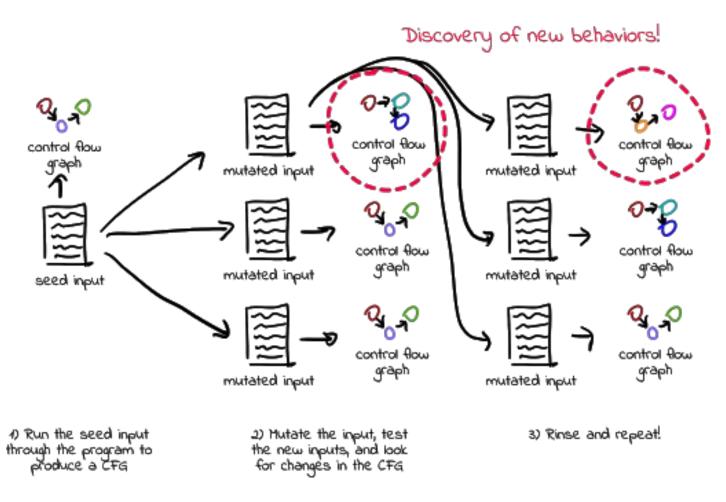
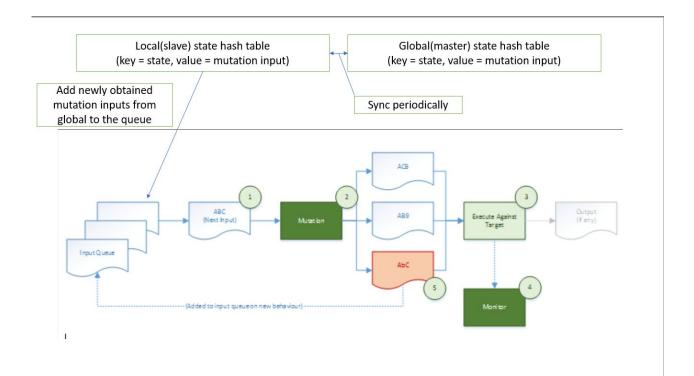
Fuzzing



 $Image\ credit:\ https://blog.trailofbits.com/2020/10/22/lets-build-a-high-performance-fuzzer-with-gpus/2020/10/22/lets-build-a-hig$

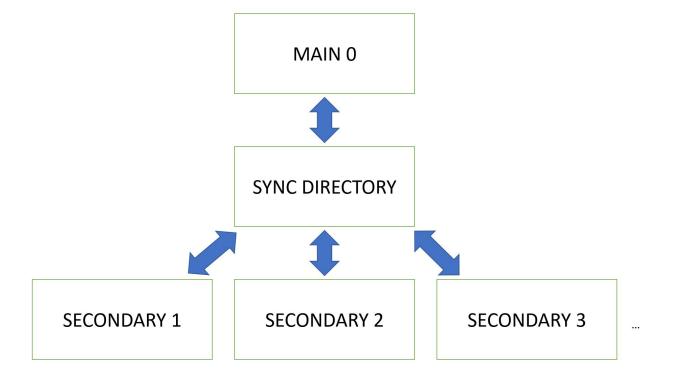
View of Single AFL++ Fuzzing Instance



AFL++ follows the scheme below:

- 1. Load an initial user-supplied input to the input queue
- 2. Take the next input out of the input queue
- 3. Attempt to trim the test case to maintain the measured behavior (1)
- 4. Mutate the input (1)
- 5. Run the input with the given program
- 6. Mutations that get a new state transition get added to input queue
- 7. Only multi-thread: Periodically sync with main thread and add interesting inputs from main to the input queue (1)
- 8. GOTO 2

Parallelism Explained



- Each Instance Classified as Main or Secondary Instance
- Each Instance Keeps Track of State Transitions Covered
- Synchronization
 - All synchronization done asynchronously
 - The Main Instance Scans all Secondary Fuzzers
 - Secondary Fuzzers scan only the Main Fuzzer
 - The topology above and the reduction of number of synchronizations help keep synchronization costs low

Testing

Specifications:

Ryzen 3600x CPU - 6 cores, 12 threads

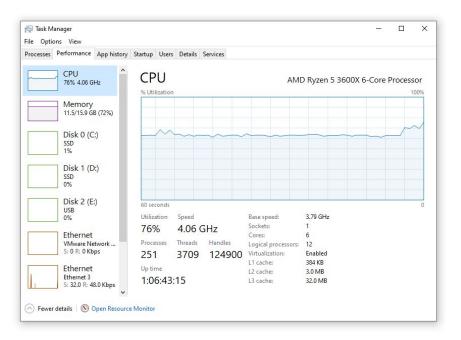
VMware running on Windows 10 settings:

Ubuntu 20.04.03 LTS

4GB RAM

CPU 6 cores, 2 threads each (gave all cores to the VM)

Program Under Test : Readelf Initial Seed : /bin/ps



CPU Usage seen from Host Device

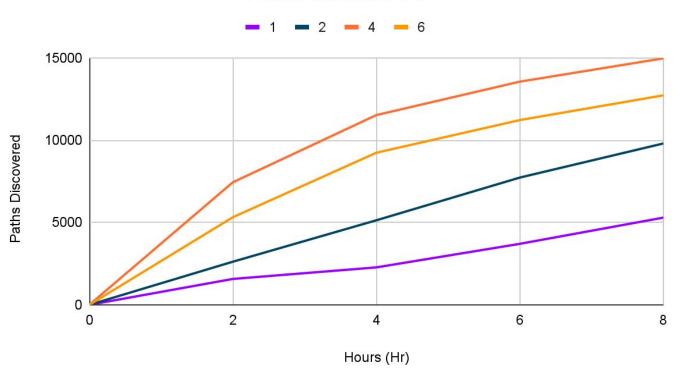
```
american fuzzy lop ++3.15a (default) [fast] {0}
       run time : 0 days, 0 hrs, 45 min, 33 sec
 last new path : 0 days, 0 hrs, 0 min, 17 sec
                                                       total paths : 1351
                                                       uniq crashes: 0
last uniq crash : none seen yet
                  none seen yet
                                                        uniq hangs : 0
 now processing: 776.0 (57.4%)
                                          map density : 0.01% / 0.04%
paths timed out : 0 (0.00%)
                                                        2.49 bits/tuple
              havoc
                                                       403 (29.83%)
LibreOffice Writer 4308/16.4k (26.29%)
                                                       551 (40.78%)
                                                       0 (0 unique)
                                                       176 (16 unique)
 bit flips : disabled (default, enable with -D)
                                                        levels : 6
              disabled (default, enable with -D)
                                                       pending: 1294
              disabled (default, enable with -D)
                                                      pend fav : 366
              disabled (default, enable with -D)
                                                      own finds: 1350
             n/a
                                                      imported : 0
             1066/382k, 279/66.3k
                                                      stability : 100.00%
by/custom/rg : unused, unused, unused, unused
   trim/eff : 5.30%/40.6k, disabled
```

Single-thread execution

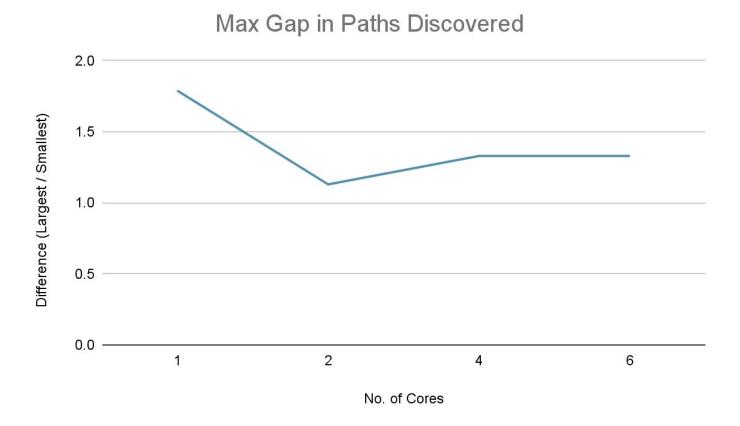
```
american fuzzy lop ++3.15a (2-6) [fast] {3}
       run time : 0 days, 2 hrs, 19 min, 13 sec
  last new path: 0 days, 0 hrs, 0 min, 7 sec
                                                       total paths : 2863
last uniq crash : none seen vet
                                                       uniq crashes : 0
                                                        uniq hangs : 0
 last uniq hang : none seen yet
                  2515.0 (87.8%)
                                          map density : 0.02% / 0.06%
paths timed out : 0 (0.00%)
                                                        3.14 bits/tuple
 now trying : havoc
                                        favored paths :
                                                       591 (20.64%)
              8703/18.3k (47.55%)
                                                       957 (33.43%)
              1.27M
                                                       0 (0 unique)
 exec speed : 180.2/sec
                                        total tmouts : 1241 (59 unique)
  bit flips : disabled (default, enable with -D)
                                                        levels : 9
 byte flips : disabled (default, enable with -D)
                                                       pending: 2521
              disabled (default, enable with -D)
                                                      pend fav : 315
              disabled (default, enable with -D)
                                                     own finds: 2095
                                                      imported: 767
              1781/887k, 305/174k
                                                     stability: 100.00%
py/custom/rg : unused, unused, unused, unused
   trim/eff : 5.09%/168k, disabled
                                                               [cpu003: 41%]
```

