

Analyzing Engineering Process Data at Microsoft: *What's the Opportunity?*

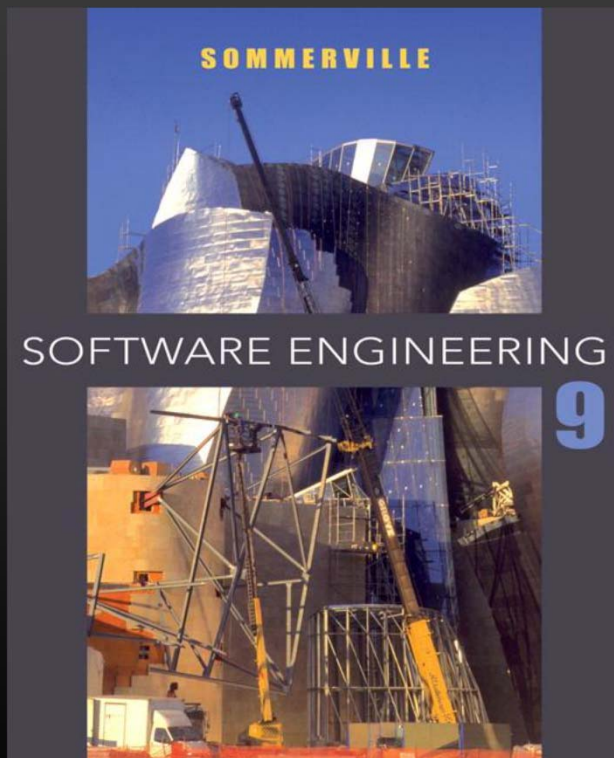
Wolfram Schulte

Principal Researcher and Partner Development Manager
Microsoft Corporation

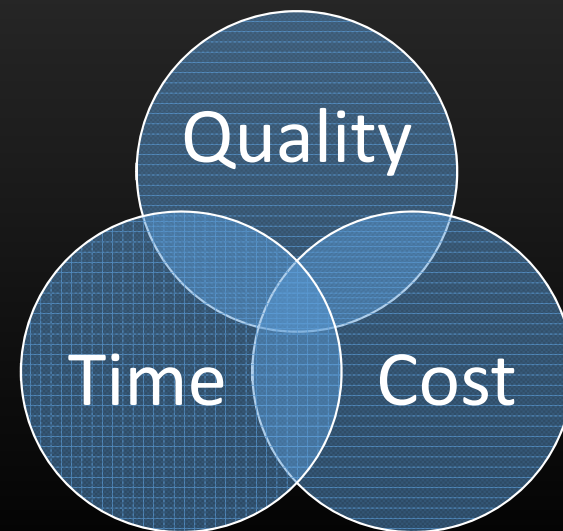
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Software Engineering (SE)



“Produce high quality software with a finite amount of resources to a predicted schedule”



SE Information Needs ...

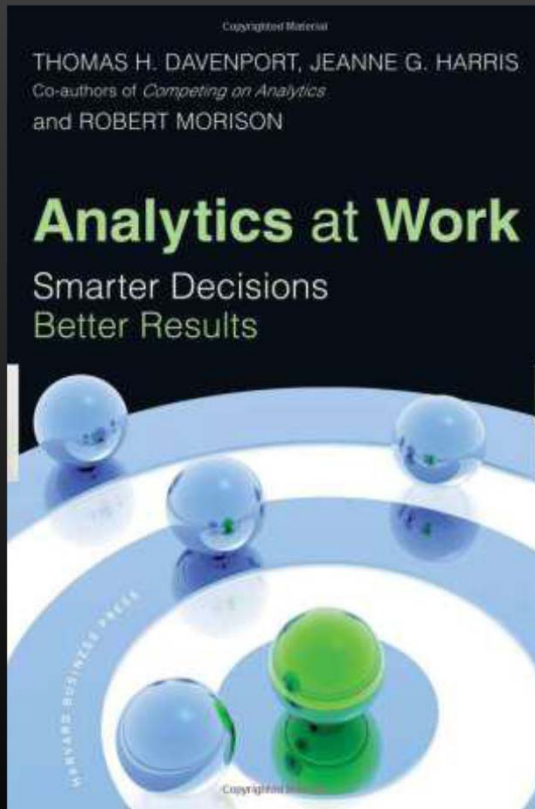
Engineers want to know

- what's going on in **code** (churn)
- and what **dependencies** exist
- where are the **bugs**
- who are the **people** involved

