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What's Eating my RAM?

JIANFEI PAN





What's Eating My RAM?

Engineering

CppCon 2024 September 17, 2024

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Software Engineer, Portfolio/Risk Analytics

TechAtBloomberg.com

A story

- **90% Memory Used:** What's that alarm?
- QBack to basics: How does my code impact memory usage?
- Memory allocation troubleshooting & tools: Leak & Fragmentation



What's that alarm?



90% Memory Used



Consequences:

- **Swap**: performance degradation
- Out-of-memory (OOM) killer: service disruption
- Multi-tenant environment: resources are shared by different processes

What's that alarm?



90% Memory Used



~\$ top -o RES

top - 14:05:08 up 1 min, 1 user, load average: 2.56, 1.69, 0.67 Tasks: 281 total, 1 running, 280 sleeping, 0 stopped, 0 zombie %Cpu(s): 8.8 us, 3.0 sy, 0.0 ni, 88.2 id, 0.0 wa, 0.0 hi, 0.0 si, 0.0 st 499.8 free, 1481.0 used, 1948.0 buff/cache 3928.7 total, 2048.0 total, 2048.0 free, 2197.6 avail Mem PID USER TIME+ COMMAND 2190 0:07.05 1544 20 0 1012080 86956 50644 S 5.0 2.2 0:01.67

