Google^a Building Customized Dynamic Program Inspectors

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Profile, monitor, or inspect application binaries as they run

• Build customized dynamic program inspectors

Target production workloads

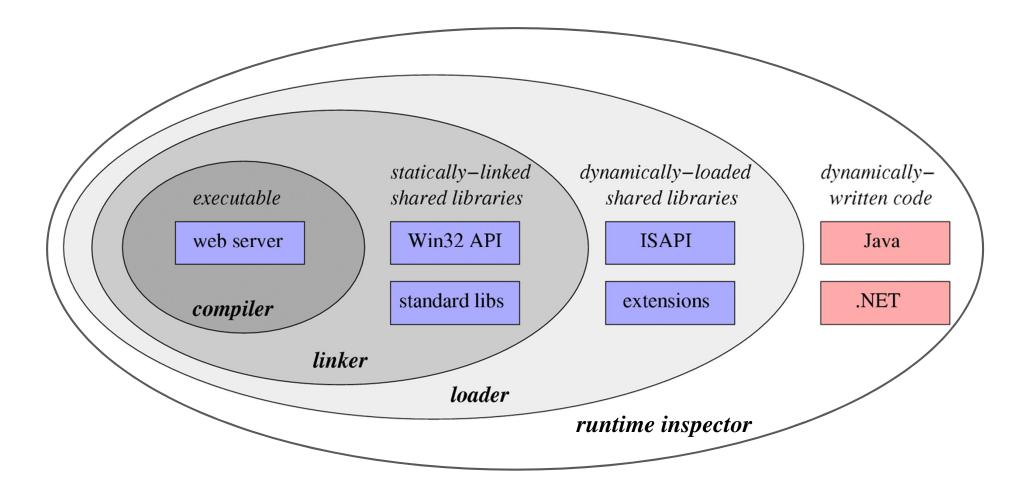
• Profile or inspect actual deployed application with no overhead when not in inspection mode

Target applications that include legacy components, thirdparty libraries, or dynamically-generated code

• Want to inspect whole program even if cannot recompile it all

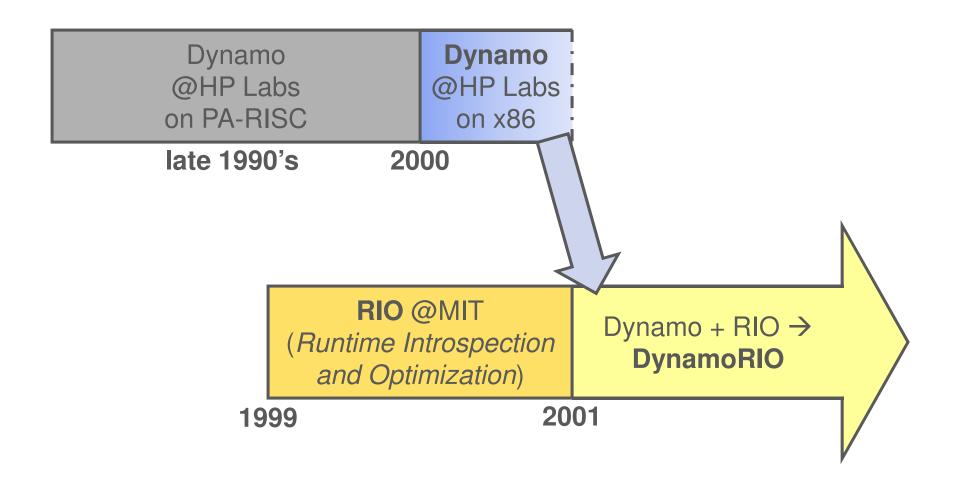
Reach of Toolchain Control Points





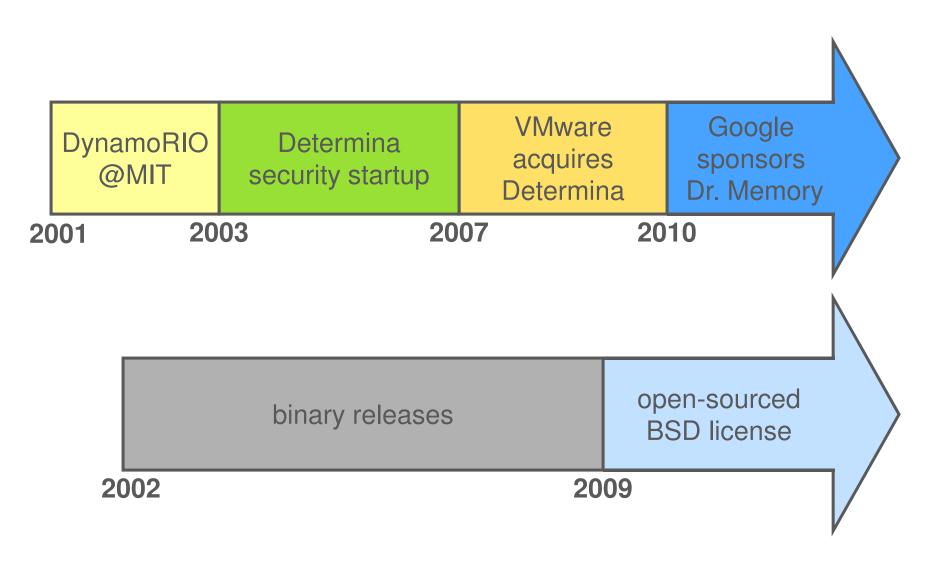
DynamoRIO





DynamoRIO History





DynamoRIO Tool Platform Design Goals

Google

Efficient

• Near-native performance

Transparent

Match native behavior

Comprehensive

• Control every instruction, in any application

Customizable

Adapt to satisfy disparate tool needs

Outline



Base System: DynamoRIO

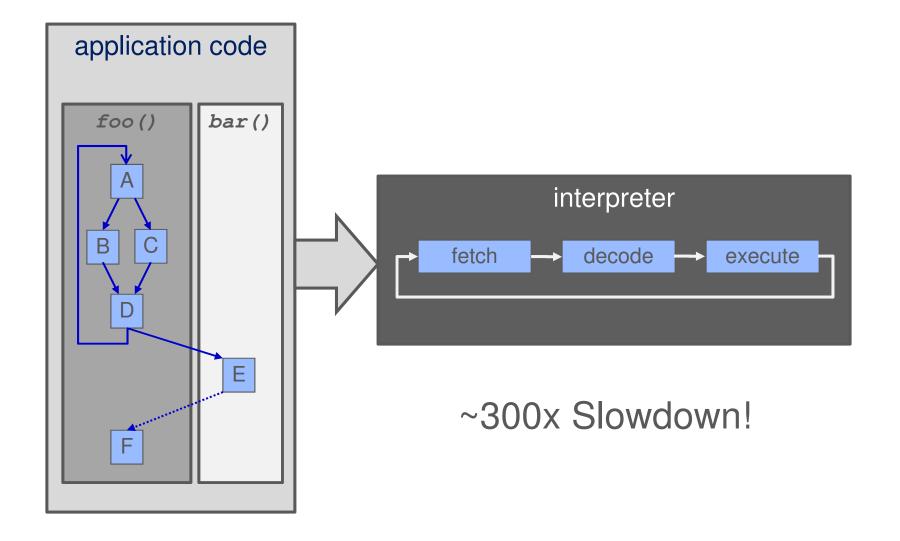
- Efficient
- Transparent
- Comprehensive
- Customizable