Managers want to know

- how to set-up an **effective dev. process** and **organization**
- what's the **quality of the product**
- can we ship **on time**
- what's the **customer experience**

SE Analytics



“Use of [SE] data, analysis and systematic reasoning to [inform and] make decisions”

Use of Analytics

| | Past | Present | Future |
|-------------|--|---|---|
| Information | What happened? <i>Reporting</i> | What is happening now? <i>Alerting</i> | What will happen? <i>Extrapolation</i> |
| Insight | How and why did it happen <i>Modeling</i> | What's the best next action? <i>Recommendation</i> | What's the best/worst that can happen? <i>Prediction</i> |

From Davenport et al. "Analytics at Work".

Optimizing for Time ... **Branch Analytics**

Branching in Source Control Management Systems

7

Coordinating the work of 100's of developers is challenging.
A common solution is to **use branches in SCM** systems

- **Benefits:** Isolating concurrent work during times of instability
- **Cost:** Increase the time that changes percolate through the system (Code Velocity)

Branches, Flow, Velocity, and Volume

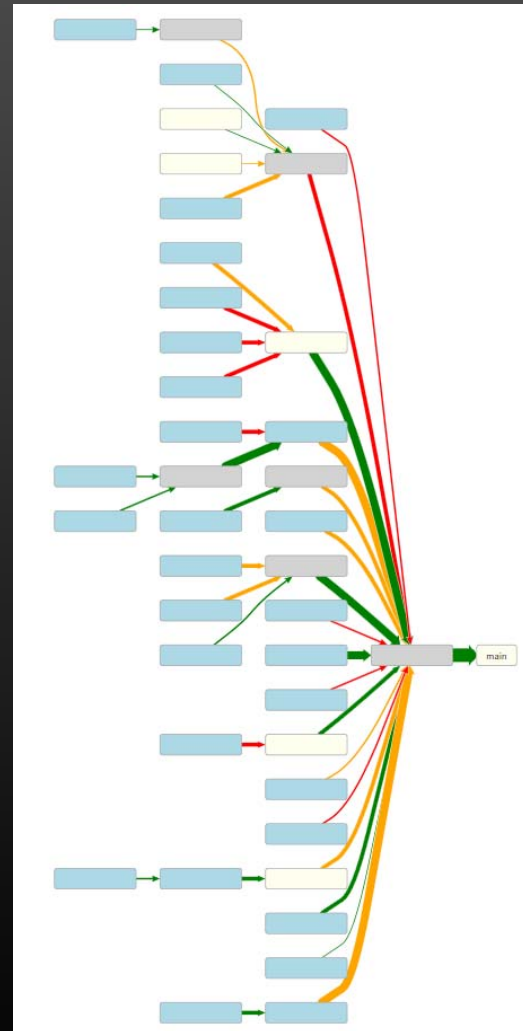
Nodes: Branches

[Size: # of developers]

