

The background of the slide features a close-up of a black wrought-iron gate with a large, gold-colored octagonal seal of Temple University. The seal depicts a classical building with columns and is surrounded by the text 'TEMPLE UNIVERSITY'. To the left, a red banner with a white logo is partially visible. A semi-transparent red horizontal band is overlaid across the middle of the image, containing the title and authors' names in white text.

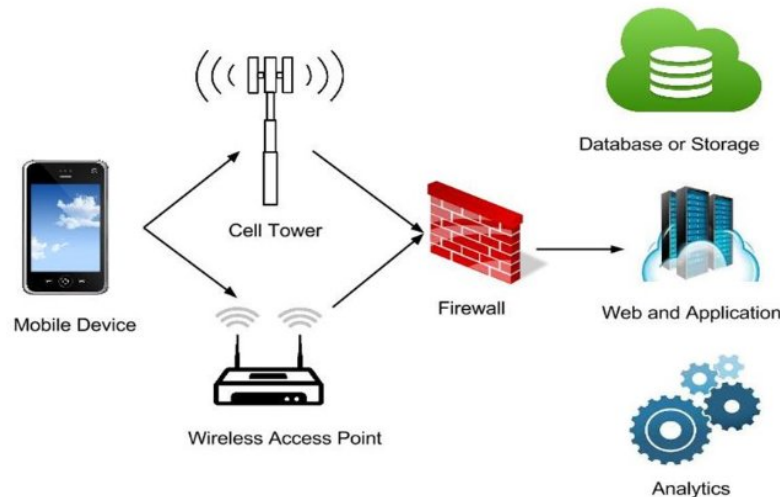
# Maximizing the User's Benefit in Mobile Cloud Computing

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# Mobile Cloud Computing

- **Concept of Mobile Cloud Computing (MCC):**
  - Offload the computation complexity task from mobile devices to the cloud
  - Combination of **cloud computing**, **mobile computing**, and **wireless networks** to bring rich computational resources to mobile users





# Mobile Cloud Computing

- **Different computation abilities**
  - Cloud (e.g., Amazon EC2, Azure):
    - Rich computation resource --- short processing delay
    - Omitted in most scenarios
  - Mobile devices:
    - Limited computation resource --- long processing delay
    - E.g., natural language processing, face recognition
- **Cost of cloud computing**
  - extra offloading/transmission delay
    - Cellular networks (low bandwidth, high energy consumption)
    - Wi-Fi (high bandwidth, low energy consumption)





# Mobile Cloud Computing

- **Task finishing time**
  - Task utility decay (reward for finishing the task)
    - E.g. hot news spreading, Siri
      - Linear decay model in this paper,  $U_t = U_0 - wt$
- **Trade-off in the MCC:**
  - Smaller task-finishing time
  - More energy consumption is possible
- **Challenge**
  - Maximize the gained utility with the given energy budget





# Problem Formulation

- **Network Model**

- Limited battery of the mobile device
- Non-preemptive task
  - Cannot be interrupted once it is scheduled

- **Scheduling problem**

- Given the arrival time, local processing time, transmission time of each task, and the battery constraint of the smartphone, find a scheduling so that the utility gain is the maximum
- NP - complete

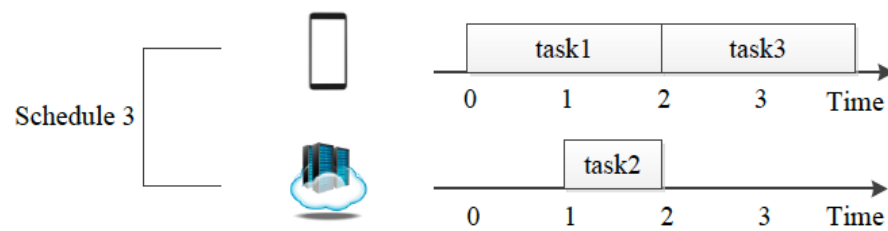
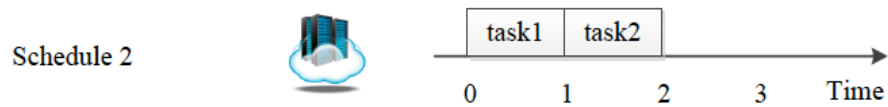
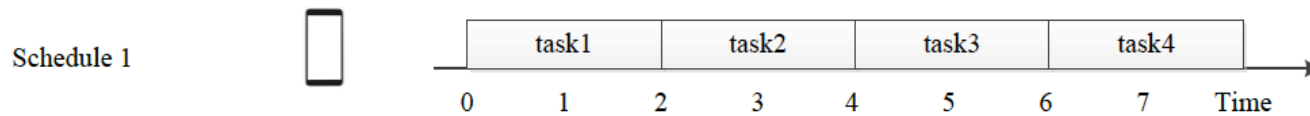




