

# libdft

## Practical Dynamic Data Flow Tracking for Commodity Systems

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# Outline

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- Problem statement
- Contribution

## 2 Design & Implementation

- Definitions
- Design overview
- Implementation

## 3 Results & Discussion

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- Summary



# Dynamic data flow tracking (DFT)

What is it?

- **Tagging and tracking** “interesting” data as they propagate during program execution
- Extremely popular research topic (also known as information flow tracking)
  - analyzing malware behavior [Portokalidis Eurosys’06]
  - hardening software against zero-day attacks [Bosman RAID’11, Qin MICRO’06, Newsome NDSS’05]
  - detecting and preventing information leaks [Zhu SIGOPS’11, Enck OSDI’10]
  - debugging software misconfigurations [Attariyan OSDI’10]

# Related work

## Architectural classification

- Integrated into full system emulators and virtual machine monitors [Ho Eurosys'06, Portokalidis Eurosys'06, Myers POPL'99]
- Retrofitted into unmodified binaries using dynamic binary instrumentation (DBI) [Qin MICRO'06]
- Added to source codebases using source-to-source code transformations [Xu USENIX Sec'06]
- Implemented in hardware [Venkataramani HPCA'08, Crandall MICRO'04, Suh ASPLOS'04]

# Related work (cont'd)

## Issues & limitations

### Ad hoc & problem-specific implementations

high overhead, little reusability, limited applicability

### Attempts for flexible DFT systems

Versatility comes at a high price

- TaintCheck [Newsome NDSS'05] → 20x overhead even for small utilities
- LIFT [Qin MICRO'06] → no multithreading support
- Minemu [Bosman RAID'11] → only 32-bit binaries
- Dytan [Clause ISSTA'07] → attempts to define a generic and reusable DFT framework, but incurs a slowdown of more than 30x



# libdft

## Brief overview

- DFT framework in the form of a shared library

### Features

- **Fast** → 1.14x – 10x slowdown
- **Reusable** → API for building *custom* DFT-powered tools
- Applicable to **commodity hardware and software** → supports multi-{process, threaded} x86 Linux applications, without requiring any modifications to the binaries or the underlying OS



# DFT

## Formalisms

- Many aliases
  - Data flow tracking (DFT)
  - Information flow tracking (IFT)
  - Dynamic taint analysis (DTA)
  - ...

### Definition

The process of **accurately** tracking the flow of **selected** data throughout the execution of a program or system



# DFT (cont'd)

## Basic aspects

- DFT is characterized by 3 aspects
  - ① **Data sources**: program, or memory locations, where *data of interest* enter the system and subsequently get *tagged*
  - ② **Data tracking**: process of *propagating* data tags according to program semantics
  - ③ **Data sinks**: program, or memory locations, where *checks* for tagged data can be made

### Note

We strictly deal with **explicit** data flows



# Design goal

Shared library for *customized DFT*

Allow the creation of “meta-tools” that *transparently* employ DFT

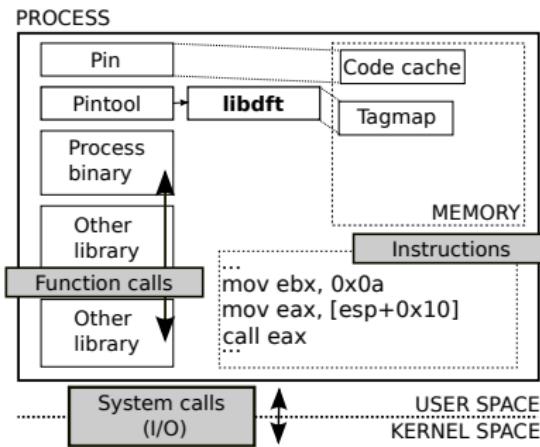


Figure: Putting it altogether: Pin, libdft, process

# Usage

libdft in a nutshell

- ➊ Pin loads itself, libdft, and a libdft-enabled tool into the same *address space* with a process (Figure 1)
- ➋ Before commencing or resuming execution, the libdft-tool defines the data sources and sinks by *tapping* arbitrary points of interest
- ➌ User-defined callbacks drive the DFT process by tagging and untagging data, or checking and enforcing data use



