

Fault-Based Testing

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Agenda

- ▶ Good tests
- ▶ Why coverage shouldn't be used a-priori
- ▶ Fault models
- ▶ Testing based on fault models
- ▶ Discussion

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What's a good test case?

- ▶ “Ability to detect failures”
 - ▶ No good test cases for a perfect program!
- ▶ “Ability to detect potential failures”
 - ▶ “Potential”? Effort?
- ▶ “Ability to detect potential (or: likely) failures with good cost-effectiveness”
 - ▶ Writing/executing/evaluating/maintaining the test
 - ▶ Remaining failures in the field—severity
 - ▶ Going from failure to fault
- ▶ Perfect! And useless!

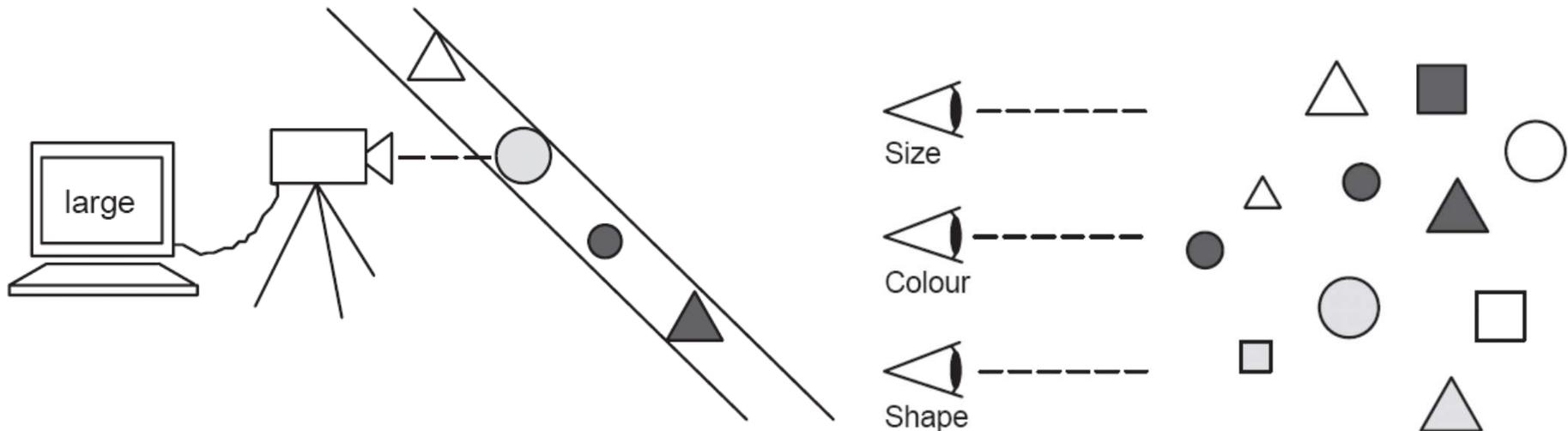
Coverage-Based Testing

- ▶ Challenge: operational, measurable quality of tests
 - ▶ „Adequacy“: selection, stopping, assessment criteria
- ▶ Adequacy criteria induce partition of input domain
 - ▶ Requirements
 - ▶ Coverage criteria
 - ▶ [Faults]

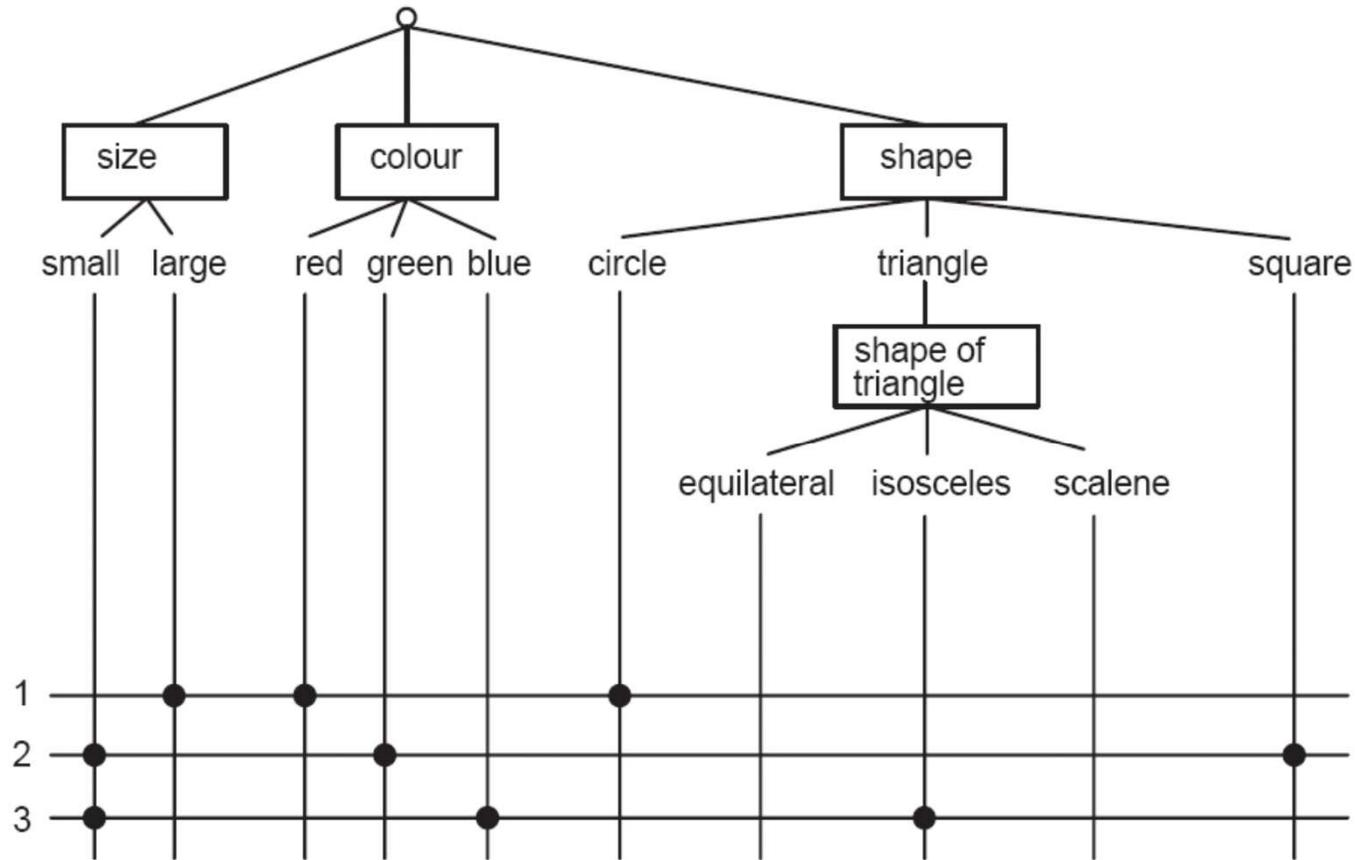
- ▶ Coverage a good response?