# Challenges

- A motivational example

- Every second, a new task arrives,  $U_t = 10 - 2t$
- Each task consumes 1 energy unit in local or 2 units to transmit
- The energy budget is 4 units



$$1: 6 + 4 + 2 + 0 = 12$$

$$2: 8 + 8 = 16$$

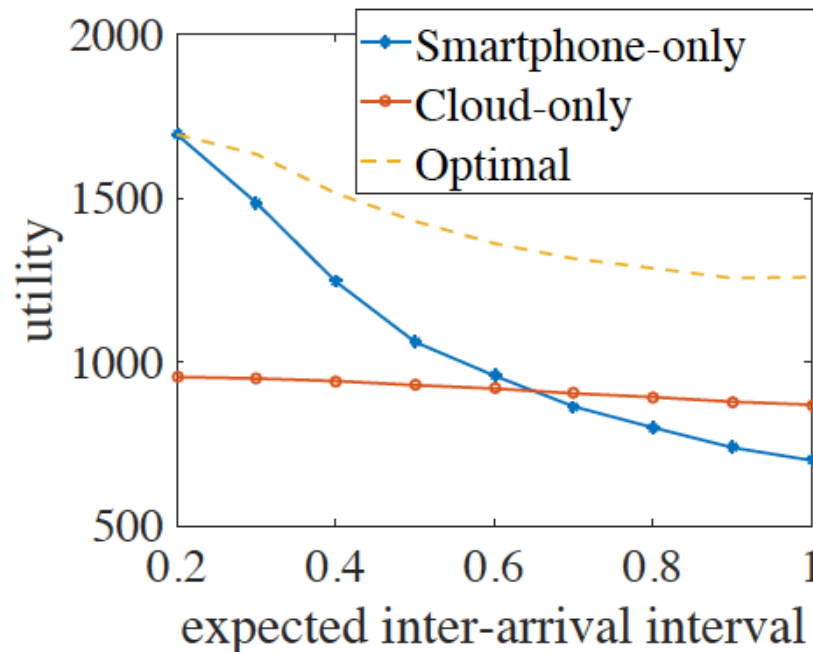
$$3: 6 + 8 + 6 = 20$$





# Challenges

- How can we optimize the mobile device and the cloud scheduling jointly?
  - Traditional approaches will lead to a bad performance in certain scenarios





# Solution

- Simple greedy scheduling does not have a performance bound
  - Cost effective
    - Unbalanced task assignment
  - Balance the finishing time
    - Low energy usage efficiency
- We propose an approximation algorithm with a good performance bound!







# Solution

- LP Rounding algorithm
  - Assume tasks can be interrupted
    - $y_{ijt}$ , task  $i$  is scheduled at  $j$  at time  $t$
    - Problem reduces into the linear programming

$$\max \sum_{j \in J} U_j - \sum_{j \in J} w_j (f_j - a_j)$$

$$\text{s.t. } \sum_{i=1}^2 \sum_{t=a_i}^T \frac{y_{ijt}}{p_{ij}} = 1,$$

$\forall j,$



Task must be completely finished

$$\sum_{j \in J} y_{ijt} \leq 1,$$

$\forall i \& t,$



Processing or transmitting one task a time

$$f_j \geq \sum_{i=1}^2 \sum_{t=a_i}^T \left( \frac{y_{ijt}}{p_{ij}} \left( \frac{2t+1+p_{ij}}{p_{ij}} \right) \right)$$

$\forall j,$



Processing time constraint

$$f_j \geq \sum_{i=1}^2 \sum_{t=a_i}^T y_{ijt}$$

$\forall j,$



Energy constraint

$$\sum_{i=1}^2 \sum_{j \in J} e_{ij} \frac{y_{ijt}}{p_{ij}} \leq B$$

$$y_{ijt} \geq 0,$$

$\forall i, j, \& t.$





# Solution

- LP Rounding algorithm
  - Calculate the LP rounding result
  - Assign the task  $i$  to  $j$  at time  $t$  with a probability based on  $y_{ijt}$ .
  - Each job is assigned at the earliest feasible time

