

~~we can safely treat  $p$  as a constant value and specify the dequeue operation as requiring constant time.~~

~~The disadvantage of this structure for the implementation of the priority queue is that the number of levels is fixed. If an application requires a priority queue with an unlimited number of priority levels, then the vector or linked list versions are a better choice.~~

## 8.4 Application: Computer Simulations

Computers have long been used to model and simulate real-world systems and phenomena. These simulations are simply computer applications that have been designed to represent and appropriately react to the significant events occurring in the system. Simulations can allow humans to study certain behaviors or experiment with certain changes and events in a system to determine the appropriate strategy.

Some of the more common simulations include weather forecasting and flight simulators. A flight simulator, which is a mock-up of a real cockpit and controlled by software, helps train pilots to deal with real situations without having to risk the life of the pilot or loss of the aircraft. Weather forecasts today are much more reliable due to the aide of computer simulations. Mathematical models have been developed to simulate weather patterns and atmospheric conditions. These models can be solved using computer applications, which then provide information to meteorologists for use in predicting the weather.

Computer simulations are also used for less glamorous applications. Businesses can use a computer simulation to determine the number of employees needed to provide a service to its customers. For example, an airline may want to know how many ticket agents are needed at certain times of the day in order to provide timely service. Having too many agents will cost the airline money, but too few will result in angry customers. The company could simply study the customer habits at one airport and experiment with a different number of agents at different times. But this can be costly and time consuming. In addition, the results may only be valid for that one airport. To reduce the cost and allow for events that may occur at various airports, a computer simulation can be developed to model the real system.

### 8.4.1 Airline Ticket Counter

Simulating an airline ticket counter, or any other *queuing system* where customers stand in line awaiting service, is very common. A queue structure is used to model the queuing system in order to study certain behaviors or outcomes. Some of the typical results studied include average waiting time and average queue length. Queuing systems that use a single queue are easier to model. More complex systems like those representing a grocery store that use multiple queues, require more complex models. In this text, we limit our discussion to single-queue systems.

## Queuing System Model

We can model a queuing system by constructing a *discrete event simulation*. The simulation is a sequence of significant events that cause a change in the system. For example, in our airline ticket counter simulation, these events would include customer arrival, the start or conclusion of a transaction, or customer departure.

The simulation is time driven and performed over a preset time period. The passing of time is represented by a loop, which increments a discrete time variable once for each tick of the clock. The events can only occur at discrete time intervals. Thus, the time units must be small enough such that no event can occur between units. A simulation is commonly designed to allow the user to supply parameters that define the conditions of the system. For a discrete event simulation modeling a queuing system, these parameters include:

- The length of the simulation given in number of time units. The simulation typically begins at time unit zero.
- The number of servers providing the service to the customers. We must have at least one server.
- The expected service time to complete a transaction.
- The distribution of arrival times, which is used to determine when customers arrive.

By adjusting these parameters, the user can change the conditions under which the simulation is performed. We can change the number of servers, for example, to determine the optimal number required to provide satisfactory service under the given conditions.

Finally, a set of rules are defined for handling the events during each tick of the clock. The specific rules depends on what results are being studied. To determine the average time customers must wait in line before being served, there are three rules:

**Rule 1:** If a customer arrives, he is added to the queue. At most, one customer can arrive during each time step.

**Rule 2:** If there are customers waiting, for each free server, the next customer in line begins her transaction.

**Rule 3:** For each server handling a transaction, if the transaction is complete, the customer departs and the server becomes free.

When the simulation completes, the average waiting time can be computed by dividing the total waiting time for all customers by the total number of customers.

## Random Events

To correctly model a queuing system, some events must occur at random. One such event is customer arrival. In the first rule outlined earlier, we need to determine if

a customer arrives during the current tick of the clock. In a real-world system, this event cannot be directly controlled but is a true random act. We need to model this action as close as possible in our simulation.

A simple approach would be to flip a coin and let “heads” represent a customer arrival. But this would indicate that there is a 50/50 chance a customer arrives every time unit. This may be true for some systems, but not necessarily the one we are modeling. We could change and use a six-sided die and let one of the sides represent a customer arrival. But this only changes the odds to 1 in 6 that a customer arrives.

