#### **Dynamic Memory Allocation**

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### **Objectives**

# Be able to analyze a memory allocator's key characteristics

- Memory usage efficiency (fragmentation)
- Speed of allocation and deallocation operations
- Locality of allocations
- Robustness

Be able to implement your own efficient memory allocator (Malloc Project)

Be able to analyze the advantages and disadvantages of different garbage collector designs

# **Harsh Reality: Memory Matters**

#### Memory is not unbounded

- It must be allocated and freed
- Many applications are memory dominated
  - E.g., applications based on complex graph algorithms

# Memory referencing bugs especially pernicious

Effects can be distant in both time and space

#### Memory performance is not uniform

- Cache and virtual memory effects can greatly affect program performance
- Adapting program to characteristics of memory system can lead to major speed improvements

# **Memory Allocation**

#### Static size, static allocation

- Global and static variables
- Linker allocates final addresses
- Executable stores these allocated addresses

#### Static size, dynamic allocation

- Local variables
- Compiler directs stack allocation
- Frame pointer (%rbp) offsets stored in the code

#### Dynamic size, dynamic allocation

- Programmer controlled
- Allocated in the heap how?

# **Dynamic Memory Allocation**

**Application** 

**Dynamic Memory Allocator** 

**Heap Memory** 

#### Explicit vs. implicit memory allocator

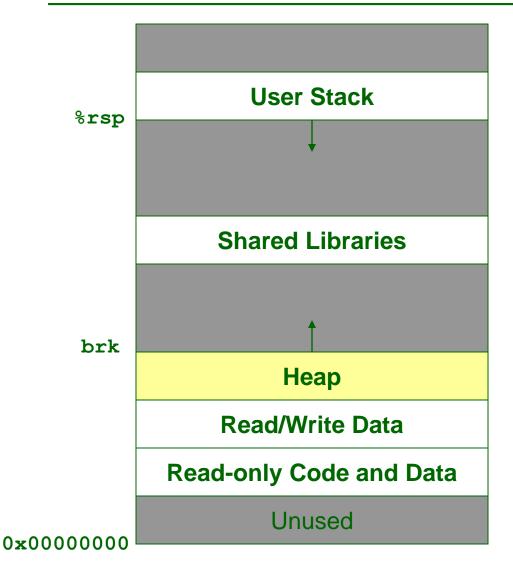
- Explicit: application allocates and frees space
  - e.g., malloc and free in C
- Implicit: application allocates, but does not free space
  - e.g., garbage collection in Java or Python

#### Allocation

- In both cases the memory allocator provides an abstraction of memory as a set of blocks
- Doles out free memory blocks to application

We will first discuss simple explicit memory allocation

### **Process Memory Image**



void \*sbrk(intptr\_t incr)

- Used by allocators to request additional memory from the OS
- brk initially set to the end of the data section
- Calls to sbrk increment brk by incr bytes (new virtual memory pages are demand-zeroed)
- incr can be negative to reduce the heap size

# **Malloc Package**

```
#include <stdlib.h>
void *malloc(size_t size)
```

- If successful:
  - Returns a pointer to a memory block of at least size bytes, (typically) aligned to 8-byte boundary
  - If size == 0, returns NULL (or a unique pointer)
- If unsuccessful: returns NULL (0) and sets errno

```
void free(void *ptr)
```

- Returns the block pointed at by ptr to pool of available memory
- \* ptr must come from a previous call to malloc or realloc
  void \*realloc(void \*ptr, size\_t size)
  - Changes size of block pointed at by ptr and returns pointer to new block
  - Contents of new block unchanged up to the minimum of the old and new sizes

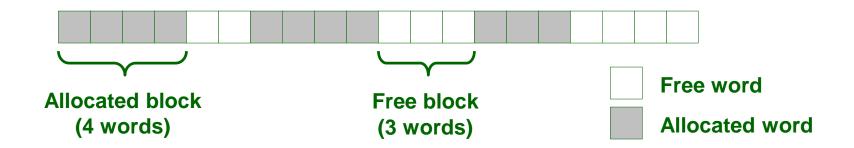
#### Malloc/realloc/free Example

```
void foo(int n, int m)
  int i, *p;
  /* Allocate a block of n ints. */
  if ((p = malloc(n * sizeof(int))) == NULL) {
   perror("malloc");
   exit(1);
  for (i = 0; i < n; i++)
   p[i] = i;
  /* Add m bytes to end of p block. */
  if ((p = realloc(p, (n + m) * sizeof(int))) == NULL) {
   perror("realloc");
   exit(1);
  for (i = n; i < n + m; i++)
   p[i] = i;
  /* Print new array. */
  for (i = 0; i < n + m; i++)
   printf("%d\n", p[i]);
  /* Return p to available memory pool. */
  free(p);
```

### **Assumptions**

#### Conventions used in these lectures

- Memory is word addressed
- "Boxes" in figures represent a word
- Each word is 4 bytes in size and can hold an integer or a pointer



# **Allocation Examples**



# **Governing Rules**

#### **Applications:**

- Can issue arbitrary sequence of malloc and free requests
- Free requests must correspond to an allocated block

#### **Allocators:**

- Can't control number or size of allocated blocks
- Must respond immediately to all allocation requests
  - i.e., can't reorder or buffer requests
- Must allocate blocks from free memory
  - i.e., can only place allocated blocks in free memory
- Must align blocks so they satisfy all alignment requirements
  - 8-byte alignment for libc malloc on many systems
- Can only manipulate and modify free memory
- Can't move the allocated blocks once they are allocated
  - i.e., compaction is not allowed

### Goals of Good malloc/free

#### **Primary goals**

- Good time performance for malloc and free
  - Ideally should take constant time (not always possible)
  - Should certainly not take linear time in the number of blocks
- Good space utilization
  - User allocated structures should use most of the heap
  - Want to minimize "fragmentation"

#### Some other goals

- Good locality properties
  - Structures allocated close in time should be close in space
  - "Similar" objects should be allocated close in space
- Robust
  - Can check that free (p1) is on a valid allocated object p1
  - Can check that memory references are to allocated space

# **Maximizing Throughput**

Given some sequence of *n* malloc, realloc, and free requests:

+  $R_{0}$ ,  $R_{1}$ , ...,  $R_{k}$ , ...,  $R_{n-1}$ 

Want to maximize throughput and peak memory utilization

These goals are often conflicting

#### **Throughput:**

- Number of completed requests per unit time
- Example:
  - 5,000 malloc calls and 5,000 free calls in 10 seconds
  - Throughput is 1,000 operations/second