Dynamic Program Inspectors

- Examples and Possibilities
- Case studies

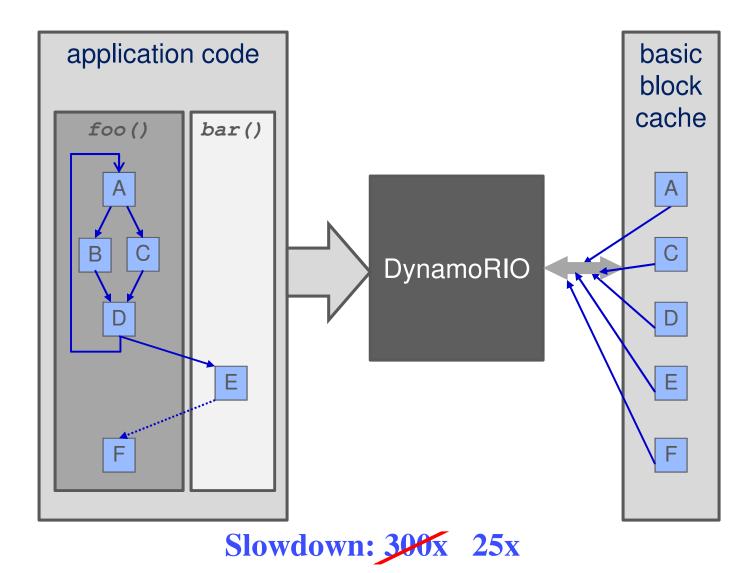
Basic Interpreter



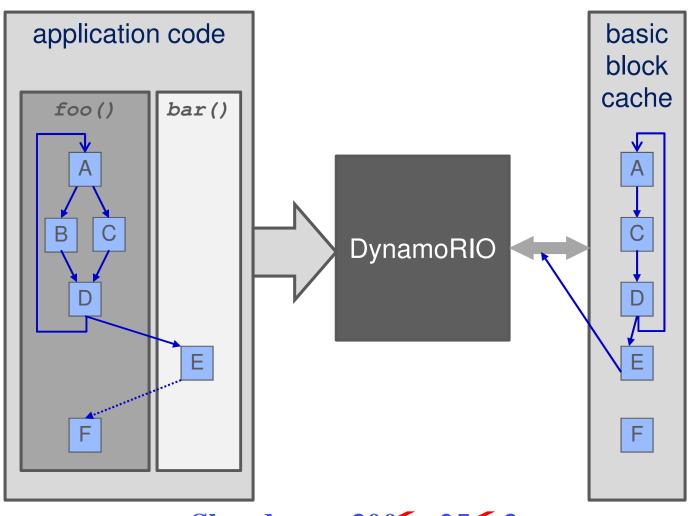


Improvement #1: Basic Block Cache



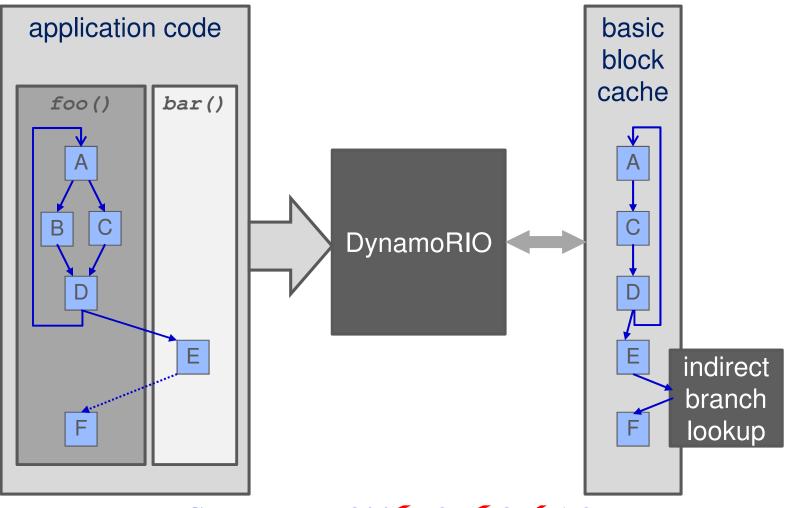


Improvement #2: Linking Direct Branches



Slowdown: 300x 25x 3x

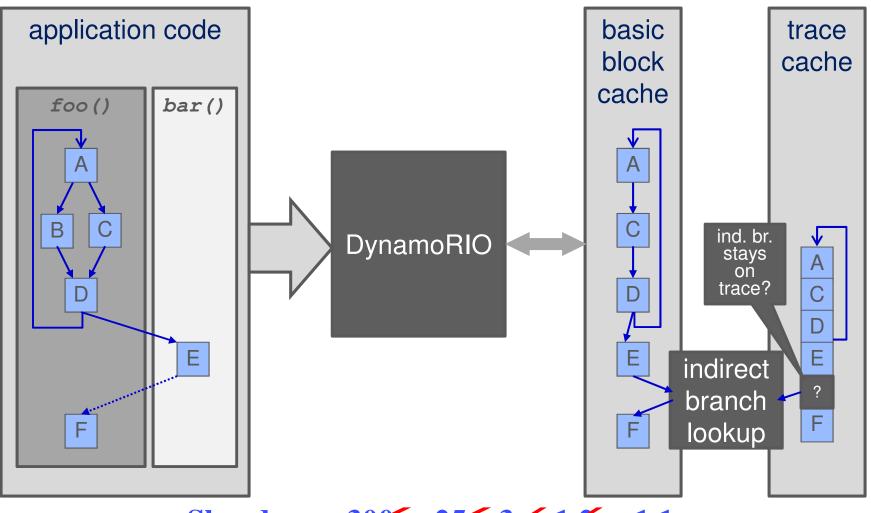
Improvement #3: Linking Indirect Branches Google



