DataRobot



Swift Mode

Dragging pytest-testmon up to DataRobot scale





Agenda

- 1. Overview
- 2. Why use testmon?
- 3. Scaling testmon to Swift Mode
- 4. Results and next steps



Overview

- 1. Who am I?
- 2. What is pytest-testmon?

Who am I? Carson Gee



- Really Full Stack (i.e. Easily distracted)
- **Worked on Cool Stuff**
 - Helped NASA map out what is under the ice in Antarctica, Greenland, and Mars
 - Served on Architects Council for Open edX
 - Brought the Copenhagen Wheel to market (e-bike conversion kit)
 - Built an AR enabled social network out of backpacks, hats, and even duct tape
 - Helped DataRobot run ~70% less unit/integration tests





















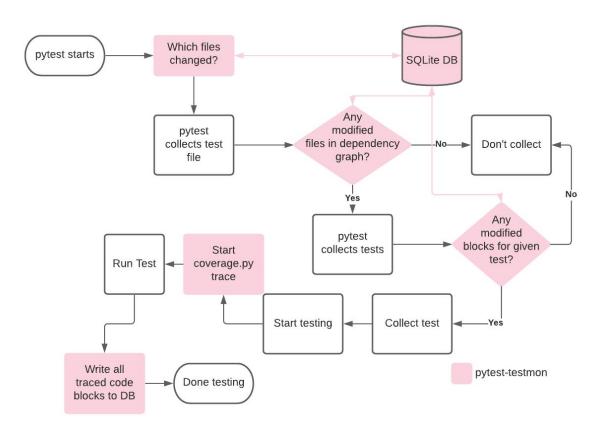
What is pytest-testmon?



- Open source plugin for the Python test runner <u>pytest</u>
- <u>Testmon</u> selects tests affected by changed files and methods
- Uses <u>coverage.py</u> to record the code a test exercises
- Uses recordings from previous runs to determine what changed and what tests should run

Pytest with testmon flow









Why testmon?

- 1. Wait, how many tests?!
- 2. Why the usual isn't enough

Wait, how many tests?!

No one wants to wait four days to test a twenty line change



Why four days you ask? Oh hi there monorepo!

- 12,604,434 lines of code (~2,000,000 Python)
- >100,000 commits, ~70,000 PRs
- 150,000+ tests run on main branch merge
- Run same tests in multiple configurations and environments (Py2/3, Kubernetes/Hadoop, etc.)

Why the usual isn't enough



Parallelization

- Only so many cores, shared services
- More servers, more problems
- Setup time starts to dominate testing time
- \$\$\$\$\$

Run most tests nightly instead of per PR

- Too much change in a given day, git bisect can take >6 hours for one failed test and doesn't work with flaky tests
- Staging/Cl system broken more frequently

Reduce tests run per change with highly cohesive tests and code

- Challenging to enforce clean dependency graphs
- Less cross dependency testing = more broken things

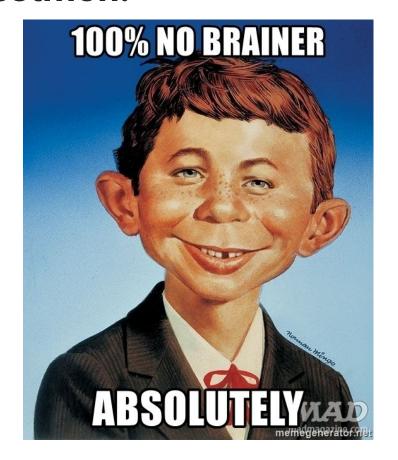
Let's Use testmon!



- Reduces number of tests for a given PR based on changes
- Less tests = less runtime
- Selecting the right tests means irrelevant broken tests are not run

Let's Use testmon!







Scaling testmon

- 1. Why it doesn't work
- 2. How we scaled it
- 3. ... How we scaled it
- 4. ...Really, how we scaled it

Why it doesn't work



- Designed to speed local development, not CI level
- Requires you to run all tests to populate DB
- Database is SQLite and needs to get distributed to build nodes
- Once distributed to build node, SQLite is single writer
- Non-code file changes break tests
- Not ready for millions of lines of code

How we scaled it: Making **Swift Mode**

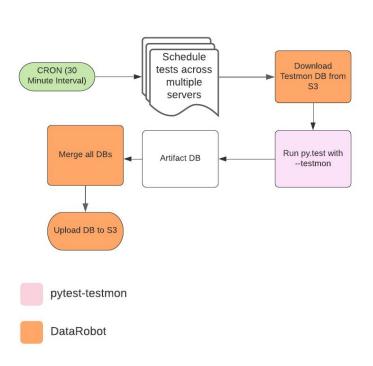


- Created Script for managing DBs
 - S3 Storage of DB
 - Merging of executor build DBs
- Created dedicated Jenkins jobs for updating DB
- Made Pytest plugin to export selected tests
 - Enable xdist and Cythonization
- Created Smart Test Entropy Rule Engine Override
 - Pytest-plugin that lets you override testmon's selections and select them anyway
 - Plugin based architecture, one plugin: file-glob
- Enable configuration in PR Templates to enable/disable testmon for a PR

