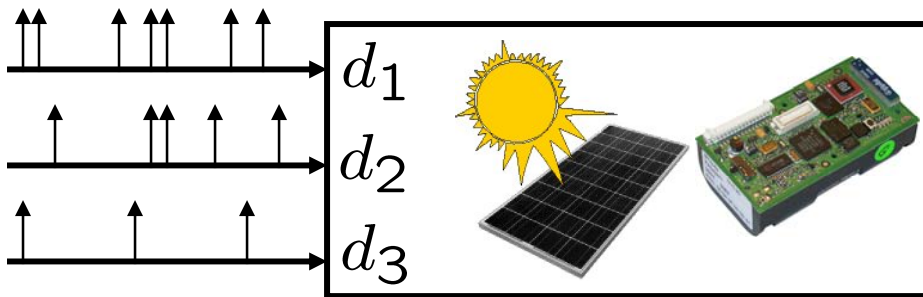
$$\Delta : \text{ with } C + E_S(\Delta) < \sum_{\Delta} e_i$$

**Time-  
Constrained**



$$\Delta : \text{ with } \Delta < \frac{\sum \Delta e_i}{P_{max}}$$

# Admittance Test



Is the scheduling of the event streams feasible with LSA ?



Abstraction

**Event stream:**

delay requirement  $d$   
energy request per event  $e$   
arrival curve  $\alpha(\Delta)$