A better approach is to allow the user to specify the odds of a customer arriving at each time step. This can be done in one of two ways. The user can enter the odds a customer arrives during the current time step as a real value between 0.0 (no chance) and 1.0 (a sure thing). If 0.2 is entered, then this would indicate there is a 1 in 5 chance a customer arrives. Instead of directly entering the odds, we can have the user enter the average time between customer arrivals. We then compute the odds within the program. If the user enters an average time of 8.0, then on average a customer arrives every 8 minutes. But customers can arrive during any minute of the simulation. The average time between arrivals simply provides the average over the entire simulation. We use the average time to compute the odds of a customer arriving as  $1.0/8.0$ , or 0.125.

Given the odds either directly by the user or computing them based on the average arrival time, how is this value used to simulate the random act of a customer arriving? We use the *random number generator* provided by Python to generate a number between 0.0 and 1.0. We compare this result to the probability (**prob**) of an arrival. If the generated random number is between 0.0 and **prob** inclusive, the event occurs and we signal a customer arrival. On the other hand, if the random value is greater than **prob**, then no customer arrives during the current time step and no action is taken. The arrival probability can be changed to alter the number of customers served in the simulation.

## 8.4.2 Implementation

We can design and implement a discrete event computer simulation to analyze the average time passengers have to wait for service at an airport ticket counter. The simulation will involve multiple ticket agents serving customers who have to wait in line until they can be served. Our design will be an object-oriented solution with multiple classes.

### System Parameters

The program will prompt the user for the queuing system parameters:

```
Number of minutes to simulate: 25
Number of ticket agents: 2
Average service time per passenger: 3
Average time between passenger arrival: 2
```

For simplicity we use minutes as the discrete time units. This would not be sufficient to simulate a real ticket counter as multiple passengers are likely to arrive within any given minute. The program will then perform the simulation and produce the following output:

```
Number of passengers served = 12
Number of passengers remaining in line = 1
The average wait time was 1.17 minutes.
```

We will also have the program display event information, which can be used to help debug the program. The debug information lists each event that occurs in the system along with the time the events occur. For the input values shown above, the event information displayed will be:

```
Time 2: Passenger 1 arrived.
Time 2: Agent 1 started serving passenger 1.
Time 3: Passenger 2 arrived.
Time 3: Agent 2 started serving passenger 2.
Time 5: Passenger 3 arrived.
Time 5: Agent 1 stopped serving passenger 1.
Time 6: Agent 1 started serving passenger 3.
Time 6: Agent 2 stopped serving passenger 2.
Time 8: Passenger 4 arrived.
Time 8: Agent 2 started serving passenger 4.
Time 9: Agent 1 stopped serving passenger 3.
Time 10: Passenger 5 arrived.
Time 10: Agent 1 started serving passenger 5.
Time 11: Passenger 6 arrived.
Time 11: Agent 2 stopped serving passenger 4.
Time 12: Agent 2 started serving passenger 6.
Time 13: Passenger 7 arrived.
Time 13: Agent 1 stopped serving passenger 5.
Time 14: Passenger 8 arrived.
Time 14: Agent 1 started serving passenger 7.
Time 15: Passenger 9 arrived.
Time 15: Agent 2 stopped serving passenger 6.
Time 16: Agent 2 started serving passenger 8.
Time 17: Agent 1 stopped serving passenger 7.
Time 18: Passenger 10 arrived.
Time 18: Agent 1 started serving passenger 9.
Time 19: Passenger 11 arrived.
Time 19: Agent 2 stopped serving passenger 8.
Time 20: Agent 2 started serving passenger 10.
Time 21: Agent 1 stopped serving passenger 9.
Time 22: Agent 1 started serving passenger 11.
Time 23: Passenger 12 arrived.
Time 23: Agent 2 stopped serving passenger 10.
Time 24: Agent 2 started serving passenger 12.
Time 25: Passenger 13 arrived.
Time 25: Agent 1 stopped serving passenger 11.
```

## Passenger Class

First, we need a class to store information related to a single passenger. We create a `Passenger` class for this purpose. The complete implementation of this class is provided in Listing 8.6. The class will contain two data fields. The first is an identification number used in the output of the event information. The second field records the time the passenger arrives. This value will be needed to determine the length of time the passenger waited in line before beginning service with an agent. Methods are also provided to access the two data fields. An instance of the class is illustrated in Figure 8.12.