# Challenges

Achieving low overhead is hard

- Size & structure of the analysis routines (*i.e.*, DFT logic) matters
- Complex analysis code → excessive register spilling
- Certain types of instructions should be avoided altogether (*e.g.*, test-and-branch, EFLAGS modifiers)

# libdft

## Prototype implementation

- libdft has been implemented using Pin v2.9
- Currently supports only x86 Linux binaries
- Consists of three main components (Figure 2)
  - ① Tagmap
  - ② Tracker
  - ③ I/O interface
- ~5000 LOC in C/C++



# libdft

## Architecture

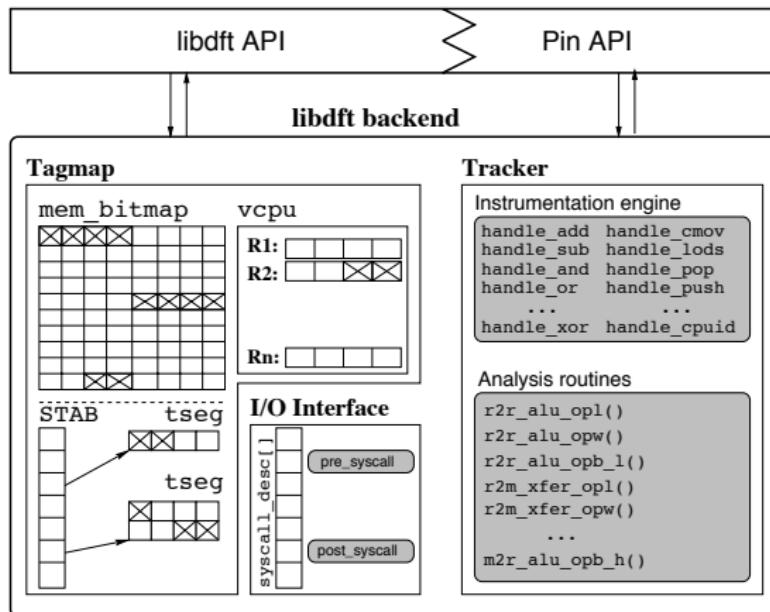


Figure: The architecture of libdft

- Stores the tags for every process
- Major impact on the overall performance → DFT logic constantly operates on data tags
- Tag format
  - **Tagging granularity** → byte
  - **Tag size** → {1,8}-bit
- Register tags
  - Per thread vcpu structure
  - 8 general purpose registers (GPRs)
- Memory tags
  - Per process mem\_bitmap, or STAB and tseg structures
  - 1 bit/byte for every byte of addressable memory

- Instruments a program for retrofitting the DFT logic
- **Instrumentation Engine**
  - Invoked *once* for each sequence of instructions
  - Handles the elaborate logic of discovering data dependencies → allows for compact and fast analysis code
  - *Inspects* the instructions of a program
  - *Determines* the analysis routines that should be injected before each instruction
  - **Allows for customization (libdft API)**
- **Analysis Routines**
  - Invoked *every time* a specific instruction is executed
  - Contain code that implements the DFT logic
  - Clear, assert, and propagate tags

# libdft

## I/O Interface

- Handles the kernel  $\leftrightarrow$  process data
- pre\_syscall/post\_syscall  $\rightarrow$  **instrumentation stubs**
- syscall\_desc[]  $\rightarrow$  **syscall meta-information table**
- The stubs are invoked upon every system call entry/exit
- Allows the user to register callback functions (libdft API)
- The default behavior of the post\_syscall stub is to untag the data being written/returned by the system call

### Advantages

- Enables the *customization* of libdft by using I/O system calls as data sources and sinks arbitrarily
- *Eliminates* tag leaks by considering that some system calls write specific data to user-provided buffers



