

# Discrete Event Simulation

DES

# DES

- Introduction:
  - System
  - Models
  - Discrete event simulation and
  - Continuous simulation
- Discrete Event Simulation:
  - Time-Advance Mechanisms
  - Event Modeling of discrete dynamic systems
  - Single-Server Single-Queue Model
  - Event graphics
  - Monte Carlo Simulation

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## Categories of Systems



Discrete and Continuous Systems

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## Discrete Systems

The state of the system changes only at discrete points in time.

These points in time are the ones at which the event occurs/change in state occurs.

Firing of a gun on an enemy target.

Model of Bank:

Number of customers waiting in line being served.

Queuing, Inventory, Machine Shop Models

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## Continuous Systems

The state of the system changes continuously

Fluid flow in a pipe

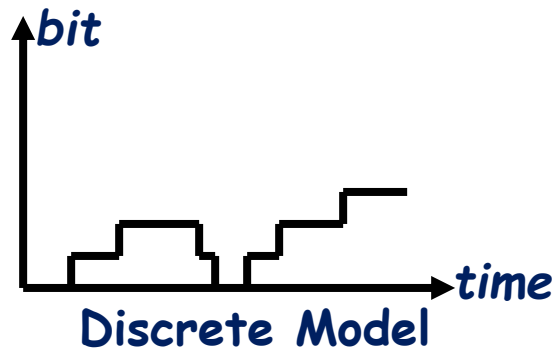
Chemical Process

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## Discrete Vs. Continuous Models

