Fault Tolerant Computing CS 530 **Random Testing** Yashwant K. Malaiya **Colorado State University**



Random Testing

- Random testing, in some form, is common for both hardware or software testing.
- It is sometimes assumed that an "average" fault can represent most faults. In reality some faults are easy to find, while some faults are very hard to find.
- For highly reliable, the real challenge is in finding hard-to-test bugs.
- "Detectability-profile" concept is introduced here.



Random Testing: Outline

- Random Testing (RT): advantages and tradeoffs
- RT vs pseudorandom testing (PR)
- Coverage and detectability profile (DP)
- Hardware and software DPs
- Connection between coverage and faults found?
- High and low testability faults during early & late testing
- Implications of an asymmetric DP



Random Testing

- Extensively used for both hardware and software
- Ideally each input is selected randomly. PR (Pseudorandom) schemes approximate random.
- Generally, quite effective for moderate coverage.
- Disadvantages:
 - Coverage hard to determine a priori.
 - Ineffective for random-pattern-resistant faults.
- Coverage tools: Random (functional) followed by Structural testing.



Random Testing: Advantage

- No test generation using structural information needed.
- Test set-up using comparison:



• Alternative: Is response reasonable?

Q: For software testing, how do you know the expected response?



Pseudorandom (PR) Testing

- Unlike true random, reproducible.
- Will not repeat until all combinations applied.
- Generation: usually just-in-time (not stored).
 - Autonomous linear feedback shift register (ALFSR).
 - Cellular automata etc possible.
- Some *randomness properties* satisfied, but not all.

Ex: Set of vectors with more 1s than 0s is not quite random.



Randomness is hard to achieve



NIST: A Statistical Test Suite for Random and Pseudorandom Number Generators for Cryptographic Applications



Coverage Achieved vs tests

- Coverage grows fast in the beginning, saturates near end.
- Is it described by
 - $C(L) = 1 e^{-aL}$?
 - No, doesn't fit.
- It is controlled by distribution of detectability of faults.
- Detectability profile (Malaiya & Yang '84):
- $H = \{h_1, h_2, \dots h_N\}$
 - N: total possible vectors
 - *h_k*: number of faults detected by exactly k vectors.



- Total faults $M = \Sigma h_k$
 - h₁: number of least testable faults

Ex: Circuit with higher h_1 would be harder to test.



Ex: Find Detectability Profile



Answer: h_k : number of faults detected by exactly k vectors. Thus $h_1 = 5$ faults, $h_3 = 1$ fault. Hence $H = (h_1, h_3) = \{5, 1\}$

Question: What is the probability that a random test will test for c s-a-1?

Detection Probability

- Detection probability: if there are N distinct possible vectors, and if a fault is detected by k of them, then its detection probability is k/N
- A fault with detection probability 1/N would be hardest to test, since it is tested by only one specific test and none other.



Detectability Profiles: Ex

CECL Full adder 45 35 Inputs=4 (N=16), M=90 30 25 hk 20 $H=(h_1,h_2,h_3,h_4,h_5,h_6,h_8)$ 15 =(1,11,2,43,21,4,8)• Schneider's counterexample 25 Hardest to test 20 circuit: 15 h, Inputs= 4 (N=16), M=4410 $H=(h_1,h_2,h_3,h_{14})=(23,19,1,1)$ 1 2 3 4 5 6 7 8 9 10111213141516

Schneider's counterexample circuit has 23 hard to test faults. A random vector has probability1/16 to detect any one of them.



Coverage with L random vectors

- h_k out of M defects detectable by exactly k vectors: detection probability k/N
- P{a defect with dp k/N not detected by a vector} = $(1 \frac{k}{\lambda T})$
- P{a defect with dp k/N not detected by L vectors} = $(1 \frac{k}{N})^L$
- Of h_k faults, expected number not covered is

$$(1-\frac{k}{N})^L h_k$$

• Expected test coverage with L vectors

$$C(L) = 1 - \sum_{k=1}^{N} (1 - \frac{k}{N})^{L} \frac{h_{k}}{M}$$



Coverage Obtained by L Vectors

• For PR tests (McClusky 87)

$$C(L) = 1 - \sum_{k=1}^{N-L} \frac{{}^{N-L}C_k}{{}^NC_k} \frac{h_k}{M}$$
$$\approx 1 - \sum_{k=1}^N (1 - \frac{k}{N})^L \frac{h_k}{M} \text{ (for Random)}$$

• For large L, terms with only low k (i.e. faults that are hard to test) have an impact. Thus only lower elements of H need to be estimated.

• For CECL Full Adder,

$$C(15) = 1 - [4.2 + 16.4 + 0.9 + 6.3 + 0.84 + 0.03 + 0 + ...] \cdot 10^{-3}$$

More in Appendix 1



Pseudorandom (PR): a vector cannot repeat, unlike in true Random.