# libdft

## Optimizations

- `fast_vcpu` Uses a scratch-register to store a pointer to the `vcpu` structure of each thread
- `fast_rep` Avoids recomputing the effective address (EA) on each repetition in REP-prefixed instructions
- `huge_tlb` Uses huge pages for `mem_bitmap` and STAB to minimize TLB poisoning
- `tagmap_col` Collapses `tseg` structures that correspond to write-protected memory regions to a single constant segment

# Performance evaluation

## Testbed

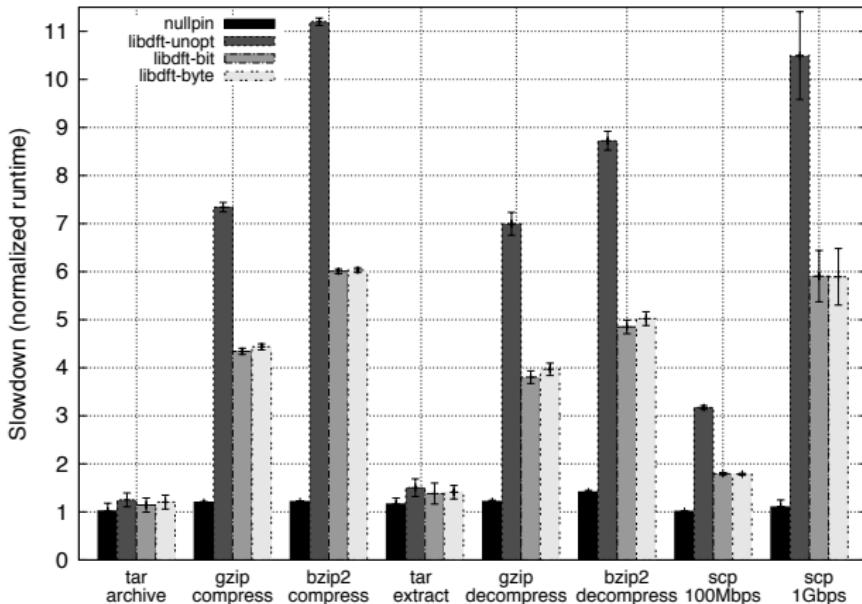
- 2 identical hosts
  - 2x 2.66GHz quad core Intel Xeon X5500 CPUs
  - 24GB of RAM
- 4 Pintools
  - **nullpin** → runs a process over Pin
  - **libdft-unopt** → Pin+libdft with no optimizations
  - **libdft-bit** → Pin+libdft with optimizations and bit-sized tags
  - **libdft-byte** → Pin+libdft with optimizations and byte-sized tags
- Debian GNU/Linux v6 (squeeze), kernel version 2.6.32
- Pin v2.9 (build 39586)

