



# Real-Time Algorithms for Event Scheduling

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## Introduction: Concurrency in Computer Music Applications

- We might want to play lots of notes in parallel
- Each MIDI note-on must have a pending note-off
- We might play multiple “tracks” within MIDI
- We might have an interactive program that listens to input and schedules new output
- BOTTOM LINE: We don’t have a single, sorted list of events to output.
- We might also want to control tempo, so we don’t really know the exact real-time for output.

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## Why not threads?

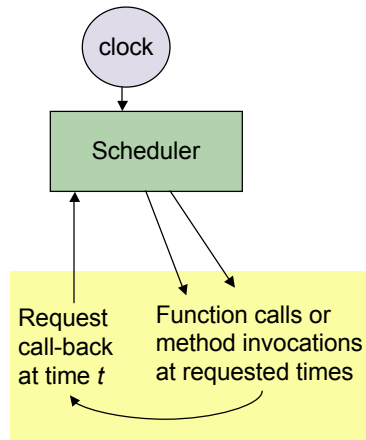
- Threads handle concurrency, and
- System already knows how to schedule threads
- BUT...
  - When threads share data, you must be very careful (use critical sections, etc.)
  - Thread overhead: stack, initialization, context switch time, etc.
  - Later will learn more about working with threads.
  - This only passes the buck to the OS...scheduling has to be solved somewhere

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## Concurrency Without Threads



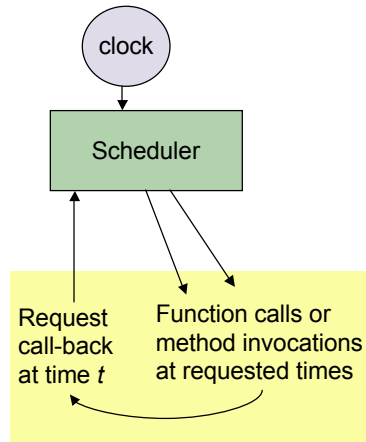
```
def echo(pitch, loudness)
    loudness -= 5
    if loudness > 0
        note(pitch, loudness)
        cause(DELAY, 'echo',
              pitch, loudness)
```

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## Concurrency Without Threads



```
def echo(pitch, loudness)
    loudness -= 5
    if loudness > 0
        note(pitch, loudness)
        cause(DELAY, 'echo',
              pitch, loudness)
```

```
def keydown(pitch)
    note(pitch, loudness)
    cause(DELAY, 'echo',
          pitch, 100)
```

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## Some Comments

- We assume all callbacks are instantaneous
- Timing is explicit – common in real-time programs including music
- Many “threads” can run in parallel
- Processing is interleaved, but
- All procedures run to completion (non-preemptive)
- Non-preemption is a feature: no locks needed for critical sections

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## Implementation of *cause()*

- Assume *schedule(id, t)* exists such that:
  - at time *t*, *event(id, t)* is called
- Implement *cause(t, func, p1, p2, p3, p4)*:  
let *e* = new *Event()*  
*e.func* = *func*  
*e.p1* = *p1*, *e.p2* = *p2*, *e.p3* = *p3*, *e.p4* = *p4*  
let *id* = &*e*  
*schedule(id, t)*
- Implement *event(id, t)*:  
let *e* = (*Event* \*) *id*  
(*e.func*)(*e.p1*, *e.p2*, *e.p3*, *e.p4*)  
free *e*
- From now on, we can just worry about *schedule()*

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## Implementation 1: linked list

- To *schedule*, insert (*id, t*) at the head of a list
- Periodically, do this:
  - for each *r* in list  
if *r.time* < *gettime()*  
remove *r* from list  
*event(r.id)*
- “Periodically”:
  - see Windows MME timer
  - loop in a thread (maybe sleep 1ms or so)
- Problem:
  - Searches entire list very often

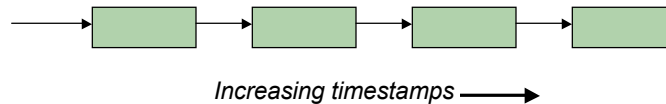
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## Implementation 2: priority queue

- Like before, but linked list is sorted:



- Periodic task removes and dispatches events until the timestamp at the head of the list is greater than the current time.
- Problem:
  - Scheduling (insertion) is linear in size of list

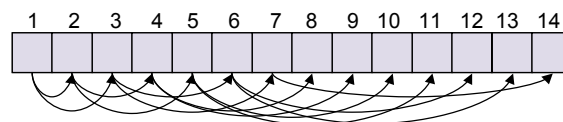
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## Implementation 3: heapsort

- Trick: embed complete binary tree in array.