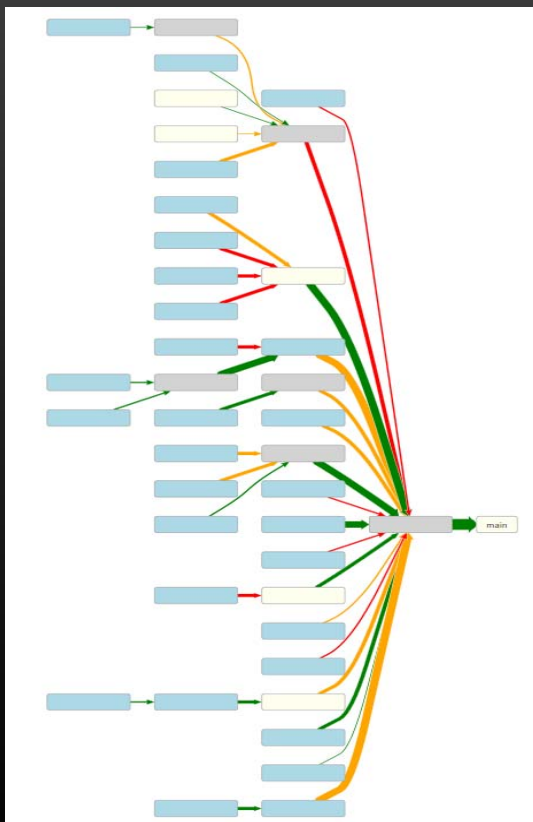
Edges: Flow of Code

Thickness: Volume

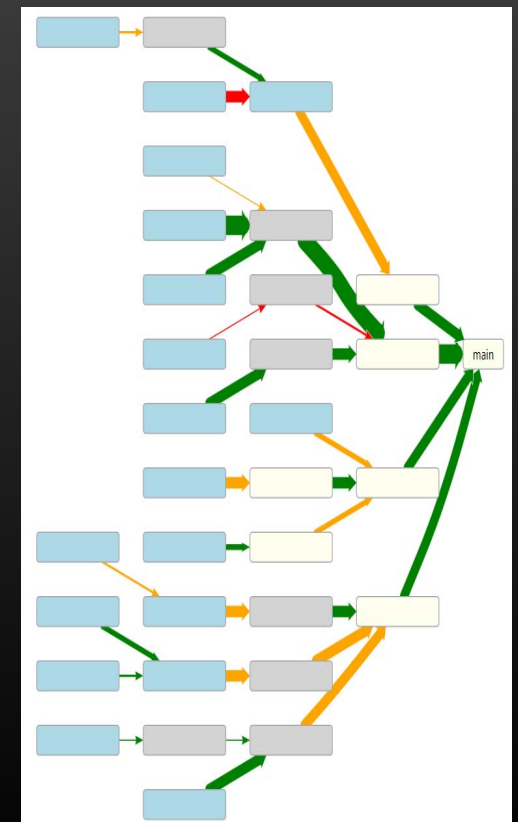
Color: Speed



Branch Structure Optimization



Identify branches that contribute to delay and restructure

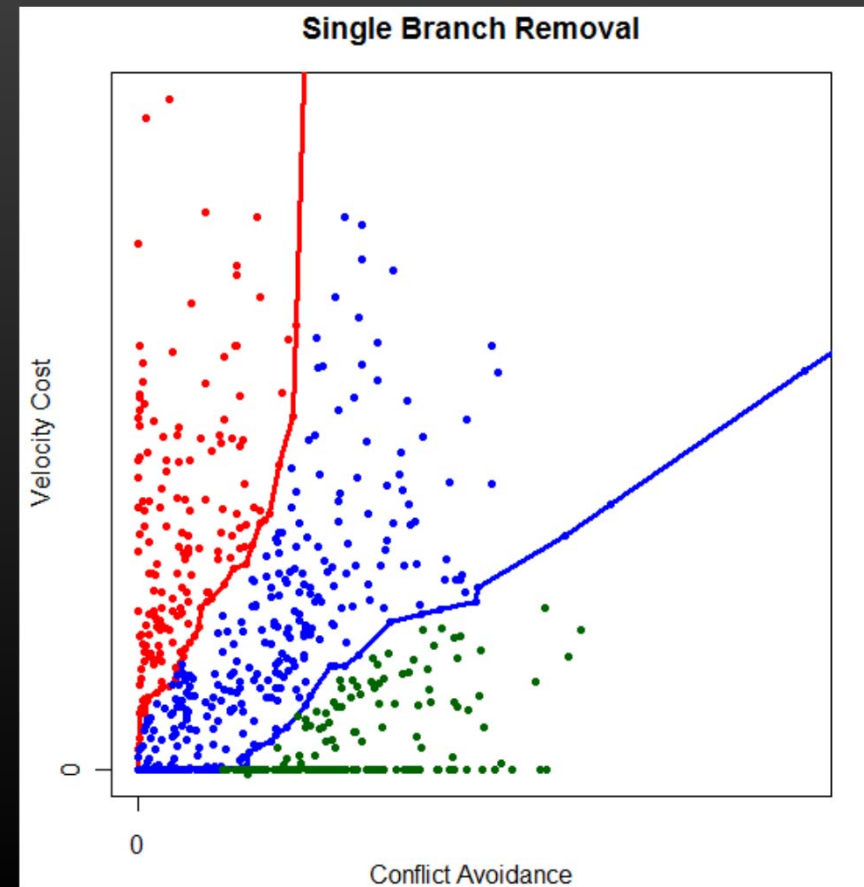


Simulate Cost-Benefit of Alternative Branch Structures

Idea: Replay code churn history with each feature-branch removed

Measure impact on:

- Velocity (“cost”)
- Avoided conflicts (“benefit”)



Results

- **Faster velocity:** ~35% more code reaching main trunk per day
- **Better reliability:** ~50% fewer merge conflicts
- **Infrastructure savings (\$):** Having fewer branches to build and maintain

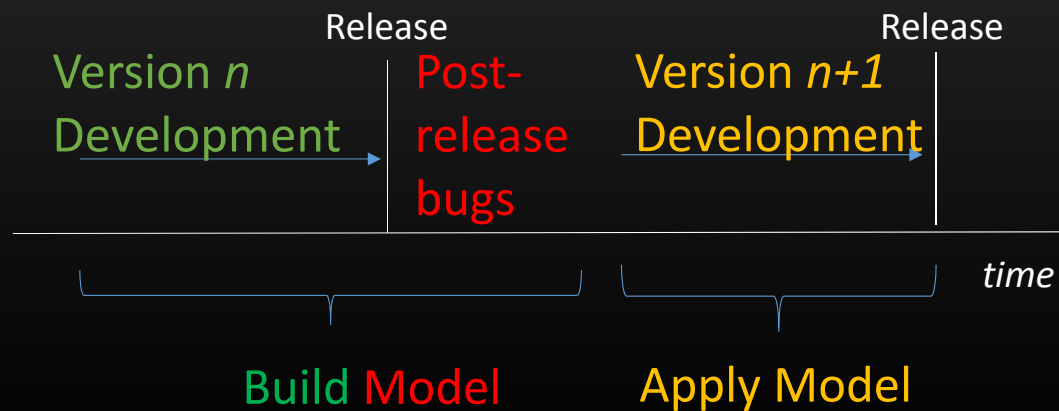
Assessing Quality Risk analysis