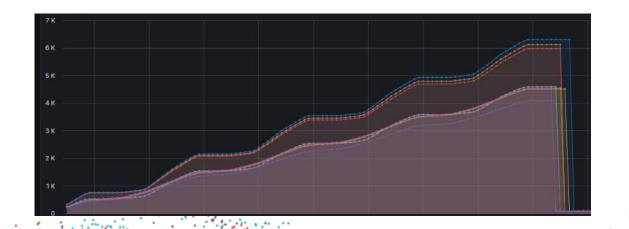
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```
new std::string("Hello");
```



90 %



malloc library

Operating System



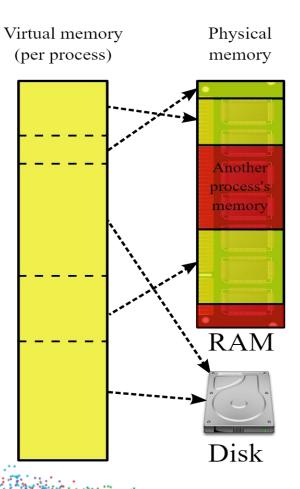






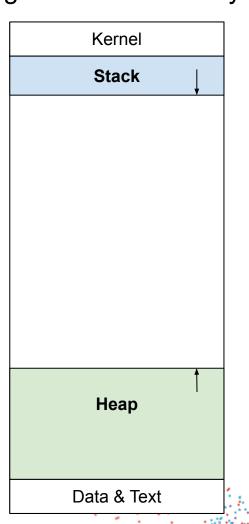
Operating System



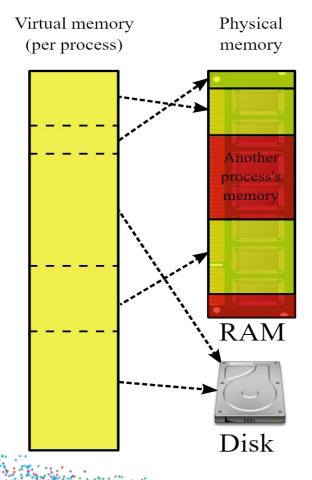




glibc's malloc library



Operating System



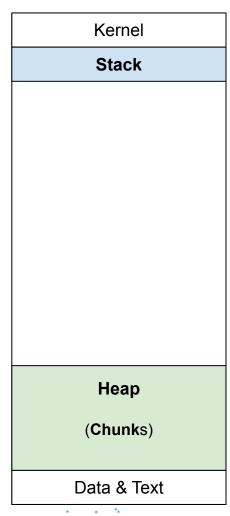


malloc

Heap:

a **contiguous** region of memory subdivided into chunks

Chunk:



malloc

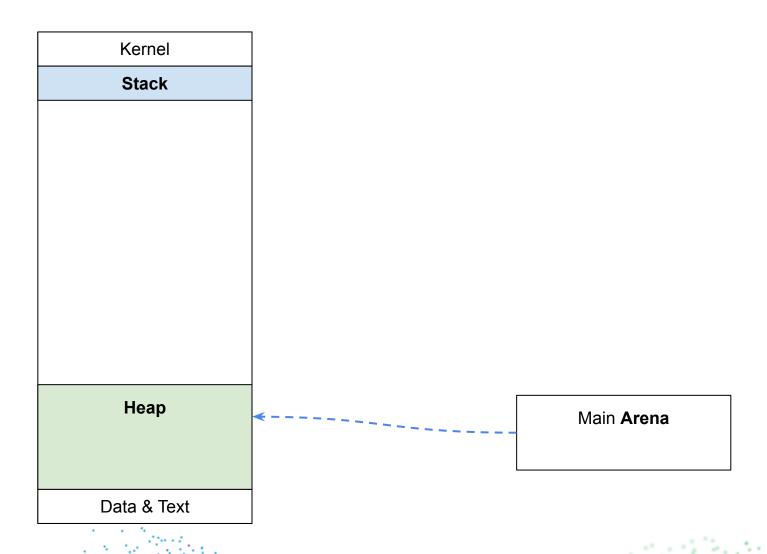
Arena:

a structure that is shared among one or more threads

Heap:

a **contiguous** region of memory subdivided into chunks

Chunk:



malloc

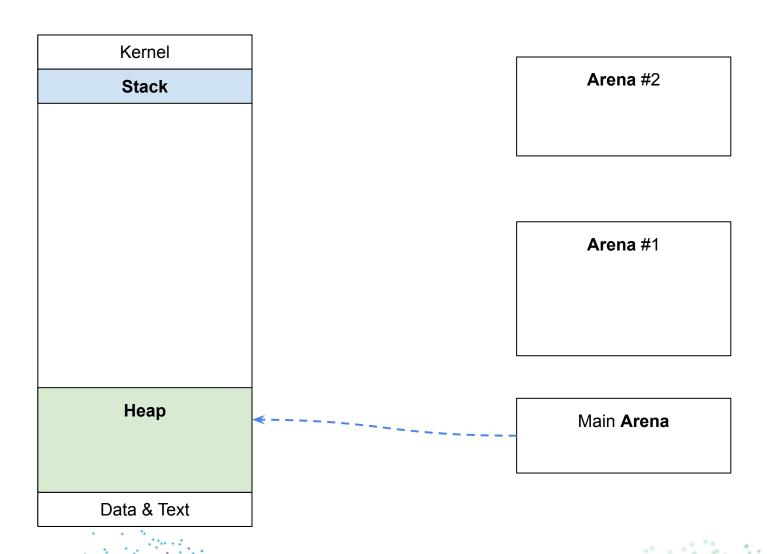
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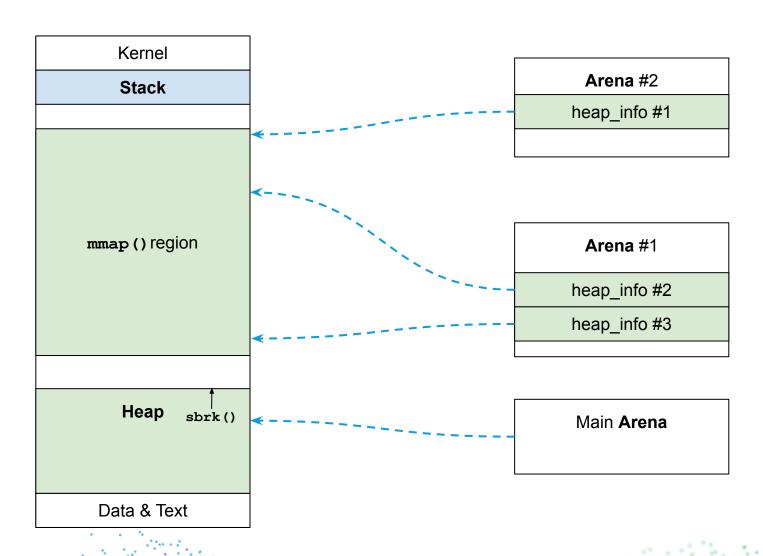
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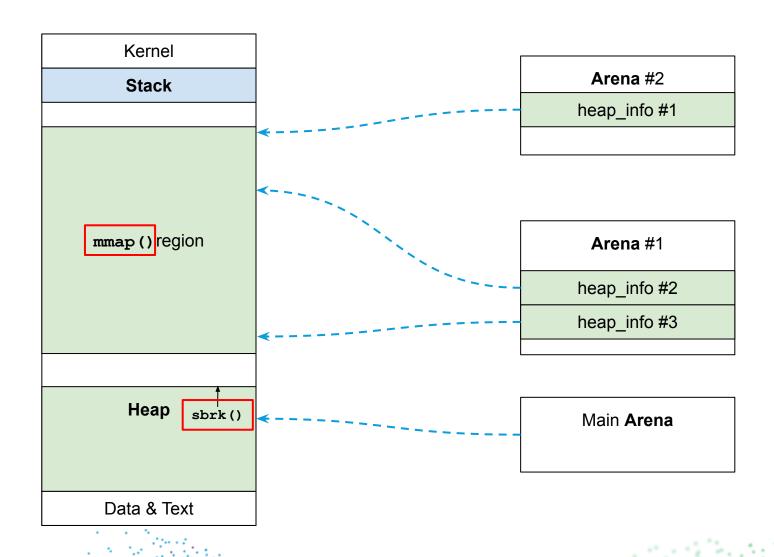
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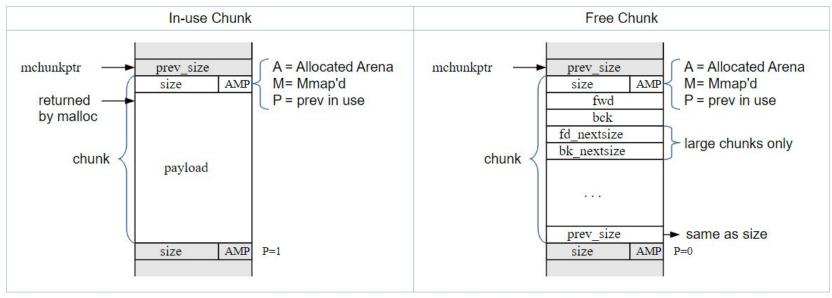
Chunk:



Chunk

can be:

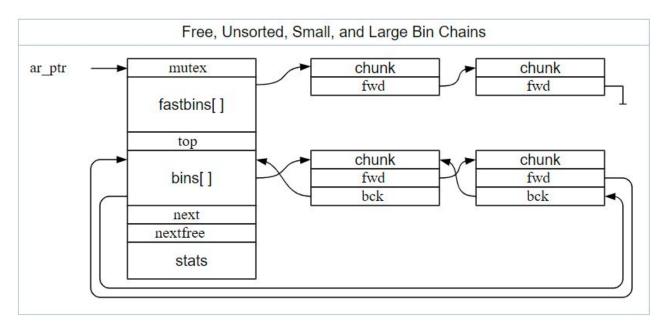
- allocated: in-use chunk
- freed: (marked as) free chunk
- combined with adjacent free chunks



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free () marks a chunk as "free to be reused", from the OS' point of view: the memory still "belongs" to the application.

Bins manage free chunks of different sizes



malloc.c

64 bins of size bytes 32 bins of size bytes 16 bins of size 512 bytes 8 bins of size 4096 bytes 4 bins of size 32768 bytes 2 bins of size 262144 bytes 1 bin of size what's left

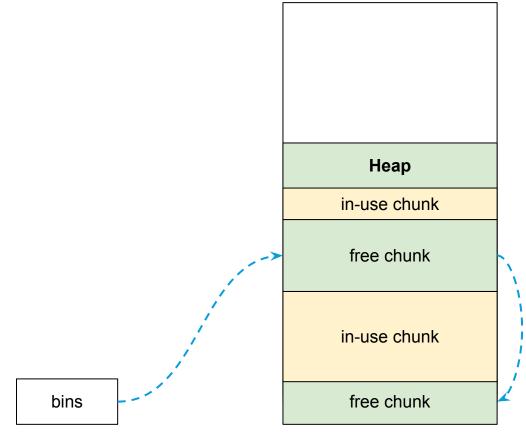
Copyright 2016 DJ Delorie. Licensed under the terms of GPLv2. Sourced from https://sourceware.org/glibc/wiki/MallocInternals.

malloc

malloc algorithm:

- •
- lacktriangle

- •
- •
- •

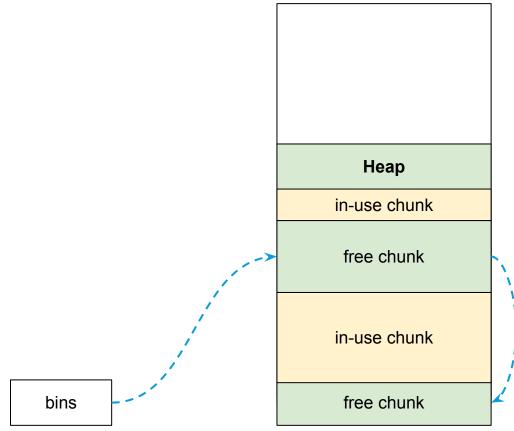


malloc

malloc algorithm:

- If the appropriate bin has a chunk in it,