Multi-thread execution

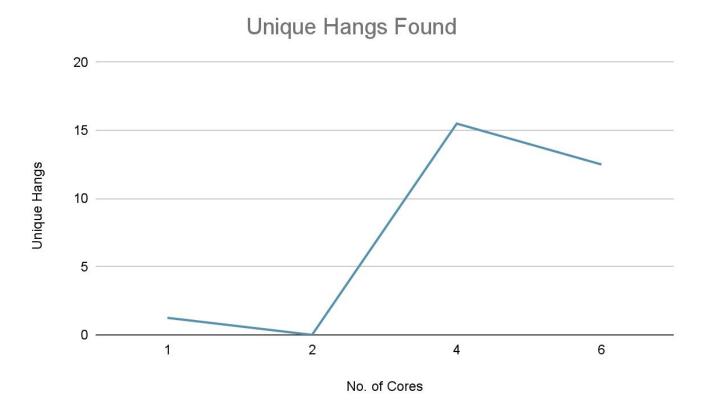




- Increase in performance from 1 core to 2, 4, 6 cores in all four time periods
- All multi-core fuzzing experienced the same trend of performance boost
 - $(0 \sim 2)$ to $(2 \sim 4)$ Hr
 - Successfully widened their gap with the single-core session, hitting the peak at around the 4 hour mark, hitting around linear speedup (2.25x / 5.07x / 4.06x).
 - $(4 \sim 6)$ to $(6 \sim 8)$
 - Performed a bit worse, narrowing the gap between single core performance (1.85x / 2.82x / 2.40x)
- 4-core performed better than 6-core
 - Possibly resource allocation problems with the virtual machine for higher core counts.



- Variety of the number of paths found between different fuzzing sessions
 - Single-Core
 - Showed a great difference between individual fuzzing sessions (1.73x)
 - Multi-Core
 - Stayed quite low (1.13x / 1.33x / 1.33x) for all multi-core sessions
- Multi-Core sessions shared interesting inputs, preventing fuzzing sessions from killing themselves
- Single-Core abruptly killed itself, causing large varieties between individual sessions.



- Increasing number of cores -> More Unique Hangs
- Search space widened from sharing inputs no need to recalculate unfruitful input combinations
- Results
 - No unique hangs found for 2 cores
 - Super-linear performance boost (12.4x / 10x) with 4 and 6 cores

Conclusion

- Less than ideal speedups due to...
 - Different instances fuzzing the same inputs and states
 - No deterministic strategy to fuzz different program states on different instances of the fuzzer
- I/O not a bottleneck
- Less variability in results from run to run with more cores

Other Implementations

- PAFL^[1]: leverage state information to distribute and confine each instance to a limited state space
- UniFuzz^[2]: dynamic centralized input queue
- Enfuzz^[3]: different grey-box fuzzers with global state and seed pool

Problems

- Original plan was to implement PAFL based on a paper, but turned out to be too difficult and out of scope
- Hardware limitations
- Fuzzing unstable with single-threaded instances

References

- [1] J. Ye, B. Zhang, R. Li, C. Feng and C. Tang, "Program State Sensitive Parallel Fuzzing for Real World Software," in *IEEE Access*, vol. 7, pp. 42557-42564, 2019, doi: 10.1109/ACCESS.2019.2905744. https://ieeexplore.ieee.org/document/8668503
- [2] Xu Zhou, Penfei Wang, Chenyifan Liu, Tai Yue, Yingying Liu, Congxi Song, Kai Lu and Qidi Yin. "UniFuzz: Optimizing Distributed Fuzzing via Dynamic Centralized Task Scheduling." 2020. https://arxiv.org/pdf/2009.06124.pdf
- [3] Chen, Yuanliang, Yu Jiang, Fuchen Ma, Jie Liang, Mingzhe Wang, Chijin Zhou, Xun Jiao and Zhuo Su. "EnFuzz: Ensemble Fuzzing with Seed Synchronization among Diverse Fuzzers." USENIX Security Symposium (2019).