# Page Replacement Computer Operating Systems, Summer 2025

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#### **Logistics**

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- PennOS Milestone 1 is due this week
- Final Exam; July 31<sup>st</sup>
  - Same format as the Midterm!
  - Last course day is July 23<sup>rd</sup>
  - Final Exam Review Thursday, July 24<sup>th</sup>
- PennOS Due Friday, July 25<sup>th</sup>
- Final Grades due August 11<sup>th</sup>
  - So even though the course is "over", there's still wiggle room at the end.
- Check-In out today, due Monday!
  - If anything looks off let me know.

#### **Lecture Outline**

- Page Replacement: High Level
  - FIFO
  - Reference Strings
  - Beladys
- \* LRU
- Thrashing
- FIFO w/ Reference bit

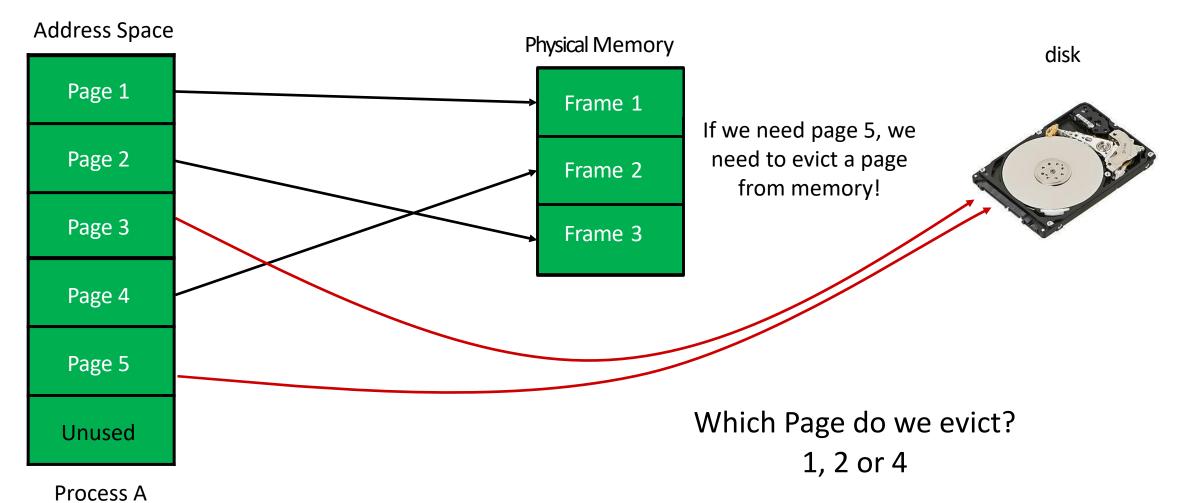
#### **Page Replacement**

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- The operating system will sometimes have to evict a page from physical memory to make room for another page.
- If the evicted page is access again in the future, it will cause a page fault, and the Operating System will have to go to Disk to load the page into memory again

#### **Evicting a Page**

Physical Memory is limited in size. Not All Pages can exist in memory.



#### Page Replacement

- Remember this? Disk access is very very slow (relatively speaking).
  - How can we minimize disk accesses?
  - How can we try to ensure the page we evict from memory is unlikely to be

used again in the future?

from the L2 cache. costlier L2 cache L2: (per byte) (SRAM) storage L2 cache holds cache lines devices retrieved from L3 cache. L3 cache L3: (SRAM) L3 cache holds cache lines retrieved from main memory. Larger, L4: Main memory slower, (DRAM) and We are at this Level: Main memory holds disk blocks cheaper retrieved from local disks. (per byte) storage Local secondary storage devices (local disks) Local disks hold files retrieved from disks on remote servers. Remote secondary storage L6: (e.g., Web servers)

Bryant and O'Hallaron, Computer Systems: A Programmer's Perspective, Third Edition

Smaller,

faster,

and

LO:

L1:

L1 cache

(SRAM)

