## Pass-and-Swap Queues

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## The M/M/1 queue

## Model

- Jobs arrive according to a Poisson process with rate $\lambda$.
- Service times are i.i.d. exponentially distributed with rate $\mu$.
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## Analysis



- Markov (birth-and-death) process.
- Stationary distribution: $\pi(n)=\left(1-\frac{\lambda}{\mu}\right)\left(\frac{\lambda}{\mu}\right)^{n}$.
- Proof: (partial) balance equations + normalization equation.


## Order-independent queues

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- Order-independent (OI) queue (Berezner et al., 1995) (Bonald and Comte, 2017)



## Order-independent queues

- Product-form stationary distribution (Gardner et al., 2016):

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\pi\left(c_{1}, c_{2}, \ldots, c_{n}\right)=\pi(\varnothing) \prod_{p=1}^{n} \frac{\lambda_{c_{p}}}{\mu\left(c_{1}, \ldots, c_{p}\right)}
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- Proof: (partial) balance equations + normalization equation.
- Why study product-form queues?
- Rich in applications.
- Exact performance analysis is not completely hopeless.


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- Adan, Kleiner, Righter, Weiss (2018)
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- Ayesta, Bodas, Dorsman, Verloop (2021)
- A: But, still, new product-form queues keep appearing, not captured by these frameworks, such as the pass-and-swap queue.


## Definition

## Pass-and-swap (P\&S) queues

- are an extension of OI queues,
- add a whole new dimension to product-form queues: intra-queue routing,
- have many applications.


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## Product-form stationary distribution

- Stationary distribution: exactly the same as OI queues!

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\pi\left(c_{1}, c_{2}, \ldots, c_{n}\right)=\pi(\varnothing) \prod_{p=1}^{n} \frac{\lambda_{c_{p}}}{\mu\left(c_{1}, \ldots, c_{p}\right)}
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- Proof: (partial) balance equations + normalization equation.
- Hence, the P\&S queue is a product-form queue.
- We also prove a simple stability condition (also valid for OI queues).


## Closed network of P\&S queues

- Tandem network of two P\&S queues with the same swapping graph:



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- Tandem network of two P\&S queues with the same swapping graph:

- B always last in the upper queue, first in the lower queue: placement order.
- The stationary distribution again has a product form (on a restricted space)!


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- The lower queue models "state-dependent arrivals" to the upper queue.



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- This is very powerful:
- Redundancy cancel-on-start and cancel-on-commit.
- Hierarchical load-distribution algorithms.


## Conclusion

## Take away

- P\&S queues broaden the family of product-form queues by allowing for intra-queue routing.
- Networks of P\&S queues also have a product form.
- Paves the way for performance analysis of other algorithms.


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## Future works

- How big is the family of product-form queues?
- Are there other routing mechanisms that lead to a product form?
- Can we find other applications of P\&S queues?