Slowdown: 300x 25x 3x 1.2x

Improvement #4: Trace Building

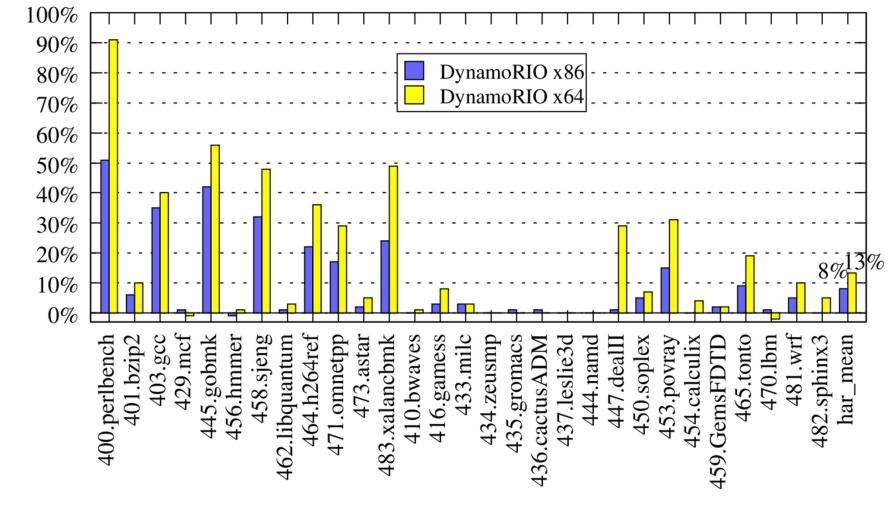




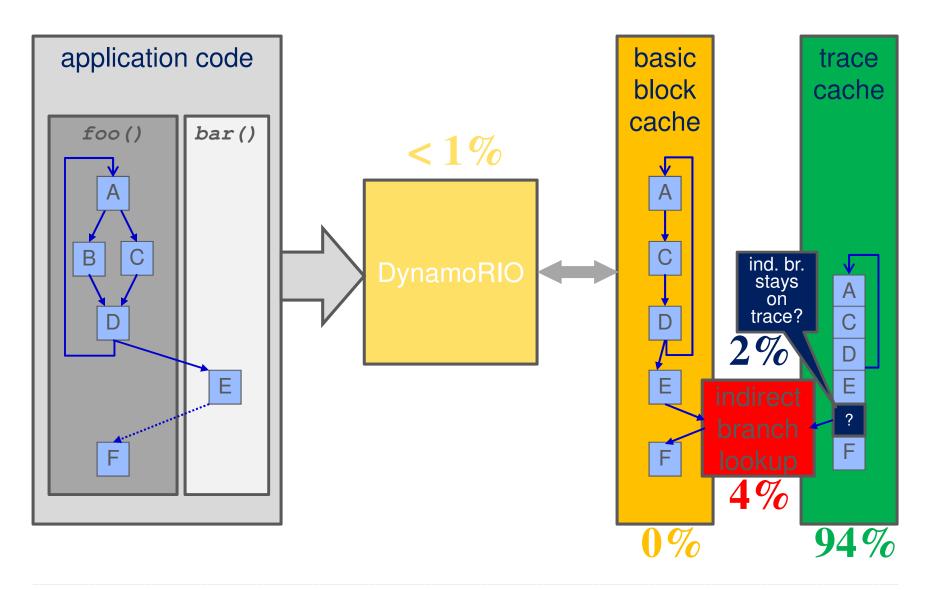
Slowdown: 300x 25x 3x 1.2x 1.1x

Base Performance: SPEC 2006

Time impact versus native



Time Breakdown for SPEC CPU INT Google



Outline



Base System: DynamoRIO

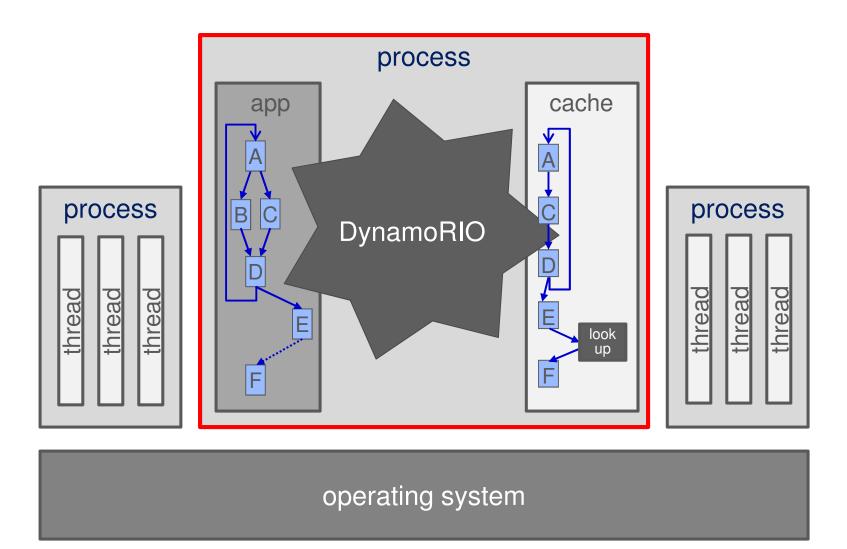
- Efficient
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Dynamic Program Inspectors

- Examples and Possibilities
- Case studies

Unavoidably Intrusive





Outline



Base System: DynamoRIO

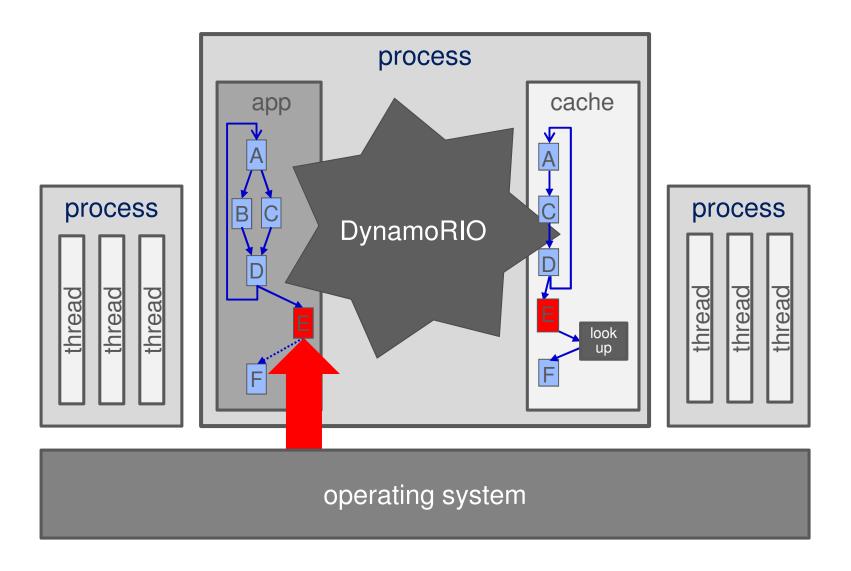
- Efficient
- Transparent
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Dynamic Program Inspectors

- Examples and Possibilities
- Case studies

Above the Operating System





Outline



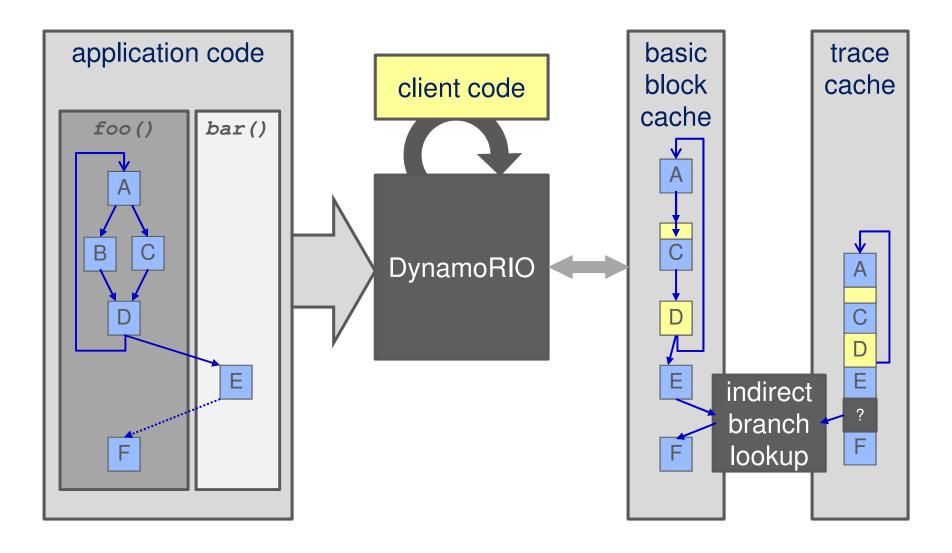
Base System: DynamoRIO

- Efficient
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Dynamic Program Inspectors