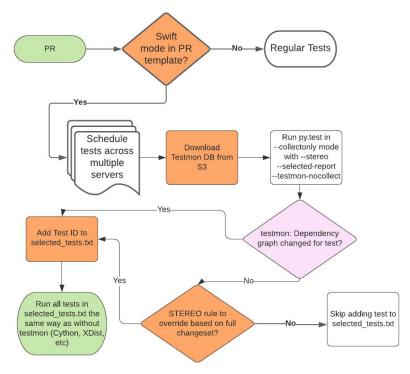
How we scaled it - Swift Mode v0



Update DB Process



Run Tests



How we scaled it - Swift Mode v0



Update DB Process



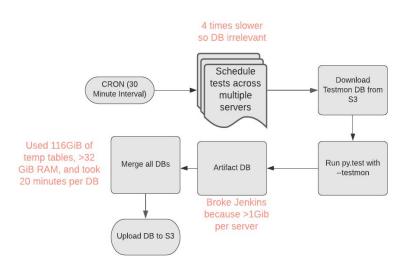
Run Tests

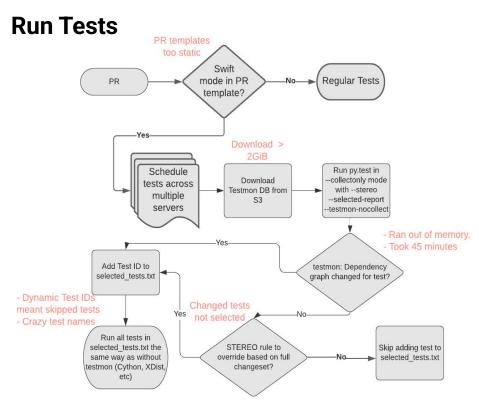


...How we scaled it



Update DB Process





...Really, how we scaled it - Swift Mode v1



Forked: https://github.com/datarobot/pytest-testmon/

- Significant DB schema and pragma changes, i.e. page through the 10 million+ dependency graph edges instead of all in one
- Code block fingerprinting performance improvements
 - Turns out finding comment and blanks lines 35% faster using strip over regex on 2 million lines really matters
- Stopped sorting tests by runtime (took >5 minutes to sort 34,000 tests)
- ALL the memory optimizations

...Really, how we scaled it - Swift Mode v1



Updates:

- Scaled update server count
- SQL optimizations for merging executor DBs
- XZ compression of DBs for transit speedup (Thanks DevInfra!)

PRs/DTS:

- Created EngProd Service for fast degradation
- Randomized test ID detection, URL encoded test names
- Added changed-tests plugin to pytest-STEREO
- AutoFCS and EngProd App detection of Swift Mode skipped tests (Thanks EngProd Squad!)

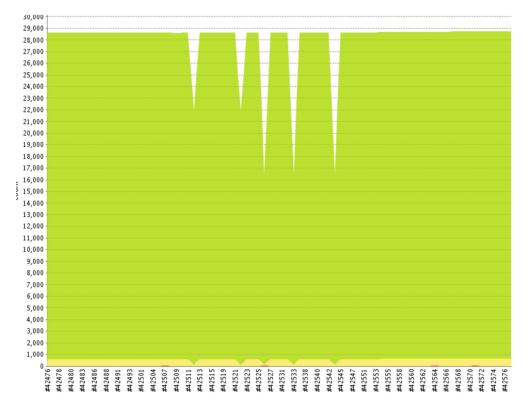


Results and Next **Steps**

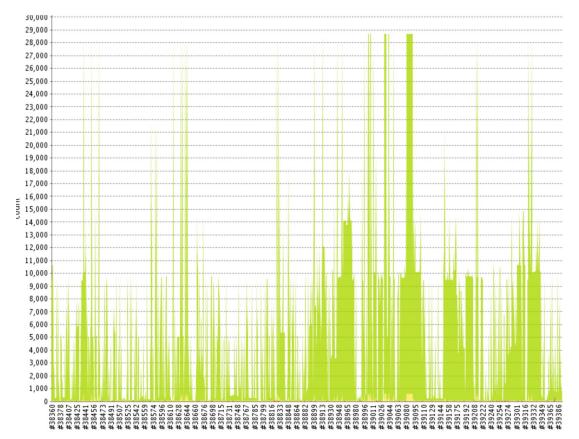
- 1. Was it worth it?
- 2. Next steps...?

Was it Worth it?





Number of Tests Run on PRs - Before







Was it worth it?



Yes (probably)!

- We run about 70% less tests
- Runtime down about 30% on average
- Saving ~\$600 USD/day

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- Coupled tests exposed!
- Master breaks more often!

Next Steps...?



Speed up PRs:

- Utilize dependency graph in fan out test scheduling
- Faster update cycles to reduce drift from master
- Experiment with using a graph database

Break CI Pipelines Less less:

- Automate correcting dependency graph selection failures
- Resolve coverage.py/Python caching issues

Questions?