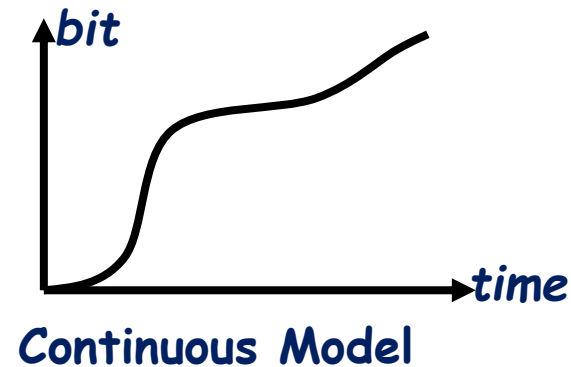
### Discrete Models

*# of cars in a parking lot*



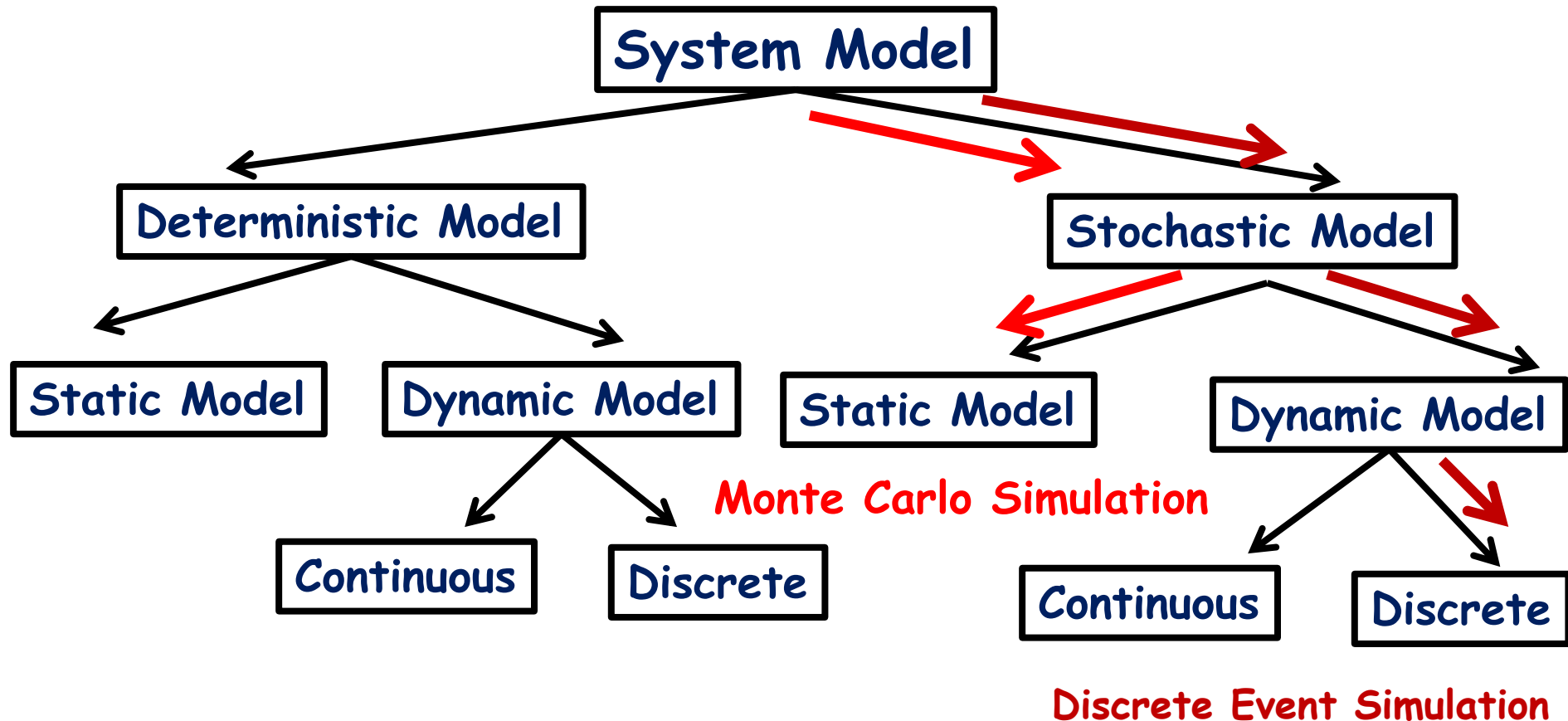
### Continuous Models

*Bit Arrival in a Queue*



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## Models Taxonomy



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## What is Discrete Event Simulation?

Computer model for a system

where

changes in the state of the system occurs (Dynamic)

at discrete points in simulation time (Discrete)

and

system state can not be predicted entirely (stochastic).



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## What is Discrete Event Simulation?

models a system  
whose state may change  
only at discrete point in time  
and  
randomly.

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## What is Discrete Event Simulation?

DES is

Stochastic:

Probabilistic

at least some of the system state variables are random:

Inter-arrival times and service times are random variables

Dynamic:

Changes over time and

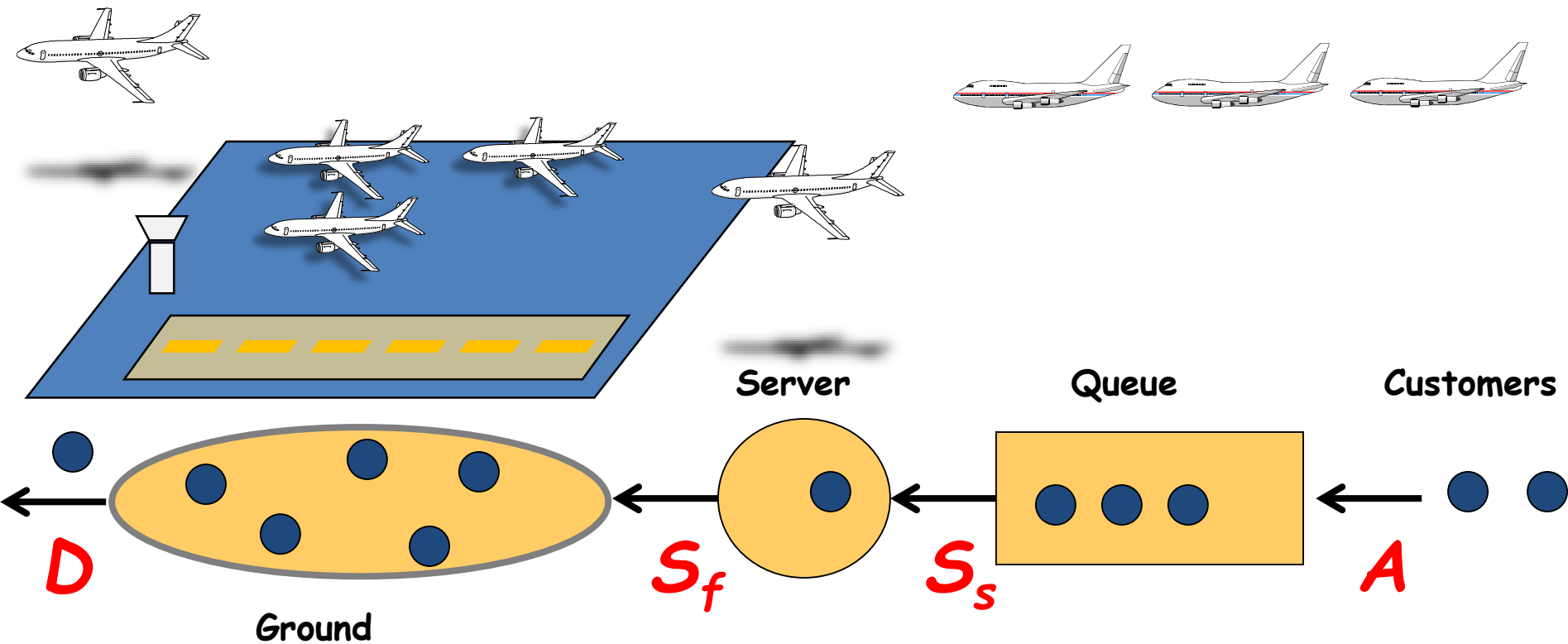
Discrete Event : The state variables change instantaneously at separate points in time