Input space partition: category-partition method

- ▶ Consider input space “under various aspects”
- ▶ For each “aspect”, form disjoint and complete set of classes
- ▶ (Iterate: build recursive classification)
- ▶ Instantiate classes so that the input domain is “covered”

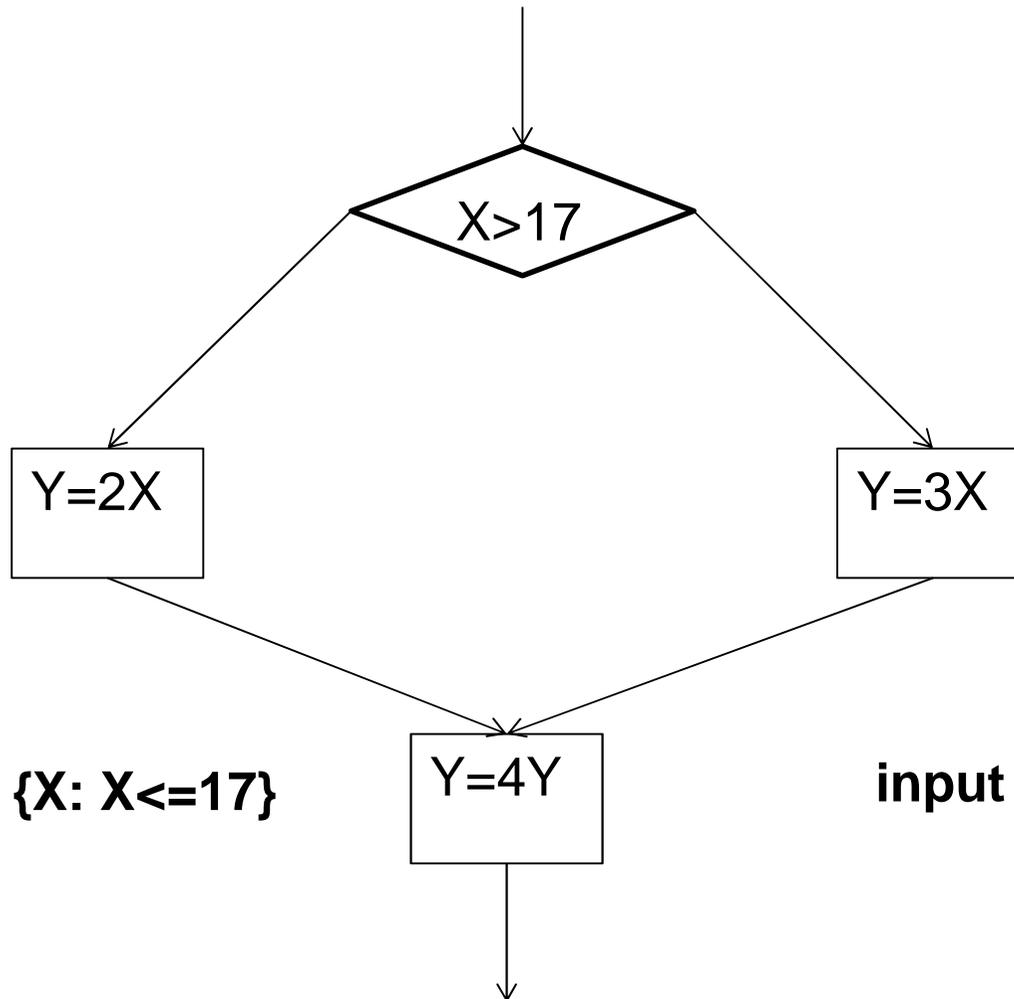


Input space partition: category-partition method



Input Space Partitioning: Coverage Criteria

```
if(X>17)
  Y=2*X;
else
  Y=3*X;
  Y=4*Y;
```



input block 1: {X: X ≤ 17}

input block 2: {X: X > 17}

Bottom line

- ▶ Coverage-based testing instance of partition-based testing
- ▶ [Coverage: statement/branch/condition/MCDCC ... coverage; also def-use pairs]

Agenda

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Simple decision

Pick two test cases for

if $x==1$

$f(g(h(i(j(k(l(m(x))))))))$

else

$m(l(k(j(i(h(g(f(x))))))))$

endif

[nondeterministic f..m]

Simple decision

Now, pick two test cases for

if $x==1$

$f(g(h(i(j(k(l(m(x))))))))$

else

$f(g(h(x)))$

endif

Simpler decision

And now, pick two test cases for

```
if x==1
```

```
    f(g(h(i(j(k(l(m(x))))))))
```

```
else
```

```
    print „Gott mit Dir, Du Land der Bayern“
```

```
endif
```

So what?

- ▶ Structural criterion a good idea?
- ▶ Fault model matters!

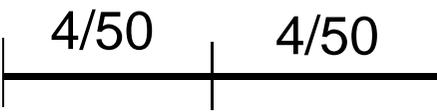
Disclaimer

- ▶ Truth somewhat more complicated:
coverage criteria usually applied to all function definitions,
not just the main function
- ▶ General idea applicable nonetheless
- ▶ Plenty of empirical evidence that coverage is not helpful
when used a-priori, mixed findings for a-posteriori usage
most recent [Inozemtseva&Reid'14]

Random and Partition Testing

- ▶ Partition testing can be **better, worse, or the same** as random testing
 - ▶ 8 in 100 inputs failure-causing, select $n=2$ tests
 - ▶ $P_r = 1 - (1 - \theta)^n = 1 - (1 - .08)^2 = .15$
- ▶ $k=2$ subdomains

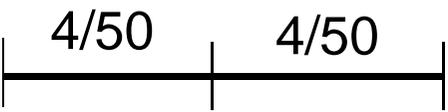
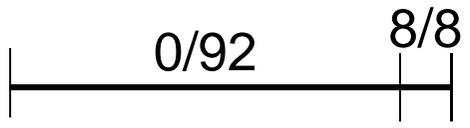
▶ $P_p = 1 - \prod_{1 \leq i \leq k} (1 - \theta_i)^{ni} = 1 - (1 - 4/50)^2 = P_r$



The diagram consists of a horizontal line with two vertical tick marks. Above the line, the first segment is labeled '4/50' and the second segment is also labeled '4/50'. This represents two subdomains of equal size, each containing 4 failure-causing inputs out of 50 total inputs.