- Examples and Possibilities
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DynamoRIO + Client - Program Inspector Google





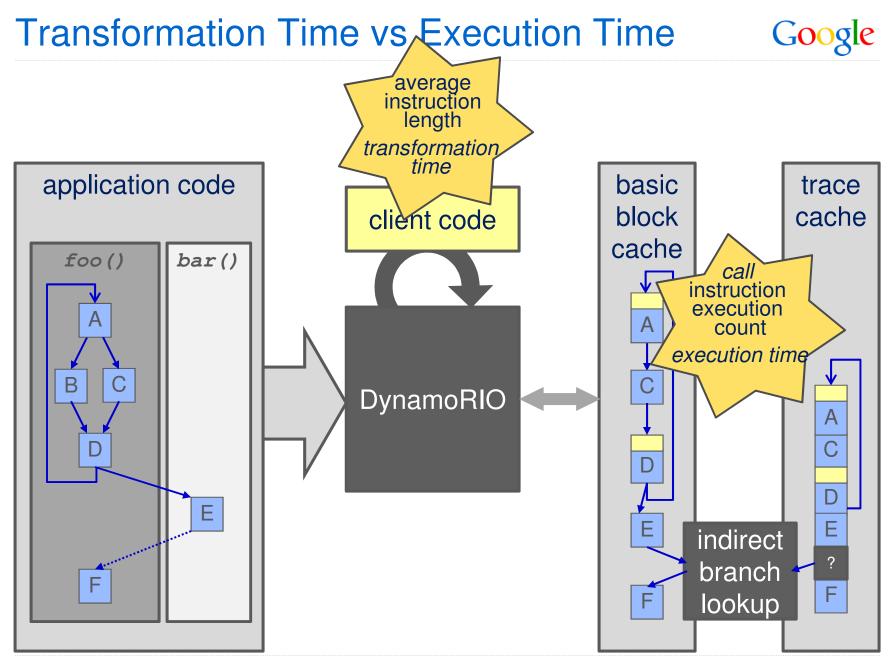
Client has opportunity to inspect and potentially modify every single application instruction, immediately before it executes

Entire application code stream

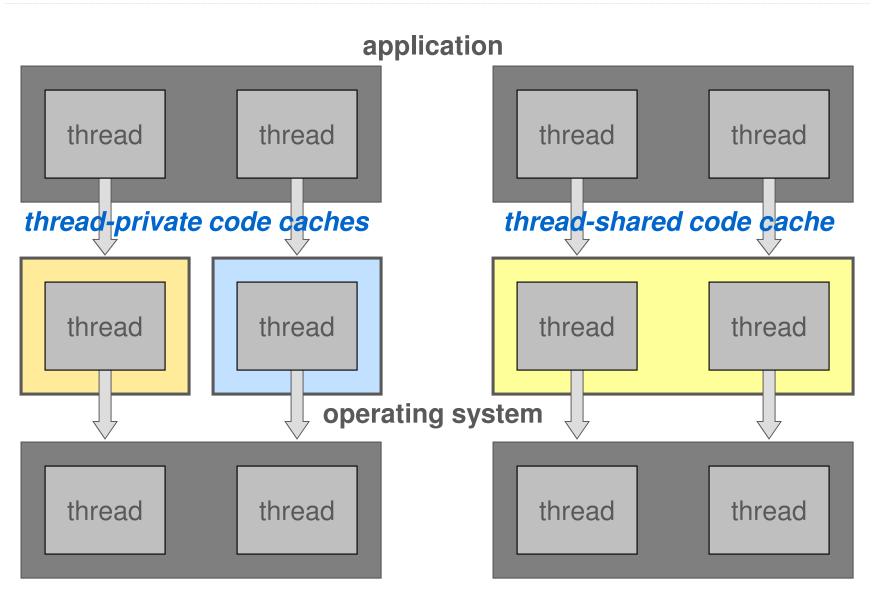
- Basic block creation event: can modify the block
- For comprehensive instrumentation tools

Or, focus on hot code only

- Trace creation event: can modify the trace
- Custom trace creation: can determine trace end condition
- For optimization and profiling tools



Code Cache Threading Models





Application thread creation and deletion

Application library load and unload

Application exception/signal

 Client chooses whether to deliver, suppress, bypass the app handler, or redirect control

Application pre- and post- system call

• Client can inspect/modify call number, params, or return value

Bookkeeping: init, exit, cache management, etc.

DynamoRIO API: General Utilities



Safe utilities for maintaining transparency

- Separate stack, memory allocation, file I/O
- Thread-local storage, synchronization
- Create client-only thread or private itimer

Application control

• Suspend and resume all other threads

Application inspection

- Address space querying
- Module iterator
- Processor feature identification

DynamoRIO API: Code Manipulation



Clean calls to C or C++ code

• Automatically inlined for simple callees

Full IA-32/AMD64 instruction representation

· Includes implicit operands, decoding, encoding

State preservation

- Eflags, arith flags, floating-point state, MMX/SSE state
- Spill slots, TLS, CLS

Dynamic instrumentation

• Replace code in the code cache

Google[®] DynamoRIO

Powerpoint Under Inspector



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Outline



Base System: DynamoRIO

- Efficient
- Transparent
- Comprehensive
- Customizable

Dynamic Program Inspectors

- Examples and Possibilities
- Case studies
 - Program shepherding
 - Dr. Memory

Examples and Possibilities



Code Inspection

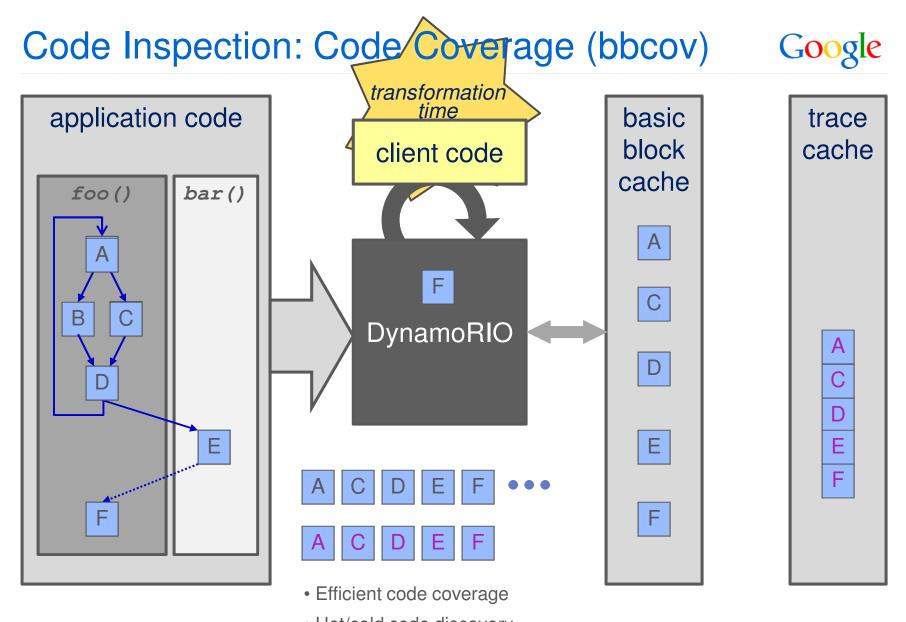
- Code coverage
- Path profiling

Data Inspection

Heap overflow detection

Concurrency Inspection

Cache contention detection



- Hot/cold code discovery
- Cold start optimization

Code Inspection: Code Coverage (bbcov)

