



# **Computer Simulation**

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**Chapter Two: Simulation Examples** 



#### Steps Required for a Successful Simulation



- Three stages of simulations:
  - Determining the characteristics of the inputs
    - Typically, inputs are modeled as probability distributions
      - Either continuous or discrete
  - □ Constructing a simulation table
    - Based on the problem at hand, a different simulation table is developed
  - ☐ For every repetition i:
    - Generate a value for each of the p inputs, and evaluate the function, which gives the value of the response Y<sub>i</sub>
      - The input values may be computed by sampling values from the distributions determined in stage 1
- A response typically depends on the inputs and one or more previous responses



#### **Simulation Table**



- Simulation table is a representation tool for monitoring the simulated system during the simulation period
- It mainly contains:
  - □ Round of replication i
  - □ Inputs X<sub>ii</sub>
  - □ Outputs (or response) Y<sub>i</sub>

			In		Response		
Repetitions	X <sub>i1</sub>	X <sub>i2</sub>		X <sub>ij</sub>		X <sub>ip</sub>	<b>y</b> i
1							
2							
n							



#### **Simulation of Queuing Systems**



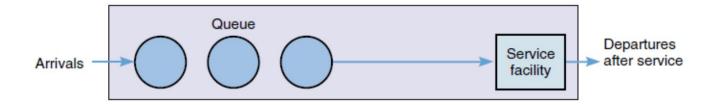
- Why Queues?
  - Queues are the best known model for discrete systems
  - We do not have a queue-less system
- A queuing system is described by:
  - □ Its calling population
  - The nature of the arrival
    - Indicated with rate of arrival
  - □ The service mechanism
    - Includes rate of service, number of servers, servers configuration
  - The system capacity
    - Number of customers can wait + Number of customers can get service
  - □ The queuing discipline
    - How the customers are selected for getting service
      - Example: First come, First serve (FIFO)



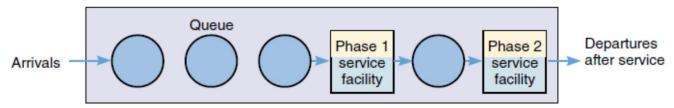
#### **Servers Configuration (1)**



- Based on the number of service phases, and service channels we have 4 types of configurations:
  - □ Single-channel/Single-phase system



Single-channel/Multi-phase system



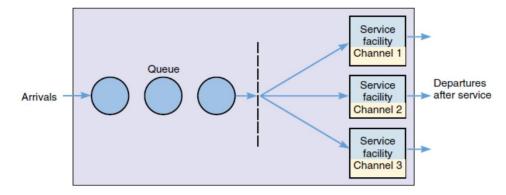
Single-channel, multiphase system



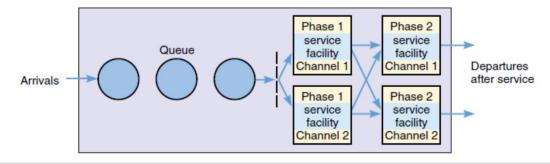
#### **Servers Configuration (2)**



- Based on the number of service phases, and service channels we have 4 types of configurations:
  - Multi-channel/Single-phase system



Multi-channel/Multi-phase system







#### Single-channel Queue Assumptions (1)



- The calling population is infinite
  - ☐ If a customer leaves the calling population and joins the waiting line or enters service, there is no change in the arrival rate of other customers that may join the queue
  - □ This simplifies our study and reduces calculations
- Arrivals for service occur in a random fashion
- Once a customer joins the waiting line, it will be eventually served (If we have self-service process)
- Service times are of some random length according to a probability distribution
  - Which does not change over time

#### Single-channel Queue Assumptions (2)



- The system capacity has no limit
  - Meaning that any number of customers can wait in line
- Customers are served in the order of their arrival
  - □ Often called FIFO: First In, First out
  - By a single server or channel
- Arrivals are defined by the distribution of the time between arrivals
  - Interarrival time
    - Inverse of arrival rate
- Services are defined by the distribution of service times

#### Single-channel Queue Assumptions (3)



- For any simple single (or multi) channel queue, the overall effective arrival rate must be less than the total service rate
  - Otherwise, the waiting line will grow without bound
  - System turns into unstable state
- In some systems, the condition about arrival rate being less than service rate may not guarantee stability
  - Other factors are also involved