Risk Prediction

Risky change: something likely to cause **fixes** in the future

Risk prediction: evaluating risk of each pre-release check-in using a statistical model

Approach: Use post-release data to decide on risk for pre-release changes



Predictors & Model

Metrics for check-ins are computed at the file level, then aggregated for check-ins

- Code metrics
- Code churn (present and past)
- Bugs
- Ownership
- Developer experience

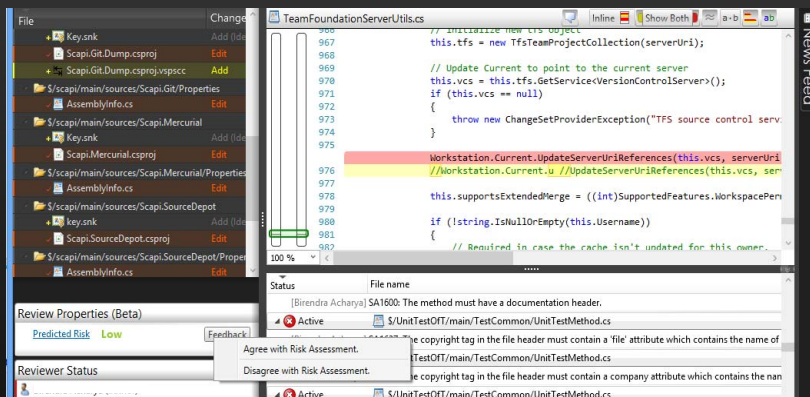
Use logistic regression model

Probability of risk is linearly proportional to values of metrics

Risk Analysis Usage

Code Review Tool for Engineers

Dashboards for Managers



Checkin filtering criteria

Change made within: days

depot name:

changeID:

branch name:

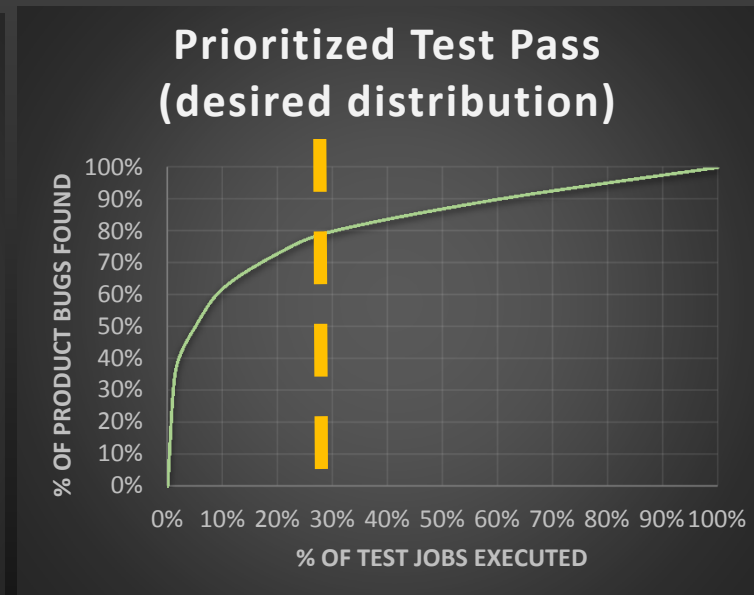
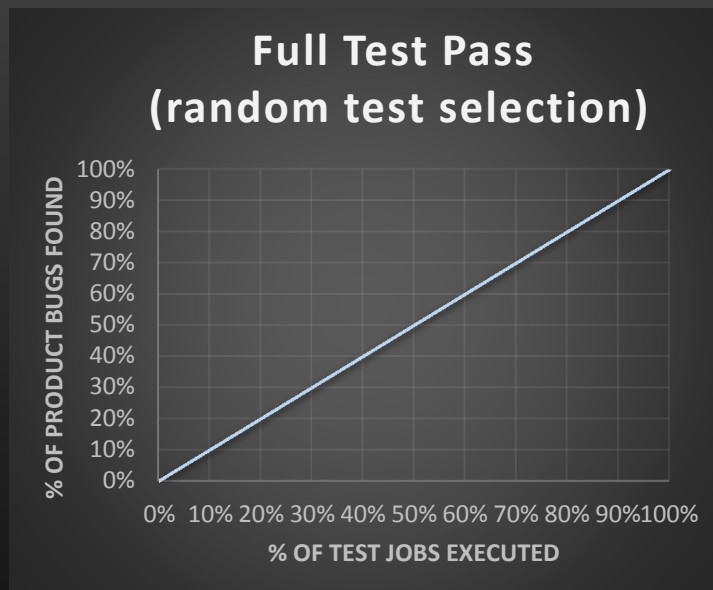
file name contains:

| Depot name | Changelist ID | Change date | Changed by | Files added | Files changed | Files deleted | Files integrated | Risk |
|------------|---------------|----------------------|------------|-------------|---------------|---------------|------------------|-----------|
| | 2688659 | 7/16/2013 6:42:10 PM | | 0 | 3 | 0 | 0 | 0.4127268 |
| | 2688664 | 7/16/2013 6:42:46 PM | | 1 | 13 | 0 | 0 | 0.6551605 |
| | 184514 | 7/16/2013 6:44:42 PM | | 0 | 14 | 35 | 1 | 0.4456684 |
| | 2688669 | 7/16/2013 6:48:59 PM | | 0 | 1 | 0 | 0 | 0.1768458 |
| | 184515 | 7/16/2013 6:44:54 PM | | 0 | 1 | 0 | 0 | 0.1768458 |