- $parent(n) = \text{floor}(n/2)$
- $left\_subtree(n) = n*2$
- $right\_subtree(n) = n*2+1$
- Heap invariant:
  - No parent is greater than its children
  - It follows that the root is the minimal element

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## Heapsort (2)

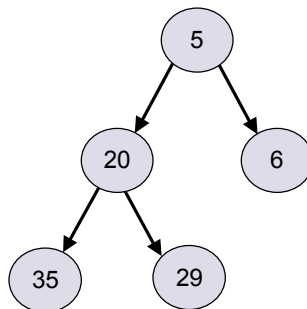
- After removing least element (array[1]), move last array element to first. Then, “bubble” down the tree by swapping new element with least of two children (iteratively) until no child is smaller.
- To add an element, insert at end of array. Then “bubble” up the tree by swapping new element with parent until parent is smaller.
- $\text{Log}(n)$  insert and delete.

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## Heapsort (3)

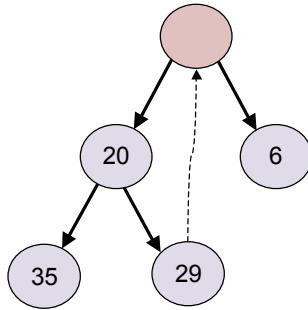


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## Heapsort (3)

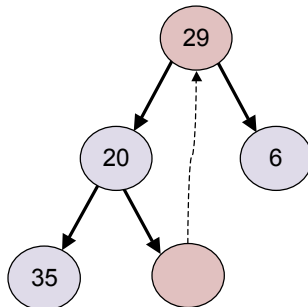


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## Heapsort (3)

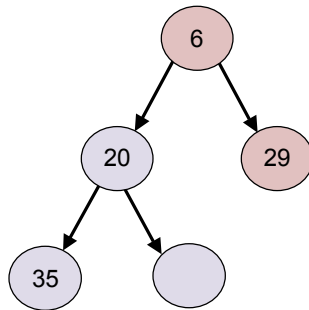


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## Heapsort (3)

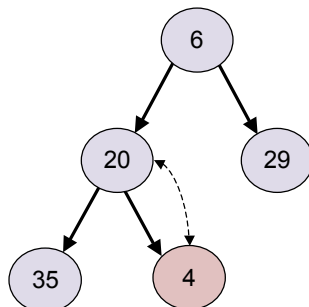


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## Heapsort (3)



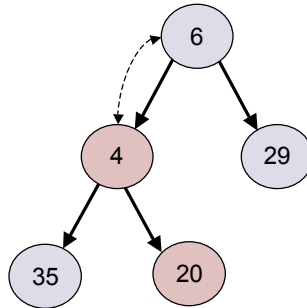
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## Heapsort (3)

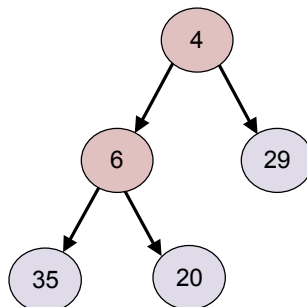


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## Heapsort (3)



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## Implementation 4: no polling

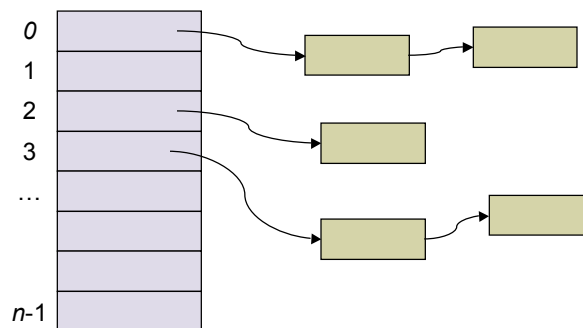
- Implementations 2 and 3 use priority queues
- Time of the next event is easily determined
- Why wake up periodically?
- Instead, *sleep* until the next event time.
- Observations:
  - Saves time when there nothing to do
  - Overhead of polling every ms or so is small

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## Implementation 5



Assuming event times are random, and table size  $n$  is comparable to number of events, this can have  $O(1)$  scheduling and dispatching time.