#### Simulation of Queuing Systems (1)



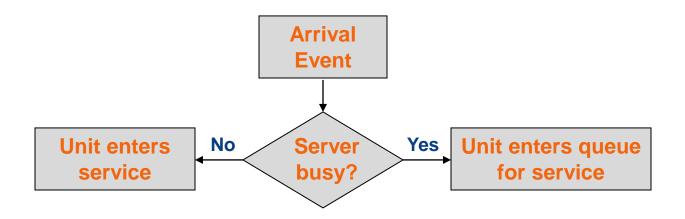
- System state in our simple queue model is the number of units in the system along with the status of the server
  - □ Status of the server could be busy or idle
- Recall:
  - □ Event is a set of circumstances that cause an instantaneous change in the state of the system
- In a single-channel queuing system there are only two possible events that can affect the state of the system:
  - Arrival event: the entry of a unit into the system
  - Departure event: the completion of service on a unit
- An important element in simulations is the clock
  - Clock is used to monitor the system during the simulation period



#### Simulation of Queuing Systems (2)



- The arrival event occurs when a unit enters the system
- The unit may find the server either idle or busy
  - □ Idle: the unit begins service immediately
  - □ Busy: the unit enters the queue for the server

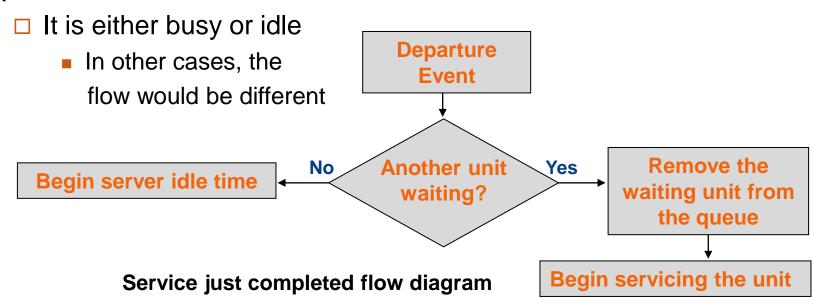


Unit entering the system flow diagram

#### Simulation of Queuing Systems (3)



- If a unit has just completed service
  - The simulation proceeds in the manner shown in the flowing diagram
- Note that we have assumed that the server has only two possible states





#### Simulation of Queuing Systems (4)



Based on the queue and server status, the following system states are expected in the **instance** a unit enters or leaves the system

#### Potential unit actions upon arrival

		Queue status			
		Not empty	Empty		
Server	Busy	Enter queue	Enter queue		
status	Idle	Impossible	Enter service		

#### Server outcomes after service completion

		Queue status			
		Not empty Empty			
Server	Busy		Impossible		
outcomes	Idle	Impossible			



#### Simulation of Queuing Systems (4)



- Simulation of queuing systems generally requires an event list
  - □ To determine what will happen next
- Simulation clock is used to determine the exact times of arrival and departure events
  - Exact times are calculated based on interarrival and service times
- Events usually occur at random times
  - Randomness provides uncertainty as in real life
  - Random numbers are distributed uniformly and independently on the interval (0,1)
  - □ One simple approach for generating random numbers is to randomly select digits, which are uniformly distributed on the set {0, 1, 2, ..., 9}, and concatenate them
    - The proper number of digits is dictated by the accuracy of the data being used for input purposes



#### Simulation of Queuing Systems (5)



- Pseudo-random numbers should be generated using a procedure
  - Detailed in Chapters 6 and 7
  - □ What is the difference between true and pseudo random number?
- Consider a shop, where 6 customers arrive randomly
  - □ Assume that the **Interarrival times** for customers are generated by rolling a die five times and recording the up face

	Interarrival	
Customer	Time	Time on Clock
1		0
2	2	2
3	4	6
4	1	7
5	2	9
6	6	15





#### Simulation of Queuing Systems (6)



- Assume that there are four possible values for Service Times ∈ {1,2,3,4}
  - □ All have equal probabilities to occur
  - These values could have been generated by writing down the numbers on chips and drawing the chips from a hat with replacement
    - Be sure to record the numbers selected ©