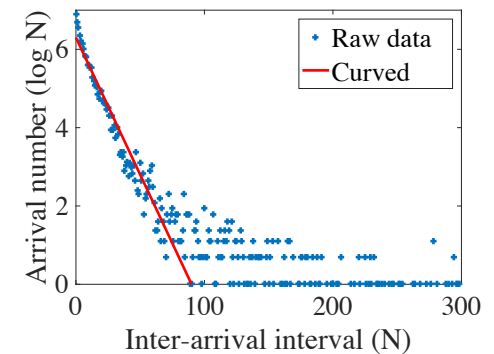
Theorem: the LP rounding algorithm has a 2-approximation ratio on expectation





# Experimental Setting

- Task arrival time
  - Average data size is 2 MB, 1 to 3 MB.
  - Follows the updates in Sina Weibo trace
    - Power-law task arrival time
- Smartphone
  - Processing time/energy is 1 MBps, 500 mW.
  - Transmission bandwidth/energy 2 MBps, 2000 mW.
  - 100 mWh energy budget





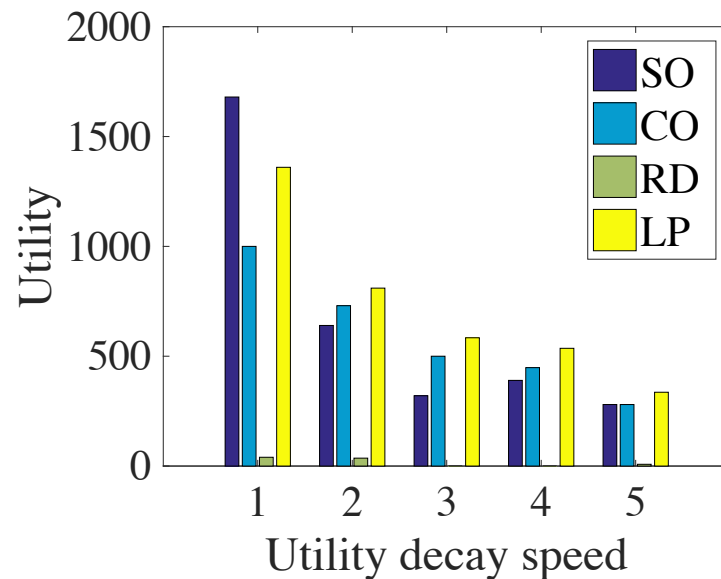
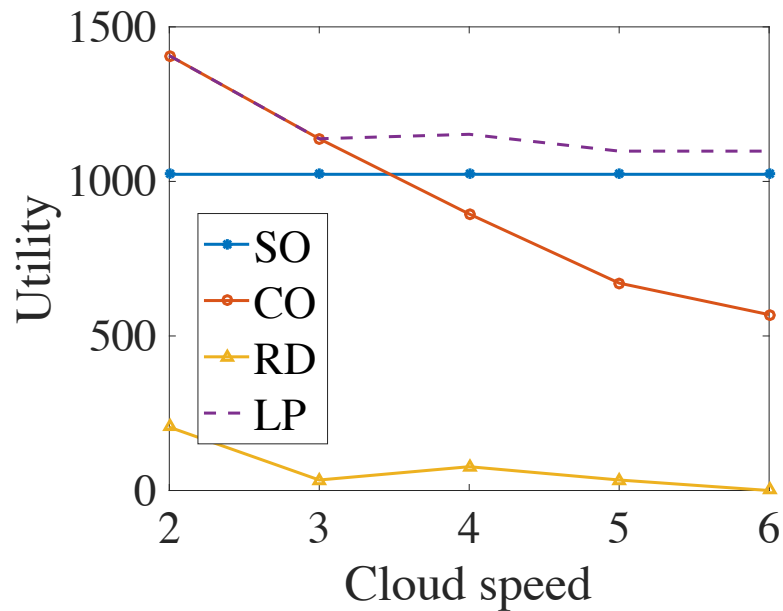
# Algorithm Comparison

- Algorithms:
  - Cloud-only (CO) algorithm, which only utilizes the cloud for computation, referred to as the AllServer algorithm in [5]
  - Smartphone-only (SO) algorithm, which only utilizes the smartphone for computation, and is referred to as the AllMobile algorithm in [5]
  - Random (RD) algorithm, which randomly assigns the new task to a device
  - Proposed LP rounding algorithm





# Simulation Result



SO and CO algorithms only achieve a good performance in certain scenarios. The proposed LP algorithm achieves a good performance or the best performance in a wide scenario. The rounding algorithm leads to a bad performance.





# Conclusion and Future Work

- We investigate mobile cloud offloading in a general scenario, where both mobile and cloud are used to maximize the gained utility
- An LP rounding algorithm is proposed with the performance bound
- Future Work
  - Online scheduling, real testbeds.





# Thank you!

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