



Structure of the Simulator

Event Scheduling Approach



Discrete-event simulation

- As mentioned, we have two main approaches to discrete-event modeling
 - we can focus on the actions to be performed when each event happens -> *event scheduling*
 - we consider all the actions of each entity while it is inside the system, focusing on its relations with other entities -> *process interaction*
- Given the approach, the simulators have some fundamental elements



Event scheduling: Simulator structure

- The basic elements of a discrete-event simulator are:
 - the **main cycle for event analysis (Event Loop)**
 - the **Future-Event Set (FES)**
 - the **functions to be executed when each event happens**
- To these key elements we can add:
 - the procedures for data collection and measurement analysis
 - the procedures for the initialization of the simulator
 - the termination criteria for the simulation



Queuing system (*event scheduling*)

■ Arrival

- Compute the inter-arrival time T_{ia} for next client
- Schedule an arrival at time $T_{curr} + T_{ia}$
- Create a record for the client
- Insert the record in the queue
- If the server is idle
 - Make the server busy
 - Determine the service time T_s
 - Schedule departure at time $T_{curr} + T_s$



Queuing system (*event scheduling*)

■ Departure

- Extract from the queue the record for the client who has just been served
- Destroy the record
- If someone is in the waiting line
 - Select a client to be served
 - Determine its service time T_s
 - Schedule the departure at time $T_{\text{curr}} + T_s$
- else
 - Make the server idle



Structure of the simulator

- Fundamental terms
 - The **simulation time**
 - The **events** and their **attributes**
 - **State variables**



The simulation time

- The simulation time is a compressed/expanded representation of the time in the real system
- In the model, time can be
 - Continuous
 - Discrete
- We can represent time through
 - a floating-point variable
 - an integer variable



The simulation time

- Continuous time:

- The time representation in **floating-point** format is the nearest one to the real nature of time
- **The probability for two events to happen exactly at the same time is zero**
- We do not need to worry in any special way about the management of contemporaneous events



The simulation time

- Discrete time:

- The time representation in **integer** format is the most suited for those systems where time evolves naturally in steps (slotted systems)
- The probability for more than one event to happen at the same discrete time may be not negligible
- We need to define an order criterion among contemporaneous events



The simulation time

- Independently from the representation format, we need a global indicator of the time evolution: **a system clock (*current time*)**
- Must be accessible from any point of the simulator, representing the current value of the simulation time



Events: data structure

- Each event must be represented in our program using a structured data type, whose nature depends on the implementation choice for the Future-Event Set
- Each event contains at least:
 - **the time** at which the event is scheduled
 - **an identifier** for the type of event
 - In the example of the queue, two event types: “arrival” and “departure”



Events: data structure

- The **event scheduling time is the key field**, since it is needed to decide which is the next event to be executed, i.e., the one with the smallest scheduling time in the FES
- The **event type** is needed to identify which kind of event must happen, and, hence, which **specific function should be executed**

the simulation time

time = 0

the list of events in the form: (time, type)

FES = PriorityQueue()

schedule the first arrival at t=0

FES.put((0, "arrival"))



Ordered list, based on the first attribute of the items (i.e., time in this case)



Events: data structure

- Often it is useful to **associate attributes to each event**
- This allows us to aggregate events according to their general type, to discriminate them later at execution time
- Example:
 - In a queuing system with two different kinds of server, instead of defining distinct events for the two servers, we define a single event “service” and we store the information on the involved server as an attribute



Event Loop

- The heart of a discrete-event simulator is the Event Loop
- It's a loop in which:
 - the next event is extracted from the FES
 - the *current time* is advanced to the scheduling time of the event
 - depending on the event type, the associated procedure is executed



Event Loop: code

```
# the simulation time
time = 0
# the list of events in the form: (time, type)
FES = PriorityQueue()
# schedule the first arrival at t=0
FES.put((first_arrival_time, "arrival"))
while time < SIM_TIME:
    (time, event_type) = FES.get()
    if event_type == "arrival":
        arrival(time, FES, queue)
    elif event_type == "departure":
        departure(time, FES, queue)
```



Event Loop: termination

- The Event Loop is executed until the termination condition is reached
- Some possibilities
 - **The FES is empty**: the system evolution ended naturally
 - The **maximum simulation time** has been reached
 - The **maximum number of events** has been reached
 - The **precision conditions on the measurements** have been satisfied
 - An anomalous condition has been reached



Future-Event Set

- The Future-Event Set is the key structure of a discrete-event simulator
- The efficiency of the simulator depends on its implementation
- We need to consider the trade-off between implementation simplicity and execution efficiency
 - simple structures are often little efficient, while the most efficient may require a complex implementation



Future-Event Set

- The Future-Event Set is the set of all the events scheduled for future execution
- From this set we extract each time the one with the minimum scheduling time (Next Event)
- Any data structure can be used to represent the FES, but obviously some structures are more suitable and more efficient than others



Future-Event Set

- The selected data structure must support in the most efficient way the common operations for the FES
 - Insertion of a new event
 - Extraction of the next event
 - Lookup and deletion of an event
- The management efficiency for the first two operations is fundamental, while lookup and deletion may be required only for advanced cases and their implementation might be not optimized



Future-Event Set

- The management efficiency depends a lot on the specific conditions of the simulator
 - The sequence of the insertion and deletion operations
 - The average number of events in the FES
- We use as a reference some estimations of the efficiency in *worst-case* scenarios and order-of-magnitude evaluations



Example: queue

```
# state variable: no. of clients in the queue  
users = 0
```

```
# *****  
# Client  
# *****  
class Client:  
    def __init__(self,type,arrival_time):  
        self.type = type  
        self.arrival_time = arrival_time
```



Event functions: arrival

```
def arrival(time, FES, queue):
    global users
    # sample the time until the next event
    inter_arrival = random.expovariate(1.0/ARRIVAL)
    # schedule the next arrival
    FES.put((time + inter_arrival, "arrival"))
    # Now manage the event; update state variable
    users += 1
    # create a record for the client
    client = Client(TYPE1,time)
    # insert the record in the queue
    queue.append(client)
    # if the server is idle start the service
    if users==1:
        # sample the service time
        service_time = random.expovariate(1.0/SERVICE)
        # schedule when the client will finish the server
        FES.put((time + service_time, "departure"))
```



Event functions: departure

```
def departure(time, FES, queue):  
    global users  
  
    # get the first element from the queue  
    client = queue.pop()  
  
    # Update state variable  
    users -= 1  
  
    # see whether there are more clients to in the line  
    if users > 0:  
        # sample the service time  
        service_time = random.expovariate(1.0/SERVICE)  
  
        # schedule when the client will finish the server  
        FES.put((time + service_time, "departure"))
```



Wrap-up

- Fundamental elements of a discrete-event simulator:
 - Future-Event Set: whose management is fundamental for the efficiency of the simulation
 - Event loop: to make time advance and events to be executed in the proper order
 - Functions for each event type: to execute the events
- Variables:
 - Current time
 - State variables
 - Indicators of the performance measures