

# Event-Driven Simulation

Textbook: Chapter 2 and 3  
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## Overview

- Event-driven simulation is a modelling paradigm in which flow of control within the system is driven by events rather than sequence
  - contrast: procedural vs. event-driven programming
- Sequential flow of control:
  - sequence, branching, iteration
- Event-driven flow of control:
  - events are managed dynamically by an event scheduler
    - typically represented by an event queue (separate from system)
  - advantages: flexible, handles synchronous/asynchronous models with arbitrary timing delays
  - disadvantages: performance

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## Overview (cont.)

- Event queue
  - every time step:
    - remove items from the event queue due for processing
    - perform appropriate action/updates/etc.
    - as future events are determined, they are added to the event queue (and will be processed at the appropriate time-step)
- Alternative: event loop
  - a thread/process monitors key resources for change, and performs an associated action when it is detected
  - NOTE: this is uncommon in computer simulation
    - unusual to desire completely asynchronous real-time behaviour in a simulated system (consider games, or graphics though...)

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## Overview (cont.)

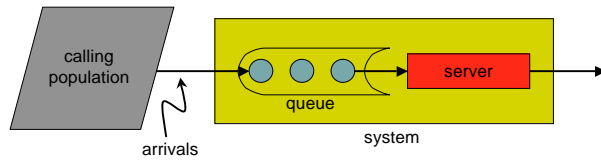
- Measures (this list is not exhaustive):
  - # customers processed ( $N$ )
  - total service/wait/system time ( $W = W_s + W_q$ )
    - cumulative measures
  - total idle/clock time ( $T_o/T_{max}$ )
  - average wait time ( $w_q = W_q/N$ )
  - probability of waiting  $p(w_q^n > 0) = \frac{\# \text{ wait}}{N}$
  - probability of idle server ( $P_o = T_o/T_{max}$ )
  - probability of busy server ( $1 - P_o$ )
  - average service time ( $w_s = W_s/N$ )
  - average service rate ( $1/w_s$ )

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## Example

- Single server queue

- we'll deal with more realistic situations shortly, however this simple example illustrates the basic concepts



- Assume:

- customers of one type arrive according to some random process
- service times vary from one customer to another

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## Example (cont.)

- In order to analyze this system numerically, we will need:

- knowledge of customer population statistics
  - distribution of inter-arrival times of customers
  - nature of calling population
- knowledge of server discipline
  - distribution of service times
- means of generating variates from appropriate distributions

- For simplicity:

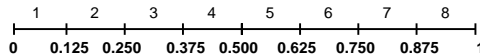
- assume inter-arrival and service times are uniformly distributed integers
  - how would we notate this queueing system?
- specifically:
  - inter-arrival times  $\in [1,8]$ , service times  $\in [3,12]$

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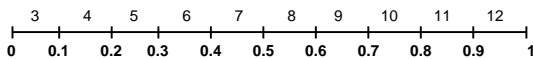
## Example (cont.)

- Since IATs and STs are uniform:

- inter-arrival times:



- service times:



- use a pseudo-random number generator to obtain a sample of 20 IATs and STs for 20 customers

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## Example (cont.)

Cust.	$U_1$	IAT	$U_2$	ST	Cust.	$U_1$	IAT	$U_2$	ST
1	-	-	0.2910	5	11	0.0997	1	0.6344	9
2	0.6039	6	0.1321	4	12	0.8616	7	0.1848	4
3	0.2782	3	0.5318	8	13	0.3889	4	0.6166	9
4	0.2103	2	0.4716	7	14	0.7455	6	0.8282	11
5	0.9101	8	0.8662	11	15	0.2544	3	0.5563	8
6	0.5983	5	0.5414	8	116	0.1191	1	0.7329	10
7	0.1931	2	0.7358	10	17	0.4876	4	0.1478	4
8	0.8663	7	0.0137	3	18	0.6441	6	0.3731	6
9	0.3944	4	0.5955	8	19	0.5232	5	0.9697	12
10	0.7223	6	0.9751	12	20	0.1856	2	0.2419	5

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## Example (cont.)

Cust.	ST	IAT	$t_{\text{arrive}}$	service start	service end
1	5	-	0	0	5
2	4	6	6	6	10
3	8	3	9	10	18
4	7	2	11	18	25
5	11	8	19	25	36
6	8	5	24	36	44
...	...	...	...	...	...

inputs
derived

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## Example (cont.)

- Basic Data

- # customers =  $N = 20$  ( $N_w = 18$ )
- total service time =  $W_s = 154m$
- total wait time =  $W_Q = 589m$
- total system time =  $W = W_s + W_Q = 743m$
- total idle time =  $T_0 = 1m$
- total clock time =  $T_{\text{max}} = 155m$

- Performance measures

- avg. wait time =  $w_q = W_Q/N = 29.45m$
- prob. of waiting =  $p(w_q^i > 0) = \#\_wait/N = 0.9$
- prob. of idle server =  $P_0 = T_0/T_{\text{max}} = 0.00645$
- prob. of busy server =  $1 - P_0 = 0.99355$

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## Example (cont.)