- lacktriangle
- lacktriangle

- lacktriangle
- •
- •

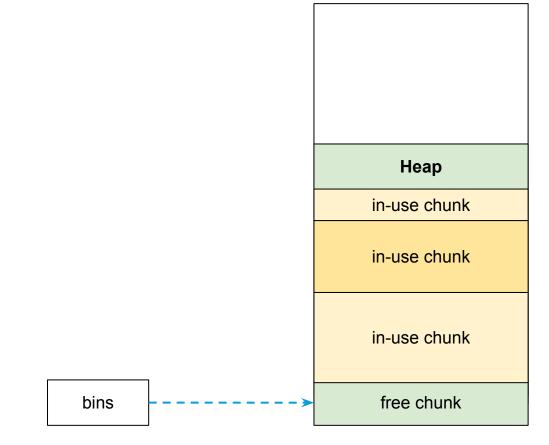


malloc

malloc algorithm:

- If the appropriate bin has a chunk in it, use that
- lacktriangle

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- •

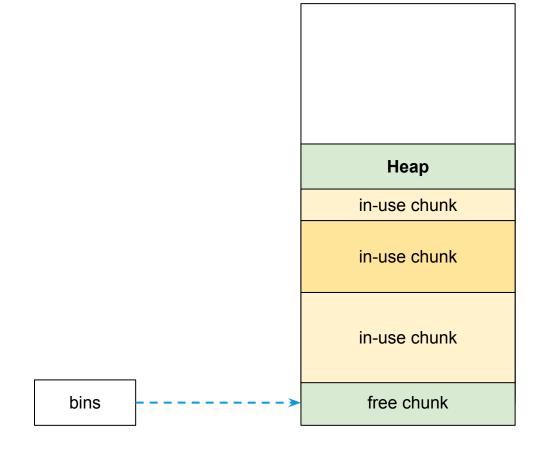


malloc

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- Place the free chunk in the appropriate bin
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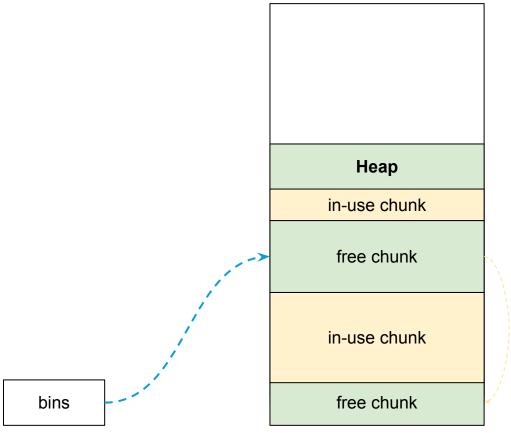


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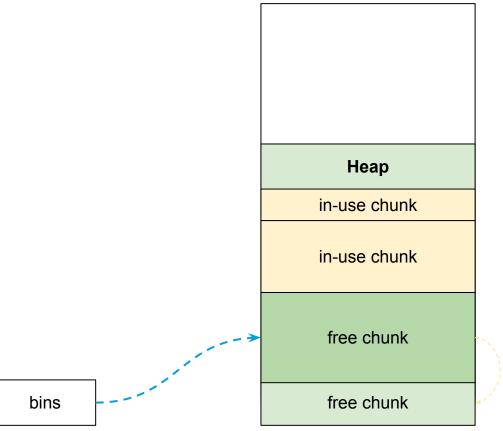
malloc

malloc algorithm:

- If the appropriate bin has a chunk in it, use that
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Free algorithm:

- Place the free chunk in the appropriate bin
- If this chunk is adjacent to another free chunk,



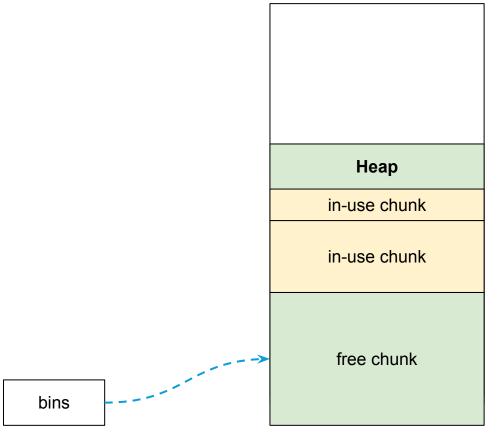
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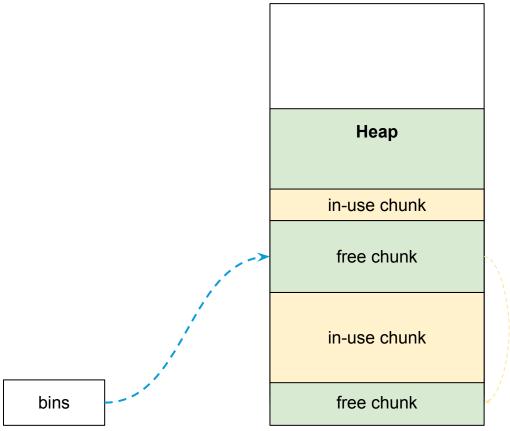
malloc

malloc algorithm:

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malloc

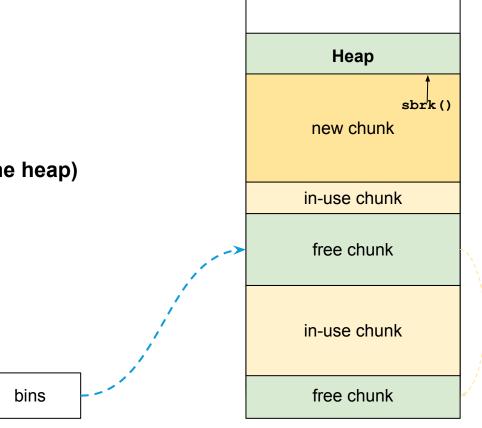
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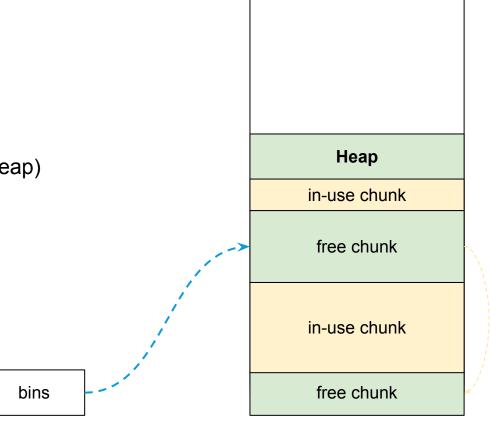
malloc

malloc algorithm:

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malloc

malloc algorithm:

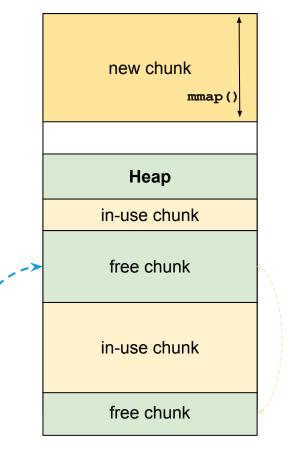
- If the appropriate bin has a chunk in it, use that
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bins

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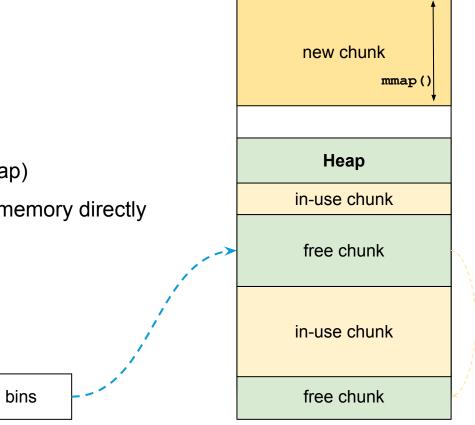


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- If this chunk is mapped: munmap

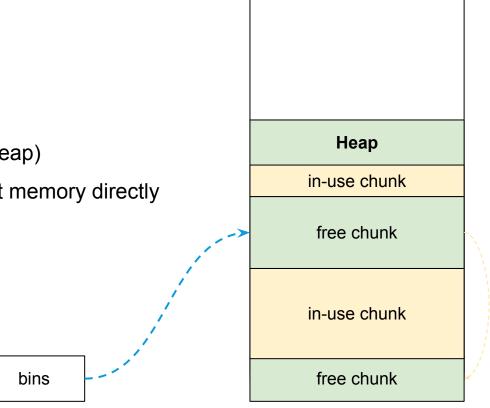


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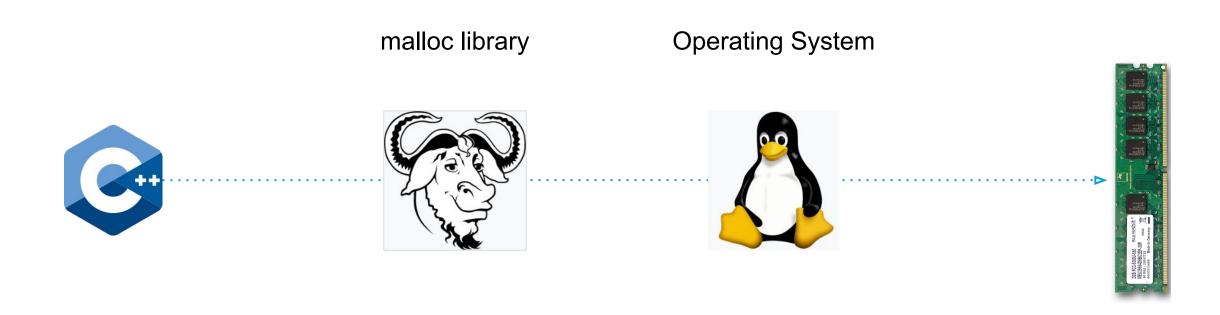
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Heap in-use chunk free chunk in-use chunk free chunk bins

(tcache, topmost chunk, shrink...)





