Effective Software

Lecture 11: JVM - Object Allocation, Bloom Filters, References, Effective Caching

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- [1] Tarkoma, S., Esteve, R., Lagerspetz, E.: Theory and Practice of Bloom Filters for Distributed Systems. IEEE Communications Surveys and Tutorials, issue 3, vol. 14, 2012.
- [2] Oaks, S.: Java Performance: 2nd Edition. O'Reilly, USA 2020.
- [3] JVM source code http://openjdk.java.net

Outline

- » Object allocation
 - Threat-local allocation buffer
 - NUMA alignment
 - Escape analysis
- » Bloom filters
 - Extensions
 - Counting bloom filter
 - Bitwise bloom filter
- » Reference objects
 - Weak, Soft, Final, Phantom
 - Reachability of objects

Fast Object Allocation

- » based on bump-the-pointer technique
 - track previously allocated object
 - fit new object into remainder of empty space
- » thread-local allocation buffers (TLABs)
 - each thread has small exclusive area (few % of Eden in total) aligned NUMA
 - remove concurrency bottleneck
 - no synchronization among threads (remove slower atomics)
 - remove false sharing (cache line used just by one CPU core)
 - exclusive allocation takes about few native instructions
 - infrequent full TLABs implies synchronization (based on lock inc)
 - thread-based adaptive resizing of TLAB
 - not working well for thread pools with varying allocation pressure
- » tuning options
 - -XX:+UseTLAB; -XX:AllocatePrefetchStyle=1; -XX:+PrintTLAB
 - -XX:AllocateInstancePrefetchLines=1; -XX:AllocatePrefetchLines=3
 - -XX:+ResizeTLAB; -XX:TLABSize=10k; -XX:MinTLABSize=2k

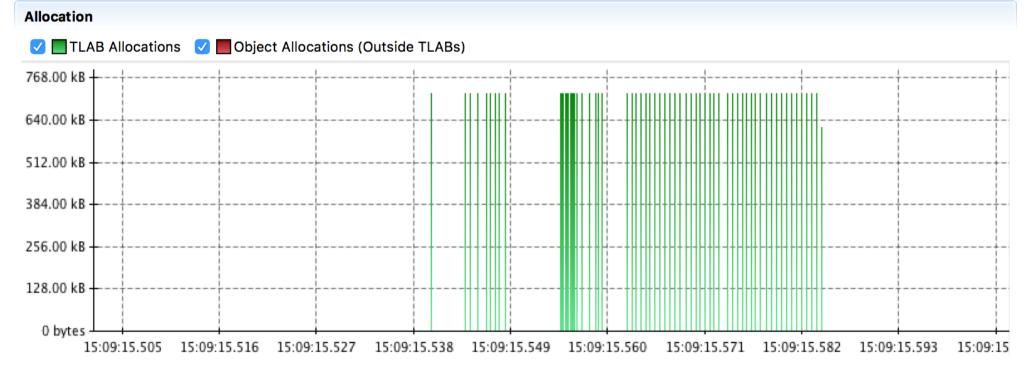
Fast Object Allocation - Example

```
class Structure {
     C2 compiler, standard OOP, size 96 Bytes:
                                                                       private boolean boolean1;
                                                                       private byte byte1;
                                read TLAB allocation pointer
      0x60(%r15),%r11 ----
mov
                                                                       private char char1:
      %r11,%r10
mov
                                                                       private short short1;
                                bump the pointer
      $0x60,%r10
add
                                                                       private int int1;
      0x70(\%r15).\%r10
cmp
                                                                       private long long1;
                                fits into TLAB check
      0x0000000107895244
iae
                                                                       private float float1;
                                store TLAB allocation pointer
                                                                       private double double1;
      %r10,0x60(%r15)
mov
                                prefetch 3 cache lines ahead
                                                                       private Object object1:
prefetchnta 0xc0(%r10)
                                                                       private boolean boolean2;
      %r11,%rdi
mov
                                prepare for object nulling
                                                                       private byte byte2;
      $0x10,%rdi
add
                                                                       private char char2;
                                RDI object data; ECX=10 qwords
      $0xa,%ecx
mov
                                                                       private short short2;
movabs $0x220558080,%r10
                             {metadata('Structure')}
                                                                       private int int2;
      0xa8(%r10), %r8
mov
                                                                       private long long2;
      %r8,(%r11)
                                                                       private float float2;
mov
                                                                       private double double2;
      %r10,0x8(%r11)
                                fill object header
mov
                                                                       private Object object2;
      %rax,%rax
xor
                                null instance
      $0x3,%rcx
shl
                                                                       Structure(int value, Object r
rep rex.W stos %al, %es:(%rdi) ;*new
                         ; - StructureTest::allocate@4 (line 5)
                                                                       @Override
                                                                       public String toString() {...
      8B - mark word
    4B / 8B – Klass ref.
                                                       Note: all examples are in JVM 8 64-bit,
       ... object data
                                                       Intel Haswell CPU, AT&T syntax
```