# **Maximizing Memory Utilization**

# Given some sequence of malloc and free requests:

•  $R_{0}$ ,  $R_{1}$ , ...,  $R_{k}$ , ...,  $R_{n-1}$ 

#### Def: Aggregate payload $P_k$ :

- malloc(p) results in a block with a payload of p
   bytes
- After request  $R_k$  has completed, the aggregate payload  $P_k$  is the sum of currently allocated payloads

#### Def: Current heap size is denoted by $H_k$

Assume that H<sub>k</sub> is monotonically increasing

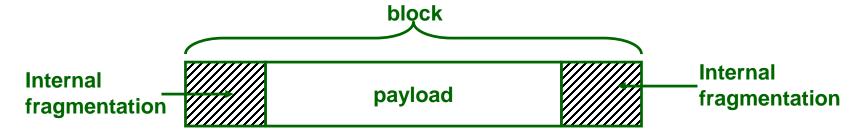
#### **Def: Peak memory utilization:**

- After k requests, peak memory utilization is:
  - $U_k = (\max_{i < k} P_i) / H_k$

# **Internal Fragmentation**

#### Poor memory utilization caused by fragmentation

- Comes in two forms: internal and external fragmentation
   Internal fragmentation
  - For some block, internal fragmentation is the difference between the block size and the payload size



- Caused by overhead of maintaining heap data structures, padding for alignment purposes, or explicit policy decisions (e.g., not to split the block)
- Depends only on the pattern of previous requests, and thus is easy to measure

# **External Fragmentation**

Occurs when there is enough aggregate heap memory, but no single free block is large enough



External fragmentation depends on the pattern of future requests, and thus is difficult to measure

### **Implementation Issues**

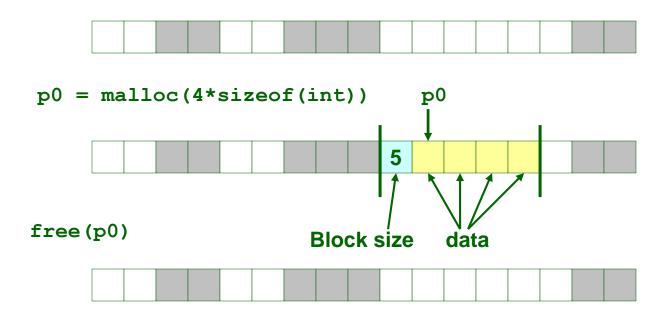
- How do we know how much memory to free just given a pointer?
- How do we keep track of the free blocks?
- What do we do with the extra space when allocating a structure that is smaller than the free block it is placed in?
- How do we pick a block to use for allocation many might fit?
- How do we reinsert a freed block?

```
free (p0)
p1 = malloc(1)
```

### **Knowing How Much to Free**

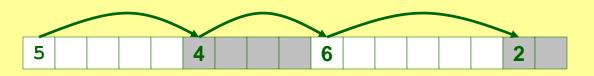
#### Standard method

- Keep the length of a block in the word preceding the block.
  - This word is often called the header field or header
- Requires an extra word for every allocated block



# **Keeping Track of Free Blocks**

Method 1: Implicit list using lengths – links all blocks



Method 2: Explicit list among the free blocks using pointers within the free blocks



**Method 3: Segregated free list** 

Different free lists for different size classes

Method 4: Blocks sorted by size

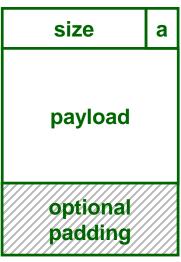
 Can use a balanced tree (e.g., Red-Black tree) with pointers within each free block, and the length used as a key

# **Method 1: Implicit List**

# Need to identify whether each block is free or allocated

- Can use extra bit
- Bit can be put in the same word as the size if block sizes are always multiples of two (mask out low order bit when reading size)

Format of allocated and free blocks



1 word

a = 1: allocated block

a = 0: free block

size: block size

payload: application data (allocated blocks only)

# **Implicit List: Finding a Free Block**

#### First fit:

Search list from beginning, choose first free block that fits

- Can take linear time in total number of blocks (allocated/free)
- Can cause "splinters" (small free blocks) at beginning of list

#### **Next fit:**

- Like first-fit, but search list from end of previous search
- Research suggests that fragmentation is worse

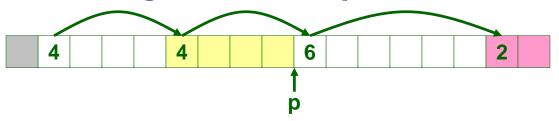
#### **Best fit:**

- Choose the free block with the closest size that fits (requires complete search of the list)
- Keeps fragments small usually helps fragmentation
- Will typically run slower than first-fit

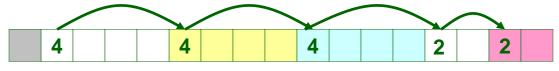
#### **Implicit List: Allocating in Free Block**

#### Allocating in a free block – splitting

 Since allocated space might be smaller than free space, we might want to split the block



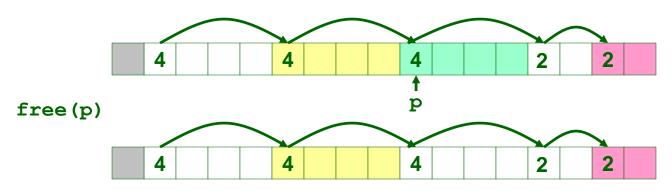
addblock(p, 4)



# **Implicit List: Freeing a Block**

#### Simplest implementation:

- Only need to clear allocated flag
  - void free\_block(ptr p) { \*p = \*p & ~0x1}
- But can lead to "false fragmentation"



malloc(5\*sizeof(int))

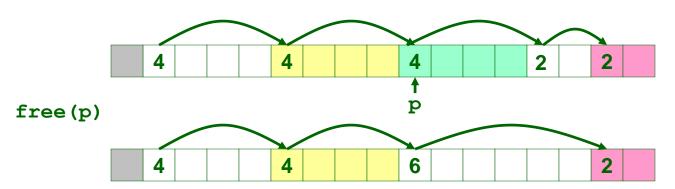
#### Oops!

 There is enough free space, but the allocator won't be able to find it!

