# "Cycles, Cells and Platters: An Empirical Analysis of Hardware Failures on a Million Consumer PCs" 

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## Introduction

- This is the first large-scale analysis of hardware failures on consumer PCs
- Two data sets:
- RAC - from Windows' Experience Improvement Program (collected from approx. 950000 machines)
- ATLAS - from reports sent when Windows boots after crash


## Data limitations

- Only Windows crashes were reported. There is no data about unrecoverable failures or application crashes.
- Opt-in participation in both programmes.


## Terminology

- TACT - Total Accumulated CPU Time
- Failures divided by type of hardware:
- CPU and associated components
- DRAM
- disk subsystem


## Failures are recurring

| Failure | $\min$ TACT | $\operatorname{Pr}[$ Ist failure] | $\operatorname{Pr}[2 n d$ fail $\mid \mathrm{I}$ fail] | $\operatorname{Pr}[3$ rd fail $\mid 2$ fails] |
| :---: | :---: | :---: | :---: | :---: |
| CPU subsytem | 5 days | I in 330 | I in 3.3 | I in I .8 |
| CPU subsytem | 30 days | I in 190 | I in 2.9 | I in I .7 |
| DRAM one bit flip | 5 days | I in 2700 | I in 9.0 | I in 2.2 |
| DRAM one bit flip | 30 days | I in 1700 | I in I 2 | I in 2.0 |
| Disk subsystem | 5 days | I in 470 | I in 3.4 | I in I .9 |
| Disk subsystem | 30 days | I in 270 | I in 3.5 | I in $\mathrm{I.7}$ |

## Underclocking vs. overclocking

|  | Vendor A |  | Vendor B |  |
| :---: | :---: | :---: | :---: | :---: |
|  | No OC | OC | No OC | OC |
| $\operatorname{Pr}[1$ st] | 1 in 400 | 1 in $2 I$ | 1 in 390 | 1 in 86 |
| $\operatorname{Pr}[2$ nd $\mid I]$ | 1 in 3.9 | 1 in 2.4 | 1 in 2.9 | 1 in 3.5 |
| $\operatorname{Pr}[3$ rd $\mid 2]$ | 1 in 1.9 | 1 in 2.1 | 1 in 1.5 | 1 in 1.3 |


|  | Underclocked | Rated |
| :---: | :---: | :---: |
| CPU subsystem | I in 460 | I in 330 |
| DRAM one-bit flip | I in 3600 | I in 2000 |
| Disk subsystem | I in 560 | I in 380 |

## Desktops vs. laptops

|  | Desktops | Laptops |
| :---: | :---: | :---: |
| CPU subsystem | I in 120 | I in 310 |
| DRAM one-bit flip | I in 2700 | I in 3700 |
| Disk subsystem | I in 180 | I in 280 |

## Interdependence of failure types

|  | DRAM failures | no DRAM failures |
| :---: | :---: | :---: |
| CPU failures | $5(0.549)$ | $2091(2100)$ |
| no CPU failures | $250(254)$ | $971,191(971,000)$ |


|  | Disk failures | no Disk failures |
| :---: | :---: | :---: |
| CPU failures | $13(3.15)$ | $2083(2090)$ |
| no CPU failures | $1452(1460)$ | $969,989(970,000)$ |


|  | Disk failures | no Disk failures |
| :---: | :---: | :---: |
| DRAM failures | $\mathrm{I}(0.384)$ | $254(255)$ |
| no DRAM failures | $1464(1460)$ | $97 \mathrm{I}, 8 \mathrm{I} 8(972,000)$ |

## Summary

| System | Topic | Finding |
| :---: | :---: | :---: |
| CPU | initial failure rate | I in 190 |
| DRAM | initial failure rate | I in 1700 |
| Disk subsystem | initial failure rate | I in 270 |
| CPU | rate after first failure | 2 order-of-magnitude increase |
| DRAM | rate after first failure | 2 order-of-magnitude increase |
| Disk subsystem | rate after first failure | 2 order-of-magnitude increase |
| DRAM | physical address locality | almost 80\% machines had a recurrence at the same |
| address |  |  |
| all | failure memorylessness | failures are not Poison |
| all | overclocking | failure rate increase $\mathrm{II} \mathrm{\%}$ to $19 \%$ |
| all | underclocking | failure rate decrease $39 \%$ to $80 \%$ |
| all | brand name / white box | brand name up to $3 \times$ more reliable |
| all | laptop / desktop | laptops $25 \%$ to $60 \%$ more reliable |

## Summary

| System | Topic | Finding |
| :---: | :---: | :---: |
| cross | CPU / DRAM | dependent |
| cross | CPU / Disk | dependent |
| cross | DRAM / Disk | independent |
| CPU | increasing CPU speed | fail. incr. per time, const per cycle |
| DRAM | increasing CPU speed | failures increase per time \& cycle |
| Disk subsystem | increasing CPU speed | fails incr. per time, decr. per cycle |
| CPU | increasing DRAM size | failure rate increase |
| DRAM | increasing DRAM size | failure rate increase (weak) |
| Disk subsystem | calendar age | rates decrease |
| CPU | calendar age | rates higher on old machines on young machines |
| Disk subsystem | intermittent faults | I5\%-39\% faulty machines |
| all |  |  |