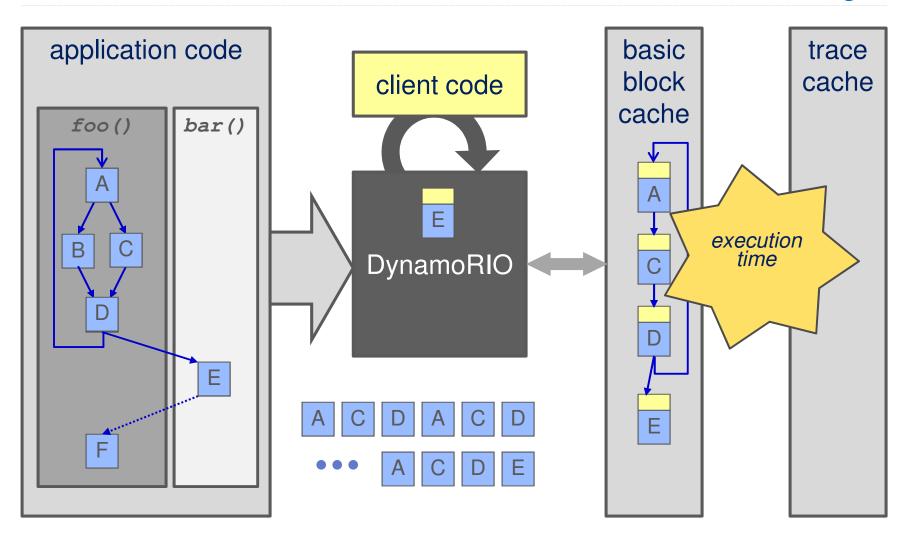
```
void dr_init(client_id_t id)
{ ...
    dr_register_bb_event(event_basic_block);
    ...
    if (dr_using_all_private_caches())
        bbcov_per_thread = true;
}
```

{

dr_emit_flags_t event_basic_block(void *dc, void *tag, instrlist_t *bb, bool trace, bool xl8)

```
...
for (instr = instrlist_first(bb); instr != NULL; instr = instr_get_next(instr)) { ... }
...
bb_table_entry_add(dc, data, start_pc, cbr_tgt, (end_pc - start_pc), num_instrs, trace);
return DR_EMIT_DEFAULT;
}
```

Code Inspection: Path Profiling (bbbuf)



Code Inspection: Path Profiling (bbbuf)



Code Inspection



Profiling

- Instruction/edge/path/inter-procedural profiling
- Hot/cold code
- Control-flow/call graph

Debugging

- Execution recording
- Software breakpoint

Security

- Program shepherding
- Code de-obfuscation

Examples and Possibilities



Code Inspection

- Code coverage
- Path profiling

Data Inspection

Heap overflow detection

Concurrency Inspection

Cache contention detection

Data Inspection: Heap Overflow Detection Google

Catch heap underflow and overflow:



- Wrap allocation routines
 - Keep track of malloc chunks.
 - Insert *redzones* between application malloc chunks and put special value (pattern) like *0xf1fd* in the redzone.
- Instrumentation
 - Check value before every memory access: look for Oxf1fd.
 - If found, check whether address is in redzone.

Instrumentation

}

void pattern insert cmp ine ud2a(void *dc, instrlist t *ilist, instr t *app, opnd t ref, opnd t pattern)

```
instr t *label:
  app pc pc = instr get app pc(app);
  label = INSTR CREATE label(drcontext);
  /* cmp ref, pattern */
  PREXL8M(ilist, app, INSTR XL8
             (INSTR CREATE cmp(dc, ref, pattern), pc));
  /* ine label */
  PRE(ilist, app, INSTR CREATE jcc short
       (dc, OP_jne_short, opnd_create_instr(label)));
  /* illegal instr */
  PREXL8M(ilist, app, INSTR XL8(INSTR CREATE ud2a(dc), pc));
  /* label */
  PRE(ilist, app, label);
void dr init(client id t id)
{ ...
#ifdef LINUX
  dr register signal event(event signal);
#else
  dr register exception event(event exception);
#endif
```

0x0000084(%eax) \$0xf1fdf1fd cmp

<label> inz

ud2a

 $<|abe|> 0x1c(\%esp) \rightarrow \%eax$ *0x0000084(%eax)* → %edx mov %edx %edx test

\$0xf77e6ea2 iz



Data Inspection

Google

Profiling

- Memory tracing
 - Cache simulation, data layout/prefetch optimization, etc.
- System call tracing
- Heap state inspection

Debugging

- Memory bug detection
 - Uninit error, buffer overflow/underflow, memory leak, etc.
- Software watchpoint

Security

• Dynamic data-flow tracking (taint-trace)

Examples and Possibilities



Code Inspection

- Code coverage
- Path profiling

Data Inspection

Heap overflow detection

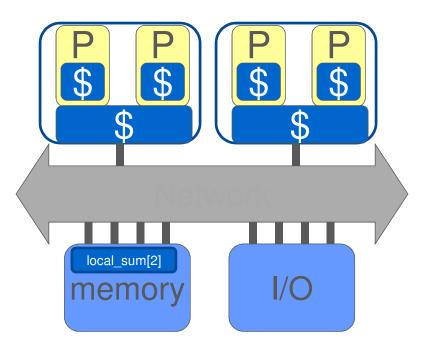
Concurrency Inspection

Cache contention detection

Concurrency Inspection: Cache Contention Google

Motivating example:

```
uint64 local_sum[2];
uint64 global_sum;
parallel_sum(int myid, int start, int end) {
  for (int i = start; i < end; i++)
      local_sum[myid] += buf[i];
      lock();
      global_sum += local_sum[myid];
      unlock();
}
```



Xeon X5460 @ 3.16GHz, 2x Quad core

# Threads	1	2		
		same core	distinct cores	
			min	max
Time(s): no padding	4.798	4.842	3.883	5.219

Hardware Performance Counter



Hardware limitation

• Limited events: must deduce from supported counter

Hardware specific

- Cache configuration, particular cache line size, cache size, etc.
- Thread-CPU binding