# **Implicit List: Coalescing**

# Join (coalesce) with next and/or previous block if they are free

Coalescing with next block

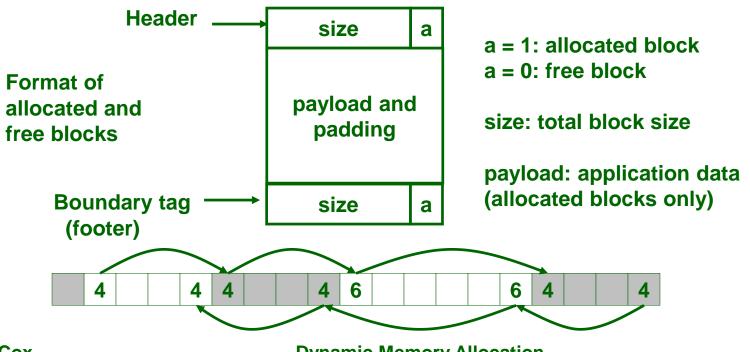


But how do we coalesce with previous block?

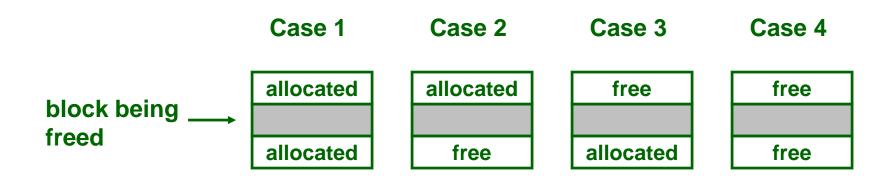
#### **Implicit List: Bidirectional Coalescing**

#### **Boundary tags [Knuth73]**

- Replicate header word at end of block
- Allows us to traverse the "list" backwards, but requires extra space
- Important and general technique!



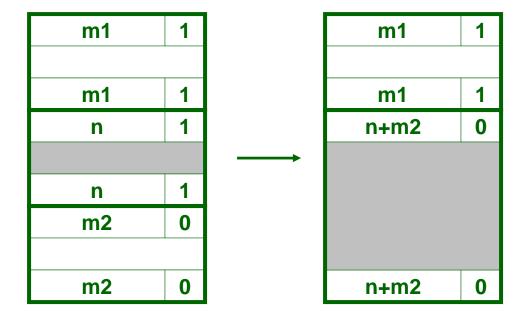
# **Constant Time Coalescing**



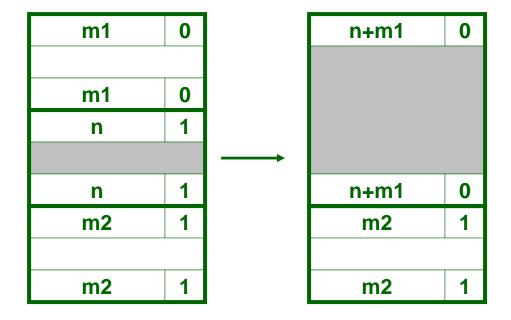
# **Constant Time Coalescing (Case 1)**

m1	1		m1	1
m1	1		m1	1
n	1		n	0
		<b>→</b>		
n	1		n	0
m2	1		m2	1
	·			·
m2	1		m2	1

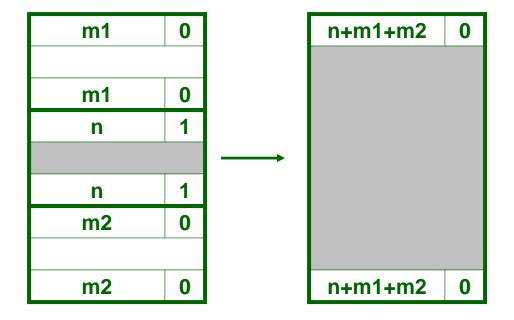
# **Constant Time Coalescing (Case 2)**



# **Constant Time Coalescing (Case 3)**



# **Constant Time Coalescing (Case 4)**



# **Summary of Key Allocator Policies**

#### **Placement policy:**

- First fit, next fit, best fit, etc.
- Trades off lower throughput for less fragmentation

#### **Splitting policy:**

- When do we go ahead and split free blocks?
- How much internal fragmentation are we willing to tolerate?

#### **Coalescing policy:**

- Immediate coalescing: coalesce adjacent blocks each time free is called
- Deferred coalescing: try to improve performance of free by deferring coalescing until needed. e.g.,
  - Coalesce as you scan the free list for malloc
  - Coalesce when the amount of external fragmentation reaches some threshold

# **Implicit Lists: Summary**

Implementation: very simple

Allocate: linear time worst case

Free: constant time worst case – even with coalescing

Memory usage: will depend on placement policy

First fit, next fit or best fit

Not used in practice for malloc/free because of linear time allocate

Used in many special purpose applications

However, the concepts of splitting and boundary tag coalescing are general to all allocators

# **Keeping Track of Free Blocks**

#### Method 1: Implicit list using lengths – links all blocks



Method 2: Explicit list among the free blocks using pointers within the free blocks



#### **Method 3: Segregated free list**

Different free lists for different size classes

#### Method 4: Blocks sorted by size

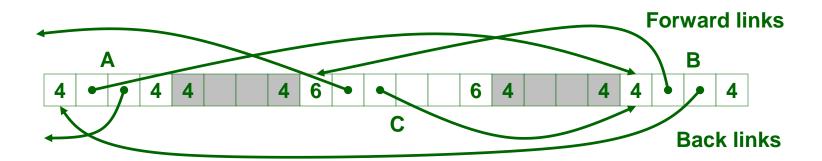
 Can use a balanced tree (e.g. Red-Black tree) with pointers within each free block, and the length used as a key

# **Explicit Free Lists**



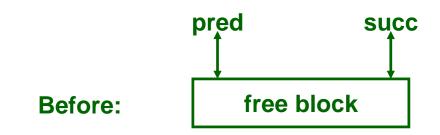
#### Use data space for link pointers

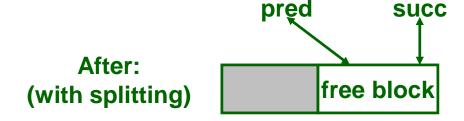
- Typically doubly linked
- Still need boundary tags for coalescing



 It is important to realize that links are not necessarily in the same order as the blocks

# **Allocating From Explicit Free Lists**





# **Freeing With Explicit Free Lists**

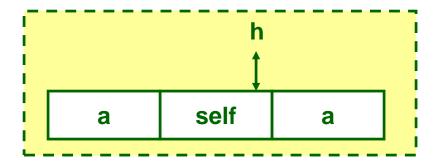
# Insertion policy: Where in the free list do you put a newly freed block?