Flight Recording to Analyze TLAB

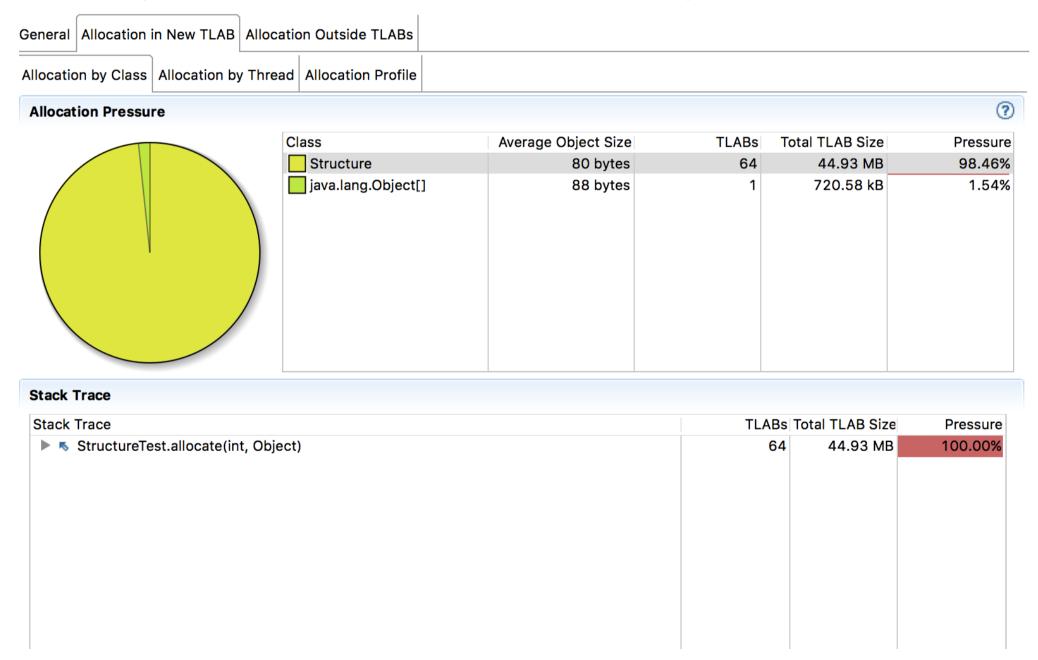
example with million of allocations of Structure, compressed OOP used

General Allocation in New TLAB Allo	ocation Outside TLABs						
Thread Local Allocation Buffer (TL	AB) Statistics	Statistics for Object Allocations (Outside TLABs)					
TLAB Count	65	Object Count	0				
Maximum TLAB Size	720.58 kB	Maximum Object Size	N/A				
Minimum TLAB Size	615.77 kB	Minimum Object Size	N/A				
Average TLAB Size	718.96 kB	Average Object Size	N/A				
Total Memory Allocated for TLABs	45.64 MB	Total Memory Allocated for Objects	N/A				
Allocation Rate for TLABs	439.59 MB/s	Allocation Rate for Objects	N/A				