	Service
Customer	Time
1	2
2	1
3	3
4	2
5	1
6	4



#### Simulation of Queuing Systems (7)



- In order to analyze our simulated single-channel queuing system, the Interarrival times and service times must be integrated
  - Two previous tables must be merged
- The following table is specifically designed for a singlechannel queue, which serves customers based on FIFO
- Events are indicated based on the clock time

A	В	С	D	Е
	Arrival	Time Service	Service	Time Service
Customer	Time	Begins	Time	Ends
Number	(Clock)	(Clock)	(Duration)	(Clock)
1	0	0	2	2
2	2	2	1	3
3	6	6	3	9
4	7	9	2	11
5	9	11	1	12
6	15	15	4	19





#### Simulation of Queuing Systems (8)

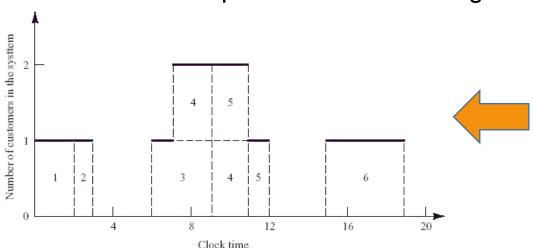


#### Event table:

- □ Unlike simulation table, entries are chronically ordered based on the occurrence of events (not the customers)
- Occurrence of two types of events (arrival and departure) in their chronological order is shown in the following table

□ Based on this table, the number of customers in every instance of

time could be represented as in the figure



	Customer	Clock
Event Type	Number	Time
Arrival	1	0
Departure	1	2
Arrival	2	2
Departure	2	3
Arrival	3	6
Arrival	4	7
Departure	3	9
Arrival	5	9
Departure	4	11
Departure	5	12
Arrival	6	15
Departure	6	19



# Simulation of Queuing in a Grocery Store (1)



- Assumptions in this example:
  - Only one checkout counter (only one server)
  - Customers arrive at this checkout counter at random from 1 to 8 minutes apart
  - □ Each possible value of inter-arrival time has the same probability of occurrence, as shown in next slide
  - The service times vary from 1 to 6 minutes with different probabilities shown in the next slide
- The problem is to analyze the system by simulating the arrival and service of 20 customers



#### Simulation of Queuing in a Grocery Store (2)



- The distribution of interarrival and service times are shown below
  - □ Based on the probability distribution, and their **cumulation**, the two following issues would be determined:
    - The precision required for random number generation
      - Number of decimal points
    - An interval for selecting a specific value for interarrival or service time

Time between			
Arrivals		Cumulative	Random-Digit
(Minutes)	Probability	Probability	Assignment
1	0.125	0.125	001-125
2	0.125	0.250	126 - 250
3	0.125	0.375	251-375
4	0.125	0.500	376-500
5	0.125	0.625	501-625
6	0.125	0.750	626 - 750
7	0.125	0.875	751 -875
8	0.125	1.000	876 000

Service Time		Cumulative	Random-Digit
(Minutes)	Probability	Probability	Assignment
1	0.10	0.10	01-10
2	0.20	0.30	11-30
3	0.30	0.60	31-60
4	0.25	0.85	61-85
5	0.10	0.95	86-95
6	0.05	1.00	96-00



# Simulation of Queuing in a Grocery Store (3)



- Simulating a grocery store that starts with an empty system is not realistic
  - Unless, the goal is to model the system from startup until the steadystate
- Based on the required accuracy for interarrival and service times, we must generate a random number
  - In order to determine the value of interarrival and service time parameters for every customer, we must match the generated numbers with the intervals
    - The rightmost two columns
  - Random numbers have the following properties:
    - They are uniformly distributed between 0 and 1
    - Successive random numbers are independent
  - Use RAND() function in Excel or rand function in Matlab



# Simulation of Queuing in a Grocery Store (4)



- Example: Determining an interarrival time for the 2<sup>nd</sup> customer
  - Since there were 8 values for interarrival times with uniform distribution, each will have 0.125 probability
    - Cumulation of these values and turning them into integer intervals requires three point decimal precision for the random number
      - □ The generated number will be then multiplied by 1000
  - □ Assume that the first random digits is 913
    - To obtain the corresponding interarrival time, enter the fourth column of the table and read 8 minutes from the first column of the table

