

Exploring Profile Guided Optimization of the Linux Kernel

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Introduction

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Background

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Methodology

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Results

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Conclusion & Wrap-up

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Q & A

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Introduction

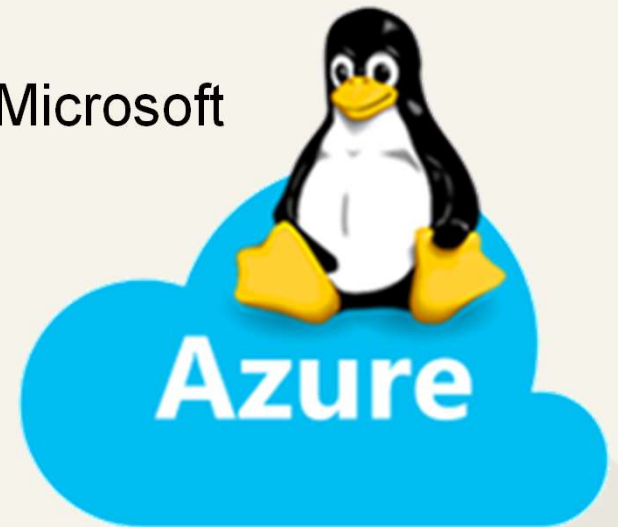




GNU/Linux Dev Tools @ Microsoft

Our Mission: Support Linux dev tooling needs for Microsoft

- Across Multiple Platforms
 - [Azure Cloud](#)
 - Half (or more) of all instance in Azure are running Linux!
 - [Windows Subsystem for Linux](#)
 - IoT (such as [Azure Sphere](#))
- Across Multiple Features and Tools
- Correctness, Performance, and Security





Optimize Single Service Instance

Internal customer request

- Linux-hosted cloud service
- Instance runs a single service
- 64-bit x86 and ARM
- Willing to build their own kernel
- **Goal:** Maximize Performance

How can a tools team help?

- Brainstorming: Profile Guided Optimization!

Complications

- Workload isn't fully known (service and architecture isn't completed)!
- No benchmarks provided



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Background





LTO and PGO – quick primer

PGO - Profile Guided Optimization (*aka Pogo, FDO, -fprofile-use*)

- Consume profile information to improve code generation
- Allow placement of code (and data) for spatial and temporal locality
- Drive inlining decisions (inline hot paths, ignore cold paths)
- Intra-function Code layout

LTO - Link Time Optimization (*aka LTCG, WPA/WPO/IPA*)