Random and Partition Testing

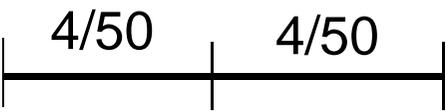
- ▶ Partition testing can be **better, worse, or the same** as random testing
 - ▶ $d=100$, 8 inputs failure-causing, $n=2$ tests to be selected
 - ▶ $P_r=1-(1-.08)^2=.15$
- ▶ $k=2$ subdomains

- ▶ $P_p=1-\prod_{1 \leq i \leq k} (1 - \theta_i)^{ni} = 1-(1-4/50)^2 = P_r$

- ▶ $P_p=1 > P_r$


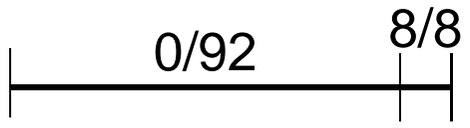
Random and Partition Testing

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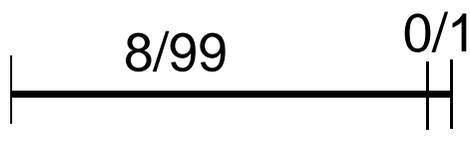
▶ $P_p=1-\prod_{1 \leq i \leq k} (1-\theta_i)^{ni} = 1-(1-4/50)^2 = P_r$



▶ $P_p=1 > P_r$



▶ $P_p=1-(1-0/1)*(1-8/99)=.08 < P_r$



Results (Weyuker&Jeng 1991)

- ▶ In general, partition based can be as good as, better than, or worse than random testing
 - ▶ **Fault-prone blocks not known in advance**

- ▶ [yes several reasonable objections to this model]
- ▶ [Generalizations]

Discussion

- ▶ If a-priori failure likelihoods are not known (or their characteristics or characteristics of their expectation), then partition-based testing **can be good or bad!**
- ▶ Yes, coverage is good from a management perspective.
Yes, MC/DC coverage is required by DO 178-B.
Yes, we can automate the derivation of tests.
- ▶ **But, we do it because we can and because one number is better than no number, not because it would, from a failure detection perspective, make sense!**

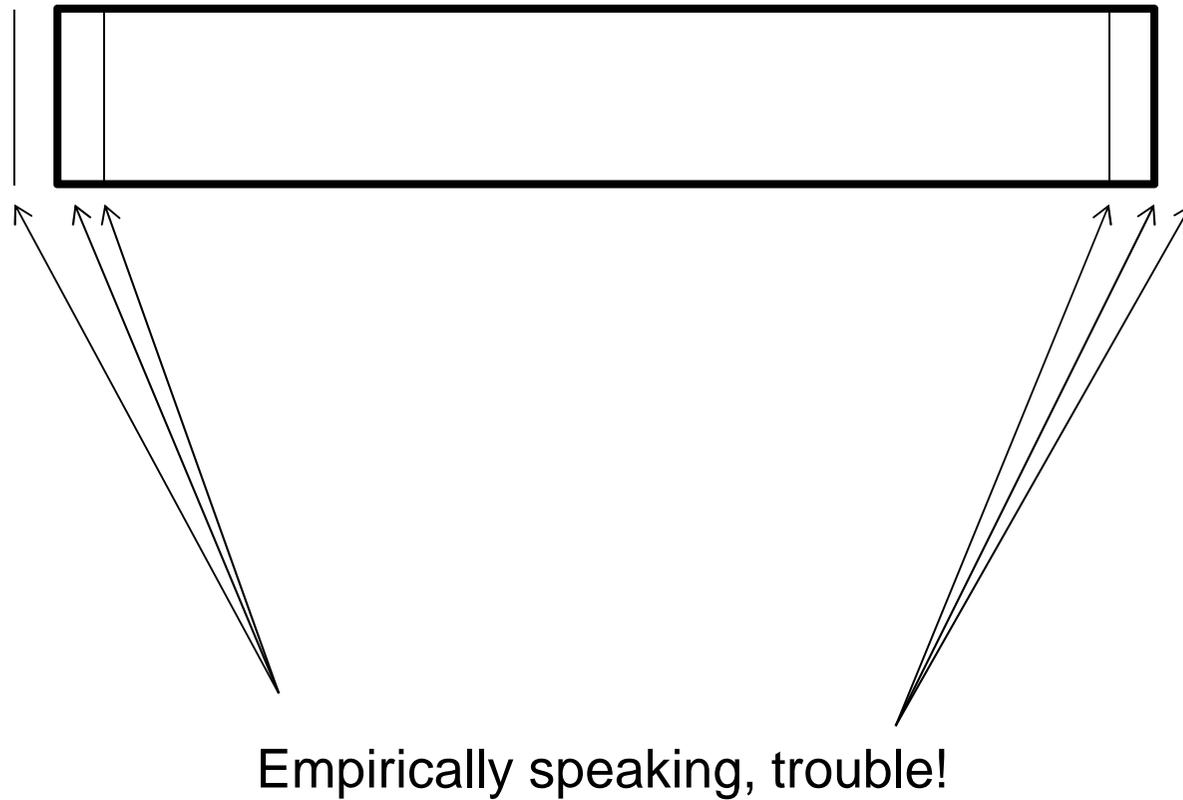
Disclaimer II

- ▶ Random testing really such a good idea?

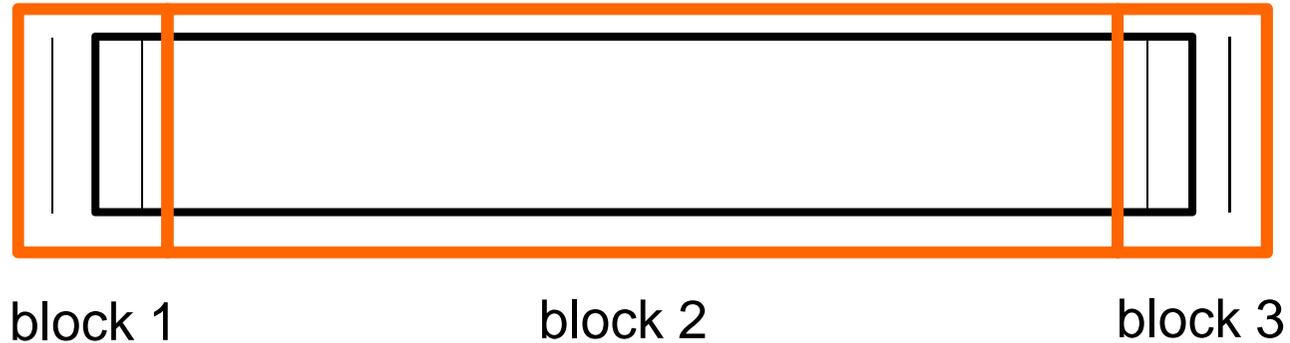
Agenda

- ▶ Good tests?
- ▶ Why coverage shouldn't be used a-priori
- ▶ **Fault models**
- ▶ Testing based on fault models
- ▶ Discussion

Limit testing?



