

Towards the Tradeoff Between Service Performance and Information Freshness

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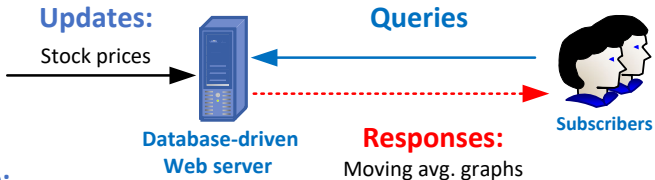
Motivation

Processing updates ← The computing resources → Processing queries

Example:

34.25	+1.01	34,726,200	722,917	328.89
43.25	+12.34	2,371,200	98,188	15,870
47.5	-1.55	2,613,000	123,674	85,000
46.25	+1.65	16,856,200	780,314	39,870
6.3	-0.79	270,000	1,690	1,200
1.68	-0.19	88,259,800	108,573	988
155	-0.96	554,700	85,882	112,000

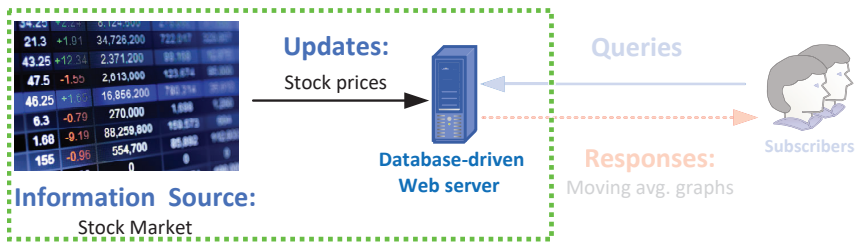
Information Source:
Stock Market



Motivation

Processing updates ← The computing resources

Example:



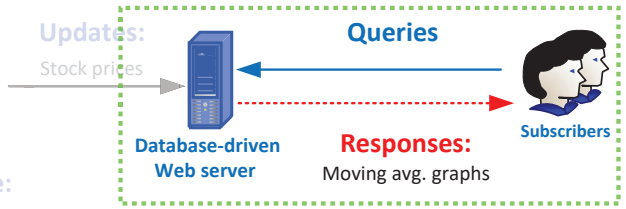
Motivation

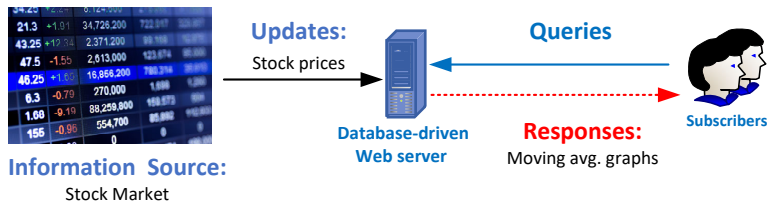
The computing resources → Processing queries

Example:

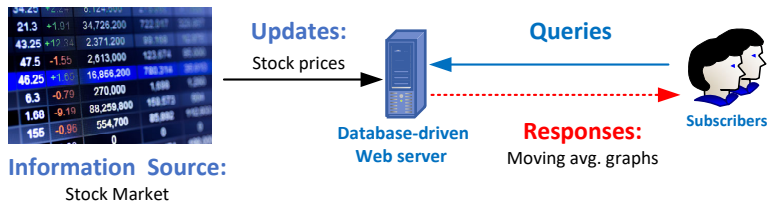
24.25	+1.01	34,726,200	722,917	320.00
43.25	+12.34	2,371,200	88,108	50.00
47.5	-1.55	2,613,000	123,874	80.00
46.25	+1.00	16,856,200	780,374	30.00
6.3	-0.79	270,000	1,000	1.00
1.68	-9.19	88,258,000	168,873	600
155	-0.96	554,700	85,880	100.00