GNU command-line utilities, Apache v2.2.16, MySQL v5.1.49,  
Firefox v3.6.18



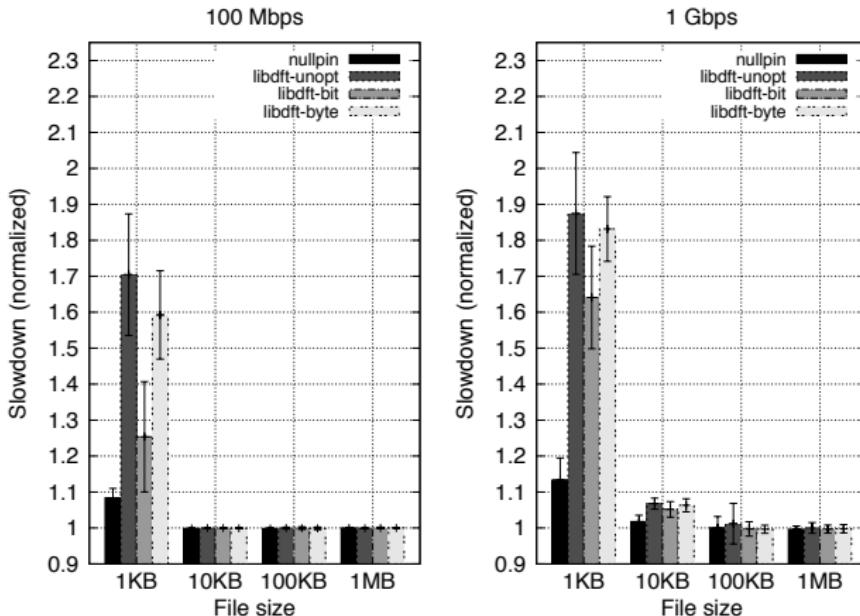
# Performance evaluation

## Command-line utilities



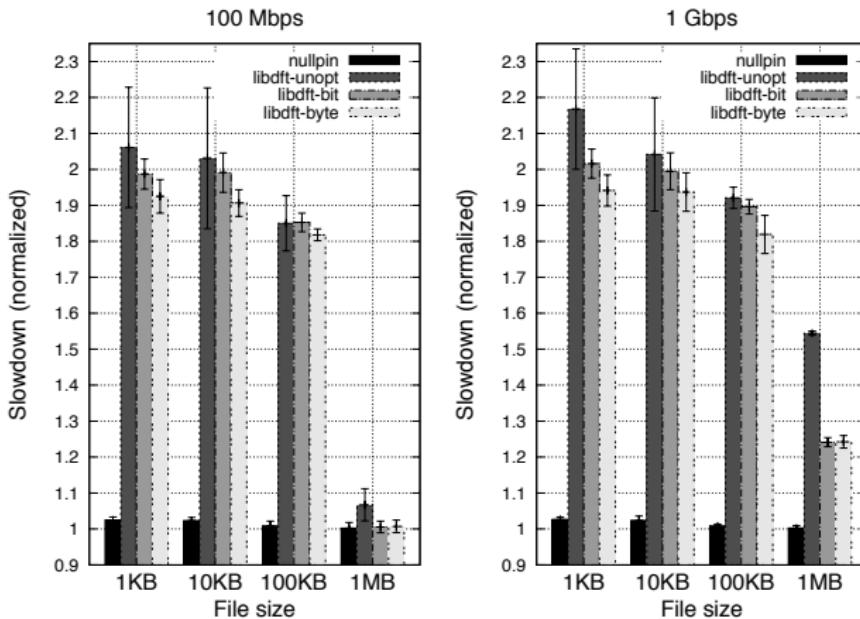
# Performance evaluation

Apache web server



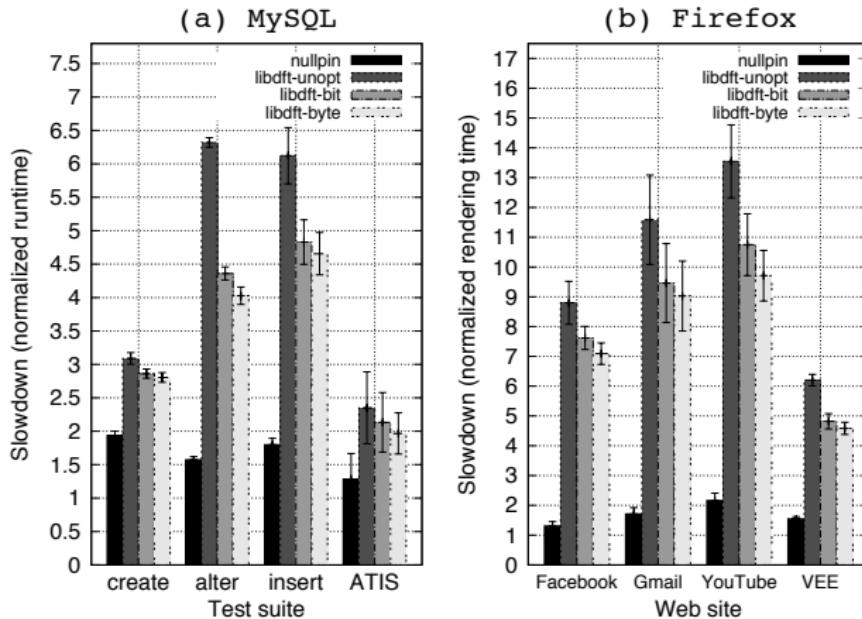
# Performance evaluation

Apache web server (cont'd)