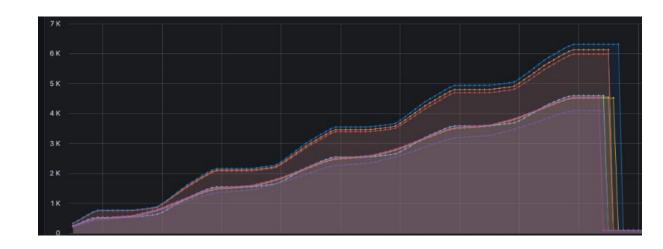
Memory which is no longer needed is not released



Memory which is no longer needed is not released

1. **new()** it, then forget it

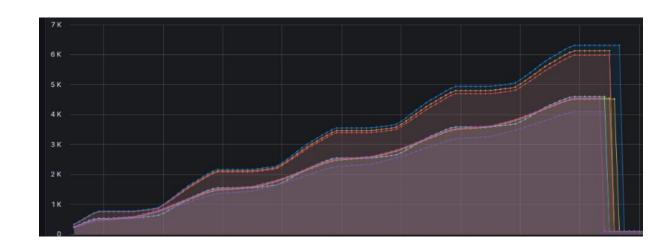
Resource acquisition is initialization (RAII) "no object leaks, no resource leaks"



Memory which is no longer needed is not released

- 1. **new()** it, then forget it
- 2. Keep entries that are no longer needed

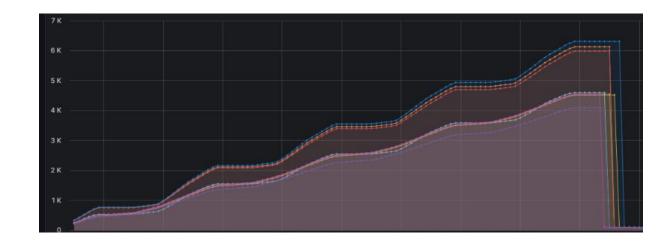
keep pushing entries into a container but never clean it



Memory which is no longer needed is not released

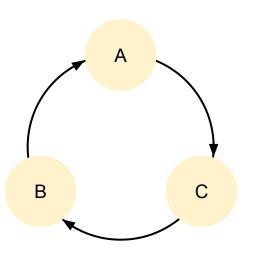
- 1. **new()** it, then forget it
- 2. Keep entries that are no longer needed
- 3. Missing virtual ~Base()

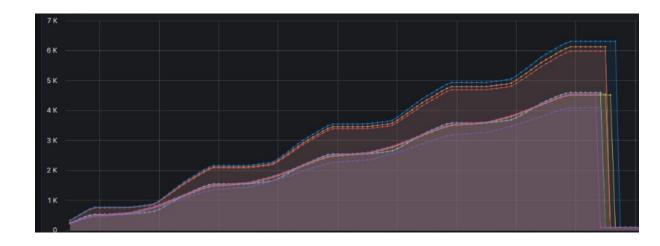
Base class' dtor isn't called



Memory which is no longer needed is not released

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- 3. Missing virtual ~Base()
- 4. Circular reference



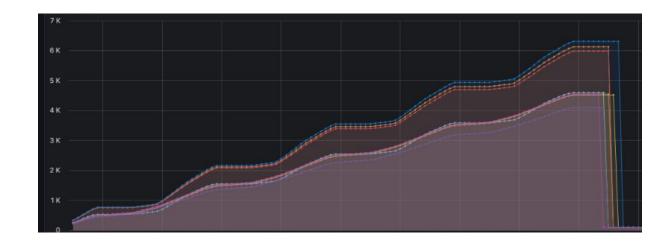


Reference counting: maintain a count of the smart pointers that point to the same object

Memory which is no longer needed is not released

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- 2. Keep entries that are no longer needed
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. . .





Tool	What	How
bslma::TestAllocator	Allocator for detecting memory error	Inject the allocator, compile & link

Allocators: handle all the requests for allocation and deallocation of memory for a given container

C++98: stateless allocators C++03: stateful allocators

C++17: PMR allocators: flexibility at run time

[&]quot;...library containers independent of the underlying memory model"

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    class Allocator = std::allocator<T>
> class vector;
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C++98: stateless allocators

C++03: stateful allocators