Allows for smarter decisions, where to focus, i.e. how to use time and resources

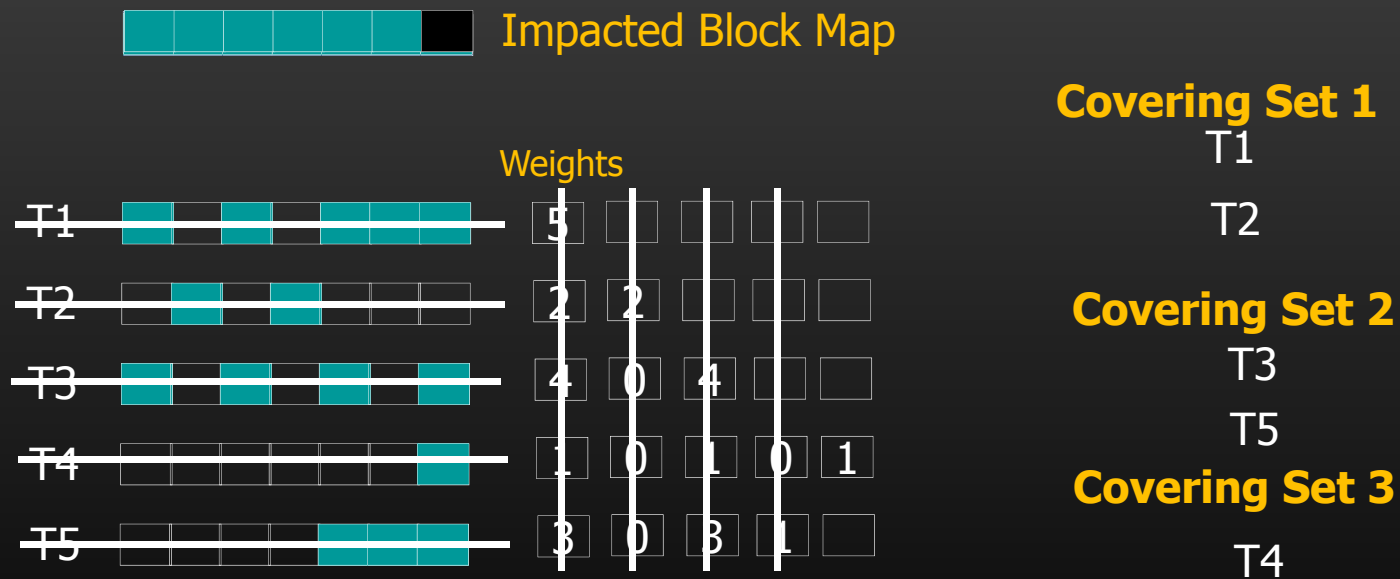
Trading Time For Quality?
Test Prioritization