		Time between			Time between
	Random	Arrivals		Random	Arrivals
Customer	Digits	(Minutes)	Customer	Digits	(Minutes)
1	_	_	11	109	1
2	913	8	12	093	1
3	727	6	13	607	5
4	015	1	14	738	6
5	948	8	15	359	3
6	309	3	16	888	8
7	922	8	17	106	1
8	753	7	18	212	2
9	235	2	19	493	4
10	302	3	20	535	5



# Simulation of Queuing in a Grocery Store (5)



- Determining the service time:
  - □ Unlike interarrival time, service time is also specified for the 1<sup>st</sup> customer
  - □ In the following table, the first customer's service time is 4 minutes, because the generated random digits 84 fall in the range 61-85

		Service			Service
	Random	Time		Random	Time
Customer	Digits	(Minutes)	Customer	Digits	(Minutes)
1	84	4	11	32	3
2	10	1	12	94	5
3	74	4	13	79	4
4	53	3	14	05	1
5	17	2	15	79	5
6	79	4	16	84	4
7	91	5	17	52	3
8	67	4	18	55	3
9	89	5	19	30	2
10	38	3	20	50	3



# Simulation of Queuing in a Grocery Store (6)



- As we observed, the fundamental tool for a manual simulation is the simulation table
- One of the most important reasons for using a simulation table is to obtain statistical measures of performance for the intended system
- Statistical measures of performance in this example are:
  - □ Every **customer's time** in the system
  - The server's idle time
- In order to compute the required statistics, totals are formed as shown in the next table
  - These totals are calculated for:
    - Service times
    - Time customers spend in the system
    - Idle time of the server
    - Customers waiting time in the queue



# Simulation of Queuing in a Grocery Store (7)



A	B Time Since Last Arrival	C Arrival	D Service Time	E Time Service	F Time Customer Waits in Queue	G Time Service	H Time Customer Spends in System	I Idle Time of Server
Customer	(Minutes)	Time	(Minutes)	Begins	(Minutes)	Ends	(Minutes)	(Minutes)
1	_	0	4	0	0	4	4	0
2	8	8	1	8	0	9	1	4
3	6	14	4	14	0	18	4	5
4	1	15	3	18	3	21	6	0
5	8	23	2	23	0	25	2	2
6	3	26	4	26	0	30	4	1
7	8	34	5	34	0	39	5	4
8	7	41	4	41	0	45	4	2
9	2	43	5	45	2	50	7	0
10	3	46	3	50	4	53	7	0
11	1	47	3	53	6	56	9	0
12	1	48	5	56	8	61	13	0
13	5	53	4	61	8	65	12	0
14	6	59	1	65	6	66	7	0
15	3	62	5	66	4	71	9	0
16	8	70	4	71	1	75	5	0
17	1	71	3	75	4	78	7	0
18	2	73	3	78	5	81	8	0
19	4	77	2	81	4	83	6	0
20	5	82	3	83	1	86	4	0
			68		56		124	18



# **Performance Analysis of Grocery Store (1)**



- Based on the achieved totals, the statistical performance measures could be calculated for analysis:
  - □ The average waiting time for a customer (minutes):

Average waiting time = 
$$\frac{\text{Total time customers wait in Queue}}{\text{Total number of customers}} = \frac{56}{20} = 2.8 \text{ minute}$$

☐ The probability that a customer has to wait in the queue:

Waiting probability = 
$$\frac{\text{Number of customers who wait}}{\text{Total number of customers}} = \frac{13}{20} = 0.65$$

The percentage of idle time for the server:

Probability of idle server = 
$$\frac{\text{Total idle time of server}}{\text{Total run (time of simulation)}} = \frac{18}{86} = 0.21$$

□ The probability of the server being busy:

Probability of busy server = 1 - idle probability = 1 - 0.21 = 0.79



#### **Performance Analysis of Grocery Store (2)**



- Calculations (cont'd):
  - □ The average (mean) service time (minute):

Average service time = 
$$\frac{Total\ service\ time}{Total\ number\ of\ customers} = \frac{68}{20} = 3.4\ minute$$