C++17: PMR allocators: flexibility at run time



- fast
- small overhead
- scoped



- code change required
- compile & link required

Tool	What	How
AddressSanitizer	Memory error detector	compile & link -fsanitize=address

google/sanitizers

a compiler instrumentation module a runtime library which replaces the malloc function

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- no code change required
- fast (50%-100% slower)



- compile & link required
- extra memory cost

Tool	What	How
valgrind memcheck	memory error detector	valgrindtool=memcheck <prog></prog>
valgrind massif	heap profiler	valgrindtool=massif <pre> <pre> <pre> <pre> </pre></pre></pre></pre>

Valgrind

runs your application in a "sandbox" insert its own instructions to do advanced debugging and profiling

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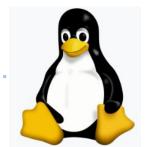
- no code change required
- no compile & link required



- slow (10-30 times slower)
- extra memory cost

.cpp malloc Op

Operating System



TestAllocator

AddressSanitizer

Valgrind



snapshot in the end

VS.

snapshots over time

TestAllocator / AddressSanitizer / memcheck

massif

snapshot in the end

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LEAK SUMMARY:

definitely lost: 921,664 bytes in 730 blocks

indirectly lost: 59,250,966 bytes in 53,741 blocks
 possibly lost: 23,493,535 bytes in 19,707 blocks
still reachable: 85,768,287 bytes in 88,669 blocks

<call stacks>

snapshot in the end

VS. snapshots over time

TestAllocator / AddressSanitizer / memcheck

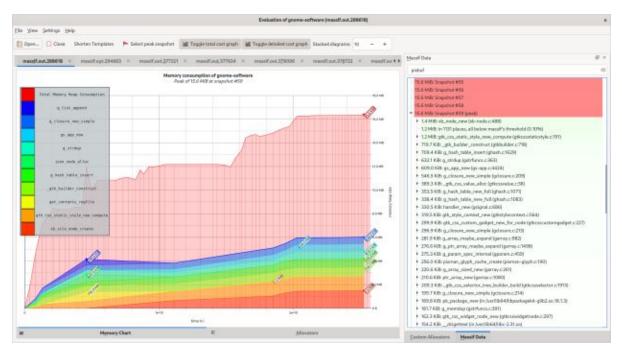
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massif



Copyright 2011 Milian Wolf. Licensed under the terms of GPLv2. Sourced from https://github.com/KDE/massif-visualizer.

Tips:

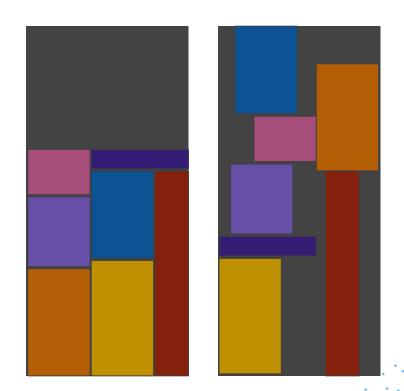
- "Static" leaks may hide the real issue we need enough traffic for profiling.
- They are all good tools, but for different cases.
