

# GSPN-Based Reliability-Aware Performance Evaluation of IoT Services

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#### Outline

- Background
- GSPN Model for Performance Evaluation
- Real Data Based Evaluation
- Conclusion and Future Work





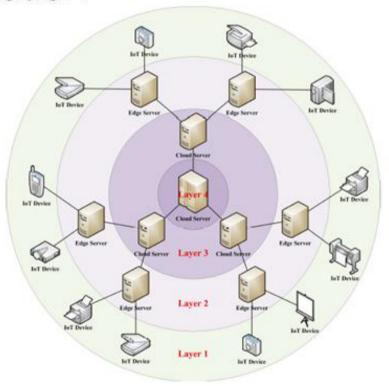
- Internet of Things (IoT)
  - Connect interrelated devices over the network
  - Cooperate with each other to reach common goals
  - Wide application in several aspects
    - ✓Industrial manufacturing
    - ✓ Smart home
    - ✓ Transportation
    - **√**...





Edge Computing

 A novel computing paradigm for IoT service implementation







- QoS of IoT Services
  - Service Level Agreement (SLA)
  - Reference for QoS Optimization
  - Measurement-Based Approach
  - Model-Based Approach

Directly applied in realtime systems

Conducted at the design phase before system implementation

#### Model-Based Approach

Much cheaper than the measurement-based approach

- Reliability Issue in IoT Systems
  - Services deployed in virtual machines (VMs) or virtualized cloud servers
  - VM migration and recovery techniques allowing the fast restart of a virtual machine when failure occurs
- Reliability-Aware QoS Evaluation

Challenges which VM migration brings -The error probing, fault repairing and system restarting take time, affecting the overall end-to-end QoS evaluation of the services.





#### Our contribution

- A theoretical approach of reliability-aware performance evaluation of IoT services
  - ✓ Formulating the dynamics of the IoT systems with GPSN models.
  - ✓ Modeling both atomic services and systems
  - ✓ Corresponding quantitative analyses
  - ✓ Empirical experiments based on real-world data





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Generalized Stochastic Petri Net (GSPN)

a 7-tuple 
$$\psi = (P, T, F, W, \Pi, M_0, \lambda)$$

- P: the finite set of places  $T = T_t \cup T_i$
- T: the finite set of transitions
- F: the finite set of arcs  $F \subseteq (S \times T) \cup (T \times S)$
- W: the weight function of arcs  $F \rightarrow \Box$
- $\Pi$ : the priority function  $T \rightarrow [0,1]$
- $M_{\scriptscriptstyle 0}$ : the initial state (marking) of the GSPN
- $\lambda$ : the set of firing rate of  $T_t$   $T_t \rightarrow \Box$





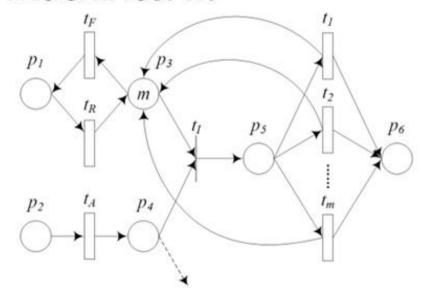
#### Cluster Model

- Maximum of Performed Machines: m
- Failure Rate:  $\lambda_F$
- Repair Rate:  $\lambda_R$
- Task Arrival Rate: λ<sub>A</sub>
- Transition Probability:

$$1 - \pi_I$$

Average Response Time:

$$RS = \frac{q_4 \cdot \pi_I + q_5}{\lambda_A \cdot \pi_I}$$



With Little's Law

q: the averageamount of tokens

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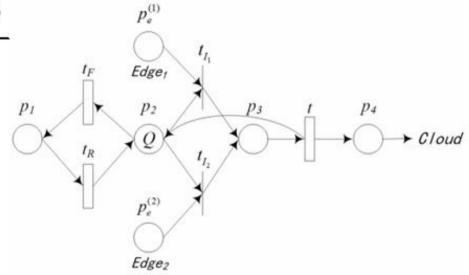


- Communication Model
  - Failure Rate:  $\lambda_F$  Repair Rate:  $\lambda_A$
  - Average Communication Delay:

$$TR = \frac{q_e^{(i)} \cdot \left(1 - \pi_I^{(i)}\right) + q_3}{\lambda_A^{(i)} \cdot \left(1 - \pi_I^{(i)}\right)}$$