The system can change at only a countable number of points in time.

These points in time are the ones at which an event occurs.

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## An Example: Airport System



## DES :Key Concepts



```
graph TD; A[DES :Key Concepts] --> B[System States]; A --> C[Events]; A --> D[Simulation Time];
```

### System States

System state at  
Current Time is  
stored in a variable  
called **State**  
**variable**

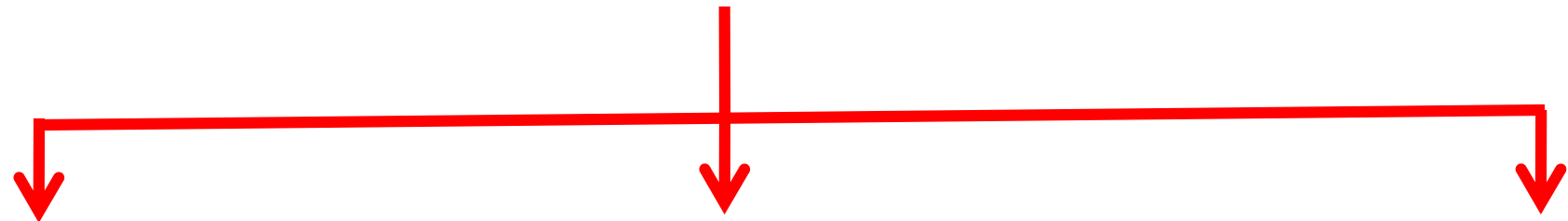
### Events

An instantaneous  
occurrence that  
changes the state  
of a system.

### Simulation Time

When each event  
is scheduled /  
occurs.