- LIFO (last-in-first-out) policy
  - Insert freed block at the beginning of the free list
  - Pro: simple and constant time
  - Con: studies suggest fragmentation is worse than address ordered
- Address-ordered policy
  - Insert freed blocks so that free list blocks are always in address order
    - i.e. addr(pred) < addr(curr) < addr(succ)</pre>
  - Con: requires search
  - Pro: studies suggest fragmentation is better than LIFO

# **Freeing With a LIFO Policy**

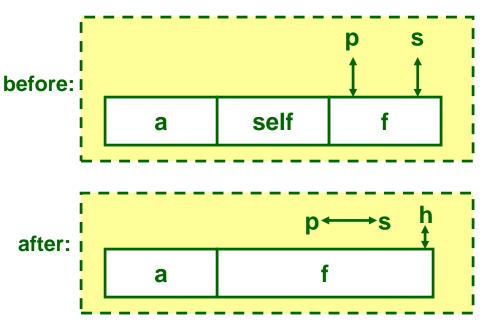
#### **Case 1: a-a-a**

 Insert self at beginning of free list



#### Case 2: a-a-f

 Splice out next, coalesce self and next, and add to beginning of free list



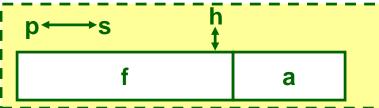
# Freeing With a LIFO Policy (cont)

### Case 3: f-a-a

 Splice out prev, coalesce with self, and add to beginning of free list before:

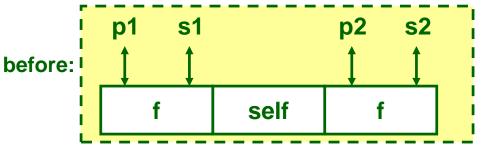


after:

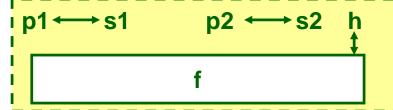


### Case 4: f-a-f

 Splice out prev and next, coalesce with self, and add to beginning of list



after:



# **Explicit List Summary**

## **Comparison to implicit list:**

- Allocate is linear time in number of free blocks instead of total blocks – much faster allocates when most of the memory is full
- Slightly more complicated allocate and free since needs to splice blocks in and out of the list
- Some extra space for the links (2 extra words needed for each block)

# Main use of linked lists is in conjunction with segregated free lists

 Keep multiple linked lists of different size classes, or possibly for different types of objects

## **Keeping Track of Free Blocks**

Method 1: Implicit list using lengths – links all blocks



Method 2: Explicit list among the free blocks using pointers within the free blocks



### **Method 3: Segregated free list**

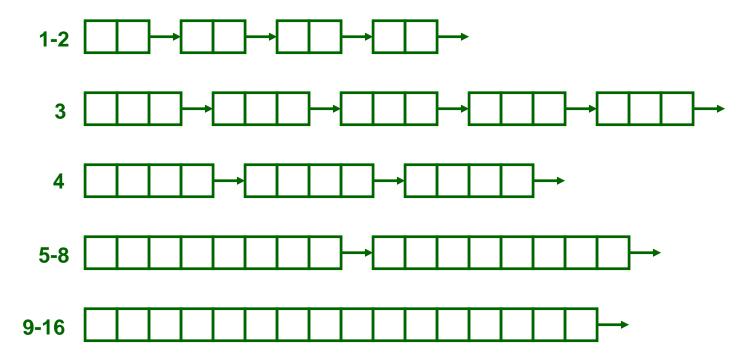
Different free lists for different size classes

### Method 4: Blocks sorted by size

 Can use a balanced tree (e.g. Red-Black tree) with pointers within each free block, and the length used as a key

# **Segregated Storage**

### Each size class has its own collection of blocks



- Often separate classes for every small size (2,3,4,...)
- Larger sizes typically grouped into powers of 2

# Simple Segregated Storage

### Separate heap and free list for each size class No splitting

#### To allocate a block of size n:

- If free list for size n is not empty,
  - Allocate first block on list (list can be implicit or explicit)
- If free list is empty,
  - Get a new page
  - Create new free list from all blocks in page
  - Allocate first block on list
- Constant time

#### To free a block:

- Add to free list
- If page is empty, could return the page for use by another size

#### **Tradeoffs:**

- Fast, but can fragment badly
- Interesting observation: approximates a best fit placement policy without having the search entire free list

## **Segregated Fits**

### Array of free lists, each one for some size class To allocate a block of size n:

- Search appropriate free list for block of size m > n
- If an appropriate block is found:
  - Split block and place fragment on appropriate list (optional)
- If no block is found, try next larger class
- Repeat until block is found

#### To free a block:

Coalesce and place on appropriate list (optional)

### **Tradeoffs**

- Faster search than sequential fits (i.e., log time for power of two size classes)
- Controls fragmentation of simple segregated storage
- Coalescing can increase search times
  - Deferred coalescing can help

# **Keeping Track of Free Blocks**

### Method 1: Implicit list using lengths – links all blocks



Method 2: Explicit list among the free blocks using pointers within the free blocks



### **Method 3: Segregated free list**

Different free lists for different size classes

### Method 4: Blocks sorted by size

 Can use a balanced tree (e.g. Red-Black tree) with pointers within each free block, and the length used as a key

# **Spatial Locality**

### Most techniques give little control over spatial locality

- Sequentially-allocated blocks not necessarily adjacent
- Similarly-sized blocks (e.g., for same data type) not necessarily adjacent

# Would like a series of similar-sized allocations and deallocations to reuse same blocks

Splitting & coalescing tend to reduce locality

? Of techniques seen, which best for spatial locality?



Simple segregated lists Each page only has similar-sized blocks

# **Spatial Locality: Regions**

## One technique to improve spatial locality

## **Dynamically divide heap into mini-heaps**

Programmer-determined

## Allocate data within appropriate region

- Data that is logically used together
- Increase locality
- Can quickly deallocate an entire region at once

Changes API malloc() and free() must take a region as an argument

## For More Info on Allocators

- D. Knuth, "The Art of Computer Programming, Second Edition", Addison Wesley, 1973
  - The classic reference on dynamic storage allocation
- Wilson et al, "Dynamic Storage Allocation: A Survey and Critical Review", Proc. 1995 Int'l Workshop on Memory Management, Kinross, Scotland, Sept, 1995.
  - Comprehensive survey
  - Available from CS:APP student site (csapp.cs.cmu.edu)

# **Implementation Summary**

### Many options:

- Data structures for keeping track of free blocks
- Block choice policy
- Splitting & coalescing policies

## No clear best option

- Many tradeoffs
- Some behaviors not well understood by anyone
- Depends on "typical" program's pattern of allocation and deallocation

## **Explicit Memory Allocation/Deallocation**

- + Usually low time- and space-overhead
- Challenging to use correctly by programmers
  - Lead to crashes, memory leaks, etc.