Flexibility

- Limited to sampling
- Hard to reconfigure

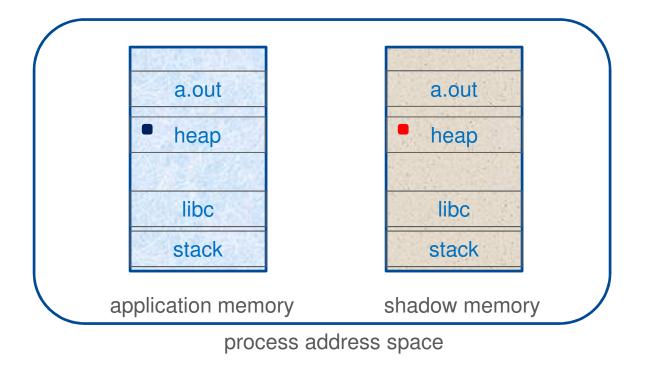
Software Shadow Memory



Store meta-data

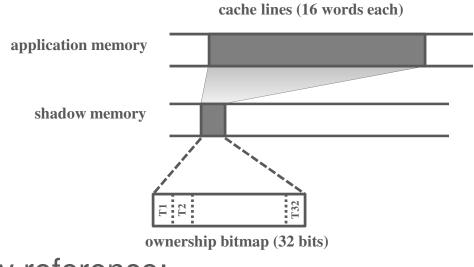
Track properties of application memory

Update via instrumented code





Cacheline mapped to thread ownership bitmap



Memory reference:

• Test and set thread bit (cache miss)

Memory write:

• Compare and set only own bit (cache invalidation)

Concurrency Inspection

Google

Profiling

- Cache contention
- False sharing
- Multi-thread communication

Debugging

- Data race detection
- Deterministic record and replay

Security

• Deterministic scheduling

Other Possible Applications



Performance

Cross-architectural performance estimation

Debugging

• Integration with debugger with reverse execution

Security

Sandboxing

Others

• Dynamic translation

Outline



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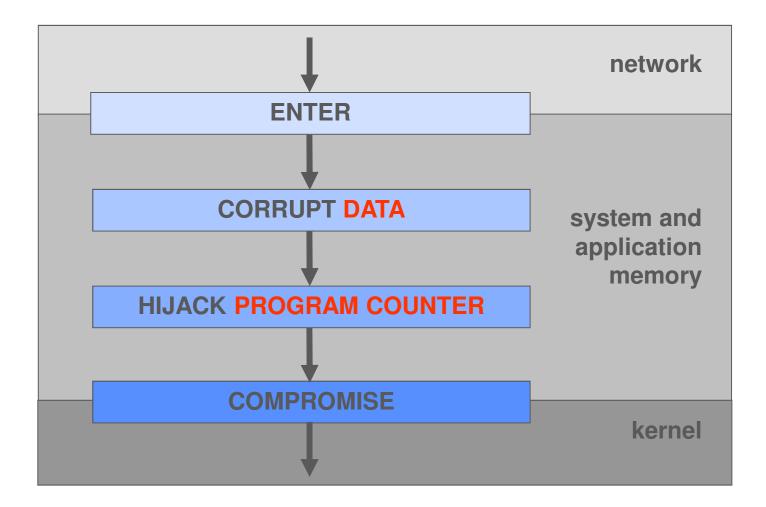
- Efficient
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Dynamic Program Inspectors

- Examples and Possibilities
- Case studies
 - Program shepherding
 - Dr. Memory

Anatomy of a Memory-Based Attack





Critical Data: Control Flow Indirection



Subroutine calls

Return address and activation records on visible stack

Dynamic library linking

• Function exports and imports

Object oriented polymorphism: dynamic dispatch

Vtables

Callbacks – registered function pointers

• Event dispatch, atexit

Exception handling

Any problem in computer science can be solved with another layer of indirection.

- David Wheeler

Critical Data: Control Flow Exploits



Return address overwrite

- Classic buffer overflow
- GOT overwrite

Object pointer overwrite or uninitialized use

Function pointer overwrite

- Heap, stack, data, PEB
- Exception handler overwrites
- SEH exploits

Any problem in computer science can be solved with another layer of indirection. But that usually will create another problem. - David Wheeler **Preventing Data Corruption Is Difficult**

Google

Stored program addresses legitimately manipulated by many different entities

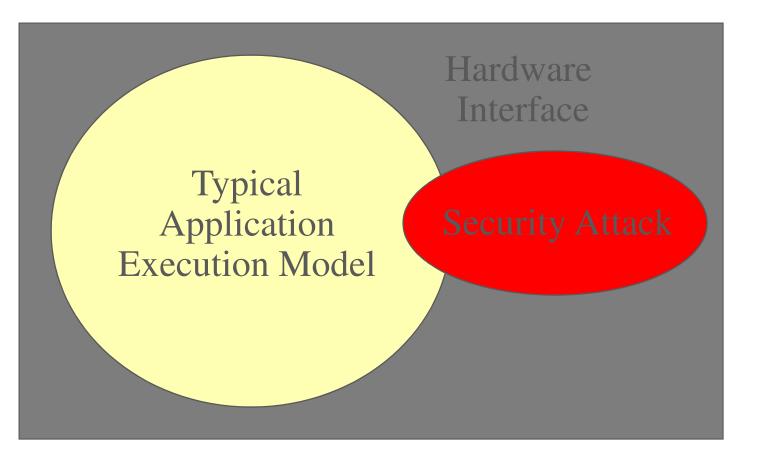
• Dynamic linker, language runtime

Intermingled with regular data

- Return addresses on stack
- Vtables in heap

Even if could distinguish a good write from a bad write, too expensive to monitor all data writes

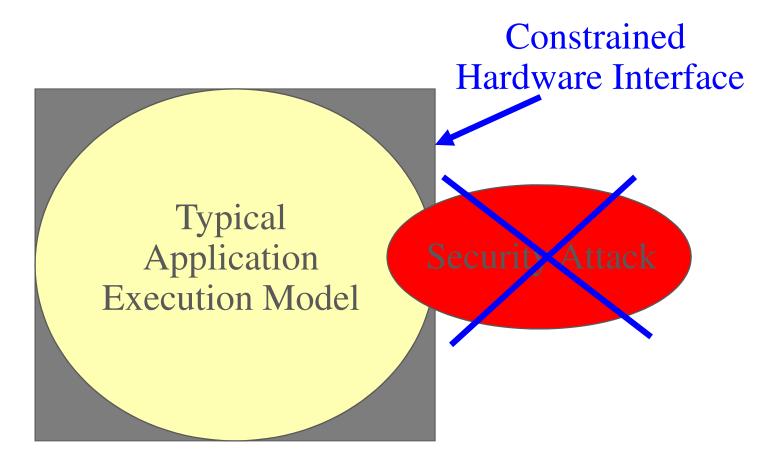
Insight: Hijack Violates Execution Model