- □ Note: we could have calculated the average service time without using the simulation table
  - It could be obtained by using the probability distribution table for service time, and the expected value equation

Expected Value = 
$$E(S) = \sum_{s=0}^{\infty} S \times P(S)$$
 [Eq. 1]  
=  $1(0.10) + 2(0.20) + 3(0.30) + 4(0.25) + 5(1.10) + 6(0.05) = 3.2$  minute

- The expected service time is slightly lower than the average service time in the simulation
  - □ The longer the simulation, the closer the average will be to



# **Performance Analysis of Grocery Store (3)**



- Calculations (cont'd):
  - □ The average of interarrival times (minute):

Average of interarrival times = 
$$\frac{\text{Sum of interrrivals}}{\text{Number of customers} - 1} = \frac{82}{19} = 4.3 \text{ minute}$$

- ☐ This result can be compared to the expected time for the uniformly distributed interarrivals
  - This could be calculated by finding the mean of the **discrete** uniform distribution whose endpoints are a=1 and b=8

$$E(A) = \frac{a+b}{2} = \frac{1+8}{2} = 4.5$$
 minute

- Again, the longer the simulation, the closer the average will be
- □ The average waiting time of those who wait:

Average waiting time of those who wait =  $\frac{\text{Total time customers wait in queue}}{\text{Total numbers of customers who wait}} = \frac{56}{13} = 4.3 \text{ minute}$ 



#### **Performance Analysis of Grocery Store (4)**



- Calculations (cont'd):
  - □ The average time a customer spends in the system:

Average time customers spends in the system = 
$$\frac{\text{Total time customers spend in the system}}{\text{Total number of customers}}$$
$$= \frac{124}{20} = 6.2 \text{ minute}$$

As it could be seen:

Average time Average time Average time customer spends = customer spends + customer spends in the system

waiting in the queue

for getting service

Average time a customer spends in the system = 2.8 + 3.4 = 6.2 minute

# Simulation of Able Baker Carhop Problem (1)

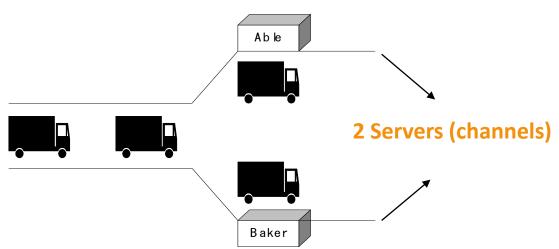


- In fast food restaurants, a drive-in facility has been considered
  - Customers can order and receive their food while driving
  - □ The person who gets the job done is called carhop
- In our example, two carhops are employed for both receiving orders, payment, and delivery simultaneously
  - □ Hence, the system is two-channel/single-phase
  - □ But the system could have been more complicated if the drivers had to order in one window, and get their food in another window, a few meters ahead
    - The system would be two-channel/two-phase

# Simulation of Able Baker Carhop Problem (1)



- Assumptions:
  - □ Customers (cars) arrive in the manner shown in next slide
  - Our carhops have different attributes:
    - Able does the job a bit faster than Baker
    - The distribution of their service times is shown in next slide
      - There would be two different tables



A drive-in restaurant where carhops take orders and bring food to the car



# Simulation of Able Baker Carhop Problem (2)



Tables for interarrivals and service times are illustrated

below

- Rules of the problem:
  - If both carhops are idle, Able gets the customer
  - □ If both are busy, the customer begins service with the first server to become free
  - To analyze the system performance, a 1-hour simulation operation is made
  - The problem is to find how well the current arrangement is working?