# **Implicit Memory Deallocation**

- + Programmers don't need to free data explicitly, easy to use
- + Some implementations could achieve better spatial locality and less fragmentation in the hands of your average programmers
- Price to pay: depends on implementation

But HOW could a memory manager know when to deallocate data without instruction from programmer?

# Implicit Memory Management: Garbage Collection

Garbage collection: automatic reclamation of heap-allocated storage – application never has to free

```
void foo() {
  int *p = malloc(128);
  return; /* p block is now garbage */
}
```

Common in functional languages and modern object oriented languages:

C#, Go, Java, Lisp, Python, Scala, Swift

Variants (conservative garbage collectors) exist for C and C++

Cannot collect all garbage

# **Garbage Collection**

# How does the memory manager know when memory can be freed?

- In general we cannot know what is going to be used in the future since it depends on conditionals
- But we can tell that certain blocks cannot be used if there are no pointers to them

# Need to make certain assumptions about pointers

- Memory manager can distinguish pointers from non-pointers
- All pointers point to the start of a block
- Cannot hide pointers (e.g., by coercing them to an int, and then back again)

# **Classical GC algorithms**

### Reference counting (Collins, 1960)

Does not move blocks

## Mark and sweep collection (McCarthy, 1960)

Does not move blocks (unless you also "compact")

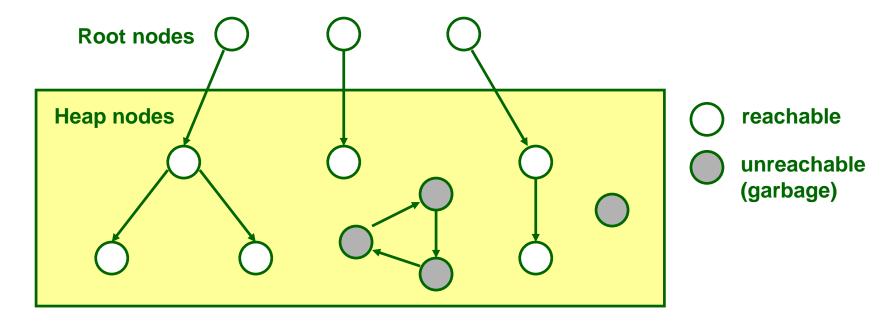
## Copying collection (Minsky, 1963)

Moves blocks (compacts memory)

For more information, see Jones and Lin, "Garbage Collection: Algorithms for Automatic Dynamic Memory", John Wiley & Sons, 1996.

# Memory as a Graph

- Each data block is a node in the graph
- Each pointer is an edge in the graph
- Root nodes: locations not in the heap that contain pointers into the heap (e.g. registers, locations on the stack, global variables)



# **Reference Counting**

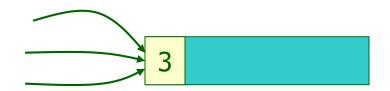
### **Overall idea**

- Maintain a free list of unallocated blocks
- Maintain a count of the number of references to each allocated block
- To allocate, grab a sufficiently large block from the free list
- When a count goes to zero, deallocate it

# **Reference Counting: More Details**

# Each allocated block keeps a count of references to the block

- Reachable → count is positive
- Compiler inserts counter increments and decrements as necessary
- Deallocate when count goes to zero

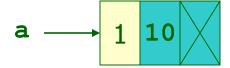


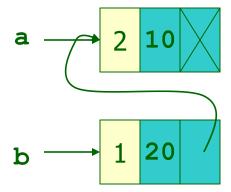
# Typically built on top of an explicit deallocation memory manager

- All the same implementation decisions as before
- E.g., splitting & coalescing

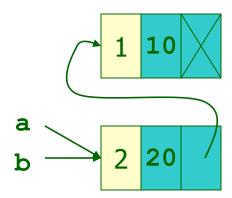
```
a = cons(10,empty)
b = cons(20,a)
a = b
b = ...
a = ...
```

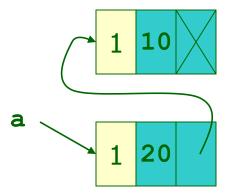
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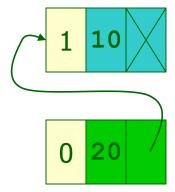




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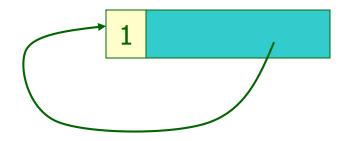
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```



```
a = cons(10,empty)
b = cons(20,a)
a = b
b = ...
a = ...
```

# **Reference Counting: Problem**

? What's the problem?



No other pointer to this data, so can't refer to it

Count not zero, so never deallocated

Following does NOT hold: Count is positive → reachable

Can occur with any cycle

# **Reference Counting: Summary**

### **Disadvantages:**

- Managing & testing counts is generally expensive
  - Can optimize
- Doesn't work with cycles!
  - Approach can be modified to work, with difficulty

### **Advantage:**

- Simple
  - Easily adapted, e.g., for parallel or distributed GC

## Useful when cycles can't happen

E.g., UNIX hard links

## **GC Without Reference Counts**

If don't have counts, how to deallocate?

# Determine reachability by traversing pointer graph directly

- Stop user's computation periodically to compute reachability
- Deallocate anything unreachable

## Mark & Sweep

### **Overall idea**

- Maintain a free list of unallocated blocks
- To allocate, grab a sufficiently large block from free list
- When no such block exists, GC
  - Should find blocks & put them on free list

## Mark & Sweep: GC

## Follow all pointers, marking all reachable data

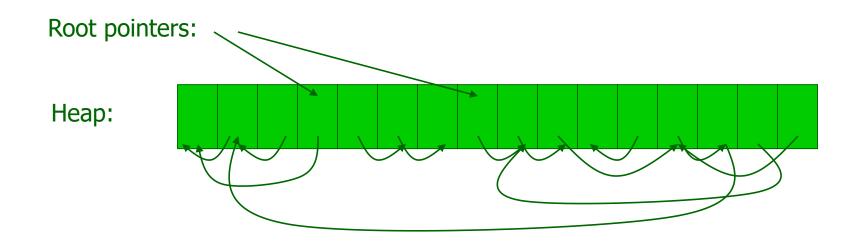
- Use depth-first search
- Data must be tagged with info about its type, so
   GC knows its size and can identify pointers
- Each piece of data must have a mark bit
  - Can alternate meaning of mark bit on each GC to avoid erasing mark bits

# Sweep over all heap, putting all unmarked data into a free list

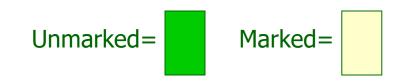
Again, same implementation issues for the free list

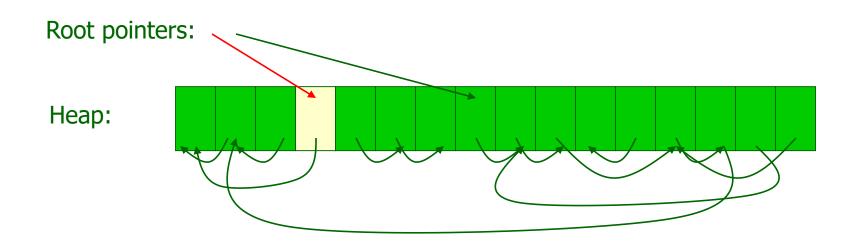
# Mark & Sweep: GC Example

Assume fixed-sized, single-pointer data blocks, for simplicity.