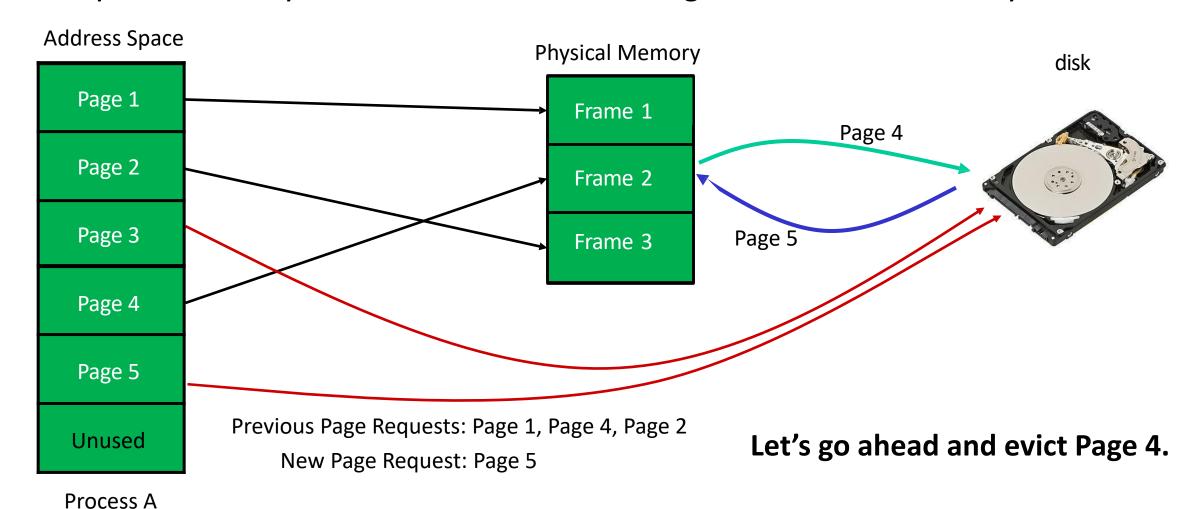
CPU registers hold words retrieved

L1 cache holds cache lines retrieved

from the L1 cache.

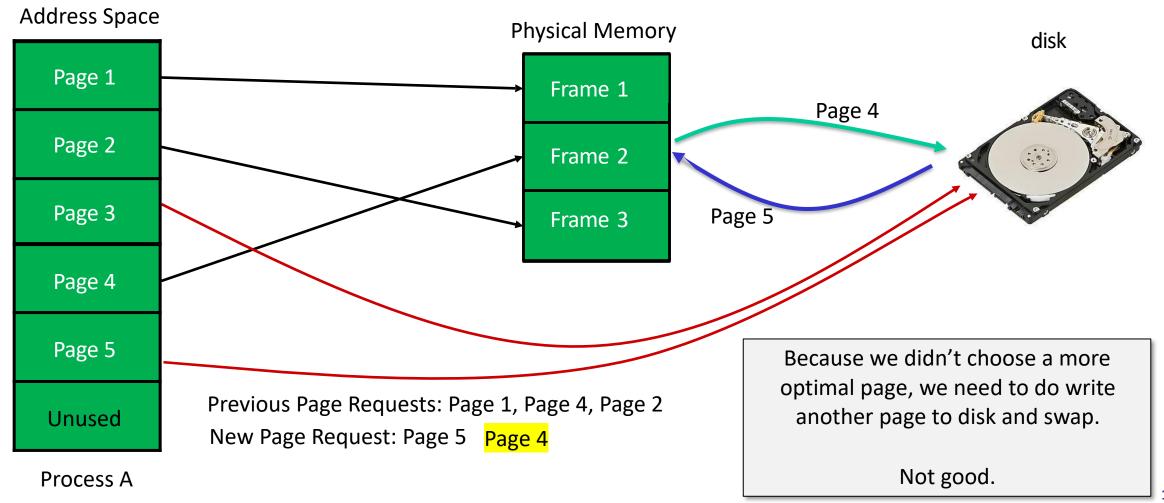
#### **Evicting a Page**

Physical Memory is limited in size. Not All Pages can exist in memory.



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Physical Memory is limited in size. Not All Pages can exist in memory.



#### **Reference String**

- A reference string is a string representing a sequence of virtual page accesses.
  By a given process on some input.
  - E.g., 0 1 2 3 4 1 2 9 5 3 2 2 ...
  - Page 0 is accessed, then 1, then 2, then 3 ...
- Having the page access history, we can now optimize for which page to select when evicting!

#### **Fault vs Eviction**

- Page Fault
  - When a corresponding page is not in memory, we need to load the page from memory.
- Eviction
  - When there are too many pages in memory, and we need to evict one to make space for another.

Just because there is a page fault does not mean there is an eviction.



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- One way to decide which pages can be evicted is to use FIFO (First in First Out)
- If a page needs to be evicted from physical memory, then the page that has been in memory the longest can be evicted.

```
#define MAX_PAGES 4

typedef struct page_stack {
    short *stack; //array
    short size;
} page_stack;
```

```
short evict(page_stack *ps){
    // There's none to evict,
    // -1 page doesn't exist
    if(ps->size == 0) return -1;
    ps->size--;
    short page_num = (ps->stack)[0];
    memmove(ps->stack, ps->stack + 1, ps->size);
    return page_num;
}
```

#### **FIFO Replacement**

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    return page_num;
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#### **FIFO Replacement**

If we have 4 frames, and the reference string:

```
4112345
```

Red numbers indicate that accessing the page caused a page fault. Accessing 5 also causes
 4 to be evicted from physical memory

#### **FIFO Replacement**

If we have 4 frames, and the reference string:

4112345

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- Red numbers indicate that accessing the page caused a page fault. Accessing 5 also causes
   4 to be evicted from physical memory
- For those who like tables :)

	Ref str:	4	1	1	2	3	4	5
Newest		4	1	1	2	3	3	5
			4	4	1	2	2	3
					4	1	1	2
Oldest						4	4	1

Given the following reference string, how many page faults (not evictions)
 occur when using a FIFO algorithm given no pages are in memory at the start.