Flight Recording to Analyze TLAB

example with million of allocations of Structure; compressed OOP used



Example – Dynamic Memory Analysis

?8

Example – Dynamic Memory Analysis

```
public static String[] method1(String[] args) {
    return Arrays.stream(args).
        filter(t -> t.matches( regex: "[^0-9]+")).
        sorted(Comparator.<String,String>comparing(String::toLowerCase).reversed()).
        collect(Collectors.toList()).toArray(new String[0]);
}
```

allocations when called with 40 elements (27 without digits):

a method	1(*		Method				▼ Objects	S	ize	Objects	(Own)	Size (Ow
Lambda. <mark>m</mark>	1ethod 1 (String	g[]) Lambda.java					1,486 99 %	101,944	99 %		1	
Classes	Packages	Object Explorer	Generations	Ages	Reachability	Class Loaders	Web Applic	ations	Callees L	ist	Merged Call	lees J
	,	,							J			
Class list	for objects se	elected in the upper ta	ıble									
ir q		Class						Object	ts Shall	ow Size	▼ Retained Size	
c int[]								167 11	12,64	3 12 %	12,648	12 %
c byte[]								57 4	12,13	5 12 %	12,136	12 %
char[]								179 12	10,92	3 11 %	10,928	11 %
🖸 boolean[]								40 3	% 10,88) 11 %	10,880	11 %
🖸 jdk.interr	nal.org.objectv	veb.asm.Item						180 12	10,08) 10 %	10,080	10 %
🖸 jdk.interr	nal.org.objectv	veb.asm.Item[]						7 0	% 7,28	7 %	7,280	7 %
🖸 java.lang	.Class							7 0	% 3,96	8 4%	3,968	4 %
🖸 jdk.interr	nal.org.objectv	veb.asm.MethodWrite	r					15 1	% 3,36	3 %	3,360	3 %
🖸 java.util.r	regex.Pattern							40 3	2,88		2,880	3 %
🖸 java.lang	~							113 8	2,71	2 3%	_,	3 %
🖸 java.util.r	regex.Matcher							40 3	% 2,56	3 %	2,560	3 %
_	regex.Pattern\$	•							% 2,24		•	2 %
	regex.Pattern\$								% 1,28		•	1 %
	.invoke.Metho	dType							% 1,20		,	1 %
java.lang									% 1,20		,	1 %
-		veb.asm.ClassWriter							% 1,17		, -	1 %
	.invoke.Membe								% 84		,	1 %
🚺 iava land	invoke Metho	dTvne\$ConcurrentWe	ak InternSet \$Weak	Fntrv				30 2	% 96	1 %	960	1 %

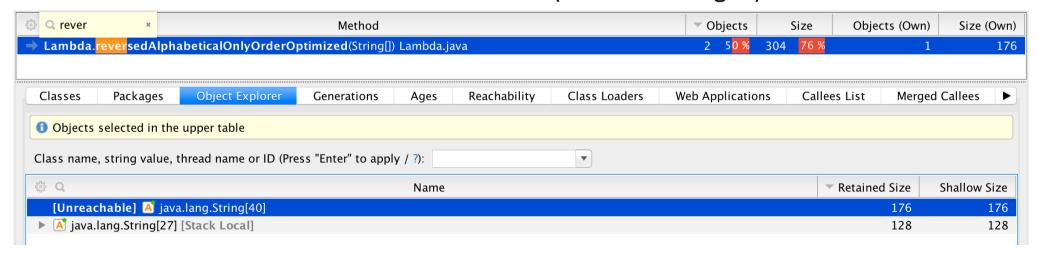
Example – Optimized – Dynamic Memory Analysis

```
private static Comparator<String> reverseIgnoreCaseComparator = String.CASE_INSENSITIVE_ORDER.reversed();
public static String[] reversedAlphabeticalOnlyOrderOptimized(String[] args) {
   String[] arr = new String[args.length];
   int i = 0:
   for (String arg : args) {
        boolean filterOut = false:
        for (int k = 0; k < arg.length(); k++) {
            char c = arg.charAt(k);
            if ((c >= '0') && (c <= '9')) {
                filterOut = true;
                break;
        if (!filterOut) arr[i++] = arg;
   Arrays.sort(arr, fromIndex: 0, i, reverseIgnoreCaseComparator);
    return Arrays.copyOf(arr, i);
```