Google

Goal: Shrink Hardware Interface







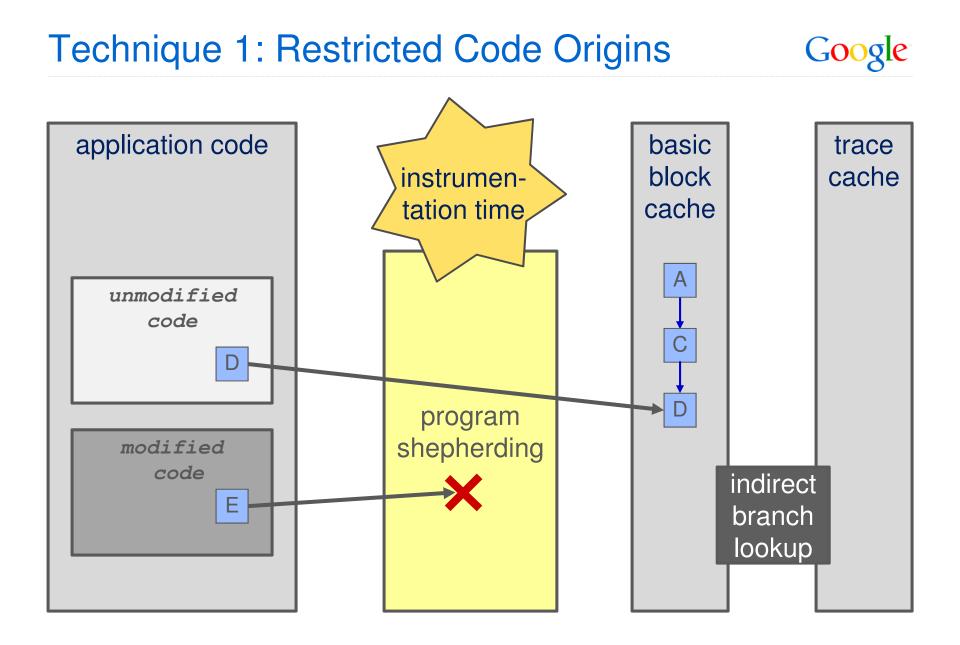
Monitor all control-flow transfers during program execution

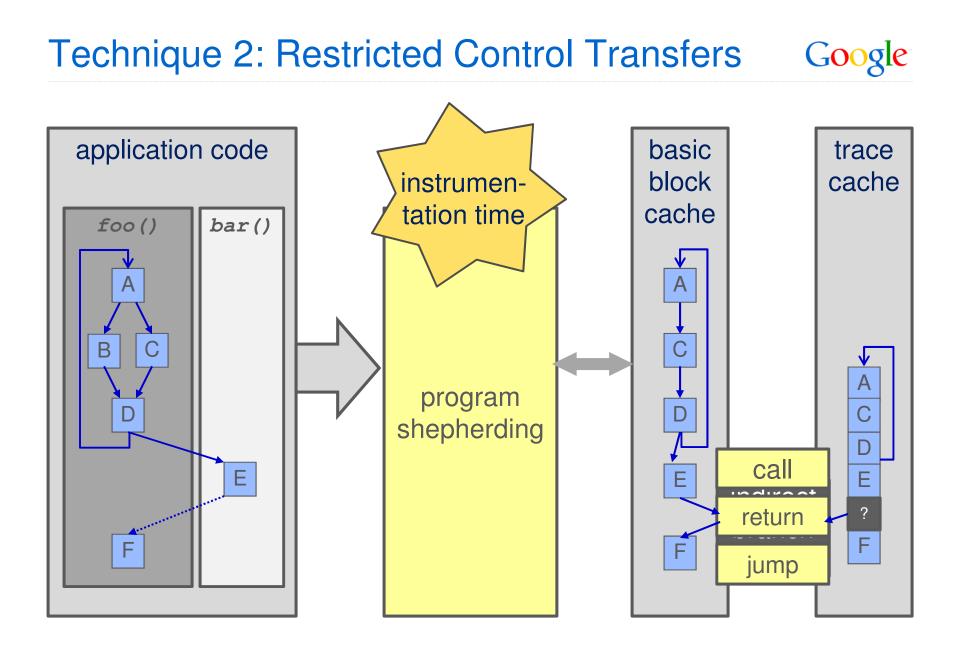
• DynamoRIO is in perfect position to do this

Validate that each transfer satisfies security policy based on execution model

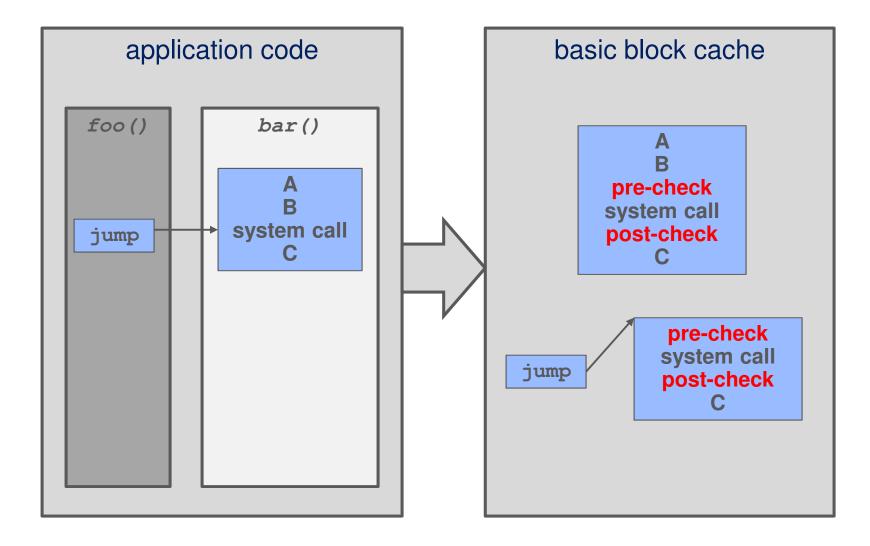
Application Binary Interface (ABI): calling convention, library invocation

The application may be damaged by data corruption, but the system will not be compromised by hijacking control flow





Technique 3: Un-circumventable Sandboxing Google





Carefully crafted security policies

Automated exemption generation: 'staging mode'

Determina, Inc: 50 customers, 10,000 machines

- No false positives in MSFT apps
- <50 unique false positives in 3rd party libraries

We treated these false positives as bugs rather than customer driven policies

Radically different from other security products

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Memory bugs are challenging to detect and fix

• Memory corruption, reading uninitialized memory, memory leaks

Observable symptoms resulting from memory bugs are often delayed and non-deterministic

- Errors are difficult to discover during regular testing
- Testing usually relies on randomly happening to hit visible symptoms
- The sources of these bugs are painful and time-consuming to track down from observed crashes

Memory bugs often remain in shipped products and can show up in customer usage

Dr. Memory



Detects *unaddressable memory accesses*

- Wild access to invalid address
- Use-after-free
- Buffer and array overflow and underflow
- Read beyond top of stack
- Invalid free, double free

