# Optimizing the software stack of a cosmic proportions cluster of multi-core machines

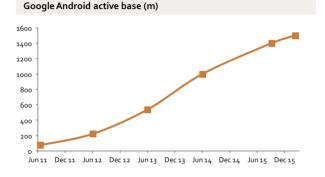
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#### Android: a cosmic size cluster

- ▶ top500: 10M cores / 15.3MW <sup>1</sup> / US\$273 million <sup>2</sup>
- Android devices:  $\sim$  6*B* cores  $^3$  /  $\sim$  300*MW*  $^4$  /  $\sim$  US\$0



[Source: Google, a16z]

 $<sup>^{1}</sup>$ https://www.top500.org/lists/2016/11

<sup>&</sup>lt;sup>2</sup>https://en.wikipedia.org/wiki/Sunway\_TaihuLight

<sup>&</sup>lt;sup>3</sup>4 cores / device

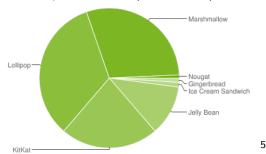
# Android Open Source Project (AOSP) Software Stack

- ► AOSP: common base for Android devices (+ customizations)
- C/C++ for the platform libraries, Java for user interface ansic 22 MLoC 39%
   cpp 13 MLoC 23%
   java 10 MLoC 17%
- $ho \sim 80\%$  execution cycles in C/C++,  $\sim 20\%$  in Java

<sup>&</sup>lt;sup>5</sup>Data collected during a 7-day period ending on January 9, 2017.

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- release/updates/deprecation (5  $\sim$  6 years)



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# Why Optimizing the Performance of Android?

Why bothering?

- the code of Android is cold (flat profile), full of branches
- there are few loops (image processing, compression, etc.)

 $<sup>^{6}</sup>$ \$0.12/kWh, battery 13.2Wh = 4.4V \* 3000mAh, charging every 48 hours

# Why Optimizing the Performance of Android?

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#### Motivation:

- same code executed billions of time
- outer loop is outside the device
- profile how often code is in use
- variation over time following popularity of apps
- continuously monitor usage patterns
- tune code optimziations over time

\$0.30 / device / year  $\longrightarrow$  \$300M / billion devices / year <sup>6</sup>





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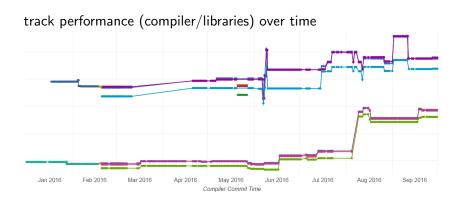
## Agenda

- Performance analysis: hot spots
- Improve performance of AOSP libraries
- Enable continuous profiling and optimizations (AutoFDO)
- Enable more secure execution environments (CFI)

## Performance Analysis

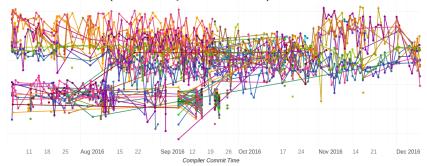
- benchmarks: track performance over time (compiler/libraries)
- linux perf: profile of cycles (per function, hot-spots)
- ▶ valgrind: number of executed instructions (branches, R/W)
- static profiles: how many uses for a function

#### **Benchmarks**



#### Benchmarks

on a real device (and a noisy benchmark...)



## Linux Perf

# Valgrind

#### Static Profile

▶ -flto: static call-graph, estimated frequencies per call

## Improve performance of AOSP libraries

#### **SARC** contributions

- ▶ update Android NDK libc++, make it easy to keep updated
- 20x speedup of std::string.find() in libc++ and libstdc++ need to port perf to memmem and strstr of bionic and glibc
- improve perf of shared\_ptr in libc++
- ▶ improve perf of string to int value parsing in libc++

# Benchmarking Standard Libraries

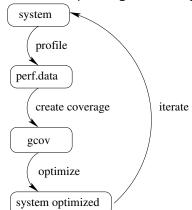
#### **SARC contribution**: std-benchmark<sup>7</sup>

- std-benchmark provides micro-benchmarks for functions in libc and C++ standard library
- detect room for improvement
  - compile with different compilers
  - link with different standard libraries
  - run on different machines: CPUs, architectures



# AutoFDO: Feedback Directed Optimization

- linux-perf extracts profiles of running systems
- ▶ little to no overhead <sup>8</sup>
- coverage (basic block frequencies) from dynamic profiles
- continuous profiling and tuning of optimizations



<sup>&</sup>lt;sup>8</sup>Google Wide Profiling: A Continuous Profiling Infrastructure for Data Centers, IEEE Micro (2010)

## AutoFDO: Example

```
sort.c
   gcc -O3 -g sort.c -o sort.exe
sort.exe
   perf record ./sort.exe
perf.data
   create_gcov --binary=sort.exe --profile=perf.data --gcov=sort.gcov
sort.gcov
    gcc -O3 -fauto-profile=sort.gcov sort.c -o sort-autofdo.exe
sort-autofdo.exe
```

## AutoFDO: Code Optimizations

- ▶ better inlining <sup>9</sup>, devirtualization, function instantiation
- hot/cold code placement
- register allocation, jump-threading, etc.

## AutoFDO: More Precise Coverage

- ▶ Intel-LBR (Last Branch Record): last 16 taken branches
- provides more precise basic block execution frequency
- how do we do this on ARM?

#### ARM-ETM: Embedded Trace Macrocell

- ARM-ETM: records execution traces (for debug)
- ightharpoonup dedicated circular buffer 1 to 3MB ( $\sim 10^5$  branches/MB)
- no overhead
- support in Linux kernel by Mathieu Poirier (Linaro)
- next android kernel linux-4.9 will support ARM-ETM

- ▶ **SARC contribution**: how to use ARM-ETM for AutoFDO
  - perf-inject translates execution traces to LBR events
  - patch similar to perf-inject for Intel Process Trace

#### AutoFDO: with ARM-ETM

```
sort.c
    gcc -O3 -g sort.c -o sort.exe
sort.exe
    perf record -e cs_etm/@20070000.etr/u --per-thread ./sort.exe
perf.data
               contains ETM execution traces
    perf inject -i perf.data -o inject.data --itrace compile ETM to LBR
inject.data
               contains LBR events
    create_gcov --binary=sort.exe --profile=inject.data --gcov=sort.gcov
sort.gcov
    gcc -O3 -fauto-profile=sort.gcov sort.c -o sort-autofdo.exe
sort-autofdo.exe
```

# From Dynamic Profiles to Power Usage

- ▶ traditionally, per app battery usage (ammeter on wire) <sup>10</sup>
- more accurate picture with linux-perf profiles:
  - profiles from the field: real world use-cases
  - merge together different profiles
  - compute code execution frequency
  - power consumption estimation per line of code

<sup>&</sup>lt;sup>10</sup>An Analysis of Power Consumption in a Smartphone, USENIX 10 ⋅ ≥ ⋅ ≥ ⋅ ∞ < ○

#### Towards more secure devices

- ► Control Flow Integrity (CFI): 2% overhead <sup>11</sup>
- to enable on Android: need to further reduce its cost

<sup>11</sup> Enforcing Forward-Edge Control-Flow Integrity in GCC&LLVM, USENIX'14