**Listing 8.6** The `Passenger` class defined in the `simpeople.py` module.

```

1  # Used to store and manage information related to an airline passenger.
2  class Passenger :
3      # Creates a passenger object.
4      def __init__( self, idNum, arrivalTime ) :
5          self._idNum = idNum
6          self._arrivalTime = arrivalTime
7
8      # Gets the passenger's id number.
9      def idNum( self ) :
10         return self._idNum
11
12     # Gets the passenger's arrival time.
13     def timeArrived( self ) :
14         return self._arrivalTime

```

## Ticket Agent Class

We also need a class to represent and store information related to the ticket agents. The information includes an agent identification number and a timer to know when the transaction will be completed. This value is the sum of the current time and the average time of the transaction as entered by the user. Finally, we need to keep track of the current passenger being served by the agent in order to identify the specific passenger when the transaction is completed. The `TicketAgent` class is implemented in Listing 8.7, and an instance of the class is shown in Figure 8.12.

The `_passenger` field is set to a null reference, which will be used to flag a free agent. The `idNum()` method simply returns the id assigned to the agent when the object is created while the `isFree()` method examines the `_passenger` field to



**Figure 8.12:** Sample `Passenger` and `TicketAgent` objects.

determine if the agent is free. The `isFinished()` method is used to determine if the passenger currently being served by this agent has completed her transaction. This method only flags the transaction as having been completed. To actually end the transaction, `stopService()` must be called. `stopService()` sets the `_passenger` field to `None` to again indicate the agent is free and returns the passenger object. To begin a transaction, `startService()` is called, which assigns the appropriate fields with the supplied arguments.

**Listing 8.7** The `TicketAgent` class defined in the `simpeople.py` module.

```

1  # Used to store and manage information related to an airline ticket agent.
2  class TicketAgent :
3      # Creates a ticket agent object.
4      def __init__( self, idNum ):
5          self._idNum = idNum
6          self._passenger = None
7          self._stopTime = -1
8
9      # Gets the ticket agent's id number.
10     def idNum( self ):
11         return self._idNum
12
13     # Determines if the ticket agent is free to assist a passenger.
14     def isFree( self ):
15         return self._passenger is None
16
17     # Determines if the ticket agent has finished helping the passenger.
18     def isFinished( self, curTime ):
19         return self._passenger is not None and self._stopTime == curTime
20
21     # Indicates the ticket agent has begun assisting a passenger.
22     def startService( self, passenger, stopTime ):
23         self._passenger = passenger
24         self._stopTime = stopTime
25
26     # Indicates the ticket agent has finished helping the passenger.
27     def stopService( self ):
28         thePassenger = self._passenger
29         self._passenger = None
30         return thePassenger

```

## Simulation Class

Finally, we construct the `TicketCounterSimulation` class, which is provided in Listing 8.8, to manage the actual simulation. This class will contain the various components, methods, and data values required to perform a discrete event simulation. A sample instance is illustrated in Figure 8.13.

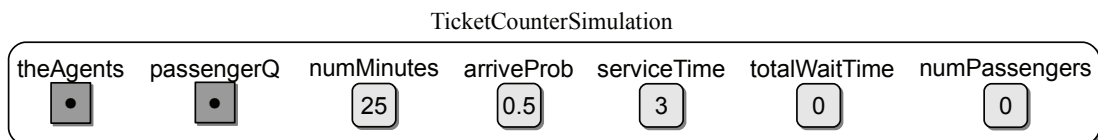
The first step in the constructor is to initialize three simulation parameters. Note the `_arriveProb` is the probability of a passenger arriving during the current time step using the formula described earlier. A queue is created, which will be

**Listing 8.8** The simulation.py module.

```

1  # Implementation of the main simulation class.
2  from array import Array
3  from llistqueue import Queue
4  from people import TicketAgent, Passenger
5
6  class TicketCounterSimulation :
7      # Create a simulation object.
8      def __init__( self, numAgents, numMinutes, betweenTime, serviceTime ) :
9          # Parameters supplied by the user.
10         self._arriveProb = 1.0 / betweenTime
11         self._serviceTime = serviceTime
12         self._numMinutes = numMinutes
13
14         # Simulation components.
15         self._passengerQ = Queue()
16         self._theAgents = Array( numAgents )
17         for i in range( numAgents ) :
18             self._theAgents[i] = TicketAgent(i+1)
19
20         # Computed during the simulation.
21         self._totalWaitTime = 0
22         self._numPassengers = 0
23
24         # Run the simulation using the parameters supplied earlier.
25         def run( self ) :
26             for curTime in range(self._numMinutes + 1) :
27                 self._handleArrival( curTime )
28                 self._handleBeginService( curTime )
29                 self._handleEndService( curTime )
30
31             # Print the simulation results.
32             def printResults( self ) :
33                 numServed = self._numPassengers - len(self._passengerQ)
34                 avgWait = float( self._totalWaitTime ) / numServed
35                 print( "" )
36                 print( "Number of passengers served = ", numServed )
37                 print( "Number of passengers remaining in line = %d" %
38                     len(self._passengerQ) )
39                 print( "The average wait time was %4.2f minutes." % avgWait )
40
41         # The remaining methods that have yet to be implemented.
42         # def _handleArrive( curTime ) :      # Handles simulation rule #1.
43         # def _handleBeginService( curTime ) : # Handles simulation rule #2.
44         # def _handleEndService( curTime ) :  # Handles simulation rule #3.