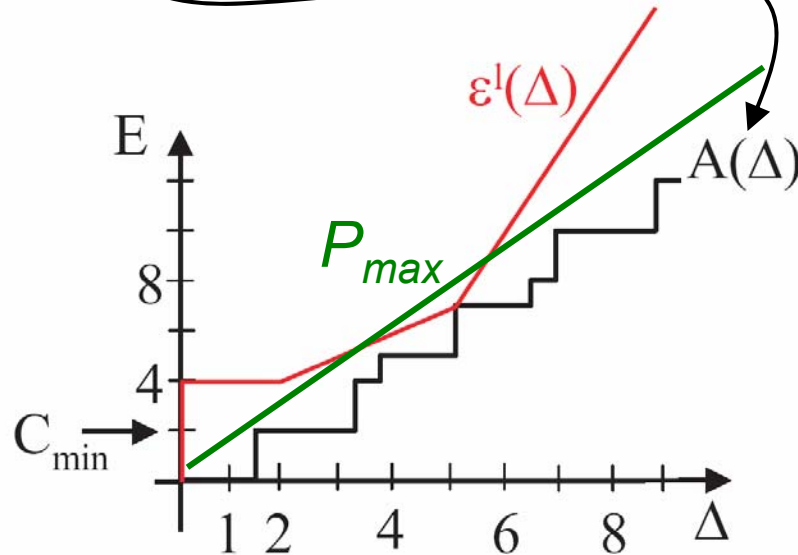
**Energy source:**

energy variability  $[\epsilon^l(\Delta), \epsilon^u(\Delta)]$

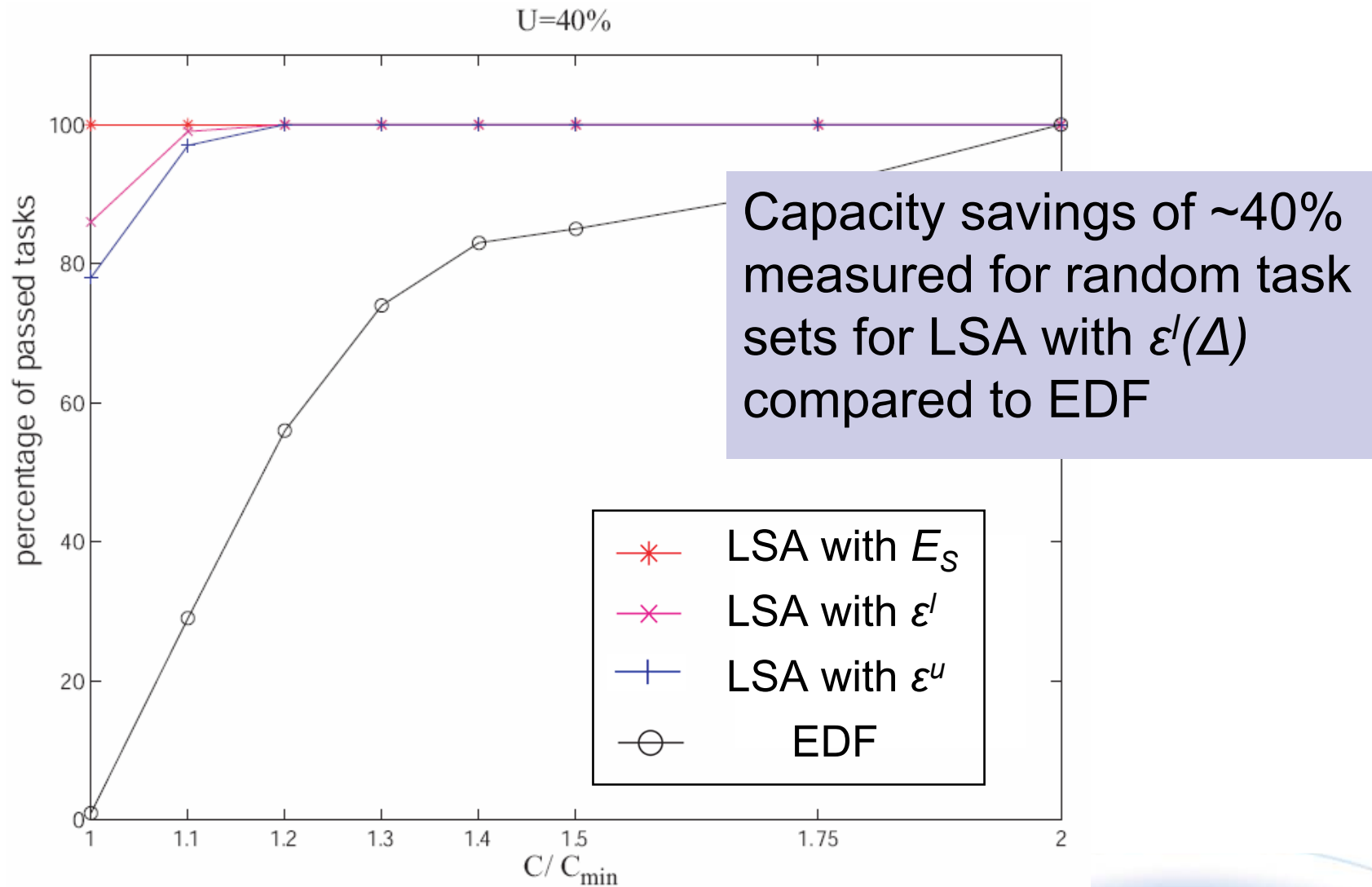
# Admittance Test

A given set of event streams  $J_i, i \in I$  is schedulable with initially stored energy  $C$ , iff

$$\forall \Delta : \sum_{i \in I} e_i \alpha_i (\Delta - d_i) \leq \min\{\epsilon^l(\Delta) + C, P_{max} \Delta\}$$