## DES :Key Concepts



System States

State Variables

For Example: Airport System

Q: # of aircrafts waiting for landing

G: # of aircrafts on the ground

B: y/n;  
y if the runway is busy

Events

Arrival: denotes aircraft arriving in air space of airport

Landed: denotes aircraft landing

Departure: denotes aircraft leaving

Simulation Time

E1 is scheduled at 10:00 AM then it is called Simulation Time of Event E1

## DES :Key Concepts



### Simulation Clock

A variable representing simulation time

### Future Event List

A List of Events to occur in future time

### Delay

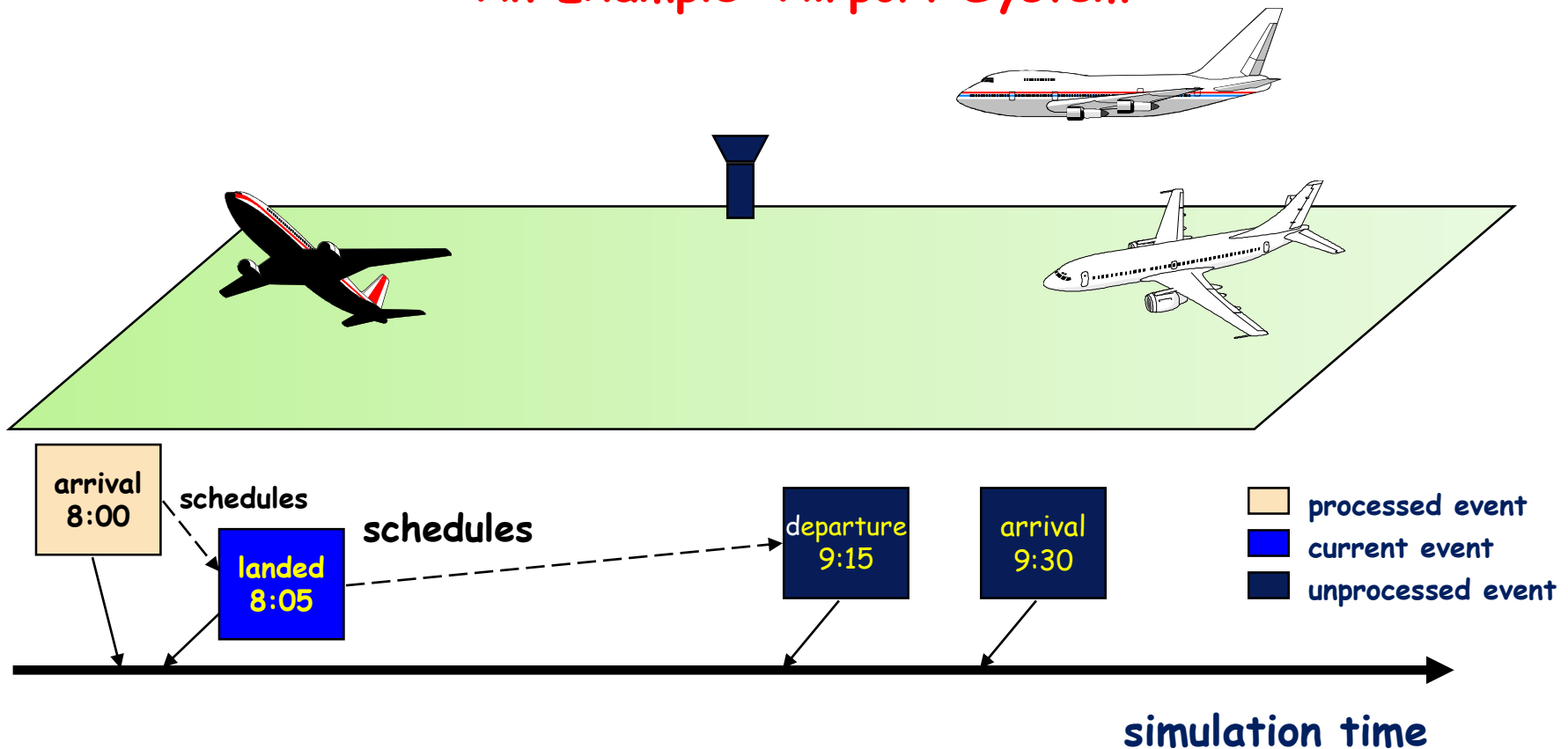
A duration of time of unspecified indefinite length, which is not known until it ends (customer delay in waiting line)

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# DES: Key Concepts

## Single Server Queue

### An Example: Airport System



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## Single Server Queuing Model

The machine shop model

There is just one service technician.

The "jobs" are the machines to be repaired and the "server" is the service technician.