Limit testing?



Blocks 1 and 3 with higher expected failure rates
Plus, comparably small w.r.t. block 2
Hence: can expect $E(P_p) > E(P_r)$

What's this?

- ▶ ... a fault model!

Fault models

- ▶ Limit testing
- ▶ Deadlocks, order violations, atomicity violations
- ▶ Incorrect transition, sneak paths, trap doors, corrupt states ...
- ▶ Invariant violations in subclass
- ▶ Syntactic problems as used in mutation testing
- ▶ Combinatorial testing

- ▶ Domain-specific faults

Fault models [Morell 1991, Pretschner et al. 2013]

- ▶ Faults are delta with correct programs
- ▶ Fault models are descriptions of mappings from correct to incorrect programs and/or characterizations of hypothesized failure domains
 - ▶ Combinatorial testing special case
 - ▶ Limit testing easier to grasp by failure domain
- ▶ „Effective“ fault models simple to define

Fault models

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- ▶ Invariant violations in subclass
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- ▶ Combinatorial testing

- ▶ **Domain-specific faults**

Agenda

- ▶ Good tests
- ▶ Partition-based testing: On „equivalence classes“
- ▶ Why coverage shouldn't be used a-priori
- ▶ Fault categories and models
- ▶ Testing based on fault models
- ▶ Methodology and Formalization
- ▶ Discussion

Example I: Legacy Business IT

► Recurring faults

Project P1

RPG:

- ▶ System state management
 - ▶ Variables not re-initialized between workflows
 - ▶ State kept in temp DB tables
- ▶ Hard-coded values
- ▶ Incorrect data types
- ▶ Too loose or too restrictive checks
- ▶ Arithmetic bugs
- ▶ ...

Project P2

Cobol:

- ▶ System state management
 - ▶ Global variable reuse
- ▶ Hard-coded values
- ▶ Arithmetic bugs
- ▶ Too loose or too restrictive checks
- ▶ Incorrect data types

PowerBuilder:

- ▶ Variables not re-initialized between workflows

PL/SQL:

- ▶ Too loose or too restrictive checks

Aggregated View: Examples

Fault

Too loose or too restrictive checks / conditions

System state management (has sub categories)

Variables not re-initialized between workflows

Global variable reuse

State kept in temporary DB table

Hard-coded values

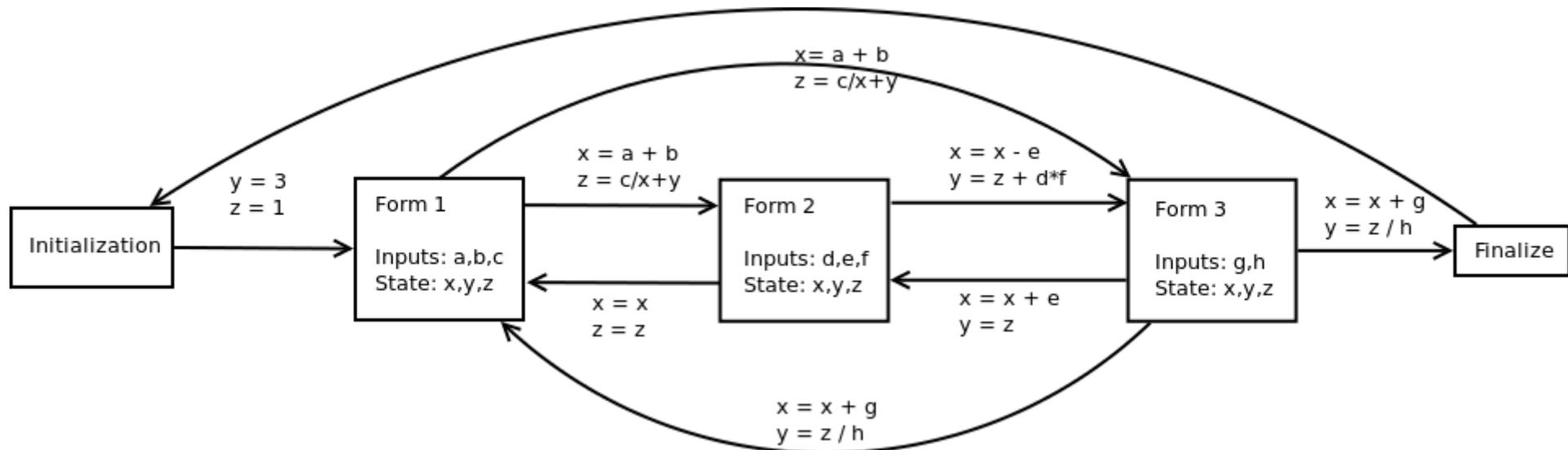
Incorrect data types

Arithmetic bugs

- And so on ...

Example: Unintended Workflows

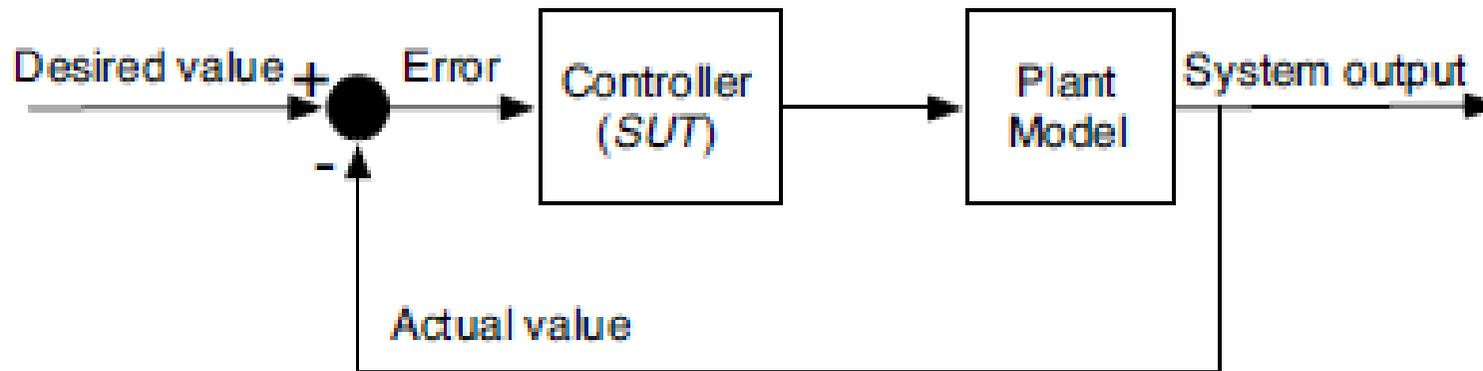
- **Problem:** navigating between forms in different ways leads to different results (failures)
- **Idea:**
 - Compare operations performed between forms (states) in different workflows
 - Use only “Next” button in GUI to determine intended or correct workflow
 - Test un-intended workflows dynamically to find high severity failures