Information Source:
Stock Market

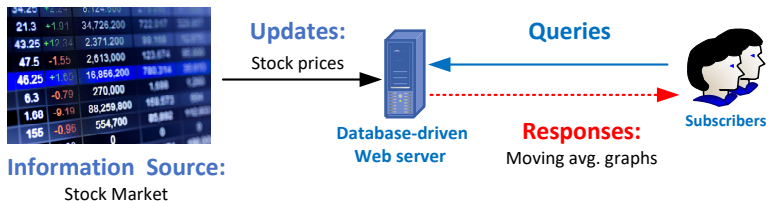




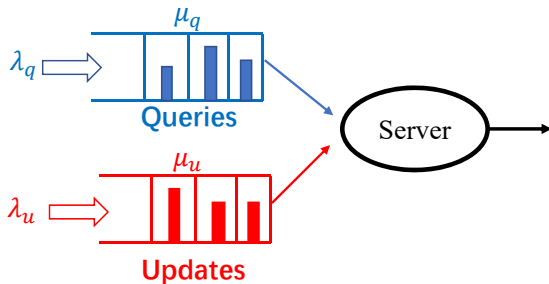
- The computing resources are **shared!**



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- How to schedule the updates and queries jointly?



- The computing resources are **shared!**
- How to schedule the updates and queries jointly?
- Tradeoff: **Service performance** vs. **Information freshness**
 - ▶ Serve updates first: **fresh** information, **long** response time
 - ▶ Serve queries first: **short** response time, **stale** information



- Two M/M/1 queues share one single server

Performance Metrics

Metric of service performance

- The response time of queries

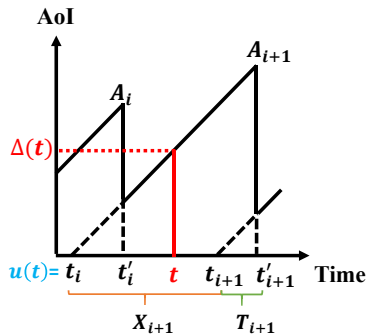
Metric of information freshness

- Age-of-Information (AoI) of updates:
The time elapsed since the generation of the latest update:

$$\Delta(t) := t - u(t)$$

- Peak-Age-of-Information (PAoI) of updates:

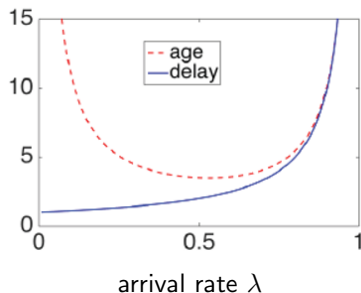
$$A_{i+1} = X_{i+1} + T_{i+1}$$



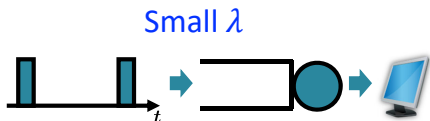
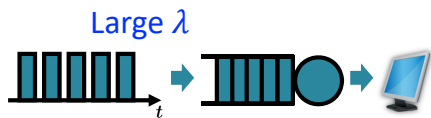
Aol vs. Throughput & Delay

M/M/1 FCFS queue: arrival rate λ , service rate $\mu = 1$

- Large arrival rate λ :
 - ▶ high throughput; large queueing delay;
large Aol
- Small arrival rate λ :
 - ▶ low delay; large interarrival time;
large Aol
- Aol depends on both:
 - ▶ queueing delay
 - ▶ inter-arrival time



(Image source: <http://www.auburn.edu/~yzs0078>)



Related Work

Response time studies:

- Performance vs. Data freshness [Labrinidis et al. '04]
- Performance vs. Robustness [Osogami et al. '05]

Aol studies:

- Aol in M/M/1 under the FCFS policy [Kaul et al. '12]
- Poisson arrivals & single server [Costa et al. '14; Yates et al. '12]
- Pull model from user side [Sang et al. '17]

None of those work analyzes the **tradeoff** between the **service performance** and **information freshness** in a rigorous manner!

Related Work

Response time studies:

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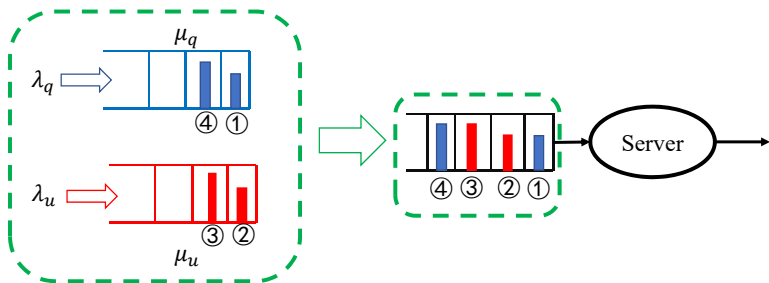
Our Contributions