123412512345

```
#define MAX_PAGES 3

typedef struct page_stack {
    short *stack; //array
    short size;
} page_stack;
```

Part 2: If we didn't have to follow a strict policy, what is the "optimal" # of pages that could be evicted to minimize faults? How many less faults would we have?

	Refstr:	1	2	3	4	1	2	5	1	2	3	4	5
Newest													
Oldest													
Evicted													

### Poll Everywhere

- Given the following reference string, how many page faults occur when using a FIFO algorithm
- \* 123412512345
- \* FIFO

	Ref str:	1	2	3	4	1	2	5	1	2	3	4	5
Newest		1	2	3	4	1	2	5	5	5	3	4	4
			1	2	3	4	1	2	2	2	5	3	3
Oldest				1	2	3	4	1	1	1	2	5	5
Evicted					1	2	3	4			1	2	



- Given the following reference string, how many page faults occur when using a FIFO algorithm
- \* 123412512345
- Theoretical optimal?

	Ref str:	1	2	3	4	1	2	5	1	2	3	4	5
Newest		1	2	3	4	4	4	5	5	5	3	4	4
			1	2	2	2	2	2	2	2	5	3	3
Oldest				1	1	1	1	1	1	1	2	5	5
Evicted					3			4			1	2	

#### "optimal" replacement

If you knew the exact sequence of page accesses in advance, you could optimize for smallest number of page faults

- Always replace the page that is furthest away from being used again in the future
  - How do we predict the future??????
  - You can't, but you can make a "best guess" (later in lecture)
- Optimal replacement is still a handy metric. Used for testing replacement algorithms, see how an algorithm compares to various "optimal" possibilities.



Given the following reference string, how many page faults occur when using a FIFO algorithm:

321032432104

```
#define MAX_PAGES 3

typedef struct page_stack {
    short *stack; //array
    short size;
} page_stack;
```

Part 2: What if we had 4 page frames, how many faults would we have?

	Refstr:	3	2	1	0	3	2	4	3	2	1	0	4
Newest													
Oldest													
Evicted													

	Refstr:	3	2	1	0	3	2	4	3	2	1	0	4
Newest													
Oldest													
Evicted													

Given the following reference string, how many page faults occur when using a FIFO algorithm:

321032432104

Three Page Frames

	Ref Str	3	2	1	0	3	2	4	3	2	1	0	4
Newest		3	2	1	0	3	2	4	4	4	1	0	0
			3	2	1	0	3	2	2	2	4	1	1
Oldest				3	2	1	0	3	3	3	2	4	4
Victim					3	2	1	0			3	2	

Given the following reference string, how many page faults occur when using a FIFO algorithm:

321032432104

Four Page Frames

	Ref str:	3	2	1	0	3	2	4	3	2	1	0	4
Newest		3	2	1	0	0	0	4	3	2	1	0	4
			3	2	1	1	1	0	4	3	2	1	0
				3	2	2	2	1	0	4	3	2	1
Oldest					3	3	3	2	1	0	4	3	2
Victim								3	2	1	0	4	3

#### Bélády's Anomaly

 Sometimes increasing the number of page frames in the data structure results in an increase in the number of page faults:/

This behavior is something that we want to avoid/minimize the possibility of.

Some algorithms avoid this anomaly (LRU, LIFO, etc.)

#### **Lecture Outline**

- Page Replacement: High Level
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- Thrashing
- FIFO w/ Reference bit

#### **LRU (Least Recently Used)**

Assumption:

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- If a page is used recently, it is likely to be used again in the future
- Use prior knowledge to predict the future (update posterior)
- Replace the page that has had the longest time since it was last used
- Sorta Reminiscent of a Priority Queue, where smaller time since last access indicates lower priority of eviction. (But too complicated)

To Evict

### Small Example: 3 Pages of Space

**4**, **0**, **1**, **2**, **0**, **3**, **0**, **4**, **2**, **3**, **0**, **3** 

1 0

To Evict

#### Small Example: 3 Pages of Space

**4**, **0**, **1**, **2**, **0**, **3**, **0**, **4**, **2**, **3**, **0**, **3** 

1 0

To make space for Page 2 – we need to evict page 4.