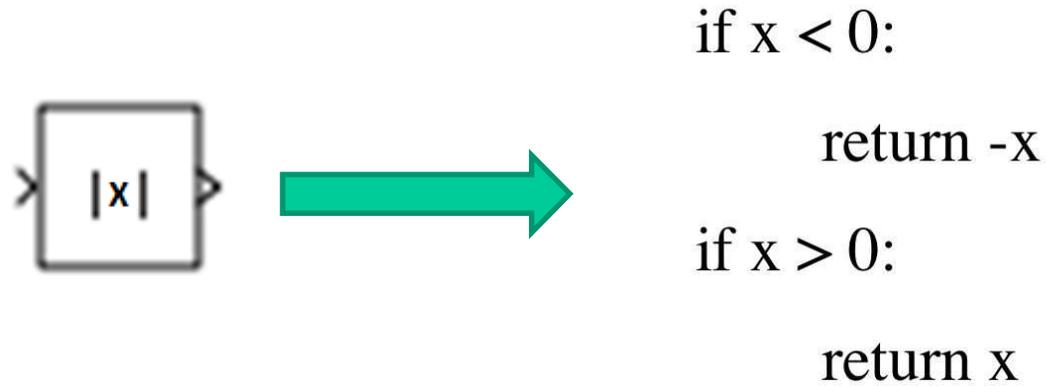
Example II: Continuous Systems

- ▶ Implementation of controllers in Matlab/Simulink
- ▶ Example 1
over/underflows; division by zero (or close-to-zero)
... using smells
A fault model.
- ▶ Example 2
problems if intended value smaller than current value –
usually, tests only for larger values
Rather a failure model.

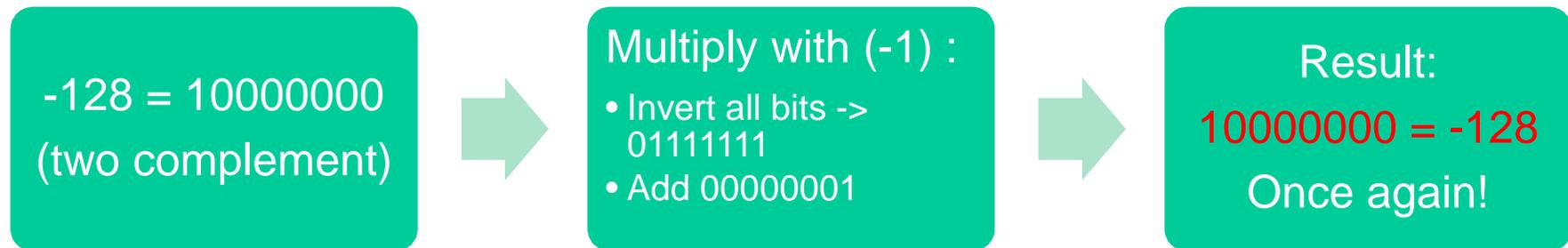
Continuous controllers and plants



Overflowing Abs – A Typical Fault Model

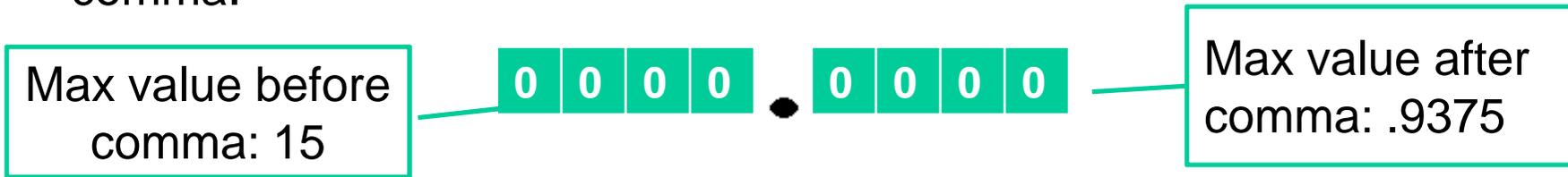


Example: 8-bit signed integer



Division by Small Value

- 8-bit unsigned fixed point value with 4 bits before and 4 after the comma.



Total value range: $15\frac{15}{16}, \dots, 15\frac{1}{16}, 15, \dots, \frac{15}{16}, \dots, \frac{1}{16}, 0$

- Example:

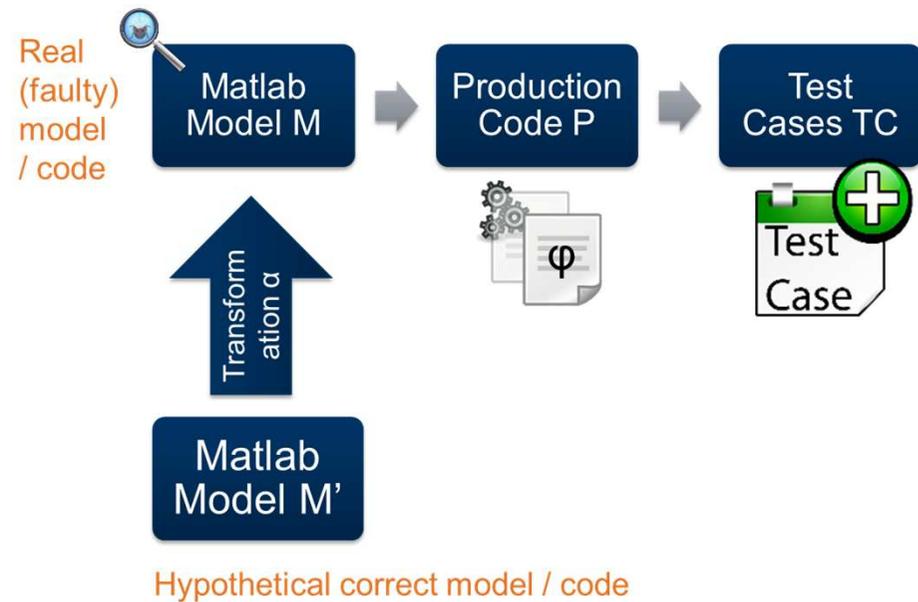
$$\frac{8}{\frac{1}{16}} = 8 \cdot 16 = 128$$

