Flaky Test Detection with Historical Test Analysis

Overview

Flaky tests are tests that fail non-deterministically — they fail sometimes and pass at other times without any change in the underlying code. These are major productivity killers in CI/CD pipelines and can erode developer trust in test results. A robust flaky test detection strategy involves **historical test analysis**, statistical modeling, and automated quarantine systems.

Historical Analysis for Flake Detection

1. Test Result Logging

Track the result of each test over time:

- Test name
- Commit hash or build ID
- Pass/Fail status
- Execution time
- Platform/Environment details

Store in a structured format (e.g., Postgres, Elasticsearch, or BigQuery).

2. Flake Scoring

Define metrics such as:

- Flake rate: Failures / Total runs
- **Bounce rate**: Failures followed by pass in next retry
- Intermittency score: Normalized standard deviation of results
 - **Example:**

? Tools for Flake Detection

Tool	Features
FlakyBot (Google)	GitHub Action that detects and quarantines flaky tests
BuildPulse	SaaS that collects CI data, ranks flaky tests
pytest-rerunfailures	Useful for retry logic and detection support
TestAnalytics (CircleCI)	Test insights with flake analysis
Custom ELK Stack	Aggregates test logs and applies heuristics

Automated Flaky Test Quarantine

- 1. Label flake candidates via thresholds (flake_rate > 10%)
- 2. Auto-quarantine in CI (e.g., skip unless manually invoked)
- 3. Notify developers with links to analysis
- 4. Periodically reintroduce and retest quarantined tests
 - ✓ GitHub Actions Example:

```
if: steps.detect-flake.outputs.flaky == 'true'
run: echo "Quarantining test ${{ matrix.test }}"
```

Conclusion

Historical test analysis is essential for proactively identifying and managing flaky tests. By collecting long-term data, computing flake scores, and integrating detection into CI, teams can prevent unreliable tests from blocking deploys and eroding confidence. The key is **detection**, **isolation**, **and continuous cleanup**.