- Performance measures...

- avg. service time =  $w_s = W_s/N = 7.7m$
- avg. service rate =  $1/w_s = 0.12987$ 
  - NOTE:  $E(1/w_s) = 1/10(3+4+\dots+12) = 7.5m$
- avg. inter-arrival time =  $\text{total\_IAT} / N - 1 = 4.3158m$
- inter-arrival rate =  $1/\text{avg\_IAT} = 0.2317\text{cust./m}$ 
  - NOTE:  $E(\text{inter-arrival rate}) = 1/8(1+2+\dots+8) = 4.5m$
- avg. time in system =  $w = W/N = w_q + (1/w_s) = 37.15m$
- etc.

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## Simpler Model

- Don't need explicit servers or customers

- Server is a boolean variable that says whether a customer is being served (LS)
- Queue is an integer variable that says how many customers is lined up (LQ)
- Events Lists (FEL)
  - Holds events clock-time pairs
    - A = arrival
    - D = departure
    - E = end
  - Will hold 1, 2 or 3 events only
    - $(E t_e)$
    - $(A t_a) (E t_e)$
    - $(A t_a)(D t_d)(E t_e)$  or  $(D t_d)(A t_a)(E t_e)$

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## Simpler Model

- For every event processed
  - Generate a service time and hence a new departure event each time LS is set
    - Can occur during an arrival event (LQ is empty)
    - Or a departure event (LQ is not empty)
  - Generate a new arrival event each time an arrival event is processed
    - This occurs whether the arriving 'customer' is
      - serviced immediately (LQ is empty and LS is false)
      - added to LQ (LQ is not empty or LS is true)
    - i.e there is always a new arrival

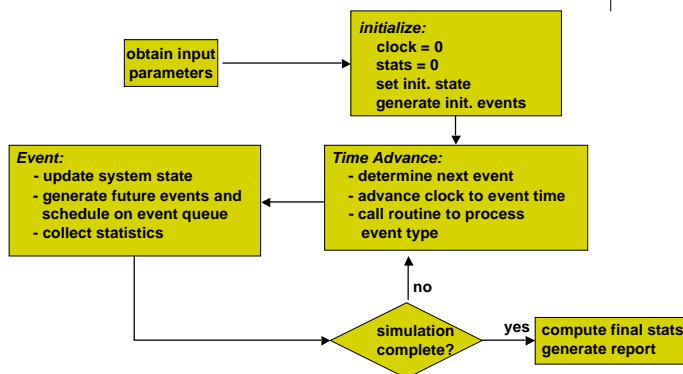
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## Example (cont.)

	Clock	Server busy	# in system queue	event queue
	init.	no	0	A0, E100
A	0	yes	0	D5, A6, E100
D	5	no	0	A6, E100
A	6	yes	0	A9, D10, E100
A	9	yes	1	D10, A11, E100
D	10	yes	0	A11, D18, E100
...	...	...	...	...

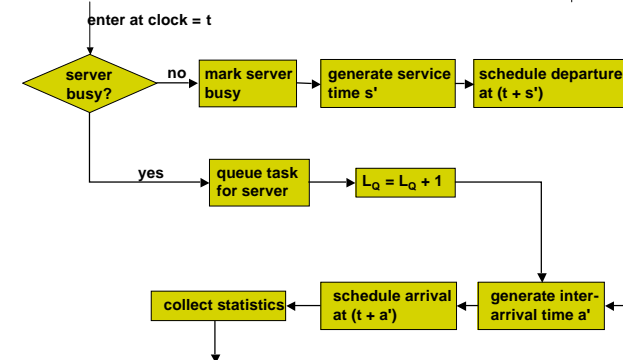
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## Event-Driven Simulation Flowchart



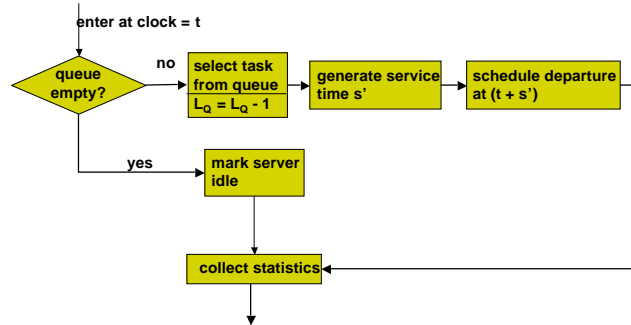
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## Arrival Event Execution Flowchart



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## Departure Event Execution Flowchart



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