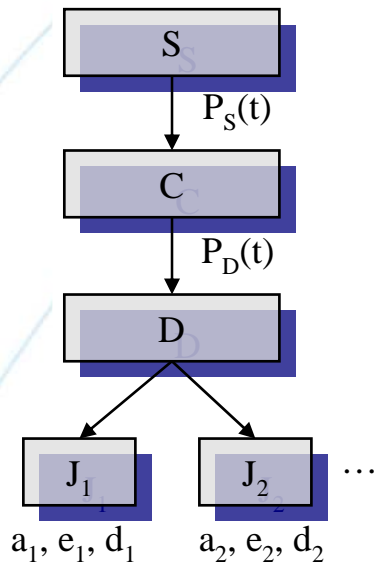


# Simulation Results

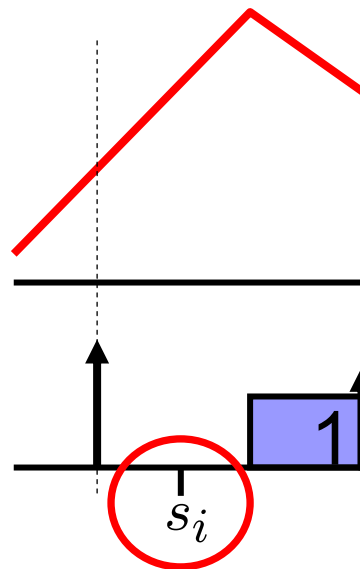


# Conclusions

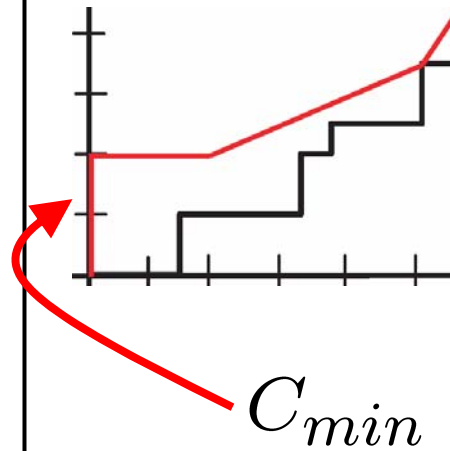
## Scheduling Scenario



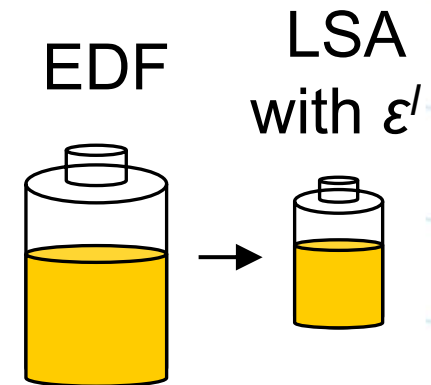
## Optimal Lazy Scheduling



## Admittance Test



## Simulation Results



# Practical Task Processing (1/3)

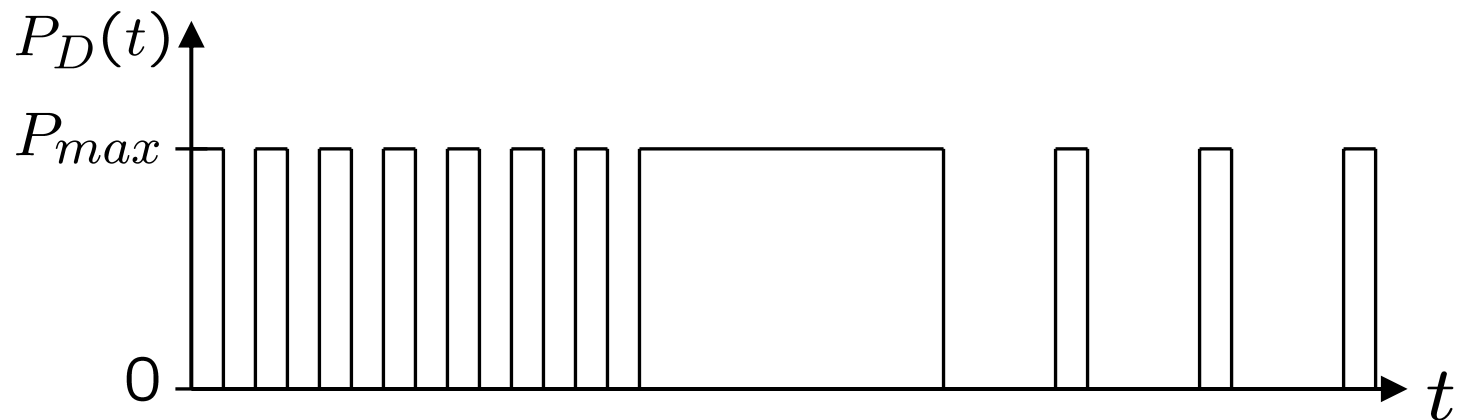
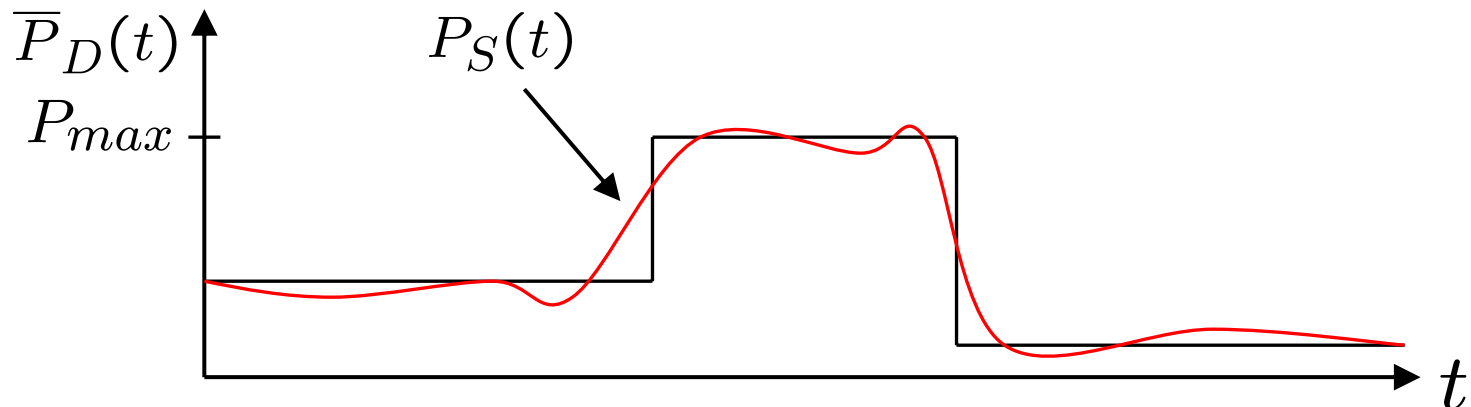
- Task processing with continuous power  $P_D = P_S$  in  $0 \leq P_D \leq P_{max}$  is **only required** if the energy storage is full ( $E_C(t)=C$ ).
- In all other situations, tasks are processed with (constant) power  $P_D = P_{max}$ .