Bank Model

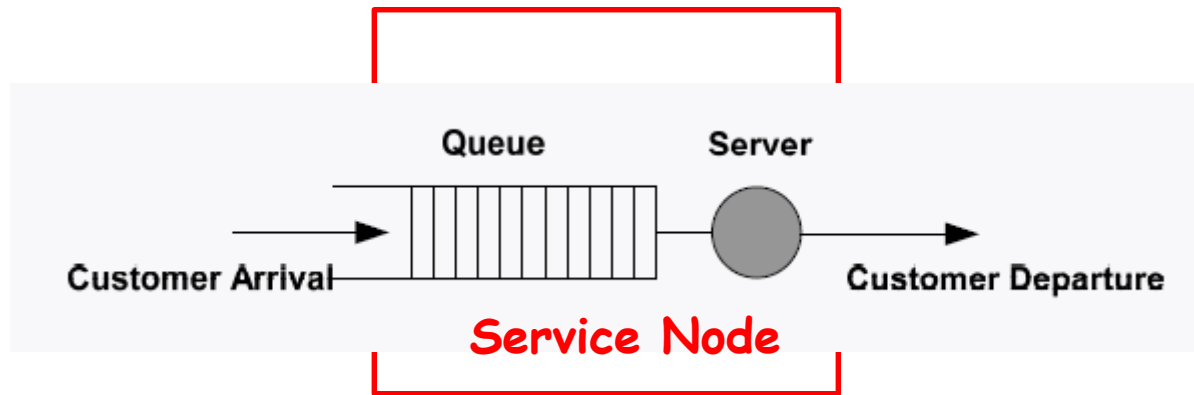
If there is only one Cashier in the Bank.

The "jobs" are Customers to be serviced and server is "Cashier".



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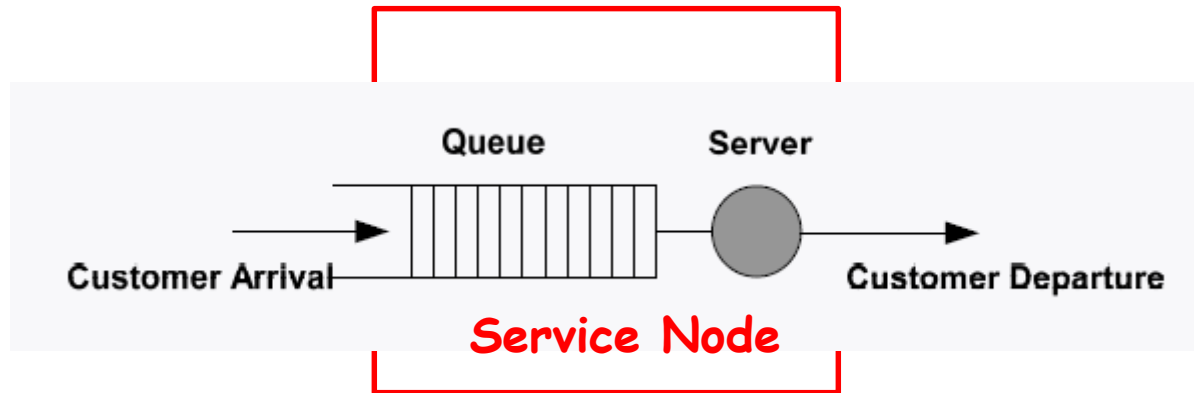
## Example: A Single Server System



Service Node: Queue + Server

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## Example: A Single Server System