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## Implementation 6

- What happens if events are not randomly distributed but separated by  $n$ ?
  - E.g. table size = 1024 and each slot represents 1ms. Many events are scheduled at times  $50 + 1024n$  ms. Slot 50 gets all events!
- Suppose we use table only for events in the near future?
- Note: reading makes this assumption already in Implementation 5.
- What do we do with events too far in future?

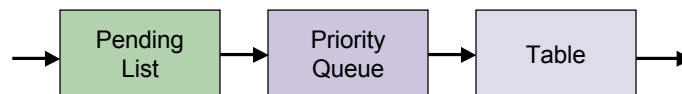
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## Implementation 6 (2)

- The answer:
  - Keep far-future events in a heap-based priority queue and deal with them later.
  - But a heap-based priority queue has  $O(\log n)$  insert time, so...
  - Schedule far-future events by inserting into a list; process the events later.

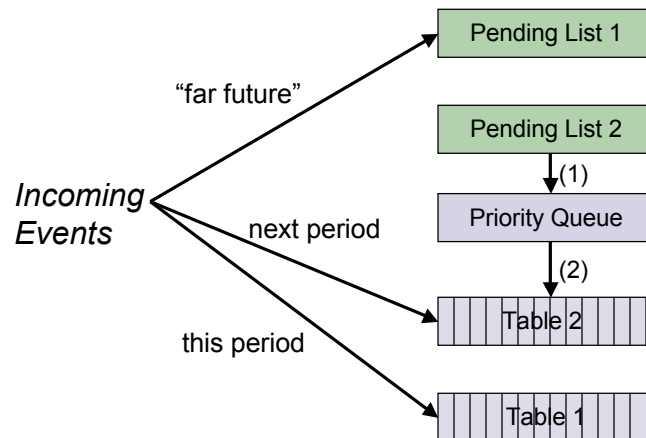


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## Implementation 6 (3)



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## Implementation 6 – Analysis

- Schedule time is  $O(1)$ : based on time, just insert into Table 1, Table 2, or Pending List
- Dispatch time is  $O(1)$  per event and  $O(1)$  per clock tick: dispatch everything in corresponding slot in Table 1.
- Additional background processing time is  $O(\log n)$  per far-future event.
- Background processing must be completed each period.

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## Implementation 6 – Discussion

- How do you schedule background processing? What if it doesn't finish in time?
- Yann Orlarey has a related scheme using an incremental radix sort instead of the heap – implemented and used in MidiShare system.
- I currently use Implementation 5:
  - Simple to implement.
  - Works with floating point timestamps.
  - Worst-case performance does not seem to happen in practice.

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## Project 2

- Implement an efficient time-based scheduler/dispatcher based on Implementation 5.
- See course web for details.
- Hint:
  - create an *event* type or class with:
    - Timestamp
    - Action (e.g. function name or function pointer)
    - Parameters (in C++, use one event type and a fixed set of parameters. If you're really ambitious you can subclass events so every action can have it's own class with its own custom set of parameters.)
    - Link to next event in linked list priority queue
  - Use PortTime callback to poll for and dispatch events from table (In Serpent, just loop reading the time, i.e. busy-wait until the time advances to the time of the next table slot.)
- Use scheduler/dispatcher in your music player.

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## Conclusions

- You should now understand...
  - How real-time applications can be structured as sequences of short computations scheduled at specific times. (note-on, note-off, respond to user input, etc.)
  - How to implement time-based schedulers efficiently
  - That polling has its advantages in real-time systems.

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## What's Next?

- Work on your project.
- Next week:
  - We assumed that events have negligible run times. How can we avoid accumulating timing errors due to real-world run-time and latency?
  - We assumed events take place at specific times. What if I want to schedule according to beats instead of seconds and the tempo is changing?

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