## Other interesting works

- Bitsquatting - DNS Hijacking without exploitation

Artem Dinaburg, July 20II, Raytheon Company

- DRAM Errors in the Wild:A Large-Scale Field Study, June 2009, Google


## Bitsquatting

- Some domains
differing by one bit
from popular ones
were aquired

| Bitsquat Domain | Original Domain |
| :--- | :--- |
| ikamai.net | akamai.net |
| aeazon.com | amazon.com |
| a-azon.com | amazon.com |
| amazgn.com | amazon.com |
| microsmft.com | microsoft.com |
| micrgsoft.com | microsoft.com |
| miarosoft.com | microsoft.com |
| iicrosoft.com | microsoft.com |
| microsnft.com | microsoft.com |
| mhcrosoft.com | microsoft.com |
| eicrosoft.com | microsoft.com |
| mic2osoft.com | microsoft.com |
| micro3oft.com | microsoft.com |
| li6e.com | live.com |
| emdn.net | 2mdn.net |
| 2-dn.net | 2mdn.net |
| 2edn.net | 2mdn.net |
| 2ldn.net | 2mdn.net |
| 2mfn.net | 2mdn.net |
| 2mln.net | 2mdn.net |
| 2odn.net | 2mdn.net |
| $6 m d n . n e t ~$ | 2mdn.net |
| fbbdn.net | fbcdn.net |
| fbgdn.net | fbcdn.net |
| gbcdn.net | fbcdn.net |
| fjcdn.net | fbcdn.net |
| dbcdn.net | fbcdn.net |
| roop-servers.net | root-servers.net |
| doublechick.net | doubleclick.net |
| do5bleclick.net | doubleclick.net |
| doubleslick.net | doubleclick.net |
|  |  |

Table 3: Bitsquat domains registered for the experiment.

## Bitsquatting

- Experiment took approx. 8 months
- "(...) a total of 52,317 bitsquat requests from I2,949 unique IP addresses."



## DRAM Errors in the Wild

Table 1: Memory errors per year:

| Platf. | Tech. | Per machine |  |  |  |  |
| :---: | :---: | ---: | ---: | ---: | ---: | ---: |
|  |  | CE <br> Incid. <br> $(\%)$ | CE <br> Rate <br> Mean | CE <br> Rate <br> C.V. | CE <br> Median <br> Affct. | UEId. <br> Incid. <br> $(\%)$ |
| A | DDR1 | 45.4 | 19,509 | 3.5 | 611 | 0.17 |
| B | DDR1 | 46.2 | 23,243 | 3.4 | 366 | - |
| C | DDR1 | 22.3 | 27,500 | 17.7 | 100 | 2.15 |
| D | DDR2 | 12.3 | 20,501 | 19.0 | 63 | 1.21 |
| E | FBD | - | - | - | - | 0.27 |
| F | DDR2 | 26.9 | 48,621 | 16.1 | 25 | 4.15 |
| Overall | - | 32.2 | 22,696 | 14.0 | 277 | 1.29 |


| Platf. | Tech. | Per DIMM |  |  |  |  |  |
| :---: | :---: | ---: | ---: | ---: | ---: | ---: | :---: |
|  |  | CE <br> Incid. <br> $(\%)$ | CE <br> Rate <br> Mean | CE <br> Rate <br> C.V. | CE <br> Median <br> Affct. | UE <br> Incid. <br> $(\%)$ |  |
| A | DDR1 | 21.2 | 4530 | 6.7 | 167 | 0.05 |  |
| B | DDR1 | 19.6 | 4086 | 7.4 | 76 | - |  |
| C | DDR1 | 3.7 | 3351 | 46.5 | 59 | 0.28 |  |
| D | DDR2 | 2.8 | 3918 | 42.4 | 45 | 0.25 |  |
| E | FBD | - | - | - | - | 0.08 |  |
| F | DDR2 | 2.9 | 3408 | 51.9 | 15 | 0.39 |  |
| Overall | - | 8.2 | 3751 | 36.3 | 64 | 0.22 |  |

## DRAM Errors in the Wild

- ECC chips only
- Recurrence probability is consistent with "Cycles, Cells and Platters (...)"
- "A DIMM that sees a correctable error is 13-228 times more likely to see another correctable error in the same month"
- Error rate increases with age


## Alpha Particles

| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 0 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 0 | 0 | 0 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 |

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Effect of a single radioactive atom decay on a computer memory. The figure shows a readout of a portion of a 64 Kb DRAM memory chip. It had been filled with all ones, and a dilute radioactive source was brought close to it. About one radioactive fragment per minute hit the chip (the source emitted alphaparticles). By observing a constant readout of the memory, it was found that a single alpha-particle could cause four memory cells to change their content from a one to a zero. From C. K. Chou, IBM Poughkeepsic, 1979 (unpublished work).

## Thank you