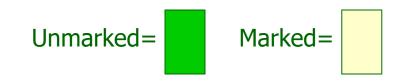


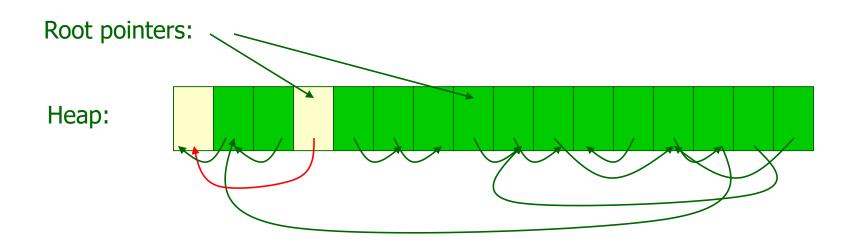
# Mark & Sweep: GC Example

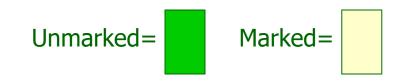


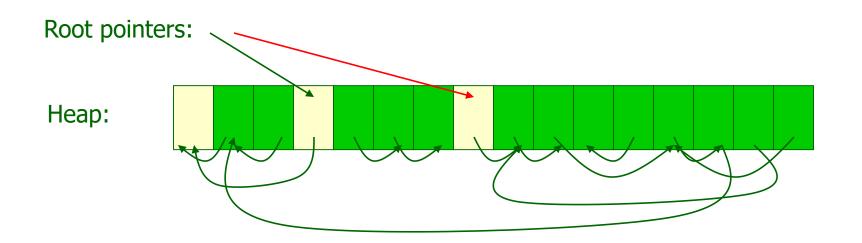


# Mark & Sweep: GC Example

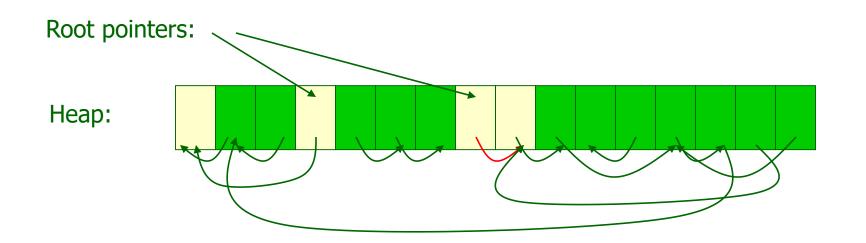


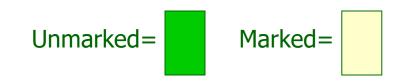


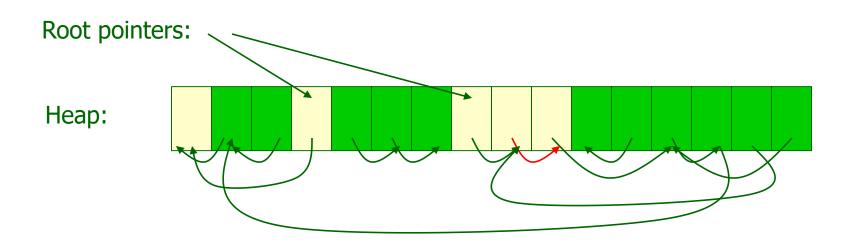


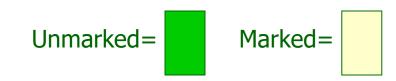


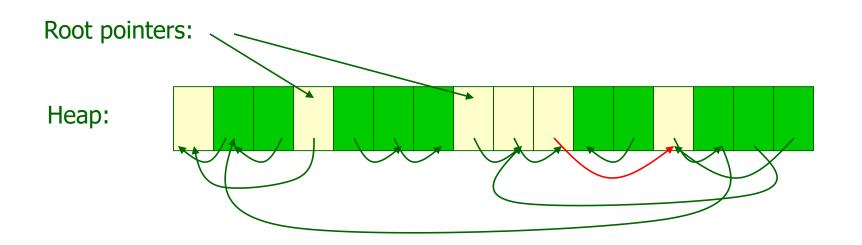


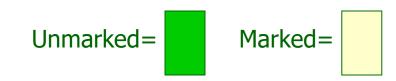


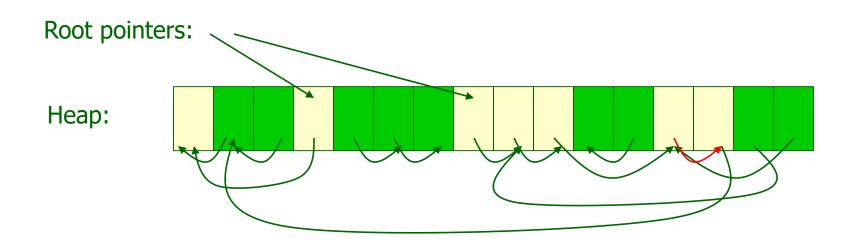




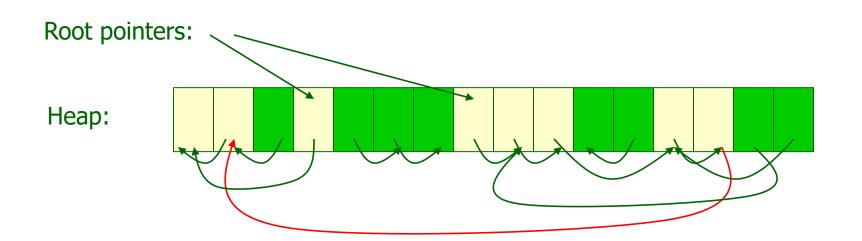




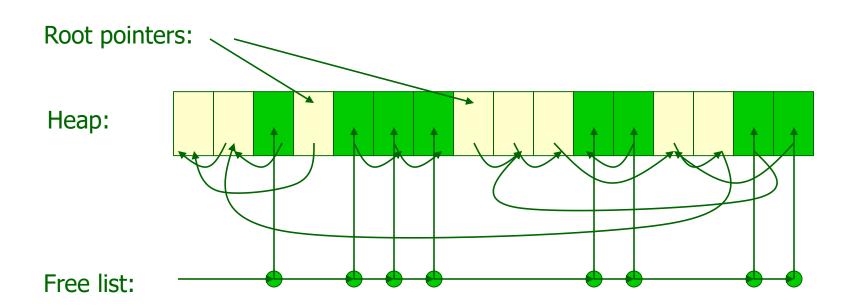












#### Mark & Sweep: Summary

#### **Advantages:**

- No space overhead for reference counts
- No time overhead for reference counts
- Handles cycles