- A single-server two-queue model for studying the key tradeoff
- Threshold-based scheduling policies that achieve better tradeoff

A Simple Policy: FCFS

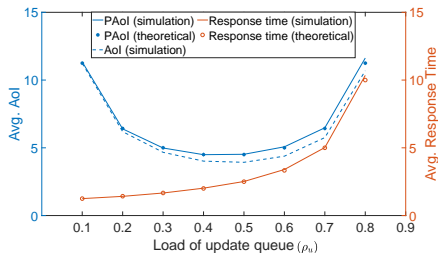
First-Come-First-Served (FCFS) policy

- Serving updates and queries according to the order of their arrivals

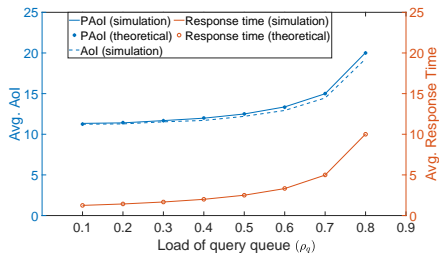


- Theoretical analysis for FCFS policy

Numerical Result: FCFS



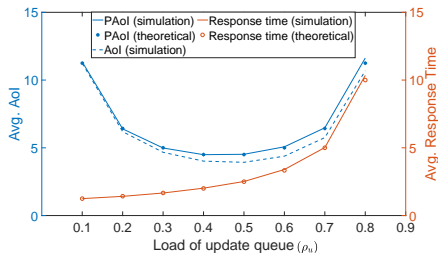
Fixed $\lambda_q = 0.1$, $\mu_q = \mu_u = 1$,
and $\rho_u = \lambda_u / \mu_u$



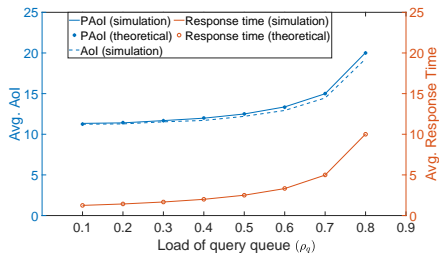
Fixed $\lambda_u = 0.1$, $\mu_q = \mu_u = 1$,
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Both average PAoI and response time are **large** when the load is high!

Numerical Result: FCFS



Fixed $\lambda_q = 0.1$, $\mu_q = \mu_u = 1$,
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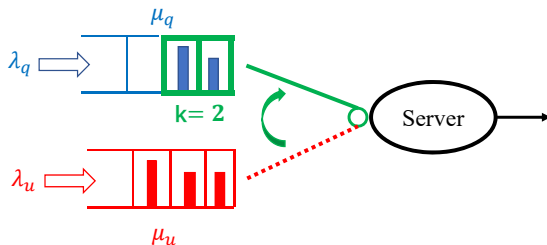
Fixed $\lambda_u = 0.1$, $\mu_q = \mu_u = 1$,
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Both average PAoI and response time are **large** when the load is high!

The FCFS has no ability in controlling the tradeoff!

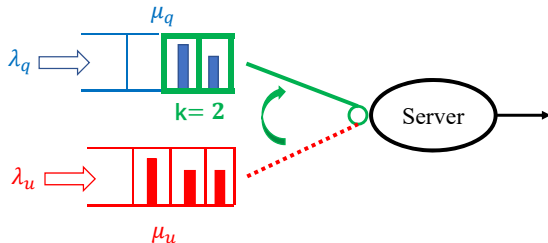
The Query- k Policy

- One single threshold k for the query queue
- Server switches condition:
 - ▶ The number of queries reaches the threshold k , or
 - ▶ The update queue becomes empty



The Query- k Policy

- One single threshold k for the query queue
- Server switches condition:
 - ▶ The number of queries reaches the threshold k , or
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- Two special cases:
 - ▶ Threshold $k = 1$: the priority is **always** given to the query queue
 - ▶ Threshold $k = \infty$: exhaustive service at both queues

Main Results: The Query-1 Policy

Proposition 2

Under the Query-1 policy, the expected response time is

$$\mathbb{E}[T_q] = \frac{1}{\mu_q} + \frac{\rho_q/\mu_q}{1 - \rho_q},$$

and the expected PAoI is

$$\mathbb{E}[A] = \mathbb{E}[X_u] + \mathbb{E}[T_u] = \frac{1}{\lambda_u} + \frac{1/\mu_u}{1 - \rho_q} + \frac{\rho_q/\mu_q + \rho_u/\mu_u}{(1 - \rho_q)(1 - \rho_q - \rho_u)}.$$

Proof sketch:

Equivalent to a preemptive priority queue with two classes of jobs [1].