- Catch the problem in earlier stages Integrate AddressSanitizer in CI.
- Install the tools so we can start profiling easily.
- Care about the lifecycle and ownership of what we allocate.

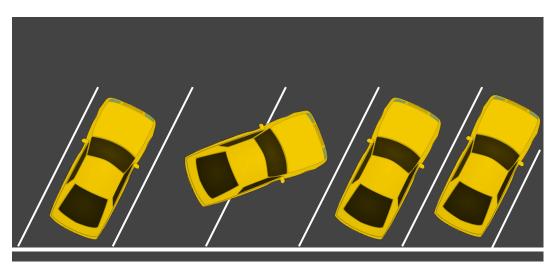
Memory leak fixed.

What else?

Fragmentation

You try to allocate a big block and you can't, even though you appear to have enough memory free





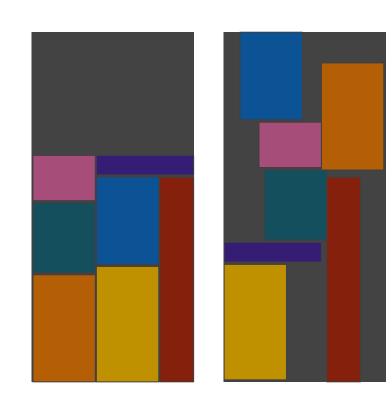
Source: Pixabay

Fragmentation

External fragmentation

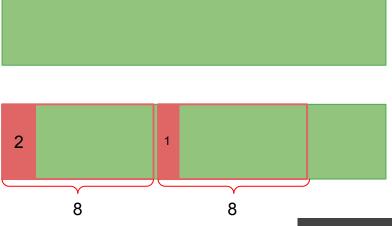


I have free spaces, but I need to extend the heap

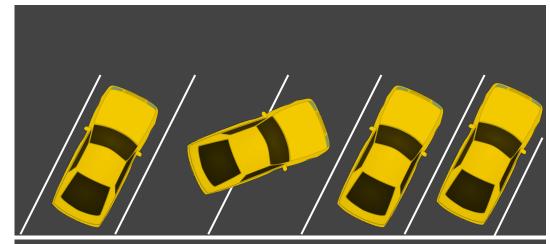


Fragmentation

Internal fragmentation



I allocate a large chunk for a small size



External:

External Fragmentation = 1 - LargestAllocableBlock / TotalFreeMemory

Most allocations can be done with chunks in bins.

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External:

External Fragmentation = 1 - LargestAllocableBlock / TotalFreeMemory

Most allocations can be done with chunks in bins.

Internal:

Internal Fragmentation = 1 - AccessedBytes / TotalAllocatedBytes

Avoid useless or underused allocations.

External Fragmentation = 1 - LargestAllocableBlock / TotalFreeMemory

mallinfo(3)

mallinfo service A:

Total bytes (arena): 244 355 072

Total in-use allocations: 31 650 352

Total free space: 212 704 720

Largest allocable block: 63 248

External Fragmentation = 0.9997

External Fragmentation = 1 - LargestAllocableBlock / TotalFreeMemory

mallinfo(3)

mallinfo service A: mallinfo service B:

Total bytes (arena): 244 355 072 Total bytes (arena): 33 292 288

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Total in-use allocations:

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Largest allocable block:

120 928

External Fragmentation = 0.9997 External Fragmentation = 0.9593

1 day - 400MB

7 day - 200MB

Internal Fragmentation = 1 - AccessedBytes / TotalAllocatedBytes