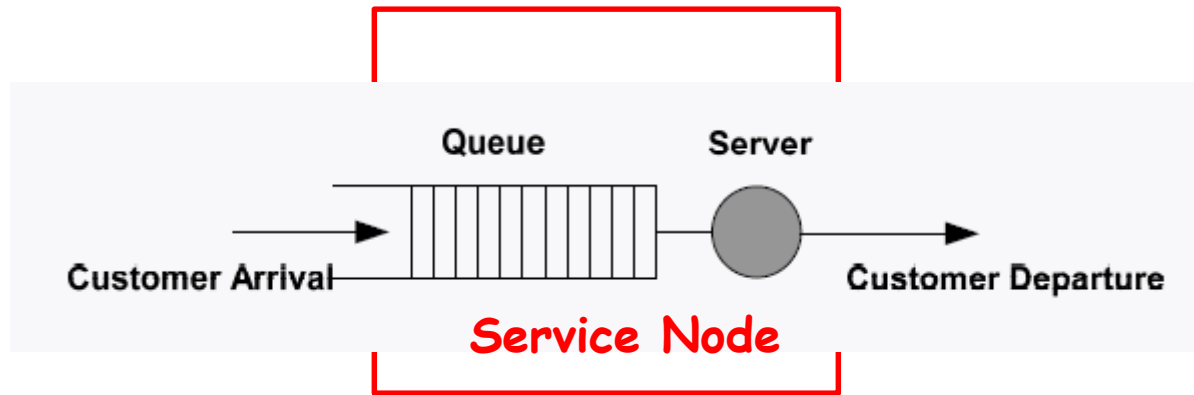
Service Node: Queue + Server

Jobs (customers) arrive at the service node at **random points in time** seeking service.

When service is provided, the **service time** involved is also **random**.

At the completion of service, jobs depart.

## Example: A Single Server System



The service node operates as follows:

as each (new) job arrives:

if the server is busy then the job enters the queue

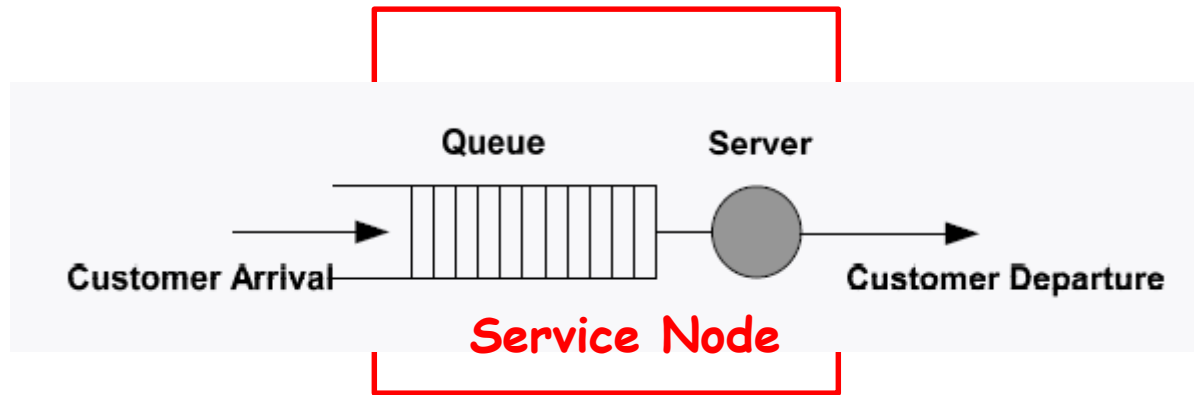
else the job immediately enters service

as each (old) job departs:

if the queue is empty then the server becomes idle,

else a job is selected from the queue to immediately enter service.

## Example: A Single Server System



At any time, the state of the server will either be **busy or idle** and the state of the queue will be either empty or not empty.

If the server is **idle**, the **queue must be empty**

If the queue is **not empty** then the **server must be busy**.

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## Algorithm: A Single Server System

$a_1, a_2, \dots, a_n$  are arrival times  
 $s_1, s_2, \dots, s_n$  are service times } are known

$c_n$  is the departure time of jobs Initially zero.

$i_n$  denotes Job Numbers Initially zero.

The server is initially idle

Queue discipline is FIFO

Queue Capacity is infinite

The `GetArrival()` and `GetService()` procedures read the next arrival and service time respectively.

This algorithm computes the delays  $d_1, d_2, \dots, d_n$

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## Algorithm: A Single Server System

$c_0 = 0.0$ ; /\* assumes that  $a_0 = 0.0$  \*/

$i = 0$ ;

while ( more jobs to process )

{

$i++$ ;

$a_i = \text{GetArrival}()$ ;

    if ( $a_i < c_{i-1}$ )

        /\* calculate delay for job i \*/

$d_i = c_{i-1} - a_i$ ;

    else

        /\* job i has no delay \*/

$d_i = 0$ ;

$s_i = \text{GetService}()$ ;

    /\* calculate departure time for job i \*/

    /\* or  $c_i = a_i + w_i$  \*/

$c_i = a_i + d_i + s_i$ ;