[1] Harchol-Balter, Mor. Performance modeling and design of computer systems: queueing theory in action. Cambridge University Press, 2013.

Main Results: The Query- k Policy

Proposition 3

Under the Query- k policy with $1 < k < \infty$, the expected response time is

$$\mathbb{E}[T_q] = \mathbb{E}[N_q] / \lambda_q,$$

and the expected PAol is

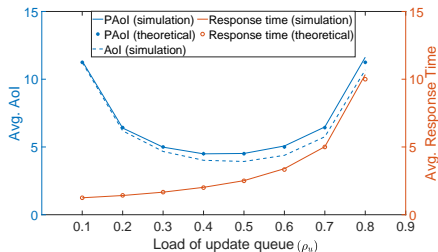
$$\mathbb{E}[A] = \mathbb{E}[X_u] + \mathbb{E}[T_u] = \frac{1}{\lambda_u} + \frac{\mu_u}{\lambda_u} \cdot \left(\frac{\lambda_q / \mu_q^2 + \lambda_u / \mu_u^2}{1 - \rho} - \frac{\mathbb{E}[N_q]}{\mu_q} \right).$$

Proof sketch:

[2] provides a method for calculating $\mathbb{E}[N_q]$, then applying the Little's Law and Conservation Law.

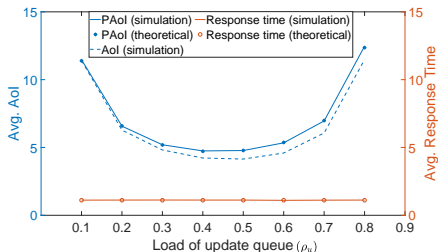
[2] Boxma, Onno J., G. M. Koole, and Isi Mitrani. "A two-queue polling model with a threshold service policy." MASCOTS'95.

Numerical Results: The Query-1 Policy



FCFS

(Fixed $\lambda_q = 0.1$, $\mu_q = \mu_u = 1$,
and $\rho_u = \lambda_u / \mu_u$)

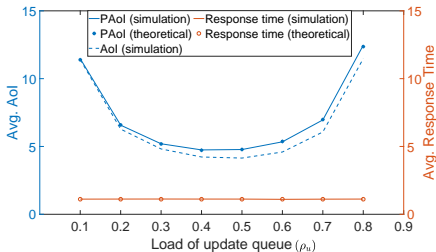


The Query-1

(Fixed $\lambda_q = 0.1$, $\mu_q = \mu_u = 1$,
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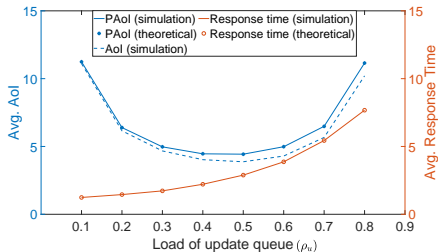
Query-1 policy achieves **much better response time** than FCFS!

Numerical Results: The Query- k Policy



The Query-1

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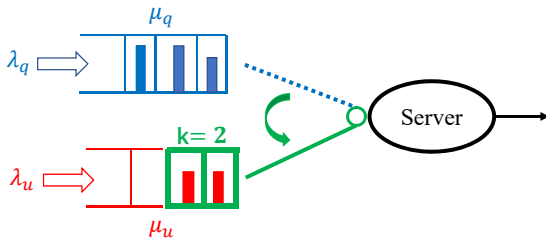
The Query-3

(Fixed $\lambda_q = 0.1$, $\mu_q = \mu_u = 1$,
and $\rho_u = \lambda_u / \mu_u$)

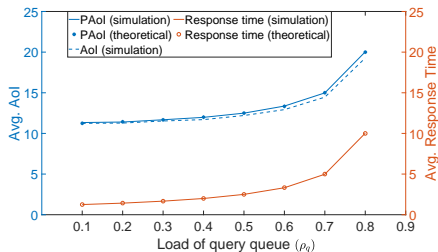
Query-3 has small improvement on the PAoI but **large response time!**