128 is far greater than the highest number (15.9375) that we could store in a 4/4-bit fixed point value

8 (decimal) as fixed point binary: 1000.0000, 1/16 as fix.p.bin: 0000.0001

8Cage [Holling et. al 2014]

- Analyze models for potential faults (smells)
- Derive and execute test as evidence for actual fault:
Use potential faults to provoke failures
- Dynamic addition of further fault models



=> Early fault detection and direct localization in the model

-
- Demo video offline if you wish

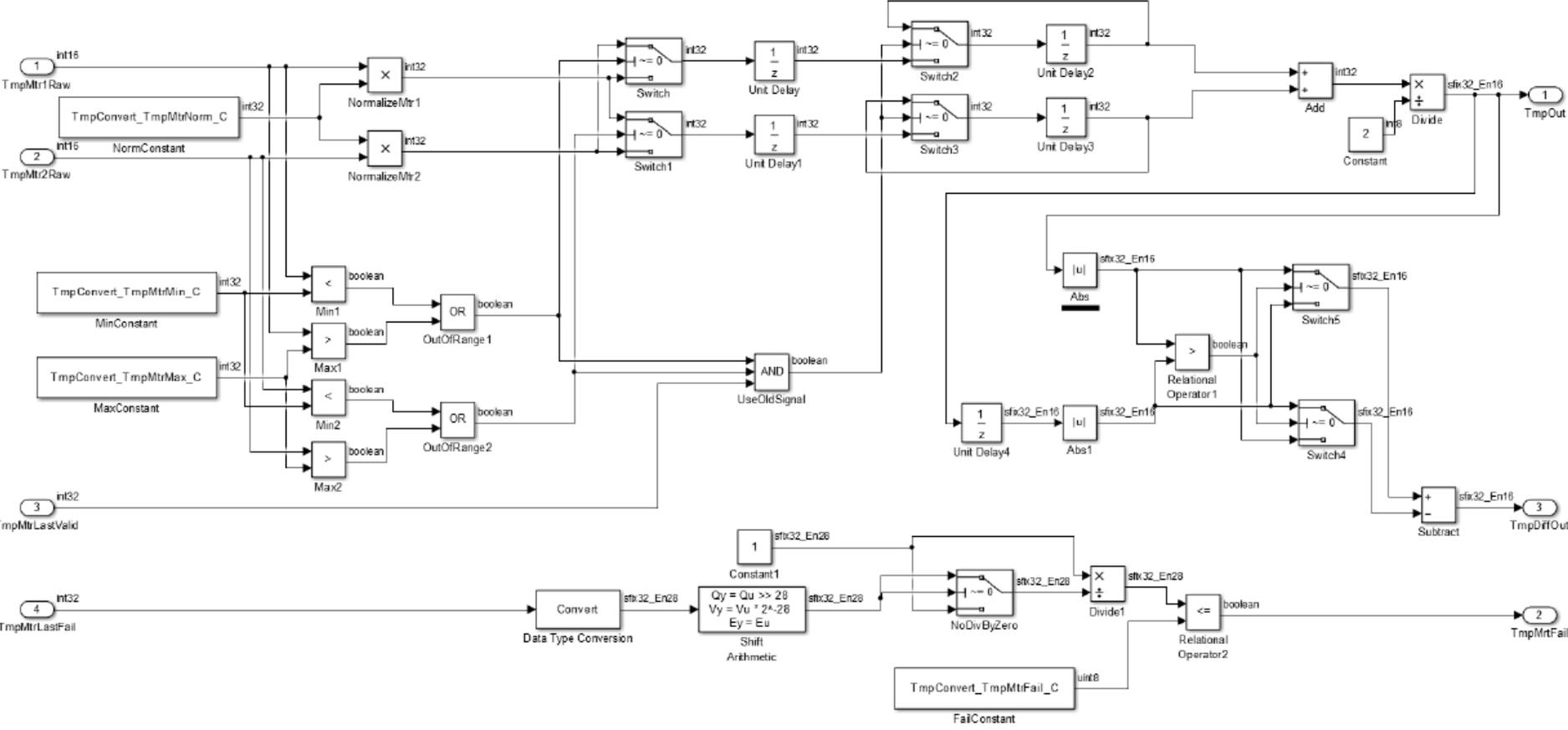
Can't we use static tools instead?

Yes we can.

But they are costly, both in terms of licenses and man power, and „trivial“ faults are annoying to the analyst – and expensive.

Similar reasoning for check lists.