To Evict

### Small Example: 3 Pages of Space

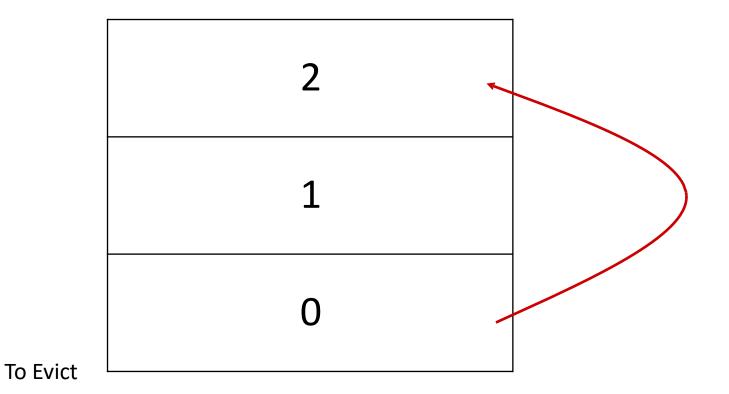
**4**, **0**, **1**, **2**, **0**, **3**, **0**, **4**, **2**, **3**, **0**, **3** 

1

To make space for Page 2 – we need to evict page 4.

#### Small Example: 3 Pages of Space

**4**, **0**, **1**, **2**, **0**, **3**, **0**, **4**, **2**, **3**, **0**, **3** 



As we access 0 again, we move to the top of the stack

33

#### Small Example: 3 Pages of Space

**4**, **0**, **1**, **2**, **0**, **3**, **0**, **4**, **2**, **3**, **0**, **3** 

2

#### Observation:

The 'order' of the values when using the LRU is always a (non-contiguous) subsequence of page accesses.

Lots of ways to reason about this...try to find a way that makes more sense to you.

### **Poll Everywhere**

- Now, using the same Reference String with LRU, let's try to fill this table out...
- If we use 4 frames, how many page faults will there be?

	Ref str:	4	0	1	2	0	3	0	4	2	3	0	3
Newest													
Oldest													
Victim													

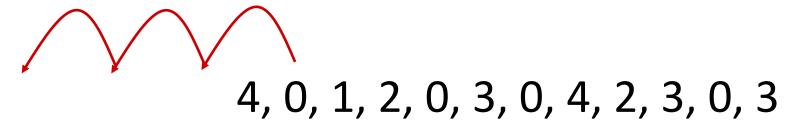
## Poll Everywhere

- Now, using the same Reference String with LRU, let's try to fill this table out...
- If we use 4 frames, how many page faults will there be?

	Ref str:	4	0	1	2	0	3	0	4	2	3	0	3
Newest		4	0	1	2	0	3	0	4	2	3	0	3
			4	0	1	2	0	3	0	4	2	3	0
				4	0	1	2	2	3	0	4	2	2
Oldest					4	4	1	1	2	3	0	4	4
Victim							4		1				



- Now, using the same Reference String with LRU, let's try to fill this table out...
- If we use 4 frames, how many page faults will there be?
  - 6 Faults!
- Easier for me to think about this in terms of subsequences



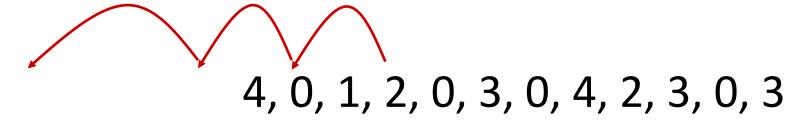
At the start, we have 4 faults as the first four pages in the reference string are unique!

The current subsequence is 4, 0, 1, 2

## Poll Everywhere

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- Now, using the same Reference String with LRU, let's try to fill this table out...
- If we use 4 frames, how many page faults will there be?
  - 6 Faults!
- Easier for me to think about this in terms of subsequences



Now, we see a zero. A zero is already in our substring, so there's no faults/evictions necessary. We remove the previous zero from the subsequence. And the "new" zero leads the sequence now.

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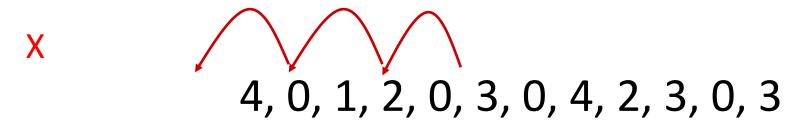
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- If we use 4 frames, how many page faults will there be?
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With our subsquence being the maximum length and with a new page in view, we perform our first eviction. The last value in the sequence is always the one to be removed using LRU.

pollev.com/cis5480

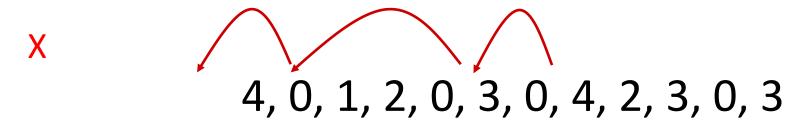
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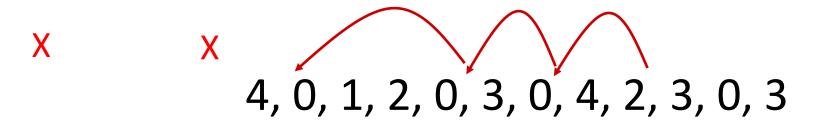
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- If we use 4 frames, how many page faults will there be?
  - 6 Faults!
- Easier for me to think about this in terms of subsequences



We see another zero, we know what to do.