}

$n = i$ ;

return  $d_1, d_2, \dots, d_n$ ;

i	1	2	3	4	5	6	7	8	9	10
$a_i$	15	47	71	111	123	152	166	226	310	320
$s_i$	43	36	34	30	38	40	31	29	36	30

## Algorithm: A Single Server System

Example

Let  $n=10$

$c_0=0$

$i=0$

Job	$a_i$	$s_i$	$c_i = a_i + s_i + d_i$	$d_i = c_{i-1} - a_i$
0			0	
		Is $a_i < c_i - 1$ ?		
1	15	43	No 58	0
		Is $a_i < c_i - 1$ ?		
2	47	36	Yes 94	$58 - 47 = 11$
		Is $a_i < c_i - 1$ ?		
3	71	34	Yes 128	$94 - 71 = 23$
		Is $a_i < c_i - 1$ ?		
4	111	30	yes 158	$128 - 111 = 17$
		Is $a_i < c_i - 1$ ?		
5	123	38	Yes 196	$158 - 123 = 35$

## Algorithm: A Single Server System

### Example

Job	$a_i$	$s_i$	$c_i = a_i + s_i + d_i$	$d_i = c_{i-1} - a_i$
0			0	
1	15	43	58	0
2	47	36	94	$58 - 47 = 11$
3	71	34	128	$94 - 71 = 23$
4	111	30	158	$128 - 111 = 17$
5	123	38	196	$158 - 123 = 35$
6	152	40	236	$196 - 152 = 44$
7	166	31	267	$236 - 166 = 70$
8	226	29	296	$267 - 226 = 41$
9	310	36	346	0
10	320	30	376	$346 - 320 = 26$

347



## Algorithm: A Single Server System Example

	$i$	:	1	2	3	4	5	6	7	8	9	10
From Algorithm	$a_i$	:	15	47	71	111	123	152	166	226	310	320
	$d_i$	:	0	11	23	17	35	44	70	41	0	26
	$s_i$	:	43	36	34	30	38	40	31	29	36	30

For future reference, note that the last job arrived at time  $a_n = 320$  and departed at time  $c_n = a_n + d_n + s_n = 320 + 26 + 30 = 376$ .

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## Algorithm: A Single Server System

### Job-Averaged Statistics

For the First  $n$  jobs,

The average inter-arrival time:  $\bar{r} = \frac{1}{n} \sum_{i=1}^n r_i = \frac{a_n}{n}$

The average service time:  $\bar{s} = \frac{1}{n} \sum_{i=1}^n s_i.$

The arrival Rate:  $1/\bar{r}$

The Service Rate:  $1/\bar{s}$

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## Algorithm: A Single Server System Job-Averaged Statistics

For  $n=10$  jobs in our example:

$$\bar{r} = a_n/n = 320/10 = 32.0$$

And

$$\bar{s} = 347/10 \quad \bar{s} = 34.7$$

If time in this example is measured in seconds, then the average inter-arrival time is 32:0 seconds per job and the average service time is 34:7 seconds per job

The corresponding **arrival rate** is  $1/\bar{r} = 1/32.0$ , approx = 0.031 jobs per second

The **service rate** is  $1/\bar{s} = 1/34.7$ , approx = 0.029 jobs per second.

## Algorithm: A Single Server System

### Job-Averaged Statistics

In this particular example, the server is not quite able to process jobs at the rate they arrive on average.

For the First  $n$  jobs,

the average delay in the queue:  $\bar{d} = \frac{1}{n} \sum_{i=1}^n d_i$

the average wait in the service node:  $\bar{w} = \frac{1}{n} \sum_{i=1}^n w_i.$

$$= \frac{1}{n} \sum_{i=1}^n (d_i + s_i)$$

$$= \frac{1}{n} \sum_{i=1}^n d_i + \frac{1}{n} \sum_{i=1}^n s_i = \bar{d} + \bar{s}.$$

## Algorithm: A Single Server System

### Job-Averaged Statistics

Our Example  $\bar{d} = 26.7$  and  $\bar{s} = 34.7$ .

Therefore, the average wait in the node is  
 $\bar{w} = 26.7 + 34.7 = 61.4$ .