Detects uninitialized memory reads

Detects memory leaks





Track the state of application memory using *shadow memory*

• Track whether allocated and whether defined

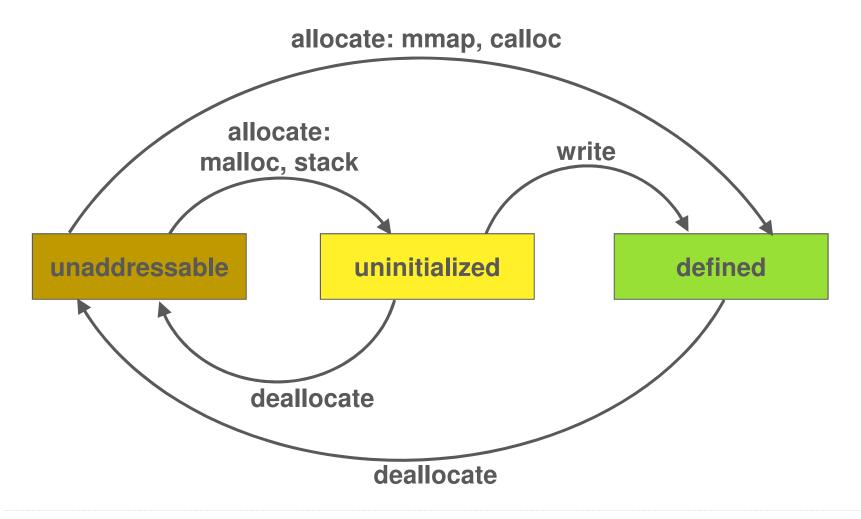
Monitor every memory-related action by the application:

- System call
- Malloc, realloc, calloc, free, mmap, mumap, mremap
- Memory read or write
- Stack adjustment

At exit or on request, scan memory to check for leaks

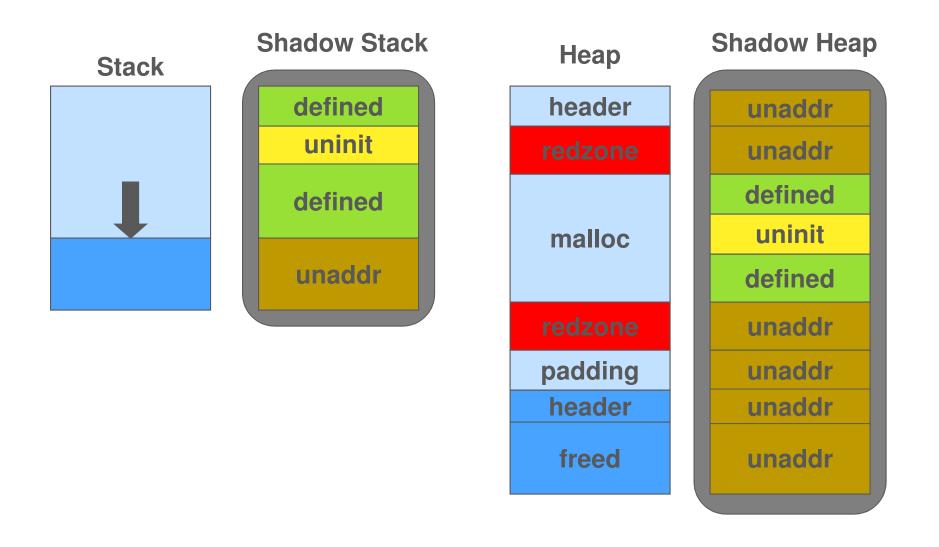


Shadow each byte of memory + registers with 1 of 3 states:



Shadow Memory



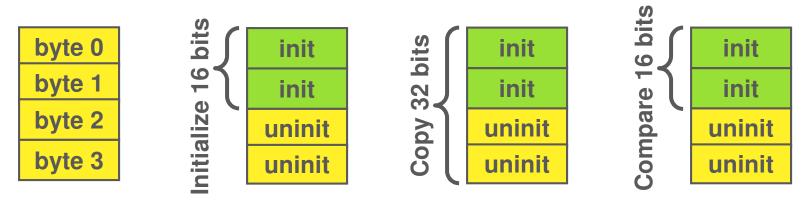


The Uninitialized Whole Word Problem

Google

Sub-word variables are moved around as whole words

- Sub-word field often initialized as sub-word yet copied as whole word
- Reads involved in copying should not raise errors



Solution: report errors on "meaningful" reads only

• Use in compare, conditional branch, address register, or system call

Requires propagating metadata and shadowing registers

• Shadow metadata mirrors application data flow



Dr. Memory uses *reachability-based* leak detection

- A leak is memory that is no longer reachable by the application
- Memory that is never freed is *not* considered a leak
 - Acceptable to not free memory whose lifetime matches process lifetime

At exit time, or on request, perform leak analysis

• Similar to mark-and-sweep garbage collection

Dr. Memory divides all allocated memory into categories based on how it can be reached by live application pointers

• Any pointer-aligned and *initialized* pointer-sized word is considered a potential pointer

Heap Usage and Staleness



Memory usage statistics

- Snapshots of memory usage spaced uniformly across execution
- Drill down by allocation callstack

"Staleness" information

- Record the time at which each allocation was last accessed
- Helps identify "logical memory leaks", where memory is still reachable but is no longer needed
- Also identifies "hotness" of heap objects

Approach

- Shadow memory state is touched or not touched
- Periodically sample shadow state and update timestamps



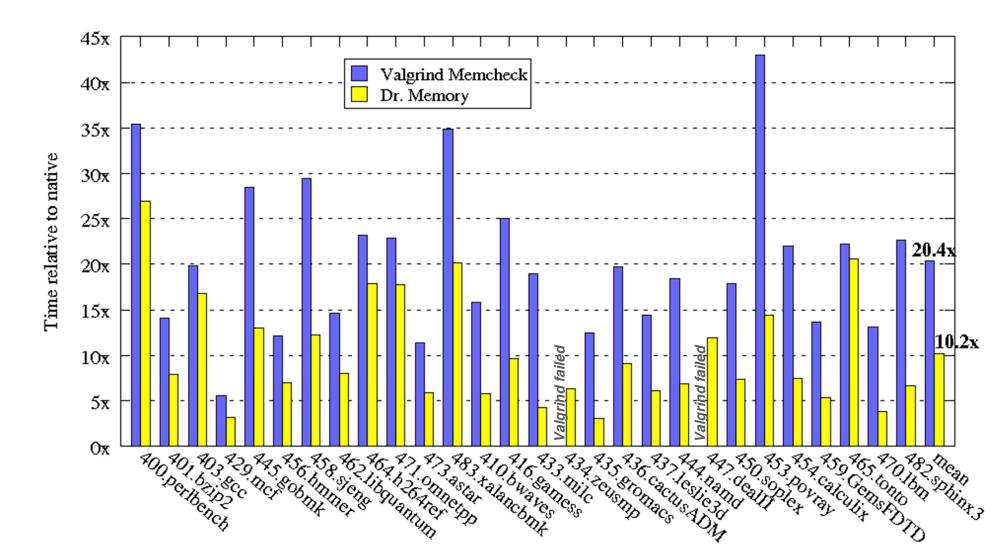
Fastpath = carefully hand-crafted machine-code kernels

- Obtain shadow metadata, combine, and propagate: inlined
- Handle stack pointer updates: lean procedure

Slowpath = clean call to C code

- Unaligned memory references
- Complex instructions
- Allocation library routine and system call handling
- Error reporting

Performance Comparison



Google

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Wrap-up

More Information



Web

- http://dynamorio.org
- http://drmemory.org

Email

- http://groups.google.com/group/dynamorio-users
- http://groups.google.com/group/drmemory-users