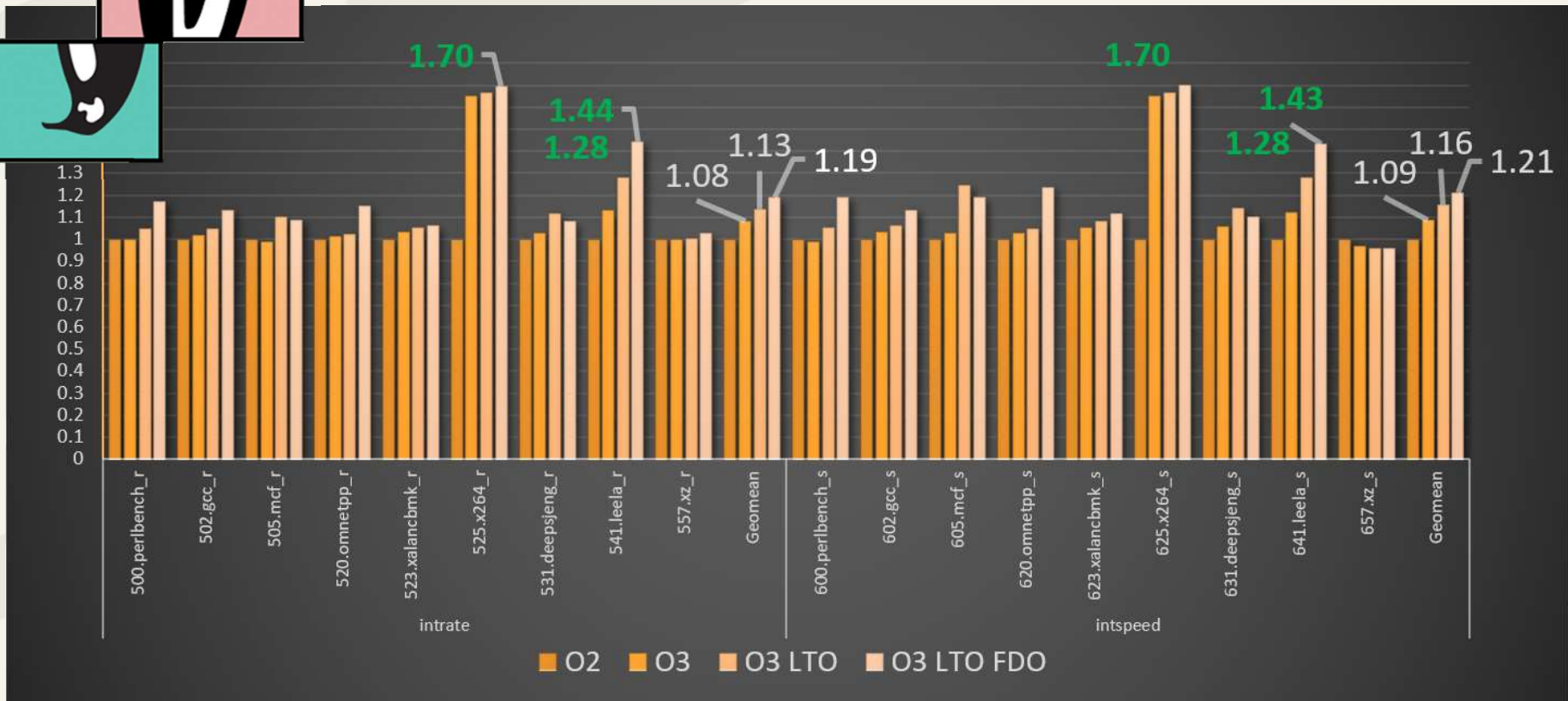
- Compile entire module/binary at once
- Inline across CPP files
- Interprocedural analysis and optimization
- Optimize using “whole program view”



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GCC 9.2.1 SPEC 2017 ARM64





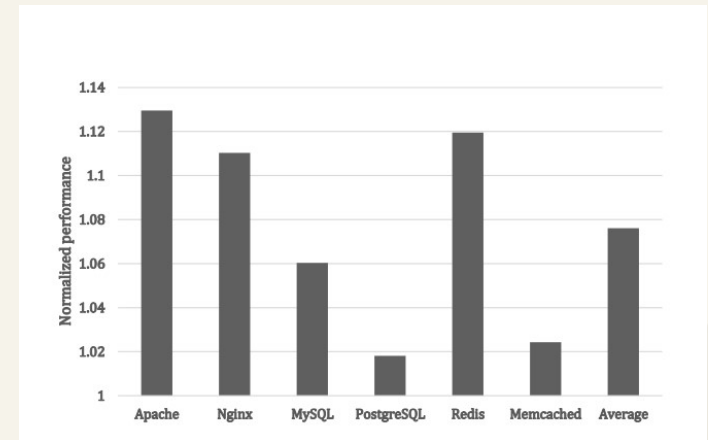
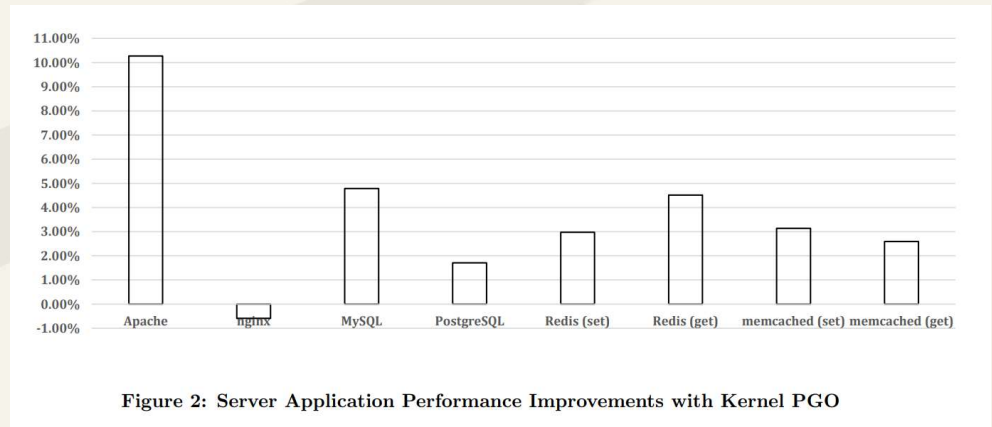
Yuan (2014)