With Little's Law

q: the average amount of tokens







# System Model

Edge Cluster<sub>1</sub> Cloud Cluster

Edge Cluster<sub>2</sub>





# System Model

Average response time of tasks at the cloud

$$RS^{(c)} = ST^{(c)} + TR$$

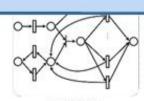
Total average response time for the system

$$RS^{(sys)} = \pi \cdot RS^{(e)} + (1 - \pi) \cdot RS^{(c)}$$

Cluster Model:

$$RS = \frac{q_4 \cdot \pi_I + q_5}{\lambda_A \cdot \pi_I}$$

Average response time of tasks at the edge









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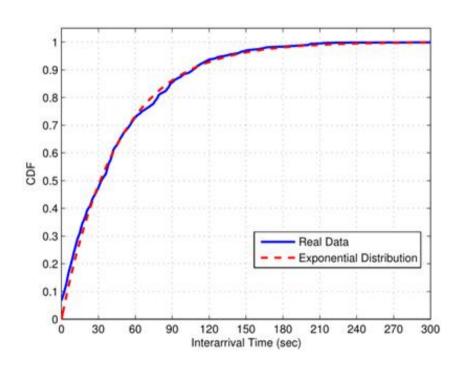
#### Datasets

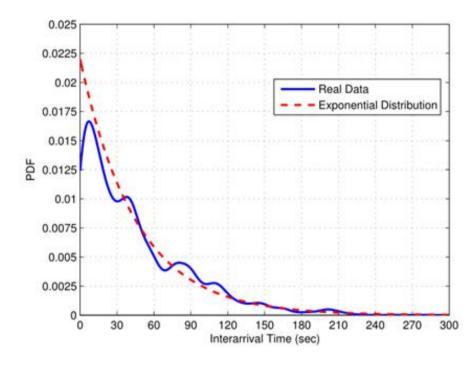
- T-Drive
  - ✓ the GPS trajectories of 10,357 taxis within the city
    of Beijing during a period of one week in 2008
  - ✓ 4 fields for each piece of data, including taxi id, timestamp, longitude and latitude
- LA-UR Failure Data
  - ✓ 23,739 failure situations of 23 High Performance Computing (HPC) systems
  - ✓ the failure logs on software, hardware and network failures, and etc.





- Arrival Distributions
  - Exponential -- Poisson

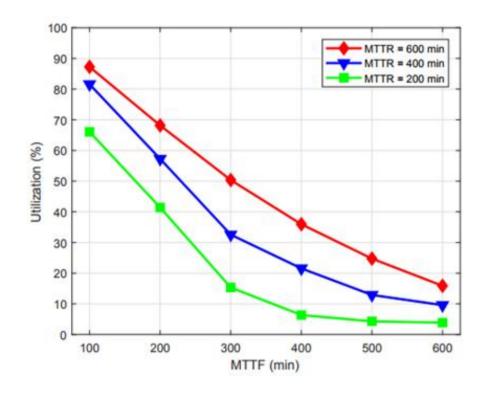






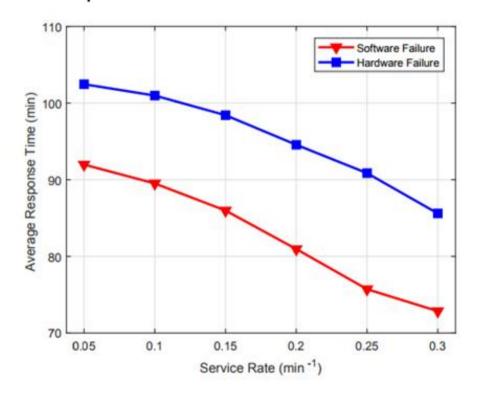


- Experimental Results
  - Cluster Utilization





- Experimental Results
  - Average Response Time





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# Conclusion

- A modeling approach of performance evaluation in edge computing paradigm
- GSPN models formulating the dynamics of loT services with reliability issues fully considered
- Quantitative analyses on performance metrics for IoT services
- Simulation experiments based on realworld data from IoT and cloud systems





#### **Future Work**

- Detailed specifications on models
  - More variety of failures in real-life IoT systems
  - More precise descriptions on the statistical distributions of the failures, repairs, arrivals and service processes
- Elaborate experimental design
  - Further validation of our approach
  - Further exploration of parameter settings





# Thank you! Q&A

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