Test Prioritization Concept



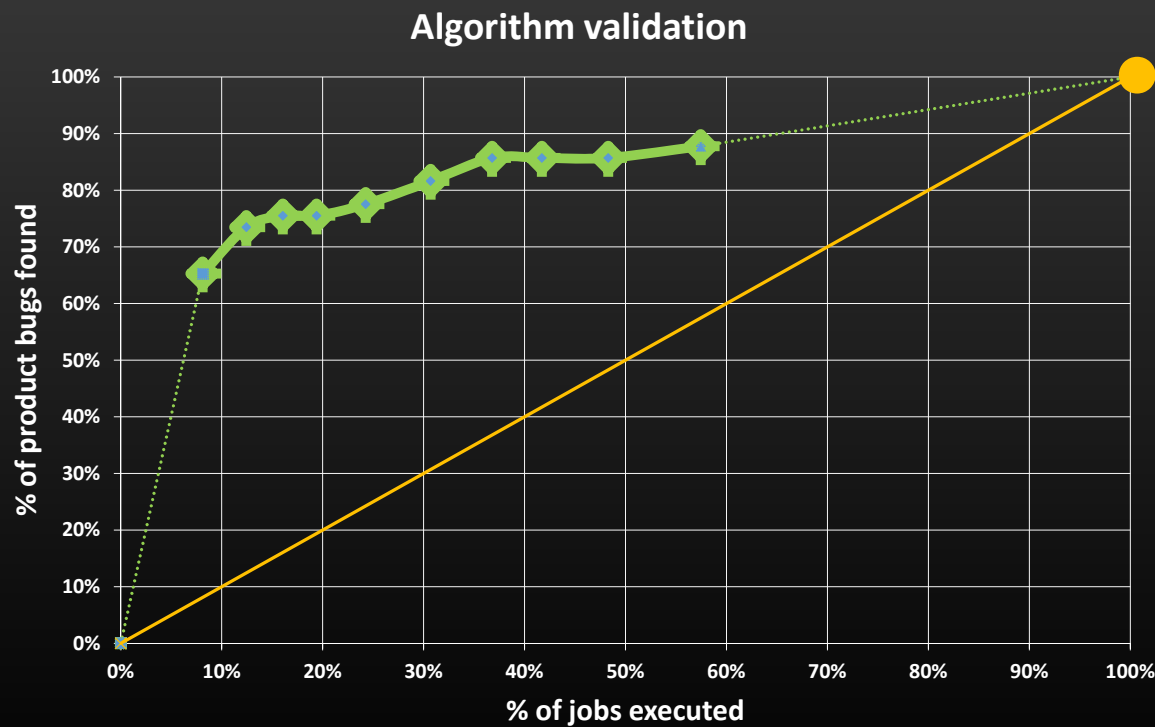
- **Goal:** for bugs that are discoverable with existing tests, find them early in the test pass
- Use information about changes to order tests to max. chances of achieving the goal
- Draw **a line** through a prioritized test suite → **test selection**

Basic Test Prioritization Idea



 Denotes that a trace T covers the impacted block

Effectiveness



Comparing:
3 month SxS experiments

- 800k+ tests, ~380 hours of total machine time with
- 13,800k+ tests and 4,500 hours of total machine time