Valgrind --tool=dhat

Zero-access

Total: 1, 548, 632, 872 bytes Reads: 0 bytes Writes: 0 bytes

Low-access

Total: 3, 638, 211, 632 bytes Reads: 886, 064 bytes Writes: 86, 202, 504 bytes

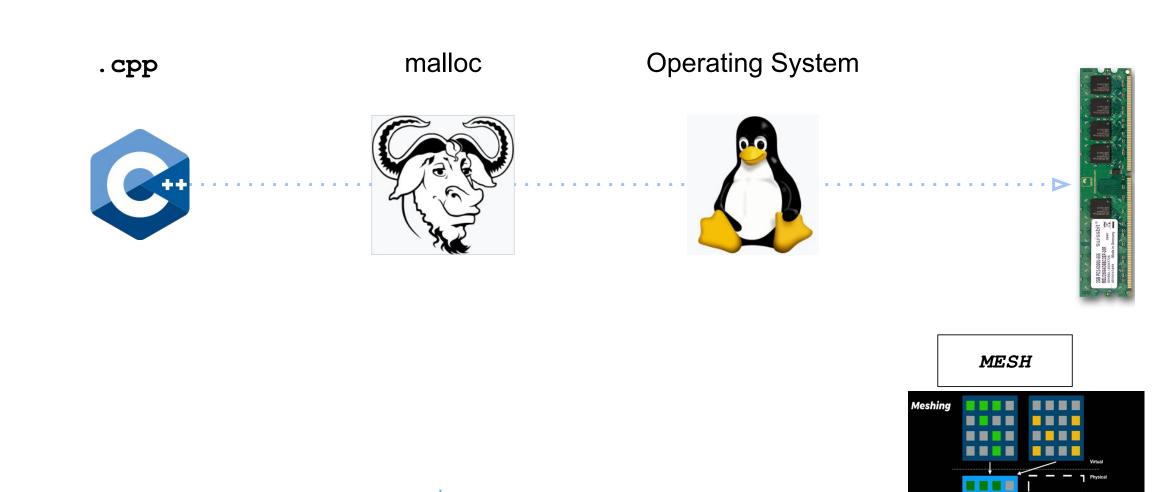
. cpp malloc Operating System

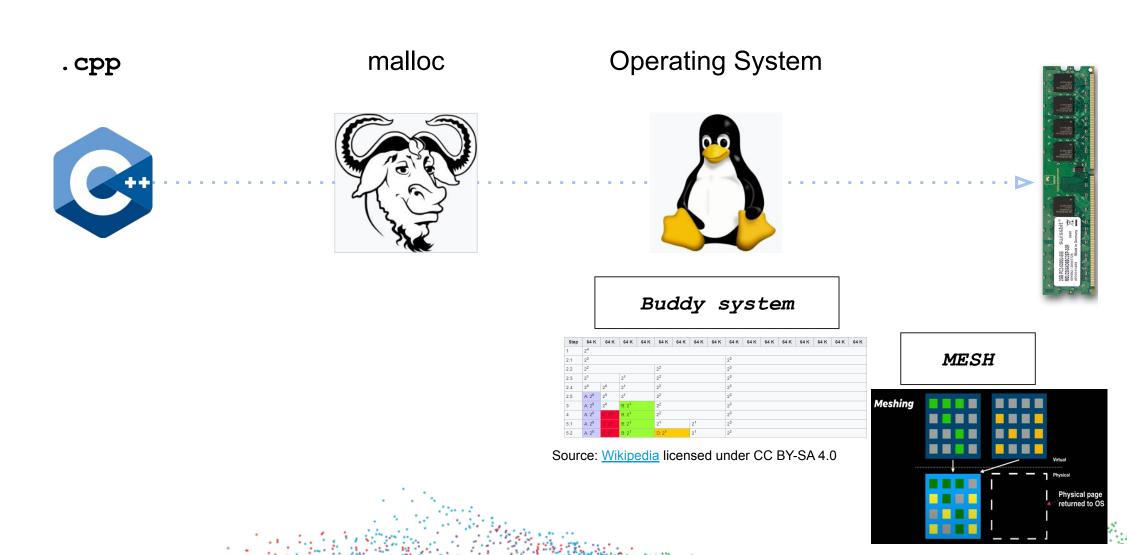












Malloc Tunable Parameters

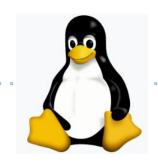
.cpp



Operating System

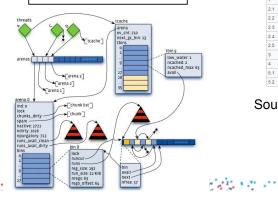






Buddy system

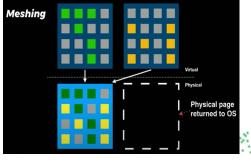






Source: Wikipedia licensed under CC BY-SA 4.0





Malloc Tunable Parameters

.cpp



Operating System



With Local Allocators

2.0

Degradation Ratio (DR)





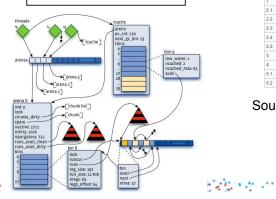
local allocators

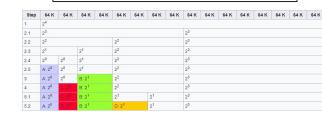
System Size = 221

Physical Locality

Max Temporal



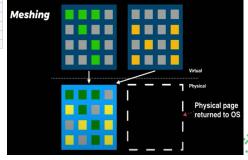




Buddy system

Source: Wikipedia licensed under CC BY-SA 4.0

MESH

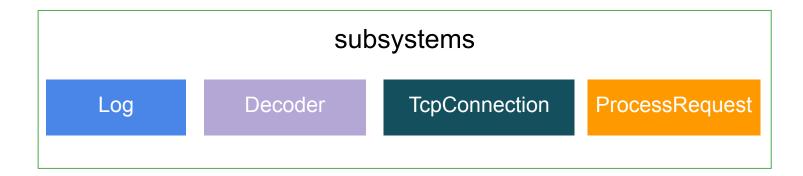


John Lakos "Local(Arena) memory allocators" - CppCon 2017

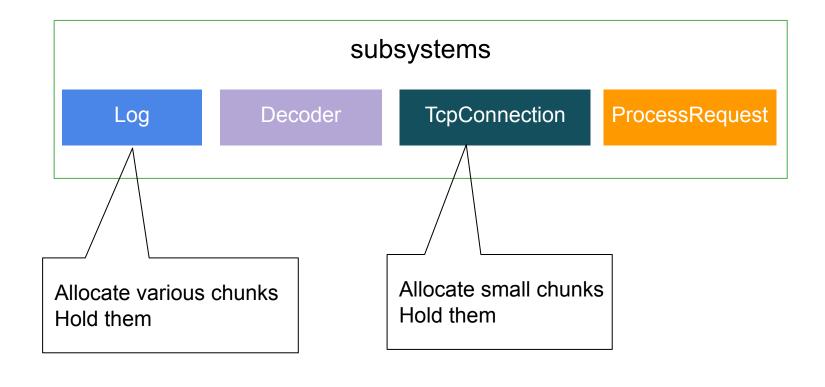
Source: scalable-memory-allocation-using-jemalloc

Long-running stateless system

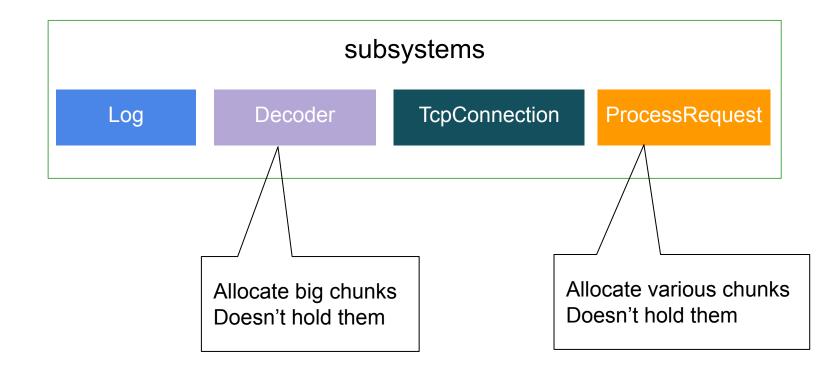
- start and run for a long time
- receive requests and process them, no state



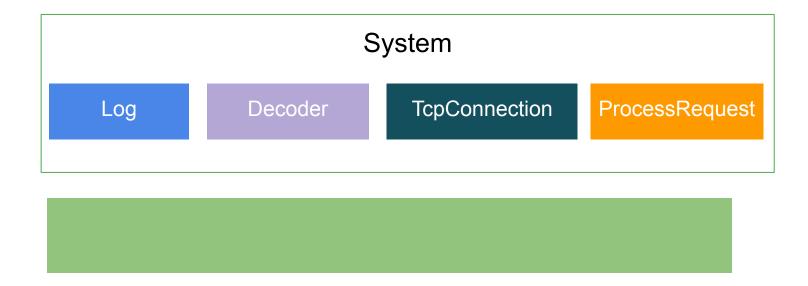




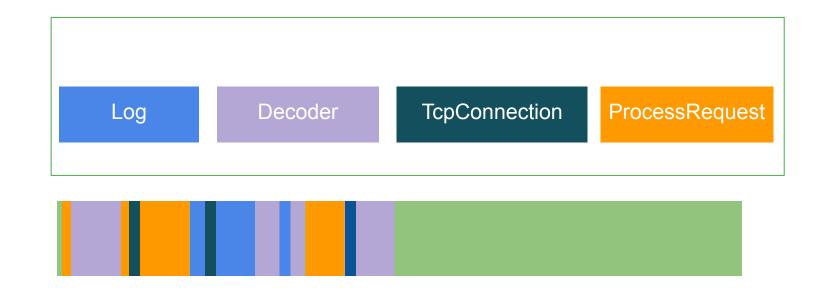




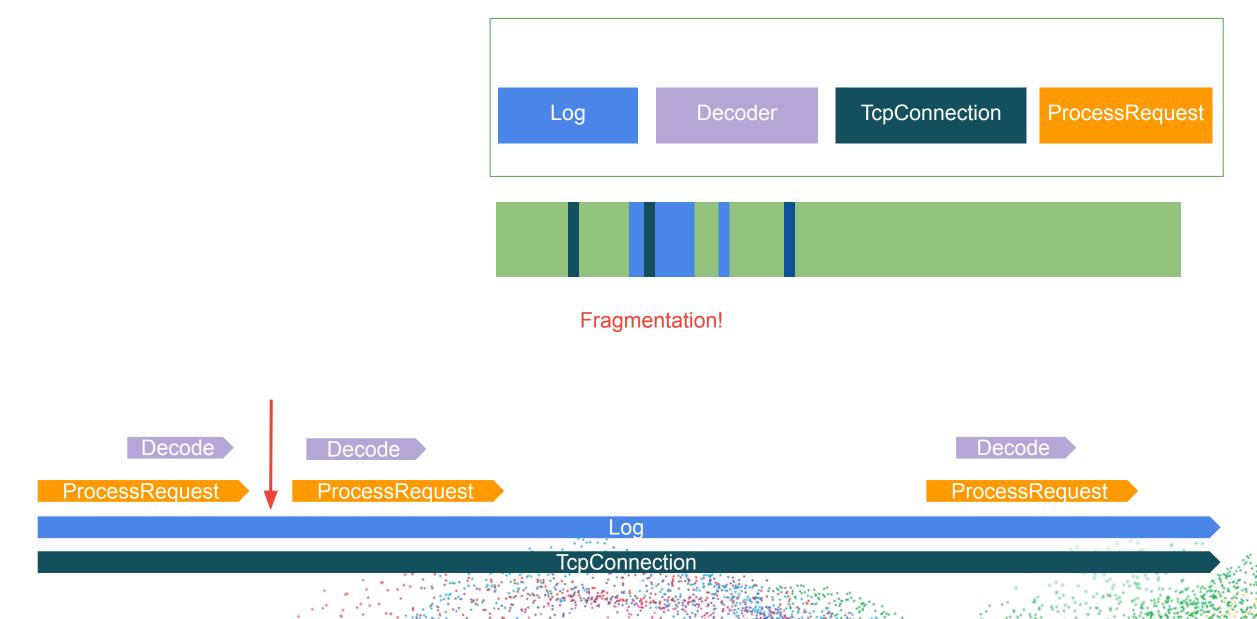


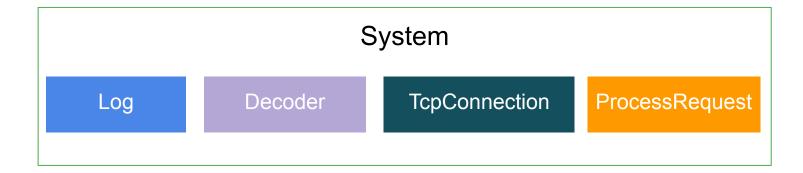


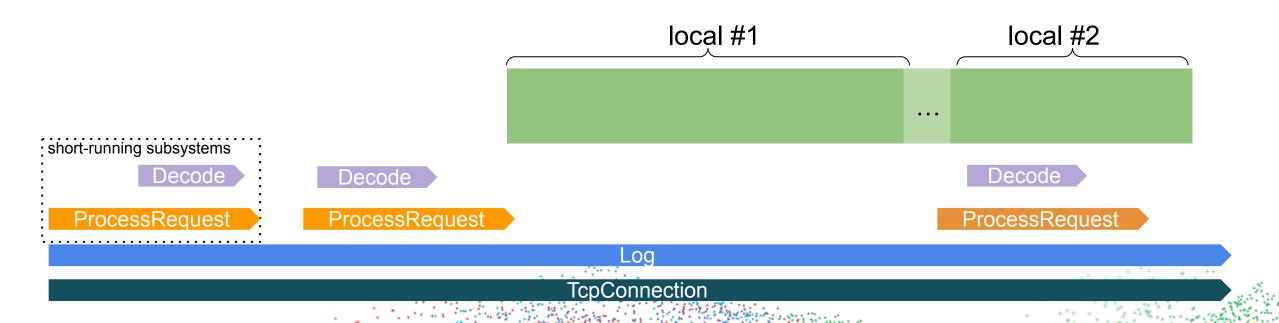


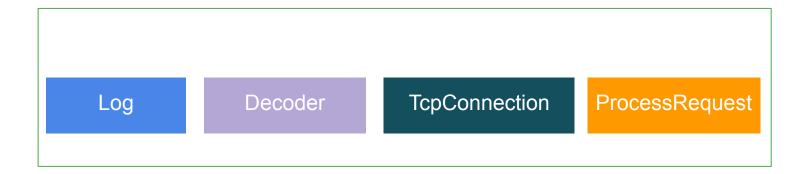


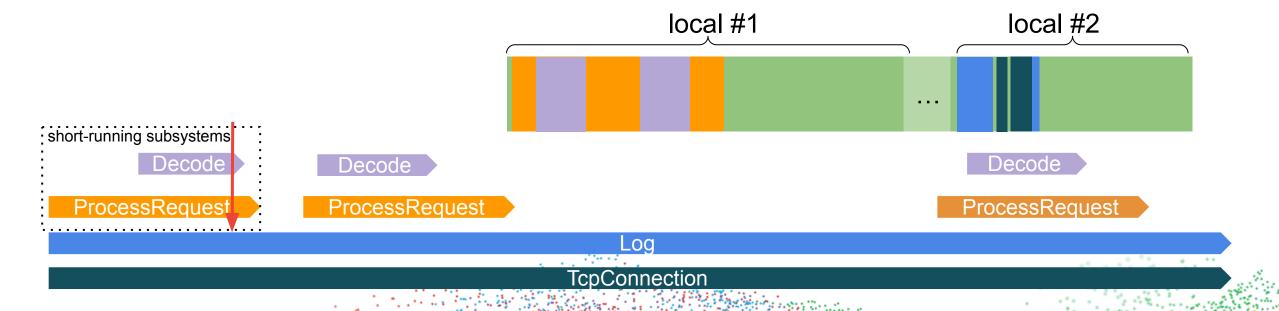


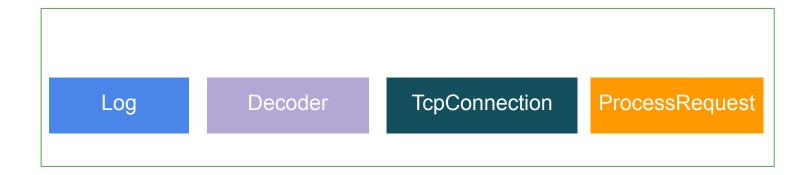


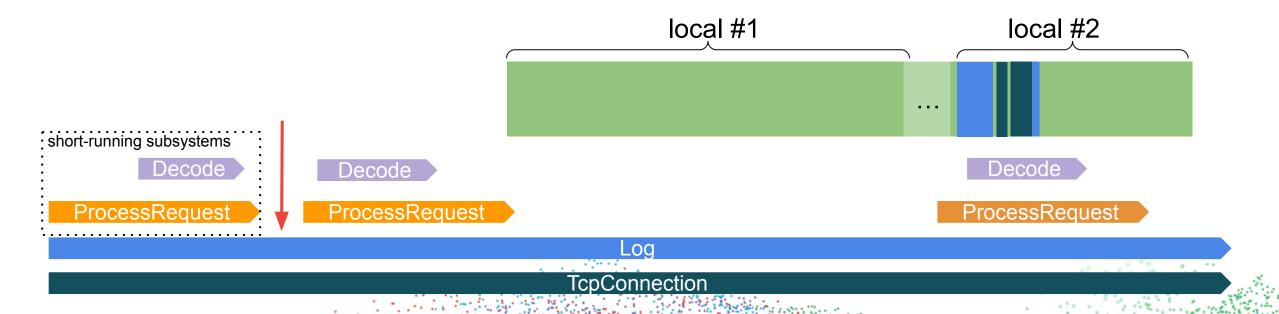


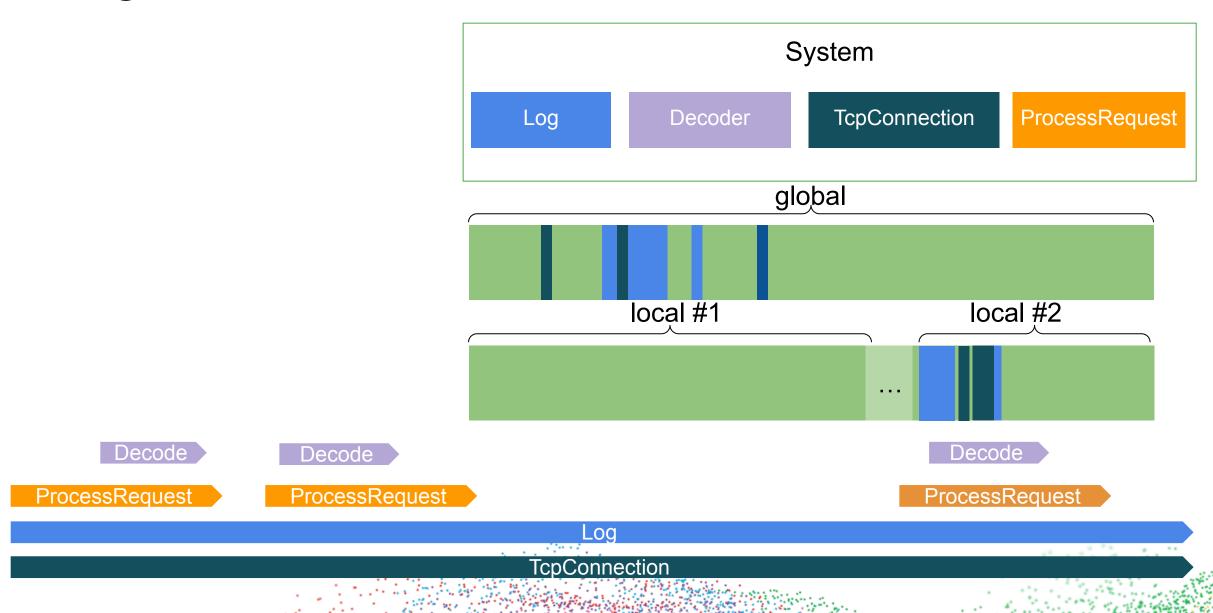




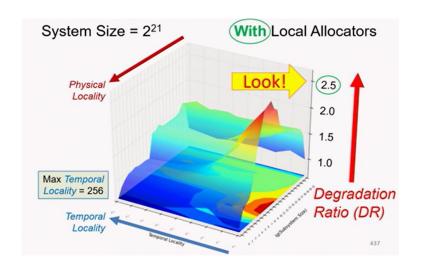


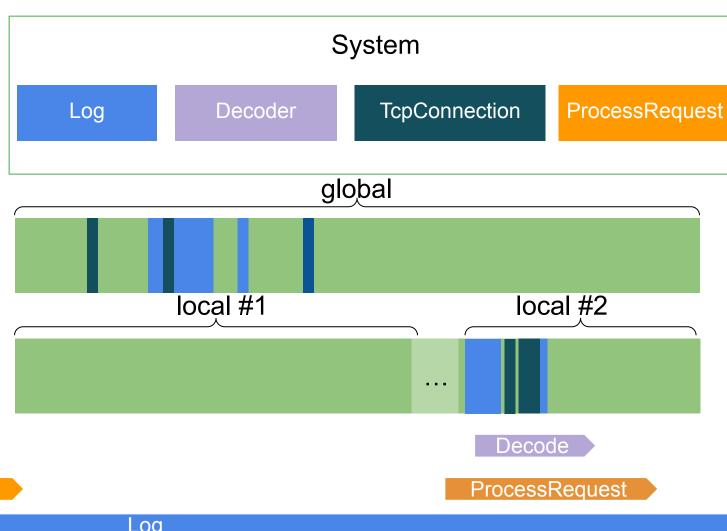






locality





Decode

Decode

ProcessRequest

ProcessRequest

TcpConnection

Using local allocator