# Performance evaluation

## MySQL RDBMS & Firefox web browser



# libdft-DTA

Taint analysis made easy

- libdft offers a small and elegant API for *transparently* incorporating DFT into running applications → can we use it in order to enforce security policies?
- Built a full-fledged DTA tool in ~ 450 LOC that protects against *code injection* attacks (e.g., stack smashing, heap corruption) *memory overwrite* attacks (e.g., return-to-libc, format string) etc.
- +7% additional runtime overhead
- Tested with real exploits

Dynamically retrofit DTA capabilities into running applications  
→ Binary inline reference monitor



# Recap

## libdft

- **Fast** (highly optimized *Tracker*)
  - *branch-less* tag propagation
  - *single assignment* tagmap updates
  - *inlined* DFT logic
- **Reusable** (API)
  - *customizable* propagation policy
  - assignment of data sources and sinks at *arbitrary* points of interest
- Applicable to **commodity hardware and software**
  - *multiprocess* and *multithreading* support
  - no *modifications* to the binaries or the underlying OS
- [www.cs.columbia.edu/~vpk/research/libdft/](http://www.cs.columbia.edu/~vpk/research/libdft/)



# Backup slides

# DFT

## Explicit vs. implicit data flows

```
1: unsigned char csum = 0;  
2:  
3: bcount = read(fd, data, 1024);  
4: while(bcount-- > 0)  
5:   csum ^= *data++;  
6:  
7: write(fd, &csum, 1);
```

(a) Data flow dependency

```
1: int authorized = 0;  
2:  
3: bcount = read(fd, pass, 12);  
4: MD5(pass, 12, phash);  
5: if (strcmp(phash, stored_hash) == 0)  
6:   authorized = 1;  
7: return authorized;
```

(b) Control flow dependency

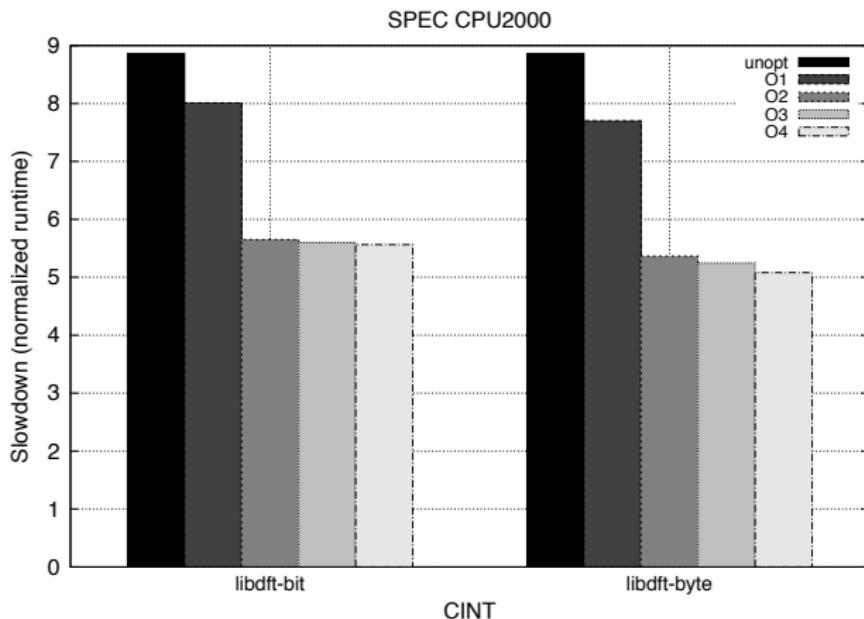
Figure: Examples of code with explicit and implicit data dependencies

# Pin DBI

- libdft relies on Pin [Luk PLDI'05] for *instrumenting* and *analyzing* the target process
- **Instrumentation** → *what* analysis routines should be inserted *where*
- **Analysis routines** → code that is dynamically injected into the application and *augments* its execution
- Pin uses a *JIT* compiler for combining the original code, libdft, and the code of a libdft-tool
- “Jitted” code is placed into a *code cache* for avoiding re-translation

# Performance evaluation

SPEC CPU2000 benchmark



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