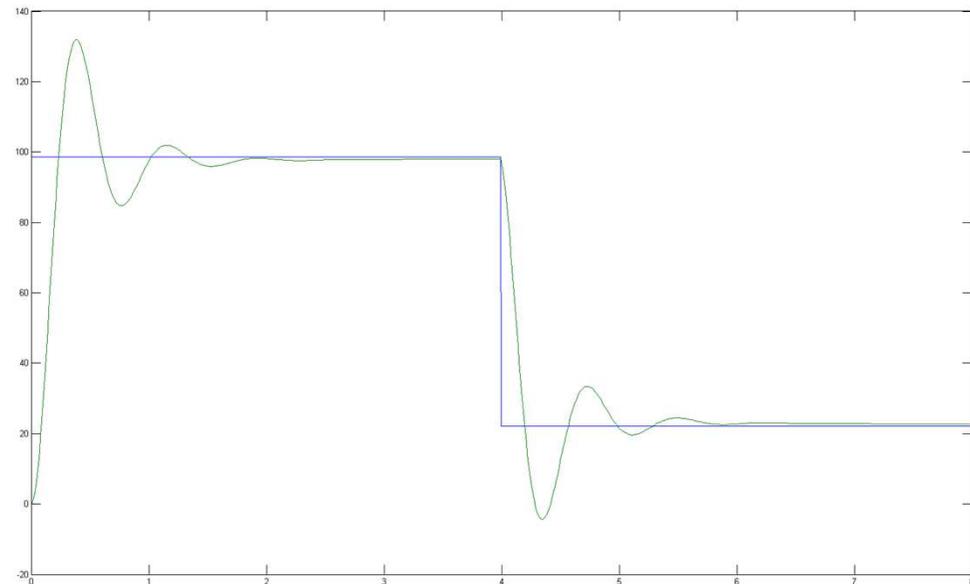
Example Controller



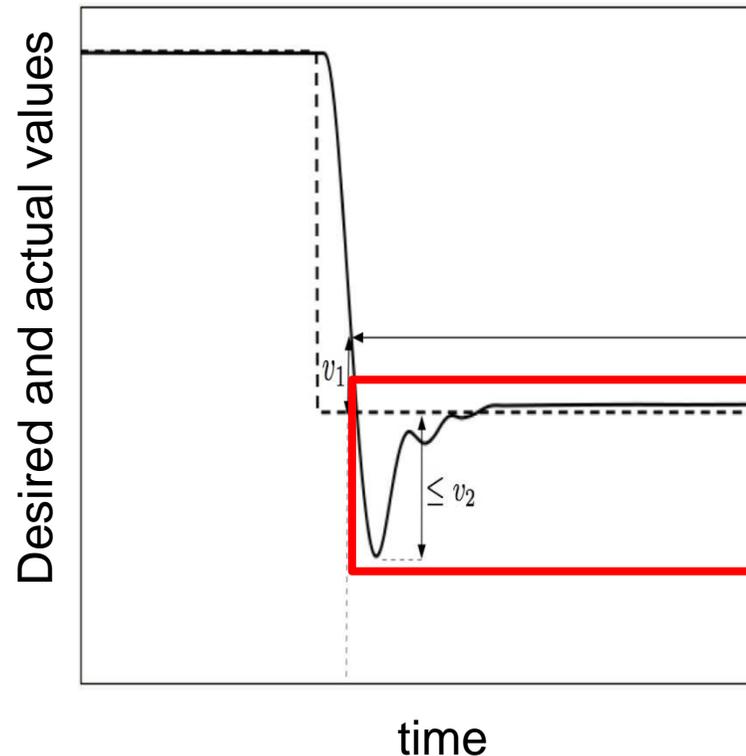
Fault Model for Continuous Systems (Failures)

- Complete test even more impossible than usual ...
 - Experts write representative tests
 - Frequent assumption: controller is in initial state (that is, 0)
 - Hence only „positive“ computations starting at 0
- ⇒ Sufficient to test requirements such as stability, responsiveness etc.?

⇒ Results by Matinnejad et al. 2013, 2014



Controller requirement – Smoothness



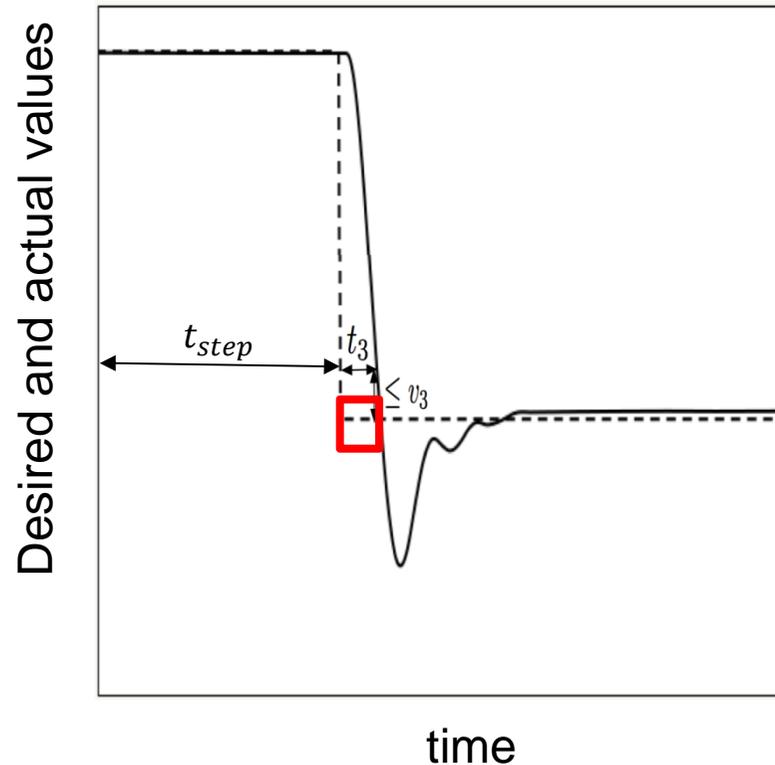
Intuition: No large over/undershoots once close to desired value

Measurement: $\max(|Actual(t) - Desired(t)|)$

where $t_{v_1} \leq t \leq t_{end}$ and t_{v_1} time when $|Actual(t) - Desired(t)| < v_1$ for the first time

Goal: maximum error $\leq v_2$ after t_{v_1}

Controller requirement – Responsiveness



- Computation:** First time until error less or equal to v_3
Measurement: *time* ($= t_3$) from t_{step} until $|Actual(t) - Desired(t)| \leq v_3$
for the first time
Goal: Check if t_3 is within required bounds

Credits

- ▶ Text book properties
- ▶ Ideas borrowed from Matinnejad et al.
- ▶ Our definitions slightly different
- ▶ Close relationship with standard controller quality criteria:
 L^1 , L^2 , ITAE, max norms

- ▶ Many more: removal of opposing force, oscillation, discretization, ...

Approach

► Simulation with two intended values (fault model)

- First half: get system to initial intended value
- Second half: get system to final intended value

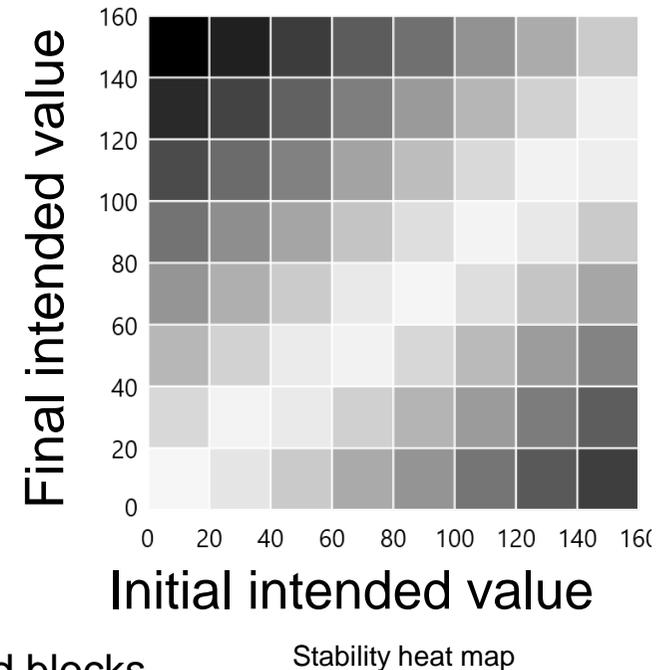
Step 1 [Matinnejad et al. 2013]:

- Partition input space into blocks
- Randomly select N points per block
- Assess requirement satisfaction per point
- Create heatmap (brighter block = better satisfaction)

Step 2 [Matinnejad et al. 2013]:

- Use more fine-grained AI search methods for selected blocks
- Find global maximum of deviation for blocks

Further fault models, e.g. oscillation of plant after reaching intended value.
[Identifying these fault models is the crucial part!]