Results

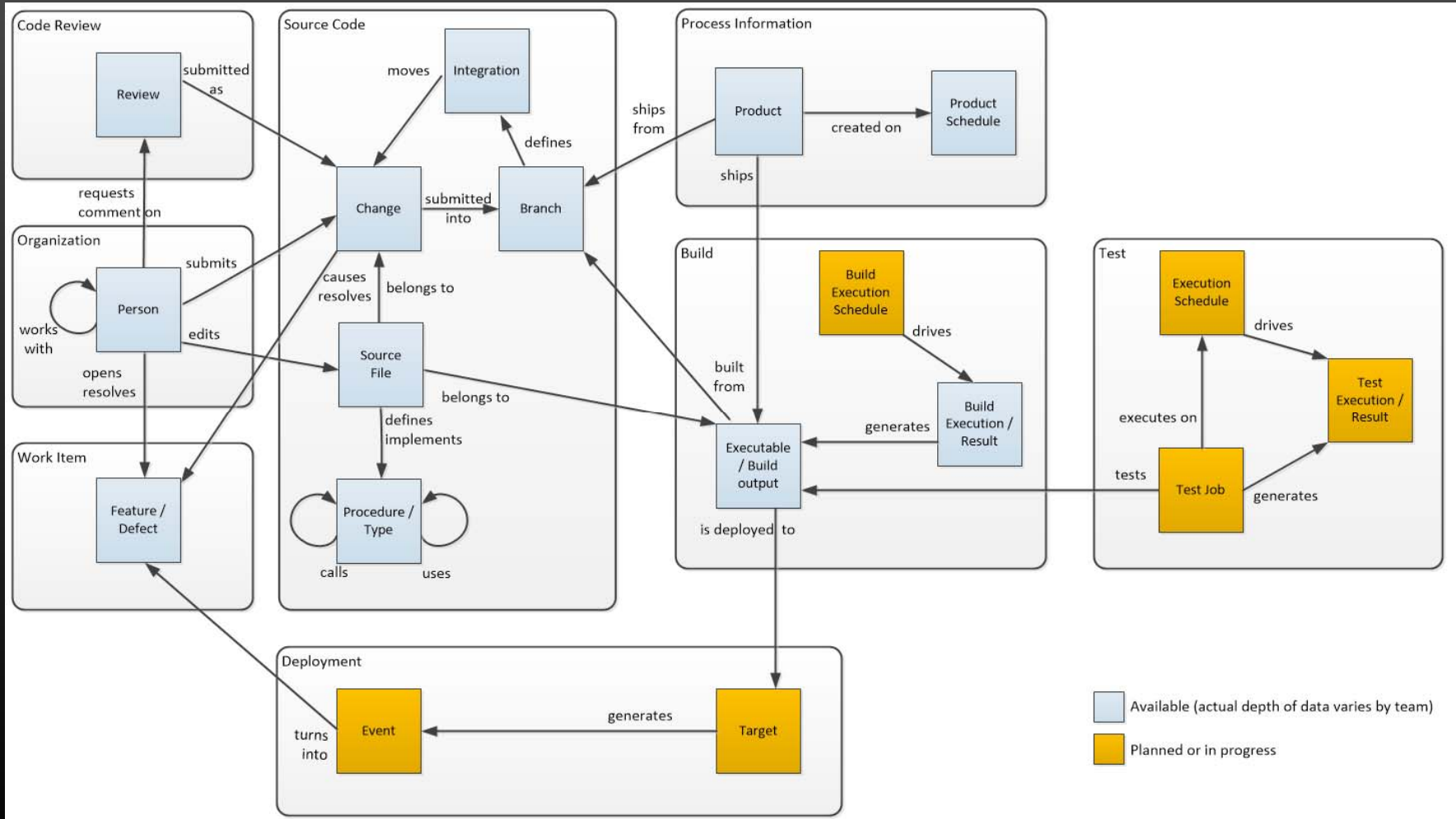
- **Faster daily tests with good effectivity**
Running only 20% of tests daily with 78% bug detection rate
- **Same reliability**
Running all tests on the weekend with 100% bug detection rate
- **Infrastructure savings (\$)**
Having fewer test machines to maintain

The Enabler: CodeMine

Collects all development process data (people, sources, bugs/features, code reviews) for all large product groups, **makes it queryable** and **provide analysis** on top.

Currently mining ~100 repositories; ~30TBs of data, 200 direct active users + tools + dashboards

Depth of CodeMine



CodeMine-enabled Scenarios :: Examples

Enable **company wide special purpose tools** (in 7 BGs)

- Branch optimization
- Risk analysis
- Test prioritization

Drives **product specific dashboards** (in 4 BGs)

- Churn, risks, bugs, ownership, velocity, build & test verdicts,...

Allow **custom queries for one-off engineering decisions** (in 6 BGs)

- Onboarding, build break analysis & alerting, perf. analysis, Org optimization, ...

Lessons learned

- Uniform representation
- Individual instances
- Policies for security, etc
- Encode process information
- Federate data access
- Discoverability

Engineering data is a gold mine for process, practice, tool improvement

<http://research.microsoft.com/~schulte>

For papers please
search for the websites of
the people on the right
e.g. enter “Chris Bird Microsoft”

or simply:

<http://research.microsoft.com/ese/>
<http://research.microsoft.com/tse/>

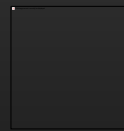
Insights by



Chris Bird



Jacek Cerwonka



Brendan Murphy



Nachi Nagappan



Alex Teterov (no website)



Tom Zimmermann