Example – Optimized – Dynamic Memory Analysis

```
private static Comparator<String> reverseIgnoreCaseComparator = String.CASE INSENSITIVE ORDER.reversed();
public static String[] reversedAlphabeticalOnlvOrderOptimized(String[] args) {
   String[] arr = new String[args.length];
   int i = 0:
    for (String arg : args) {
        boolean filterOut = false:
        for (int k = 0; k < arg.length(); k++) {
            char c = arg.charAt(k);
            if ((c >= '0') \&\& (c <= '9')) {
                filterOut = true:
                break;
        if (!filterOut) arr[i++] = arg;
   Arrays.sort(arr, fromIndex: 0, i, reverseIgnoreCaseComparator);
    return Arrays.copyOf(arr, i);
```

allocations when called with 40 elements (27 without digits):



Know Your Application Behavior

- » simple code could be very inefficient know what you are using
- » a lot of small short-lived objects still slow down your application
 - allocations in TLAB are quite fast but not as fast as no allocation
 - check escape analysis or change your code
 - objects in TLAB fulfill cache data locality and are NUMA aligned
 - no false sharing between cores (data in cache line are just used by one CPU core)
 - increase pressure on young generation and thus minor GC
 - other objects are promoted earlier to old generation
 - increase number of major GC
- » a lot of long-lived objects slow your application even more
 - each time all live objects must be traversed
 - compacting GC must copy objects
 - breaks original data locality
 - can imply false sharing between cores

Escape Analysis - Not All Objects Are Allocated

- » **C2 compiler** perform **escape analysis** of new object *after inline of hot methods*
- » each new object allocation is classified into one of the following types:
 - **NoEscape** object does not escape method in which it is created
 - all its usages are inlined
 - never assigned to static or object field, just to local variables
 - at any point must be JIT-time determinable and not depending on any unpredictable control flow
 - if the object is an **array**, indexing into it must be JIT-time constant
 - ArgEscape object is passed as, or referenced from, an argument to a method but does not escape the current thread
 - *GlobalEscape* object is accessed by different method and thread
- » NoEscape objects are not allocated at all, but JIT does scalar replacement
 - object deconstructed into its constituent fields (stack allocated)
 - disappear automatically after stack frame pop (return from the method)
 - no GC impact at all + do not need track references (write comp. barrier)
- » ArgEscape objects are allocated on the heap, but all monitors are eliminated

Escape Analysis Example

```
public static class Vector {
   private final int a1, a2;
   public Vector(int a1, int a2) {
        this.a1 = a1;
       this.a2 = a2;
   public Vector add(Vector v) {
        return new Vector(a1+v.getA1(),a2+v.getA2());
   public int mul(Vector v) {
        return v.getA1()*a1 + v.getA2()*a2;
   public int getA1() {
        return al;
   public int getA2() {
        return a2;
public int compute(int val) {
    Vector v = new Vector(val+1, val*2);
    synchronized (v) {
        return v.add(v).mul(v);
```