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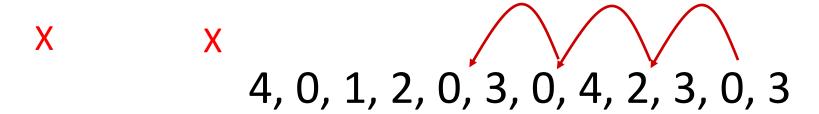
- Now, using the same Reference String with LRU, let's try to fill this table out...
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  - 6 Faults!
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We perform our second eviction!

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- Now, using the same Reference String with LRU, let's try to fill this table out...
- If we use 4 frames, how many page faults will there be?
  - 6 Faults!
- Easier for me to think about this in terms of subsequences



We see another two, no eviction or fault necessary as it was already in the subsequence.

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- Now, using the same Reference String with LRU, let's try to fill this table out...
- If we use 4 frames, how many page faults will there be?
  - 6 Faults!
- Easier for me to think about this in terms of subsequences

Same thing with the three...

Now, we see that the rest of the pages are already in the sequence so there's no need to continue this.

### **LRU** Implementation

Couple of Possibilities

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- we would need to timestamp each memory access and keep a sorted list of these pages
  - High overhead, timestamps can be tricky to manage :/
- Keep a counter that is incremented for each memory access
- Look through the table to find the lowest counter value on eviction
  - Looking through the table can be slow
  - Should you weigh time of access more when it's more recent? (e.g. 3,3,3,3,3,3,3,3,3,1,1)
- Whenever a page is accessed find it in the stack of active pages and move it to the bottom

### **LRU Approximation: Reference Bit & Clock**

It is expensive to do bookkeeping every time a page is accessed. Minimize the bookkeeping if possible

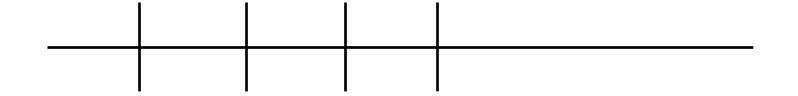
- When we access a page, we can update the reference bit for that PTE to show that it was accessed recently
  - This is done automatically by hardware, when accessing memory.
  - Setting a bit to 1 is much quicker than managing time stamps and re-organizing a stack

 We could check the reference bit at some clock interval to see if the page was used at all in the last interval period University of Pennsylvania

- Each page gets an 8-bit "counter".
- On clock interval and for every page:
  - shift the counter to the right by 1 bit (>> 1)
  - write the reference bit into the MSB of the counter.
  - Current reference bit is reset to 0

- If we read the counter as an unsigned integer, then a larger value means the counter was accessed more recently
  - Right shifting allows us to take into consideration time since the last access as we
  - essentially divide the value by 2 if there were no accesses.

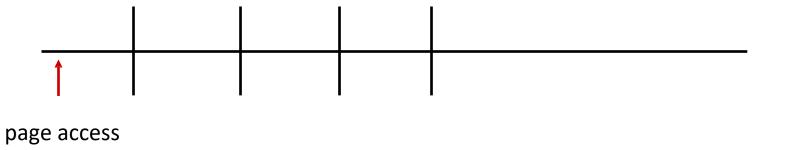
Timeline



Counter:

0 0	0 0	0	0	0	0
-----	-----	---	---	---	---

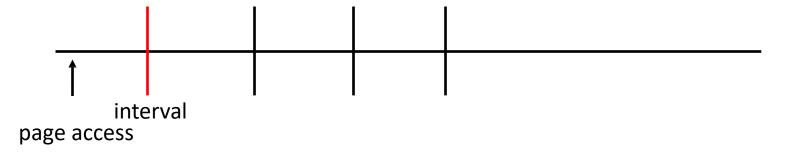
#### \* Timeline



Counter:

0 0 0 0 0 0
-------------

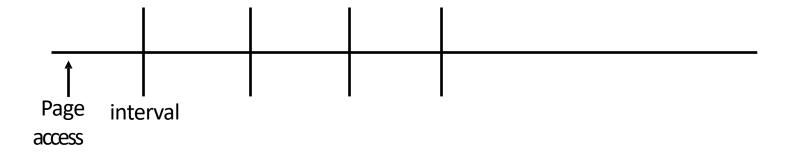
#### \* Timeline



Counter:

1	0	0	0	0	0	0	0
	1						

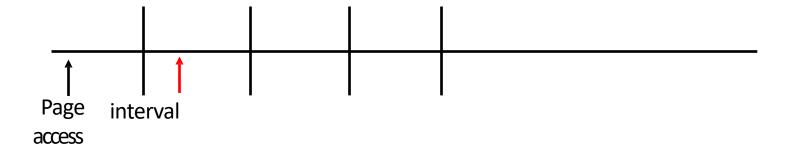
#### \* Timeline



Counter:

	1	0	0 0	0	0	0	0	0
--	---	---	-----	---	---	---	---	---

#### Timeline



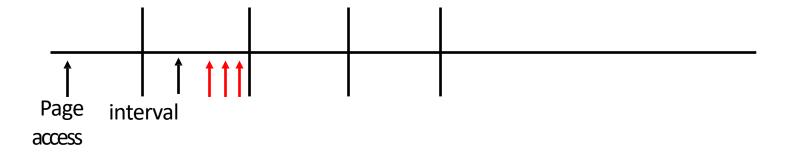
Counter:

|--|

\* Ref Bit: 1

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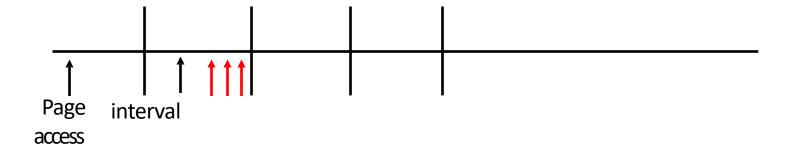
#### \* Timeline



Counter:

	1	0	0	0	0	0	0	0
--	---	---	---	---	---	---	---	---

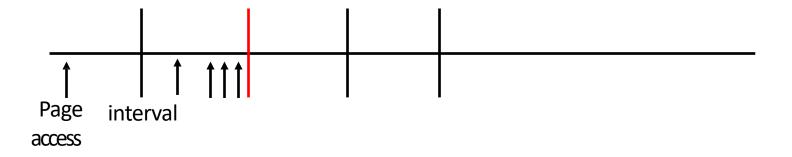
#### \* Timeline



Counter:

1	0	0	0	0	0	0	0

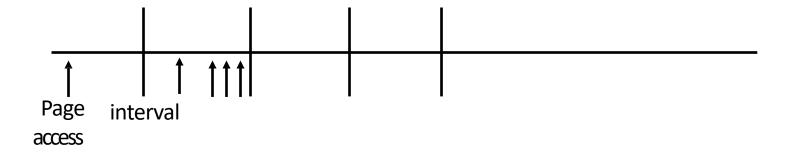
#### \* Timeline



Counter:

1 1 0	0 0	0 0	0
-------	-----	-----	---

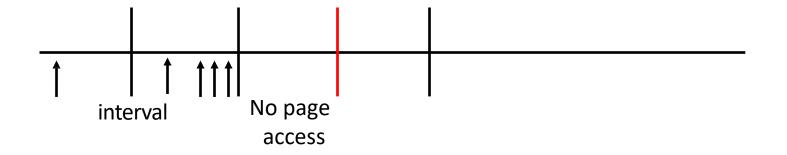
#### Timeline



Counter:

1 1 0	0	0	0	0	0
-------	---	---	---	---	---

#### Timeline



Counter:

0 1	1 0	0	0	0	0
-----	-----	---	---	---	---

### **Aging: Analysis**

#### Analysis

- Low overhead on clock tick and memory access
- Still must search page table for entry to remove/update
- Insufficient information to handle some ties
  - Only one bit information per clock cycle
  - Information past a certain clock cycle is lost

### **Lecture Outline**

- Page Replacement: High Level
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- \* LRU
- Thrashing
- FIFO w/ Reference bit

### **Thrashing**

- This is not specific to LRU, but it is easiest to demonstrate with LRU
- When the physical memory of a computer is overcommitted, causing almost constant page faults (which are slow)
  - Overcommitment most commonly happens when there are too many processes, and thus too much memory needed
  - Can also happen with a few processes, if the process needs too much memory

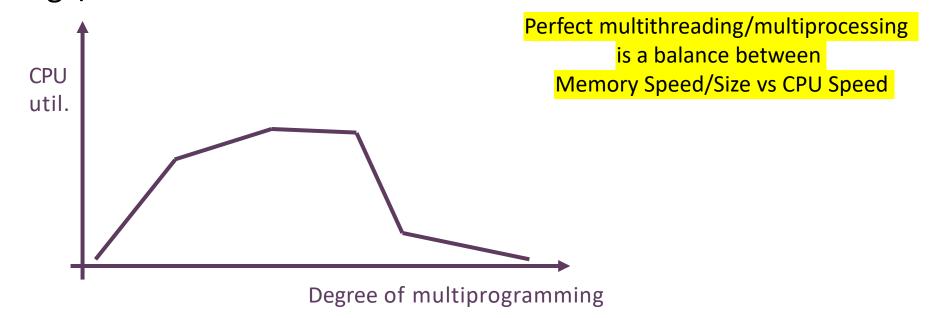
### Thrashing

Consider the following example with three page frames and LRU

LRU	Ref str:	0	1	2	3	0	1	2	3	0	1	2	3
Recent		0	1	1	2	0	1	2	3	0	1	2	3
			0	1	2	3	0	1	2	3	0	1	2
To Evict				0	1	2	3	0	1	2	3	0	1
Evicted					0	1	2	3	0	1	2	3	0