Time between			
Arrivals		Cumulative	Random-Digit
(Minutes)	Probability	Probability	Assignment
1	0.25	0.25	01-25
2	0.40	0.65	26-65
3	0.20	0.85	66-85
4	0.15	1.00	86-00

Service Time		Cumulative	Random-Digit		
(Minutes)	Probability	Probability	Assignment		
2	0.30	0.30	01-30		
3	0.28	0.58	31-58		
4	0.25	0.83	59-83		
5	0.17	1.00	84-00		

Service Time		Cumulative	Random-Digit		
(Minutes)	Probability	Probability	Assignment		
3	0.35	0.35	01-35		
4	0.25	0.60	36-60		
5	0.20	0.80	61-80		
6	0.20	1.00	81-00		



# Simulation of Able Baker Carhop Problem (3)



#### Manual simulation data has been recorded as follows:

A	В	С	D	Е	F	G	Н	I	J	K	L
						Able			Baker		
Customer	Random Digits	Time between	Clock Time	Random Digits	Time Service	Service	Time Service	Time Service	Service	Time Service	$Time\ in$
No.	for Arrival	Arrivals	of Arrival	for Service	Begins	Time	Ends	Begins	Time	Ends	Queue
1	_	_	0	95	0	5	5				0
2	26	2	2	21				2	3	5	0
3	98	4	6	51	6	3	9				0
4	90	4	10	92	10	5	15				()
5	26	2	12	89				12	6	18	0
6	42	2	14	38	15	3	18				1
7	74	3	17	13	18	2	20				1
8	80	3	20	61	20	4	24				0
9	68	3	23	50				23	4	27	0
10	22	1	24	49	24	3	27				0
11	48	2	26	39	27	3	30				1
12	34	2	28	53				28	4	32	0
13	45	2	30	88	30	5	35				0
14	24	1	31	01				32	3	35	1
15	34	2	33	81	35	4	39				2
16	63	2	35	53				35	4	39	0
17	38	2	37	81	39	4	43				2
18	80	3	40	64				40	5	45	0
19	42	2	42	01	43	2	45				1
20	56	2	44	67	45	4	49				1
21	89	4	48	01				48	3	51	0
22	18	1	49	47	49	3	52				0
23	51	2	51	75				51	5	56	0
24	71	3	54	57	54	3	57				0
25	16	1	55	87				56	6	62	1
26	92	4	59	47	59	3	62				0
						56			43		11



# Simulation of Able Baker Carhop Problem (4)



- In many cases, the pen & paper technique for obtaining the simulation table is infeasible
  - □ Especially when the number of customers and events is high and the configuration of the system is complicated
    - It takes significant time to generate the table ⊗
  - □ Solution: Excel or Matlab
    - The row for the first customer is filled in manually
      - □ To generate random numbers, use **RAND()** function in case of Excel or another random function replacing the random digits
    - After the first customer, the rows for other customers must be filled based on logic and formulas
      - □ Example: the "Clock Time of Arrival" (column D) in the row for the second customer is computed as follows:

$$D_i = D_{i-1} + C_i$$

Add the arriving time for the previous customer, and interarrival time for the current customer



# Simulation of Able Baker Carhop Problem (4)

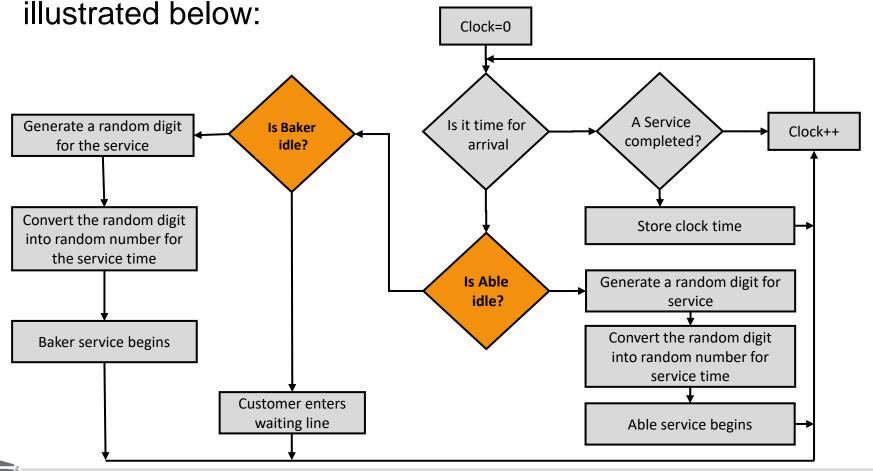


- It is possible to use conditional logic for the customers in Excel
  - □ We can use the macro function IF(), which returns one of two values depending on whether a condition is true or false:
    - IF (condition, value if true, value if false)
  - □ This macro has three arguments:
    - The condition to be checked
    - The returned value in case of a true condition
    - The returned value in case of a false condition