#### **Disadvantage:**

Noticeable pauses for GC

#### Stop & Copy

#### **Overall idea:**

- Maintain From and To spaces in heap
- To allocate, get sequentially next block in From space
  - No free list!
- When From space full, GC into To space
  - Swap From & To names

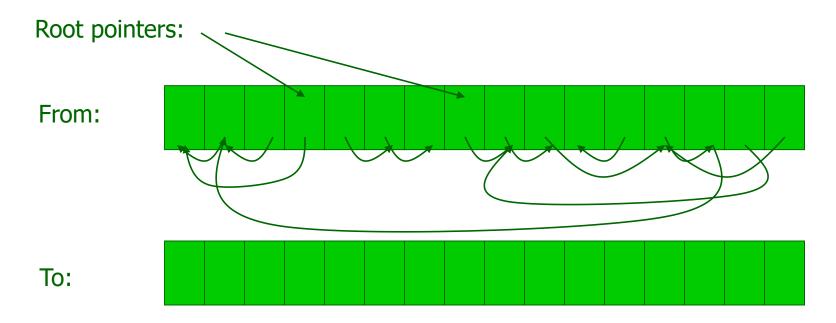
#### Stop & Copy: GC

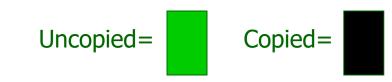
# Follow all From-space pointers, copying all reachable data into To-space

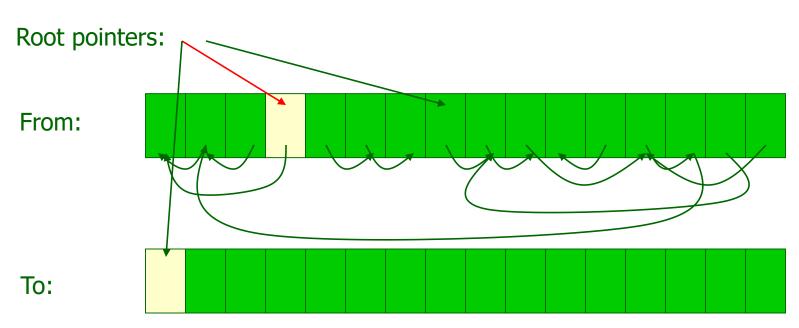
- Use depth-first search
- Data must be tagged with info about its type, so GC knows its size and can identify pointers

**Swap From-space and To-space names** 

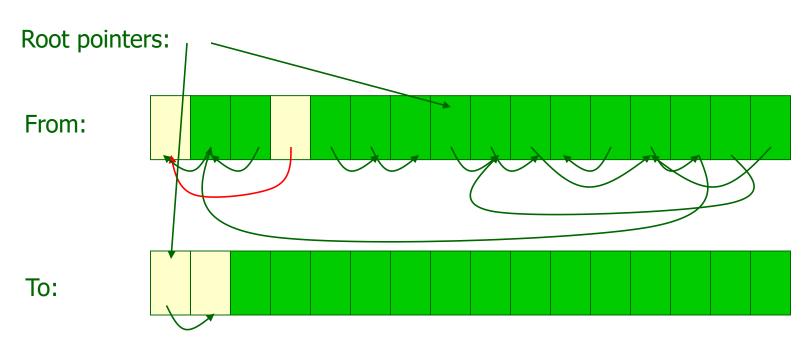
Assume fixed-sized, single-pointer data blocks, for simplicity.