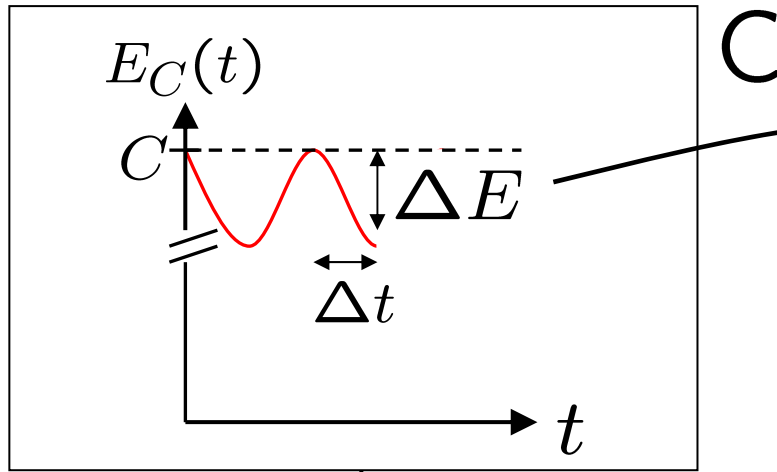


# Practical Task Processing (2/3)

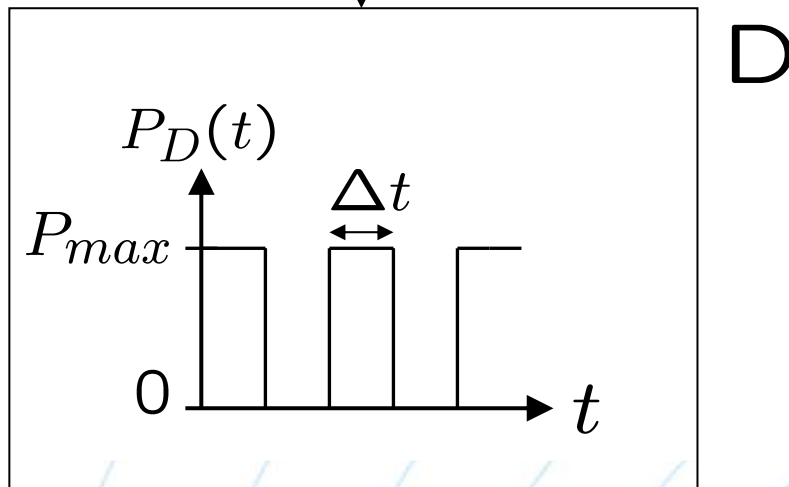
Approximating  $\bar{P}_D(t) \sim P_S(t)$  by duty cycling



# Practical Task Processing (3/3)



$$\Delta E = P_{max} \cdot \Delta t - \epsilon^l(\Delta)$$



$$C' = C - \Delta E$$