#### Simulation of Able Baker Carhop Problem (5)



Flowchart of the Able/Baker problem algorithm has been



# Simulation of Able Baker Carhop Problem (6)



- How to compute when Able and Baker will become free?
  - □ It also helps us to calculate servers busy time
  - □ It is necessary to find the beginning of service for a customer
    - Let's say, customer 10 (If it gets service from Able = F10)
    - We use the built-in Excel function for maximum over a range, MAX()

■ 
$$F10 = IF(D10 > MAX(H$1: H9), D10, IF(D10 > MAX(K$1: K9), ""$$
,  $MIN(MAX(H$1: H9), MAX(K$1: K9)))$ 

- How the logic works?
  - □ D10 is the arrival of customer 10
  - ☐ H\$1:H9 represents the finishing time of service for last customers who got service from Able
  - □ K\$1:K9 represents the finishing time of service for last customers who got service from Baker

# Simulation of Able Baker Carhop Problem (7)



- If the first condition (Able idle when customer 10 arrives) is true, then the customer begins immediately at the arrival time in D10
- Otherwise, a second IF() function is evaluated, which says if Baker is idle, put nothing in the cell
- Otherwise, the function returns the time that Able or Baker becomes idle
  - Whichever is first [the minimum or MIN() of their respective completion times]
- Is this correct?
  - □ F10 = IF  $\Big(D10 > MAX(H\$1: H9), D10, IF \Big(D10 > MAX(K\$1: K9), ""$ , MIN $\Big(MAX(H\$1: H9), MAX(K\$1: K9)\Big)\Big)\Big)$



# Simulation of Able Baker Carhop Problem (8)



- The mentioned code assumes that there is only a single column indicating the beginning of service for every customer
  - Regardless of having two servers
    - Each must have a column for beginning of service for their own
  - □ This assumption is not with accordance to principles of the problem
- We must indicate the beginning of service for a specific customer on the related column, only if the corresponding server handles the job
  - ☐ Just assume MAX(H)>MAX(K)
  - Baker beginning will be written on Able, which is incorrect
  - $\square$  IF(MAX(H\$1: H9) < MAX(K\$1: K9), MAX(H\$1: H9), "")



# Simulation of Able Baker Carhop Problem (9)



- For service times for Able, you could use another IF() function to make the cell blank or have a value:
  - $\square$  G10 = IF(**F10** > **0**, new service time, "")
  - □ F10>0 means customer 10 was assigned to Able
    - Therefore, we check the Able service time table and assign a service time to customer 10
- As you can see, service time value could be only indicated for a server, if it has a corresponding start time
  - □ Based on what we discussed in previous slide
- To obtain service ending time:
  - $\square$  H10 = IF(F10 > 0, F10 + G10, "")



# Simulation of Able Baker Carhop Problem (9)



- Let's have a discussion about performance of this queuing system:
- The analysis of our simulation table results in the following:
  - □ Busy time of Able (%):

Total time of Able service time
$$\frac{\text{Total time of Able service time}}{\text{Total simulation time}} = \frac{56}{62} = 90\%$$

- Over the 62-minute period Able was busy 90% of the time.
- □ Busy time of Baker (%):

Total time of Baker service time 
$$=\frac{43}{62}=69\%$$

- Baker was busy only 69% of the time
- The seniority rule keeps Baker less busy (and gives Able more tips)
- Why?



# **Simulation of Able Baker Carhop Problem (10)**



- Nine of the 26 arrivals (about 35%) had to wait in the queue
- The average waiting time for all customers was only about 0.42 minute (25 seconds), which is very small
  - □ Average queue time =  $\frac{11}{26}$  = 0.42 Minute = 25 Seconds
- Those nine who did have to wait only waited an average of 1.22 min, which is quite low
  - □ Average queue time for those who waited =  $\frac{11}{9}$  = 1.2 Minute

#### **Simulation of Able Baker Carhop Problem (11)**



- In summary, this system seems to be well balanced
- One server cannot handle all the diners
- Three servers would probably be too many
- Adding an additional server would surely reduce the waiting time to nearly zero
  - □ However, the cost of waiting would have to be quite high to justify an additional server