```
void execution(int request_number,
               bslma::Allocator* allocatorL,
               bslma::Allocator* allocatorS){
    Subsystem longLiveSubsystem(allocatorL);
    Subsystem shortLiveSubsystem(allocatorS);
    for(int i = 1; i<=request_number; ++i){</pre>
        longLiveSubsystem.allocate();
        shortLiveSubsystem.allocate();
        longLiveSubsystem.allocate();
        shortLiveSubsystem.allocate();
        longLiveSubsystem.allocate();
        shortLiveSubsystem.allocate();
        shortLiveSubsystem.deallocate();
```

```
cout<< "global allocator" <<endl;
execution(request_number, 0, 0);</pre>
```

```
cout<< "local allocator" <<endl;
bdlma::SequentialAllocator bsa_s;
bdlma::SequentialAllocator bsa_l;
execution(request_number, &bsa_l, &bsa_s);</pre>
```

Using local allocator

global allocator

Total non-mmapped bytes: 89 346 048

Total allocated space : 8 224

Total free space : **89 337 824**

LargestAllocableBlock 48

Free chunks 2 789 300

local allocator

Total non-mmapped bytes : 135 168

Total allocated space : 8 224

Total free space : 126 944

LargestAllocableBlock 126 944

Free chunks

External Fragmentation = 0.99999946

Elapsed(ms) = 5049

External Fragmentation = 0

Elapsed(ms) = 4026

Additional Reading

glibc's malloc

- 2. Tech talks:
 - a. C++ allocators: Local(Arena) memory allocators John Lakos CppCon 2017
 - b. What Programmers Should Know About Memory Allocation S. Al Bahra, H. Sowa, P. Khuong CppCon 2019
 - c. Emery Berger "Mesh: Automatically Compacting Your C++ Application's Memory"- CppCon 2019
 - d. Getting Allocators out of Our Way Alisdair Meredith & Pablo Halpern CppCon 2019



Thank you!

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