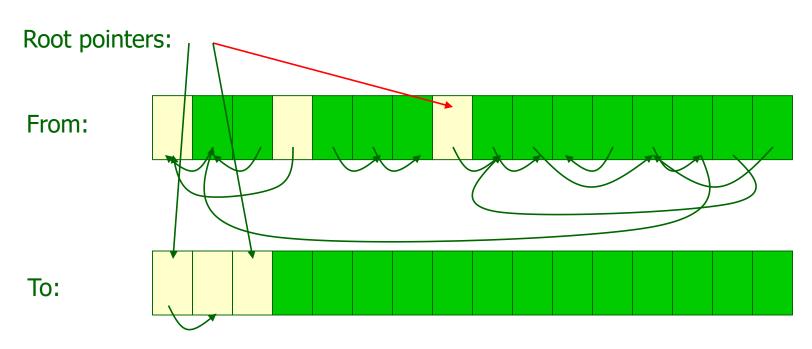




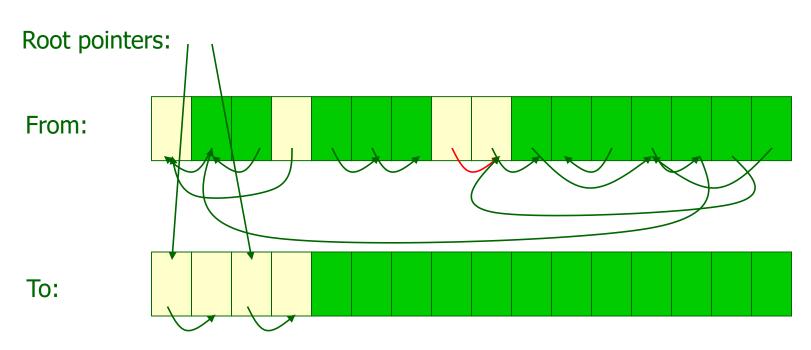




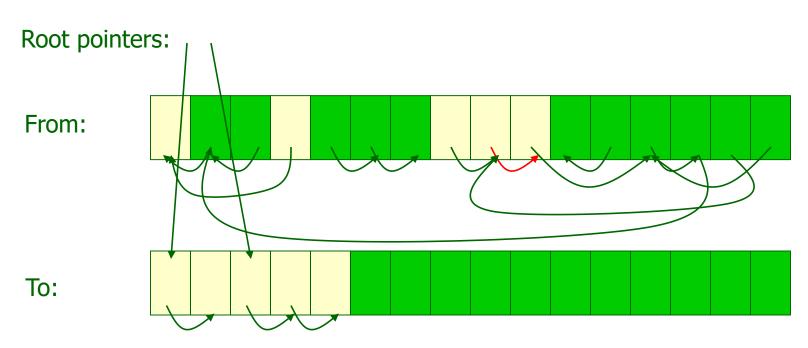


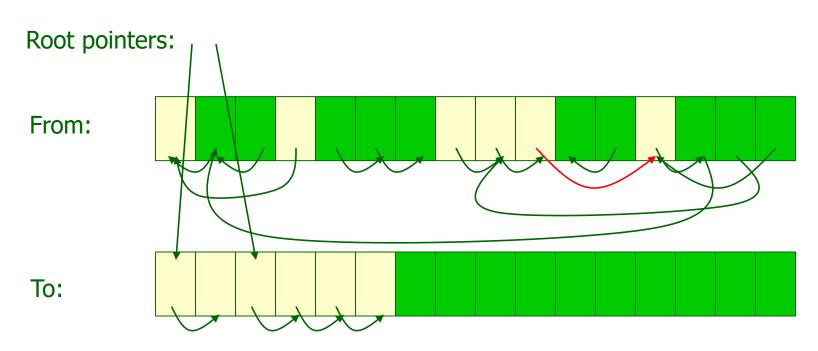


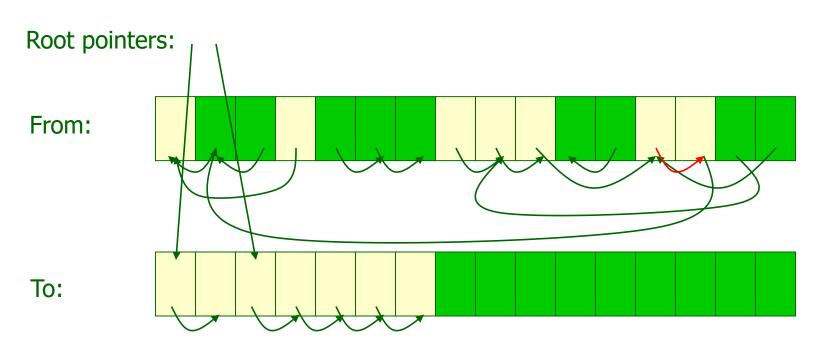


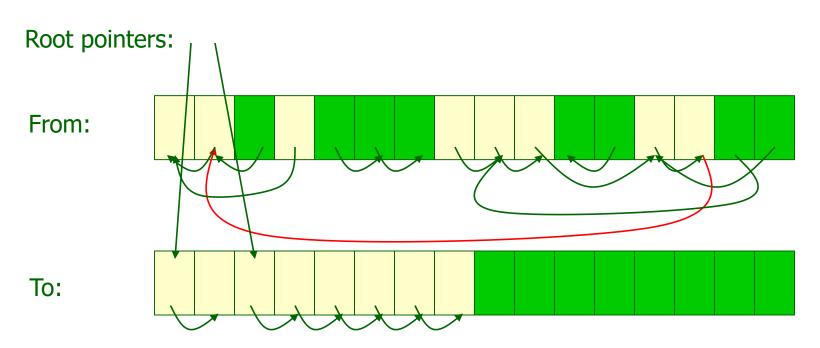


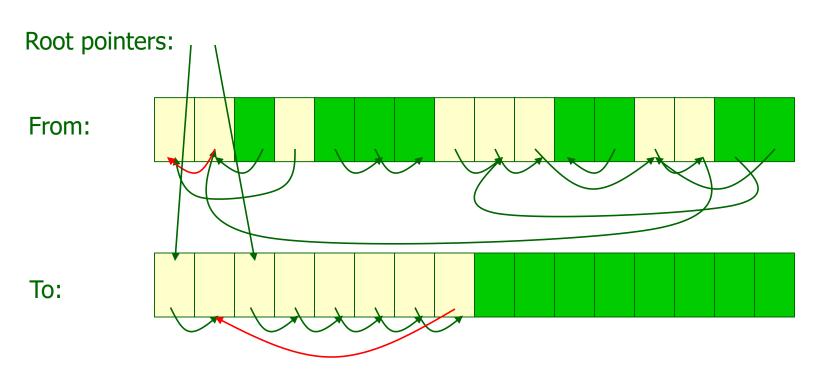


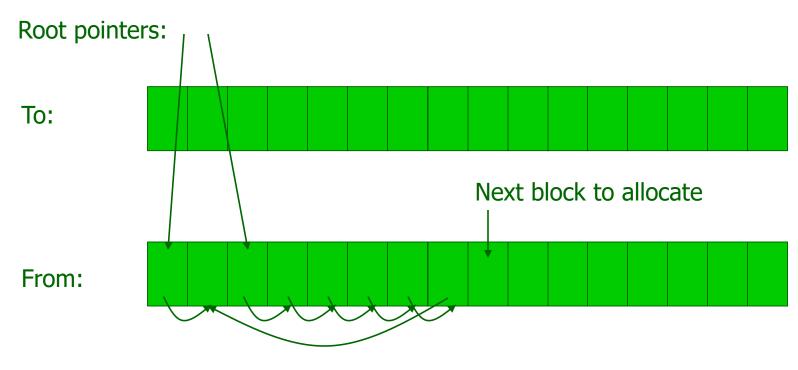












#### **Stop & Copy**

#### **Advantages:**

- Only one pass over data
- Only touches reachable data
- Little space overhead per data item
- Very simple allocation
- "Compacts" data
- Handles cycles

#### **Disadvantages:**

- Noticeable pauses for GC
- Double the basic heap size

#### Compaction

Moving allocated data into contiguous memory Eliminates fragmentation Tends to increase spatial locality Must be able to reassociate data & locations

Not possible if C-like pointers in source language

#### **GC Variations**

#### Many variations on these three main themes

- Concurrent GC, which does not stop the computation during GC
- Generational GC, which exploits the observation that most objects have a short lifetime
- Conservative GC

# Combinations of these three main themes are common

 Java uses both Copying and Mark-and-Sweep within a Generational GC

#### **Conservative GC**

#### Goal

Allow GC in C-like languages

**Usually a variation on Mark & Sweep** 

# Must conservatively assume that integers and other data can be cast to pointers

- Compile-time analysis to see when this is definitely not the case
- Code style heavily influences effectiveness

#### GC vs. malloc/free Summary

Safety is not programmer-dependent Compaction generally improves locality

#### Higher or lower time overhead

Generally less predictable time overhead
 Generally higher space overhead

#### **Next Time**

#### **Virtual Memory**