The Update- k Policy

- Similar to the Query- k policy, except threshold k for the update queue
- Server switches condition:
 - ▶ The number of updates reaches the threshold k , or
 - ▶ The query queue becomes empty

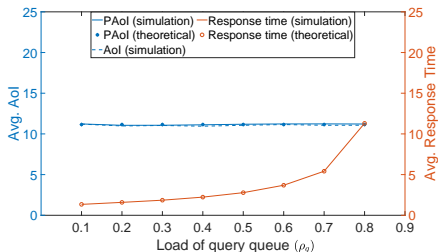


Numerical Result: The Update-1 Policy



FCFS

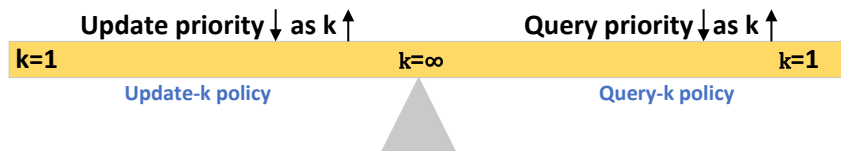
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The Update-1

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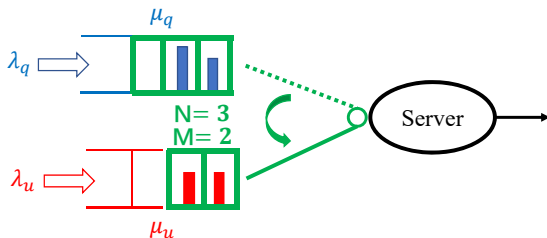
Update-1 achieves **much better PAol** than FCFS!



The priority is given to one queue only!

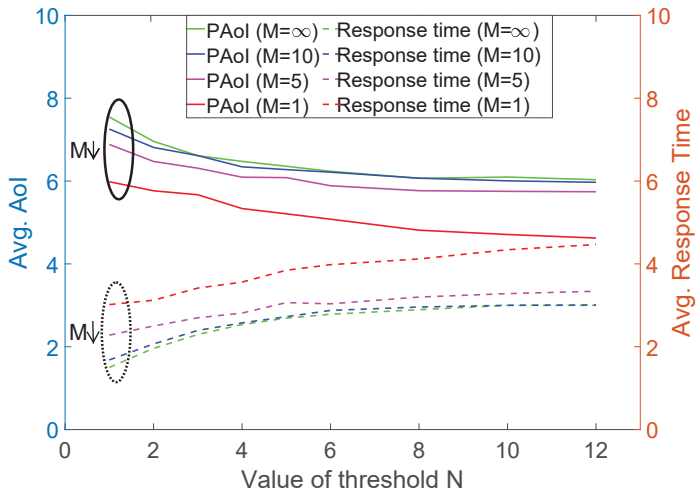
The Joint- (M, N) Policy

- Threshold M for the update queue; threshold N for the query queue
- Server switces conditions
 - ▶ The threshold is reached, or
 - ▶ The other queue is empty





Simulation Result: The Joint- (M, N) Policy





Conclusion:

- Proposed a simple single-server two-queue model
 - ▶ Tradeoff: **Service performance** vs. **Information freshness**
- Proposed threshold-based scheduling policies
 - ▶ The Query- k , the Update- k and the Joint- (M, N) policy
 - ▶ Analyze the response time and the PAol rigorously

Future Work:

- Average PAol vs. Average Aol
- The systematical analysis of the Joint- (M, N) policy
- Switching overhead

Thank You!

Questions?

Zhongdong Liu (zhongdong.liu@temple.edu)

Analysis: FCFS

Proposition 1

Under the FCFS policy, the expected response time is

$$\mathbb{E}[T_q] = \frac{\rho_u/\mu_u + (1 - \rho_u)/\mu_q}{1 - \rho_u - \rho_q},$$

and the expected PAoI is

$$\mathbb{E}[A] = \mathbb{E}[X_u] + \mathbb{E}[T_u] = \frac{1}{\lambda_u} + \frac{\rho_q/\mu_q + (1 - \rho_q)/\mu_u}{1 - \rho_u - \rho_q}.$$

Proof sketch:

For an update, its response time = total service time of updates + total service time of queries + its own service time.