### **Thrashing**

- It is good to have more processes running, then we can have better utilization of CPU.
  - While one process waits on something, another can run
  - More on CPU Utilization later
- As we use more processes running at once, more memory is needed, can cause thrashing:/



### **FIFO Analysis**

- Remember FIFO? The first page replacement algorithm we covered?
  - Evict the page that has been in physical memory the longest
- Analysis:
  - Low overhead. No need to do any work on each memory access, instead just need to do something when loading a new page into memory & evicting an existing page
  - Not the best at predicting which pages are used in the future :/

Could we modify FIFO to better suit our needs?

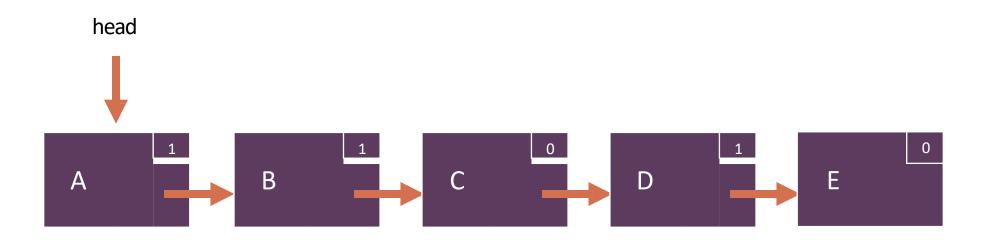
#### **Second Chance**

- Second chance algorithm is very similar to FIFO
  - Still have a FIFO queue
  - When we take the first page of the queue, instead of immediately evicting it, we instead
    check to see if the reference bit is 1 (was used in the last time interval)
  - If so, move it to the end of the queue
  - Repeat until we find a value that does not have the reference bit set (if all pages have reference bit as 1, then we eventually get back to the first page we looked at)



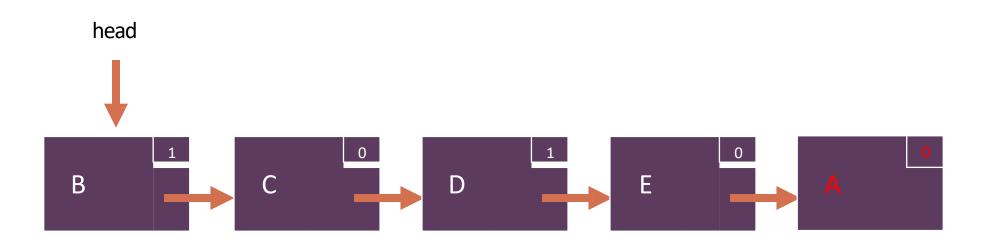
If we need to evict a page: start at the front

Reference bit is 1, so set to 0 and move to end



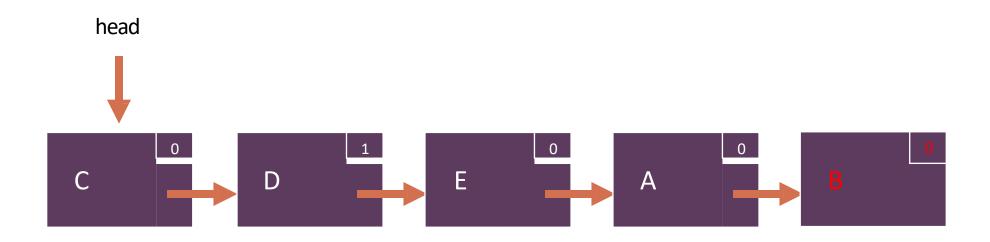
If we need to evict a page: start at the front

\* Reference bit is 1, so move to end



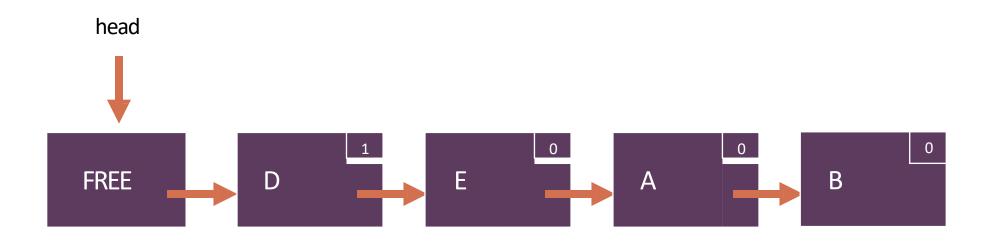
If we need to evict a page: start at the front