Escape Analysis Example

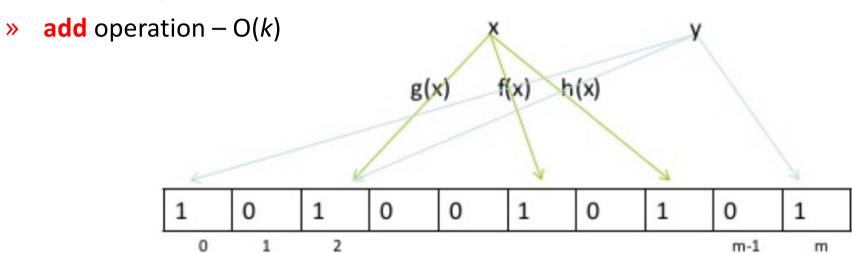
```
C2 compilation with inline:
                 22
                                 EscapeExample::compute (37 bytes)
                                    @ 10
                                          EscapeExample$Vector::<init> (15 bytes)
                                                                                 inline (hot)
                                     @ 1
                                           java.lang.Object::<init> (1 bytes)
                                                                             inline (hot)
sub
        $0x18,%rsp
                                    @ 20
                                          EscapeExample$Vector::add (26 bytes)
                                                                              inline (hot)
                                     @ 9
                                           EscapeExample$Vector::getA1 (5 bytes)
        %rbp,0x10(%rsp)
                                                                                accessor
mov
                                     @ 18
                                            EscapeExample$Vector::getA2 (5 bytes)
                                                                                 accessor
        %edx,%r11d
mov
                                     @ 22
                                            EscapeExample$Vector::<init> (15 bytes)
                                                                                  inline (hot)
         %edx,%r11d
add
                                                                               inline (hot)
                                             java.lang.Object::<init> (1 bytes)
                                                                              inline (hot)
                                          EscapeExample$Vector::mul (20 bytes)
                                    @ 24
        %edx,%r10d
mov
                                           EscapeExample$Vector::getA1 (5 bytes)
                                     @ 1
                                                                                accessor
shl
        %r10d
                                     @ 10
                                            EscapeExample$Vector::getA2 (5 bytes)
                                                                                 accessor
         %r10d,%r8d
mov
                                                     public int compute(int val) {
                                                        Vector v = new Vector(val+1, val*2);
add
         %r10d,%r8d
                                                        synchronized (v) {
imul
         %r10d,%r8d
                                                            return v.add(v).mul(v);
         $0x2,%r11d
add
inc
         %edx
                                         # this:
                                                        rsi:rsi
                                                                     = 'EscapeExample'
imul
         %r11d,%edx
                                         # parm0:
                                                        rdx
                                                                     = int
         %edx,%eax
mov
                                                                      (sp of caller)
                                                        [sp+0x20]
                                      no allocation at all, no synchronization
         %r8d,%eax
add
                                      all done out of stack in registers only
         $0x10,%rsp
add
         %rbp
pop
         %eax,-0x21742ec(%rip)
test
                                                                                       15
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reta
```

Bloom Filter

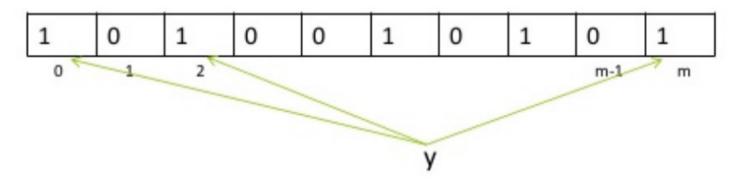
- » bloom filter operations
 - add a new object to the set
 - test whether a given object is a member of the set
 - **no deletion** is possible
- » strong memory reduction (few bits per element) compared to other collections
 - compensated by **small false positive** rate (usually 1%)
 - guaranteed no false negative
 - not storing elements (where all standard collections must store elements)
- » always constant complexity for add and test/query (even for collisions)
- » very useful in **big data** processing and other applications
 - used to test that the object is certainly not present
 - e.g., reduce a lot of I/O operations reading full collections in a particular file where bloom filters are kept in RAM or read quickly from disk