- <http://sei.pku.edu.cn/~yaoguo/papers/Yuan-ApSys-14.pdf>

Yuan (2015)

- <http://sei.pku.edu.cn/~yaoguo/papers/Yuan-APSys-15.pdf>

Previous Research PGO + Linux Kernel



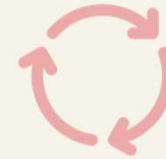


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Methodology





Setup

Software: Ubuntu 19.10

with GCC 9.2.1, binutils 2.33, kernel 5.3

Hardware: Marvell Thunder X2 (ARM64)

Enabling LTO + PGO

- We reached out to Andi Kleen for help with LTO
- After a few back-and-forths (and one patch) we had LTO working
- Docs + trial-and-error all that was needed to get PGO working



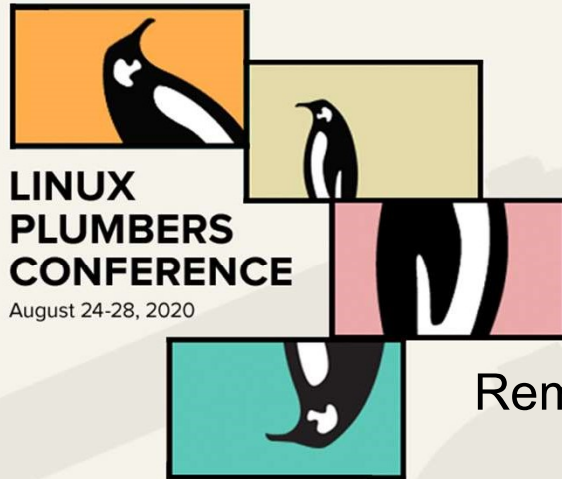
Profiling the Kernel

Instrumentation-based profiling

Kernel Configuration:

```
CONFIG_DEBUG_FS=y  
CONFIG_GCOV_KERNEL=y  
CONFIG_GCOV_PROFILE_ALL=y
```

- Build and install kernel with instrumentation
- Run scenario
- After run trace location is @
/sys/kernel/debug/gcov
*.gcda; *.gcno
owned by `root` (so chown/chmod)



Optimizing the Kernel

Remember: clean your build

- follow normal clean steps; *and*
- Ensure previous coverage options are disabled!

GCC expects the profile data to be in **a specific location** in the kernel build directory *or* in a flattened path

```
'#home#user81#linux-build#linux-5.3.0#debian#build#build-generic#some#dir#with#a#file.gcda
```

Set **build flags** to add ``-fprofile-use``

```
KCFLAGS="-fprofile-use=/home/user81/gcov-test/generic-instr/gcov -Wno-coverage-mismatch -Wno-error=coverage-mismatch"
```

Work around **breakages**

```
CFLAGS_lockref.o=-fno-profile-use -O0 to linux/lib/Makefile.
```



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Results





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Scenarios

redis

Popular database, cache, hash, BSD licensed
built-in benchmarking (redis-benchmark)