-
- Demo video offline if you wish

Discussion

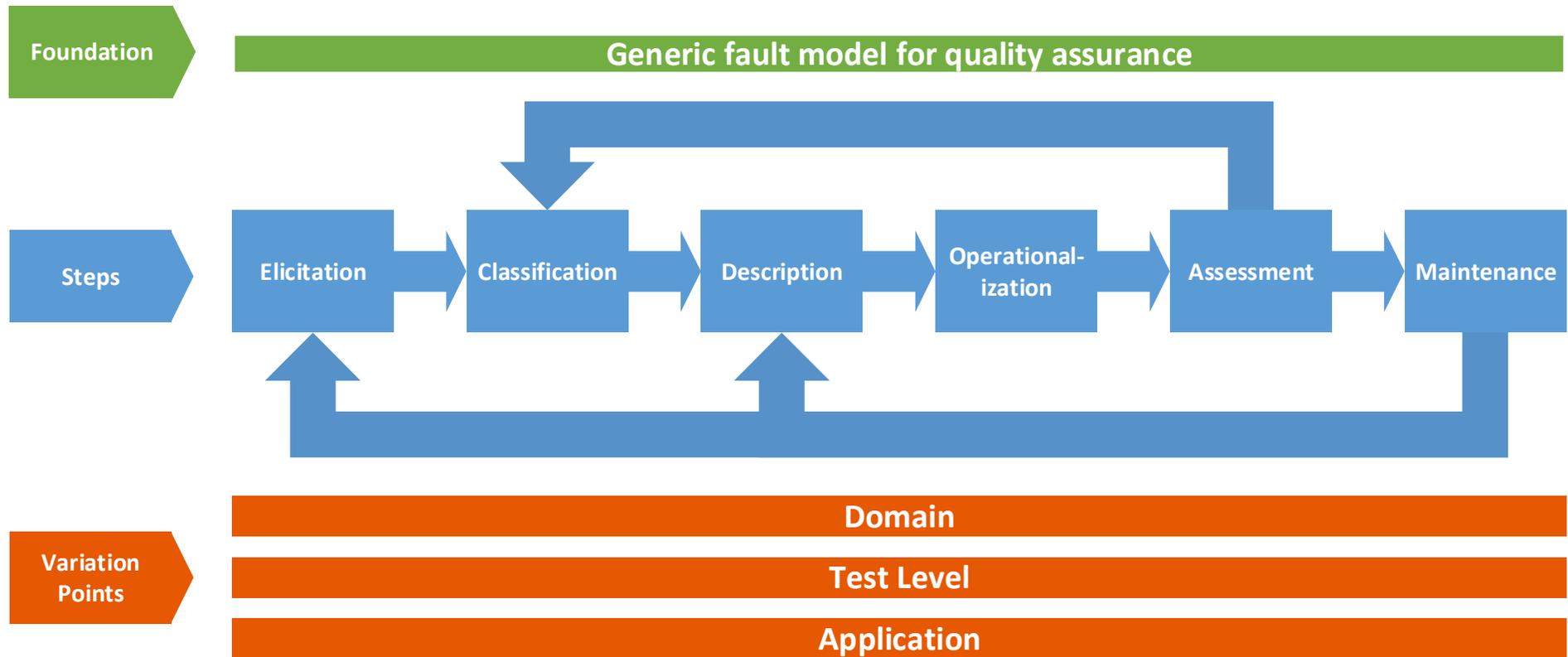
- ▶ Controller designers know what they are doing
- ▶ Various industry partners report they don't have these problems
- ▶ More interesting situation for cascading controllers

- ▶ TUM open source implementation
Source: <https://github.com/AlvinStanescu/ControllerTester>
Installer: <http://sourceforge.net/projects/controllertester/>

How to Describe Fault Models

- ▶ Ad-hoc implementations
- ▶ Currently working on generic description

Process: Big Picture



Agenda

- ▶ Good tests?
- ▶ Partition-based testing
- ▶ Why coverage shouldn't be used a-priori
- ▶ Fault models
- ▶ Testing based on fault models
- ▶ **Discussion**

Discussion

- ▶ Various tools do similar things – but for general faults
 - ▶ Test case derivation helps rule out false positives
- ▶ Fault injection not a new idea
- ▶ Fault models available –
code reading the more efficient approach?
- ▶ How much process, how much technology?
- ▶ How to build and maintain a good fault data base? Agility?
- ▶ Fault-based testing needs to be complemented

(Deliberate) Limitations

```
. . .
hashOut.data = hashes + SSL_MD5_DIGEST_LEN;
hashOut.length = SSL_SHA1_DIGEST_LEN;
if ((err = SSLFreeBuffer(&hashCtx)) != 0)
    goto fail;
if ((err = ReadyHash(&SSLHashSHA1, &hashCtx)) != 0)
    goto fail;
if ((err = SSLHashSHA1.update(&hashCtx, &clientRandom)) != 0)
    goto fail;
if ((err = SSLHashSHA1.update(&hashCtx, &serverRandom)) != 0)
    goto fail;
if ((err = SSLHashSHA1.update(&hashCtx, &signedParams)) != 0)
    goto fail;
    goto fail;
if ((err = SSLHashSHA1.final(&hashCtx, &hashOut)) != 0)
    goto fail;

err = sslRawVerify(...);
. . .
```

Wrap-Up and What's in it for you?

- ▶ „Good“ test cases require fault models
- ▶ Coverage not based on fault model
- ▶ „Fault models“ non-trivial
 - ▶ But everybody uses them all the time!
- ▶ Fault model needs to be applicable ...
- ▶ ... but not finding a problem doesn't make tests bad!!
- ▶ Operationalization: tests and check lists

- ▶ Continue to build a culture of faults!

References

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