Bloom Filter

- » use bit array with a m bits
- » use *k* independent hash functions



» query operation



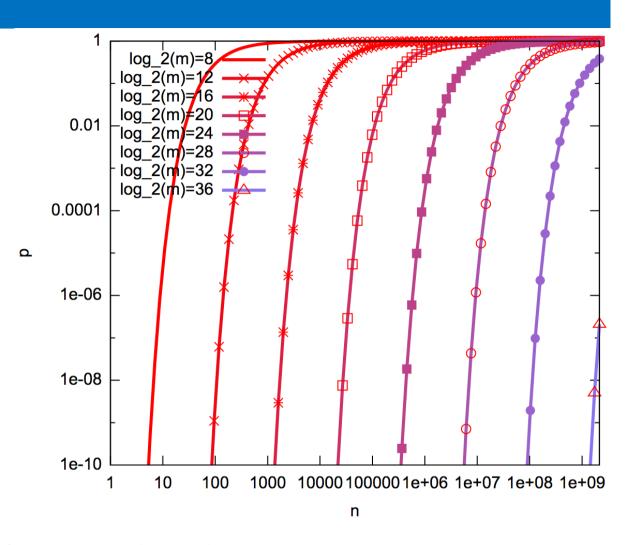
Bloom Filter

» number of bits in the filter

$$ceil\left(\frac{n \cdot \ln(p)}{\ln\left(\frac{1}{2^{\ln(2)}}\right)}\right)$$

» number of hash functions

$$round\left(\frac{\ln(2)\cdot m}{n}\right)$$

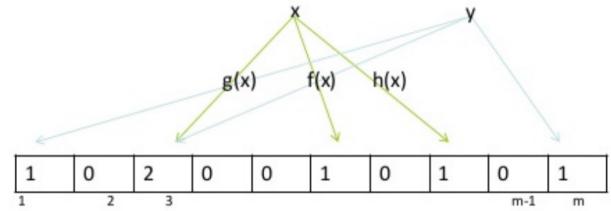


- » example store 1 million of Strings with total size 25 MB
 - Set<String> requires >50 MB retained size
 - Bloom Filter with FP rate 1% requires 1.13 MB and 7 hash functions
 - more than 44 times smaller and in 99% cases query is TP

Extensions of Bloom Filter

» counting bloom filter

• support **delete** and **count estimate** operation



- each position in filter is bucket (e.g., 3 bits) working as counter
 - add increment
 - delete decrement; count is min value
 - query test non-zero
- bucket overflow problem
 - no more increments when there is max counter value
 - increasing FN errors by deletions of elements

» bitwise bloom filter

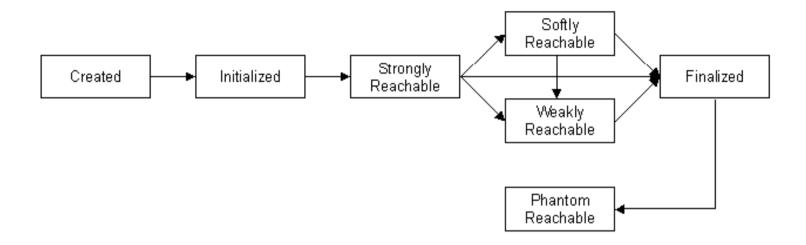
• multiple counting (dynamically added) filters to address issues above

SW - Lecture 11

Reference Objects

- » mortem hooks more flexible than finalization
- » reference types (ordered from strongest one):
 - {strong reference}
 - soft reference optional reference queue
 - weak reference optional reference queue
 - {final reference} mandatory reference queue
 - phantom references mandatory reference queue
- » can enqueue the reference object on a designated reference queue when GC finds its referent to be less reachable, referent is released
- » references are enqueued only if you have strong reference to REFERENCE
- » GC must run to pass them to Reference Handler to enqueue them into reference queue
 Reference Reference reference queue
- Reference is another instance on the heap – 48 Bytes for standard OOP, 64-bit JVM

Reachability of Object



- » strongly reachable from GC roots without any Reference object
- » softly reachable not strongly, but can be reached via soft reference
- » weakly reachable not strongly, not softly, but can be reached via weak reference; clear referent link and become eligible for finalization
- » eligible for finalization not strongly, not softly, not weakly and have nontrivial finalize method
- » phantom reachable not strongly, not softly, not weakly, already finalized or no finalize method, but can be reached via phantom reference
- » unreachable none of above; eligible for reclamation

Weak Reference

- » pre-finalization processing
- » usage:
 - do not retain this object because of this reference
 - don't own target, e.g., listeners
 - canonicalizing map e.g., ObjectOutputStream
 - implement **flexible version of finalization**:
 - prioritize
 - decide when to run finalization
- » get() returns
 - referent if not cleared
 - null, otherwise
- » referent is cleared by GC (cleared when passed to Reference Handler) and can be reclaimed
- » need copy referent to strong reference and check that it is not null before using it
- » WeakHashMap<K,V> uses weak keys; cleanup during all standard operations

Weak Reference – External Resource Clean-up

- » clean-up approach for ReferenceQueue<T>
 - own dedicated thread

- clean-up before creation of new objects
 - limited clean-up processing to mitigate long processing
 - use poll() non-blocking fetch of first