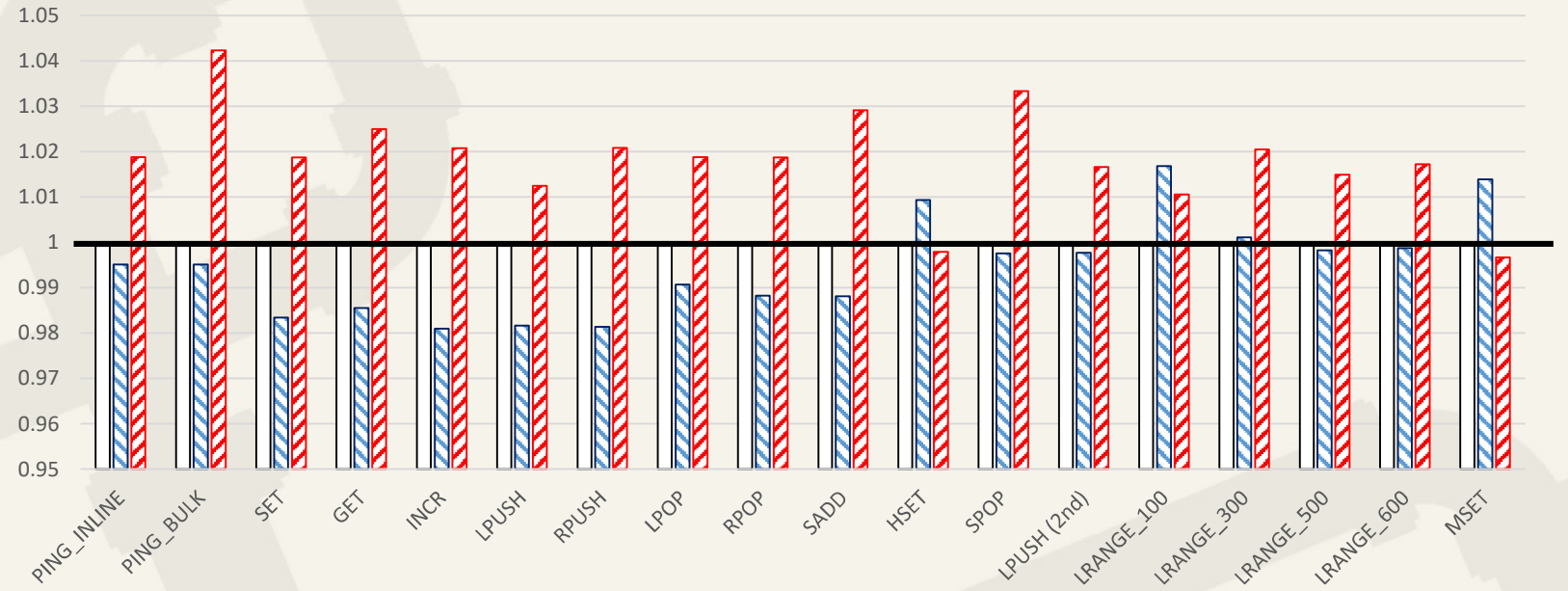
<https://redis.io>



Redis

redis-benchmark on ARM64

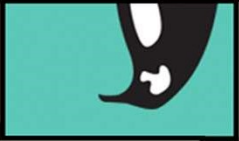
□ Baseline-5.3 ▨ O3-5.3 ▩ PGO-5.3





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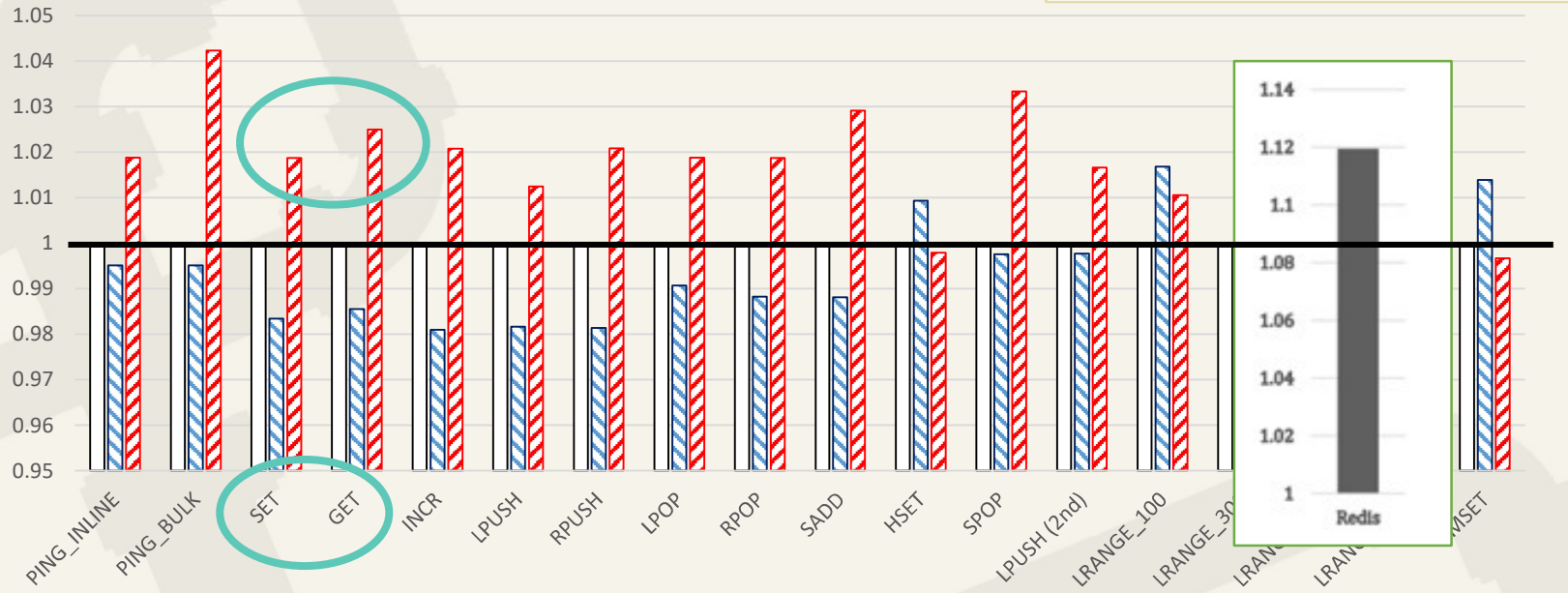
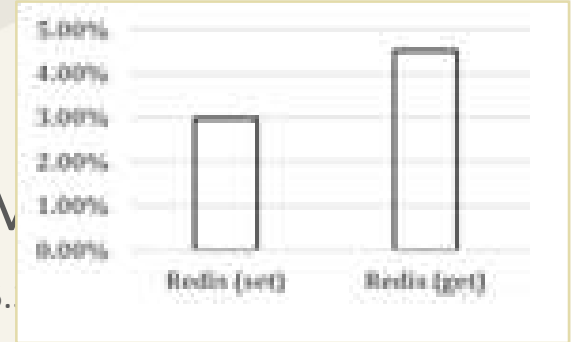
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Redis