Detectability Profile: software

- Regardless of initial profile, after some initial testing, the profile will become asymmetric
- In the early development phases, inspection and early testing are likely to remove most easy to test bugs, while leaving almost all hardest to test bugs still in.



Detectability Profile: software

• Adam's <u>Data</u> for a large IBM software product





Detectability Profile: Software

- Software detectability profile is exponential
- Justification: Early testing will find & remove easy-totest faults.
- Testing methods need to focus on hard-to-find faults.

As testing time progresses, more of the faults are clustered to the left.





Implications of Asymmetrical DP

- Faults are not alike, and an "average" fault does not represent a hard-to-test fault.
- A fault injected artificially typically does not represents a hard-to-test fault.
- Faults found early during testing are not a good sample of faults that will be found later during testing.



Implications of Asymmetrical DP

- Fault seeding
- Fault sampling
- Fault exposure ratio



Implications: Fault Seeding

- A program has x defects. We want to estimate x.
- Seed j new faults.
- Do some testing. Let faults found be j₁ seeded faults and x₁ original faults.
- Assuming $j_1/j = x_1/x$ we get $x = x_1 \frac{j}{j_1}$
- However, in reality the x faults include harder faults to test,

$$\frac{j_1}{j} > \frac{x_1}{x} \quad hence \ x > \frac{x_1 j}{j_1}$$



Implications: Estimation by Inspection Sampling

- Software with x bugs is inspected by two separate teams that finds x₁ and x₂ bugs respectively, of which x₃ are shared.
- Assuming $x_1/x = x_3/x_2$ we get $x = \frac{x_1x_2}{x_3}$
- However actually since x includes more harder to test faults,

$$\frac{x_3}{x_2} > \frac{x_1}{x} \text{ hence } x > \frac{x_1 x_2}{x_3}$$



Implications: fault exposure ratio

Let N(t) be the number of bugs at time t during testing, then if a is a parameter,

$$\frac{dN(t)}{dt} = -aN(t)$$

If a is constant, then $N(t) = N(0)e^{-at}$ [expo SRGM] However in random testing a should decline as faults get harder to find.

If testing is intelligent, then a can rise, which can give

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rise to Logarithmic SRGM
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Don't worry about this here, we will come to it when we will study software reliability.



References

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Appendix

Ex: Coverage for CECL adder

- 16 vectors (0000 to 1111), 90 potential defects (transistor level)
- A fault with det prob 1/16 has probability 0.0625 to be detected with 1 test, while fault with det prob 8/16 has 0.5 (i.e. 50%) of getting tested by it.
- With 20 vectors, 28% of faults with det prob 1/16 will still be left undetected, while those with det prob 8/16 will almost certainly be found.
- Table next gives the coverage obtained for faults with specific detectability values.



Ex: C(L) and components for CECL Full Adder

CECL full adder

N = 16

M = 90

| Hk | 1 | 11 | 2 | 43 | 21 | 4 | 8 | |
|---------------|--------|--------|--------|--------|--------|--------|--------|----------|
| k => | 1 | 2 | 3 | 4 | 5 | 6 | 8 | Coverage |
| Test Length L | | | | | | | | |
| 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 1 | 0.0625 | 0.1250 | 0.1875 | 0.2500 | 0.3125 | 0.3750 | 0.5000 | 0.2736 |
| 5 | 0.2758 | 0.4871 | 0.6459 | 0.7627 | 0.8464 | 0.9046 | 0.9688 | 0.7652 |
| 10 | 0.4755 | 0.7369 | 0.8746 | 0.9437 | 0.9764 | 0.9909 | 0.9990 | 0.9263 |
| 15 | 0.6202 | 0.8651 | 0.9556 | 0.9866 | 0.9964 | 0.9991 | 1.0000 | 0.9710 |
| 20 | 0.7249 | 0.9308 | 0.9843 | 0.9968 | 0.9994 | 0.9999 | 1.0000 | 0.9865 |

After 20 vectors:

| covered | 0.72 | 10.24 | 1.97 | 42.86 | 20.99 | 4.00 | 8.00 |
|-----------|------|-------|------|-------|-------|------|------|
| remaining | 0.28 | 0.76 | 0.03 | 0.14 | 0.01 | 0.00 | 0.00 |



Coverage of faults with different detectability values

The plot in the next slide for CECL Full Adder shows that

- Faults with high detection probability get covered soon,
- while those with low detection probability are resistant to random testing.



Coverage of partitions





Shift in profile with progress in testing

- Next slide for CECL Full Adder
- •Assume that a fault is removed from consideration when found
- •X-axis is k (k=1 hardest to find)
- •Plot shows that at the beginning there are nearly 50% of the faults with det prob k/N = 4/16.
- After 20 vectors, more than 60% of the remaining faults have det prob 2/16.
- •"Low hanging fruit" get picked quicker.



Shift in profile with progress in testing