Custom Finalizer Example

```
public abstract class CustomFinalizer extends WeakReference<Object> {
    private static final ReferenceQueue<Object> referenceQueue = new ReferenceQueue<>();
    private static final CustomFinalizer circularEnd = new CustomFinalizer() {...};
    private CustomFinalizer next, prev;
    public CustomFinalizer(Object referent) {...}
   private CustomFinalizer() {...}
    private void executeCustomFinalize() {...}
    public abstract void customFinalize();
    static {
        Thread cleanupThread = new Thread(() -> {
            for (;;) {
                try {
                    CustomFinalizer toCleanup = (CustomFinalizer) referenceQueue.remove();
                    toCleanup.executeCustomFinalize();
                } catch (InterruptedException e) {
        }, name: "Custom finalizer");
        cleanupThread.setDaemon(true);
        cleanupThread.start();
```

Custom Finalizer Example

```
public CustomFinalizer(Object referent) {
    super(referent, referenceQueue);
    synchronized (circularEnd) {
        next = circularEnd.next;
        circularEnd.next.prev = this;
        prev = circularEnd;
        circularEnd.next = this;
    }
}

private void executeCustomFinalize() {
    if (next == null) return;
    synchronized (circularEnd) {
        prev.next = next;
        next.prev = prev;
    }
    next = prev = null;
    customFinalize();
}
```

» usage example, beware of implicit this strong reference in instance context

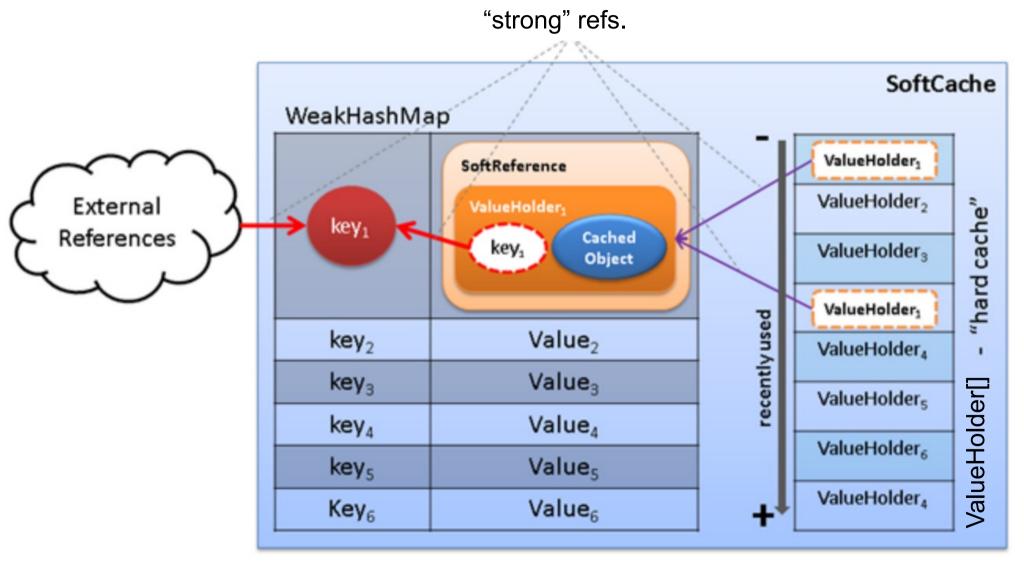
```
new CustomFinalizer(monitoredObjectForFinalization) {
    @Override
    public void customFinalize() {
        // custom finalization
    }
};
```

Soft Reference

- » pre-finalization processing
- » usage:
 - would like to keep referent, but can loose it
 - suitable for caches create strong reference to data to keep them
 - objects with long initialization
 - frequently used information
 - reclaim only if there is "memory pressure" based on heap usage
 - now timestamp > (SoftRefLRUPolicyMSPerMB * amountOfFreeMemoryInMB)
 -XX:SoftRefLRUPolicyMSPerMB=N (default 1000)
 - all are cleared before OutOfMemoryError
- » get() returns:
 - referent if not cleared; null, otherwise
 - updates timestamp of usage (can keep recently used longer)
- » referent is cleared by GC (cleared when passed to Reference Handler) and can be reclaimed