```

**Figure 8.13:** A sample TicketCounterSimulation object.

used to represent the line in which passengers must wait until they are served by a ticket agent. The ticket agents are represented as an array of `Agent` objects. The individual objects are instantiated and each is assigned an id number, starting with 1. Two data fields are needed to store data collected during the actual simulation. The first is the summation of the time each passenger has to wait in line before being served, and the second keeps track of the number of passengers in the simulation. The latter will also be used to assign an id to each passenger.

The simulation is performed by calling the `run()` method, which simulates the ticking of the clock by performing a count-controlled loop keeping track of the current time in `curTime`. The loop executes until `_numMinutes` have elapsed. The events of the simulation are also performed during the terminating minute, hence, the need for the `_numMinutes + 1` in the `range()` function. During each iteration of the loop, the three simulation rules outlined earlier are handled by the respective `_handleXYZ()` helper methods. The `_handleArrival()` method determines if a passenger arrives during the current time step and handles that arrival. `_handleBeginService()` determines if any agents are free and allows the next passenger(s) in line to begin their transaction. The `_handleEndService()` determines which of the current transactions have completed, if any, and flags a passenger departure. The implementation of the helper methods is left as an exercise.

After running the simulation, the `printResults()` method is called to print the results. When the simulation terminates there may be some passengers remaining in the queue who have not yet been assisted. Thus, we need to determine how many passengers have exited the queue, which indicates the number of passenger wait times included in the `_totalWaitTime` field. The average wait time is simply the total wait time divided by the number of passengers served.

The last component of our program is the driver module, which is left as an exercise. The driver extracts the simulation parameters from the user and then creates and uses a `TicketCounterSimulation` object to perform the simulation. To produce the same results shown earlier, you will need to seed the random number generator with the value 4500 before running the simulation:

```
random.seed( 4500 )
```

In a typical experiment, a simulation is performed multiple times varying the parameters with each execution. Table 8.1 illustrates the results of a single experiment with multiple executions of the simulation. Note the significant change in the average wait time when increasing the number of ticket agents by one in the last two sets of experiments.

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## Exercises

**8.1** Determine the worst case time-complexity for each operation defined in the `TicketCounterSimulation` class.



Num Minutes	Num Agents	Average Service	Time Between	Average Wait	Passengers Served	Passengers Remaining
100	2	3	2	2.49	49	2
500	2	3	2	3.91	240	0
1000	2	3	2	10.93	490	14
5000	2	3	2	15.75	2459	6
10000	2	3	2	21.17	4930	18
100	2	4	2	10.60	40	11
500	2	4	2	49.99	200	40
1000	2	4	2	95.72	400	104
5000	2	4	2	475.91	2000	465
10000	2	4	2	949.61	4000	948
100	3	4	2	0.51	51	0
500	3	4	2	0.50	240	0
1000	3	4	2	1.06	501	3
5000	3	4	2	1.14	2465	0
10000	3	4	2	1.21	4948	0

**Table 8.1:** Sample results of the ticket counter simulation experiment.

**8.2** Hand execute the following code and show the contents of the resulting queue:

```
values = Queue()
for i in range( 16 ) :
    if i % 3 == 0 :
        values.enqueue( i )
```

**8.3** Hand execute the following code and show the contents of the resulting queue:

```
values = Queue()
for i in range( 16 ) :
    if i % 3 == 0 :
        values.enqueue( i )
    elif i % 4 == 0 :
        values.dequeue()
```

**8.4** Implement the remaining methods of the `TicketCounterSimulation` class.

**8.5** Modify the `TicketCounterSimulation` class to use seconds for the time units instead of minutes. Run an experiment with multiple simulations and produce a table like Table 8.1.

**8.6** Design and implement a function that reverses the order of the items in a queue. Your solution may only use the operations defined by the Queue ADT, but you are free to use other data structures if necessary.