redis-benchmark on ARM

Baseline-5.3 O3-5.3 PGO-5.3





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Conclusion & Wrap-up





Conclusion

We saw wins with PGO in Redis

- Close to the limit for non-kernel bound scenario

We would a better measurement of core kernel performance

- Stable benchmarks for filesystem, network, scheduler, etc.

We'd love to see more

- Microsoft Windows heavily utilizes both LTO (LTCG) and PGO
- Windows sees **5-20% improvements** from PGO
 - we want to investigate if this is relatable

Cyclic Dependency

- Usage drives quality; quality drives usage



Acknowledgements

Fellow Team Members

Roman “@kromych” (Microsoft)

Di “Modi” Mo (Facebook)

Other Folks

Andi Kleen (Intel)



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Q & A





Jobs!

Microsoft is hiring Linux developers and folks with Linux experience!

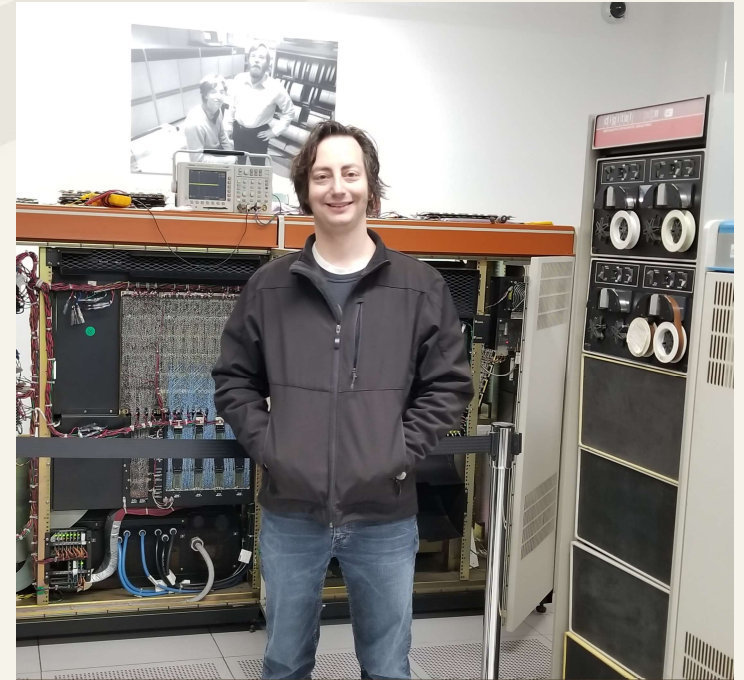
<https://careers.microsoft.com/us/en/search-results?keywords=Linux>




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Thank You!



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