Efficient Cache Example

efficient LRU tracking in combination with memory pressure for older

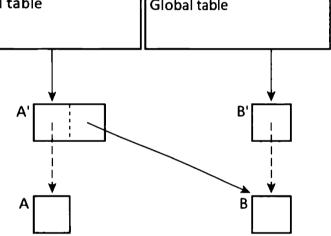


Final Reference – Object with Non-Trivial Finalize

- » finalize hook cannot be used directly (package limited)
- » instance allocation of object with non-trivial finalize method
 - slower allocation than standard objects
 - run time call of Finalizer.register with possible global safe point
 - not inlined, all references saved in stack with OopMap
 - allocates FinalReference instance and do synchronized tracking
- » referent is not cleared and reclaimed before finalization
 - all referenced objects cannot be reclaimed as well
- » only one Finalizer thread for all Final references of all types
 - call finalize method and clear referent
 - issue when finalize creates strong reference again
 - no priority control between multiple finalize methods
 - long running finalize delays all other finalization
 - daemon thread and JVM can terminate before finalization of all
- » finalized objects can be reclaimed during subsequent GC cycle

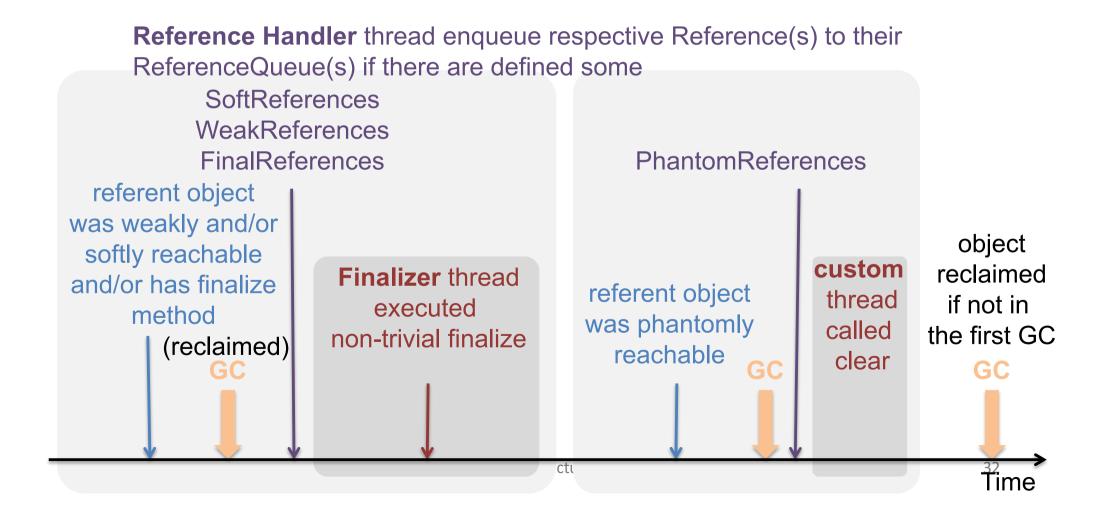
Phantom Reference

- » post-finalization processing, pre-mortem hook
- » usage:
 - notifies that the object is not used before its reclamation
 - used to guarantee given order of finalization of objects (not possible with Weak references)
 - A, B finalizable objects (e.g., Weakly)
 - A', B' PhantomReferences
- » get() returns:
 - null always
 - referent can be read using reflection
 - avoid making strong reference again
- » must specify reference queue for constructor (can be cleared)
- » referent is not cleared and reclaimed until all phantom references are not become unreachable or manually cleared using method clear()
 - » all referenced objects cannot be reclaimed as well



Reference Object

- » only one GC cycle needed to reclaim referent object if there is only soft or weak references to the same object
- » multiple GC cycles needed for referent objects having at least one final or phantom reference



Performance Cost for References

» creation cost

- allocation instance
- synchronization with tracking of Reference (strong references)
- » garbage collection cost (-XX:+PrintReferenceGC –XX:+PrintGCDetails)
 - tracking live not follow referents
 - construct list of live References each GC cycle
 - discovered field in Reference
 - per-reference traversal overhead regardless referent is collected or not
 - softly, weakly + finalizable, phantomly
 - Reference Object itself are subject for garbage collection

» enqueue cost

- reference handler enqueue with synchronization
- » reference queue processing cost
 - synchronized queue consumption

Reachability of Object