\* Reference bit is 1, so move to end



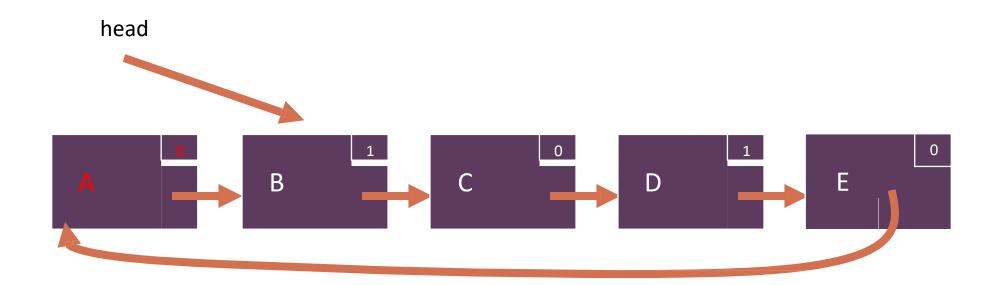
If we need to evict a page: start at the front

Found a page with reference bit = 0, evict Page C!



#### **Second Chance Clock**

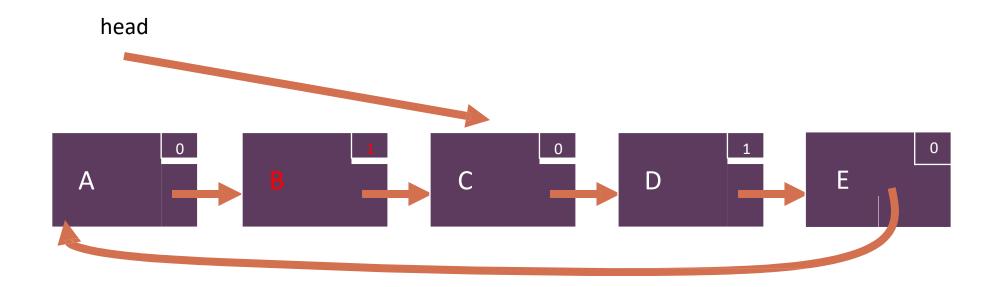
- Optimization on the second chance algorithm
- Have the queue be circular, thus the cost to moving something to the "end" is minimal



#### **Second Chance Clock**

- Optimization on the second chance algorithm
- Have the queue be circular, thus the cost to moving something to the "end" is minimal

Can also be modified to prefer to evict clean pages instead of dirty pages



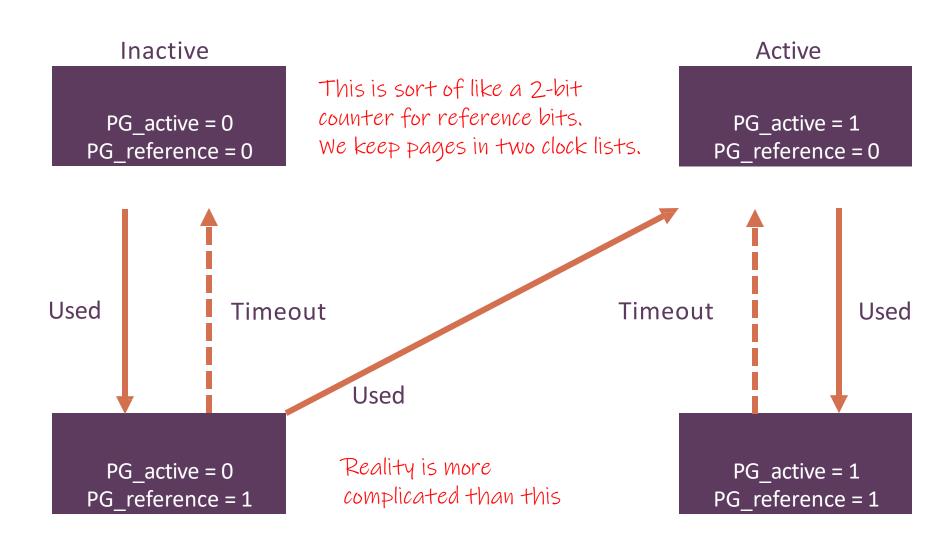
### **Linux Two-List Clock Page Replacement Algorithm**

- Maintains two lists: Active list and Inactive list
- Eviction Priority:

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- Chose a page from the inactive list first
- Page Access Behavior:
  - If a page has not been referenced recently, move it to the inactive list
- If a page is referenced:
  - Set its reference flag to true
  - It will be moved to the active list on the next access
  - Two accesses are required for a page to become active
- Decay Mechanism:
  - If the second access doesn't happen, the reference flag is reset periodically
  - After two timeouts without activity, the page is moved to the inactive list

### **Linux Diagram**



### **Linux Diagram**

Linux will want to keep a good ratio of inactive to active, so that there are always some pages that are considered "more ok"

