#### **Hard Data on Soft Errors**

A Global-scale Survey of GPGPU Memory Soft Error Rates

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#### **Motivation**

- GPUs originate in **error-insensitive** consumer graphics
- Neither ECC nor parity on most\* graphics memory

 How suitable is the installed base of consumer GPUs (and consumer GPU-derived professional hardware!)
 for error-sensitive general purpose computing?

\* of which, more later

# Why would a comp bio group care?

#### **CUDA-Enabled Package**

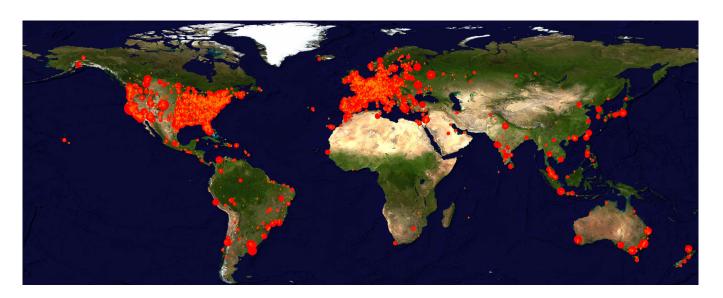
Folding@home (molecular dynamics)

**OpenMM** (molecular dynamics)

**PAPER** (3-D chemical similarity)

**SIML** (1-D chemical similarity)

Native TFLOPS*	x86 TFLOPS*	Active CPUs	Total CPUs
211	211	221349	2913112
4	4	4836	132350
25	25	7904	105536
49	49	28932	445150
1199	1265	11750	101032
2242	4731	18840	157865
1086	2291	38502	876947
4816	8576	332113	4731992
	211 4 25 49 1199 2242 1086	211 211 4 4 4 25 25 49 49 1199 1265 2242 4731 1086 2291	211     211     221349       4     4     4836       25     25     7904       49     49     28932       1199     1265     11750       2242     4731     18840       1086     2291     38502



We've written a lot of CUDA-enabled software, and we run it on a lot of GPUs.

### Methodology – MemtestG80

- Custom software, based on Memtest86 for x86 PCs
- Open source (LGPL), available at https://simtk.org/home/memtest
- Variety of test patterns:
  - Constant (ones, zeros, random)
  - Walking ones and zeros (8-bit, 32-bit)
  - Random words (on-GPU parallel PRNG)
  - Modulo-20 pattern sensitivity
  - Novel iterated-LCG integer logic tests
  - Bit fade

#### MemtestG80 – Validation

- Negative control verify that it doesn't throw spurious errors in "known-good" situations
  - Known-good PSUs, machines located in air-conditioned environments.

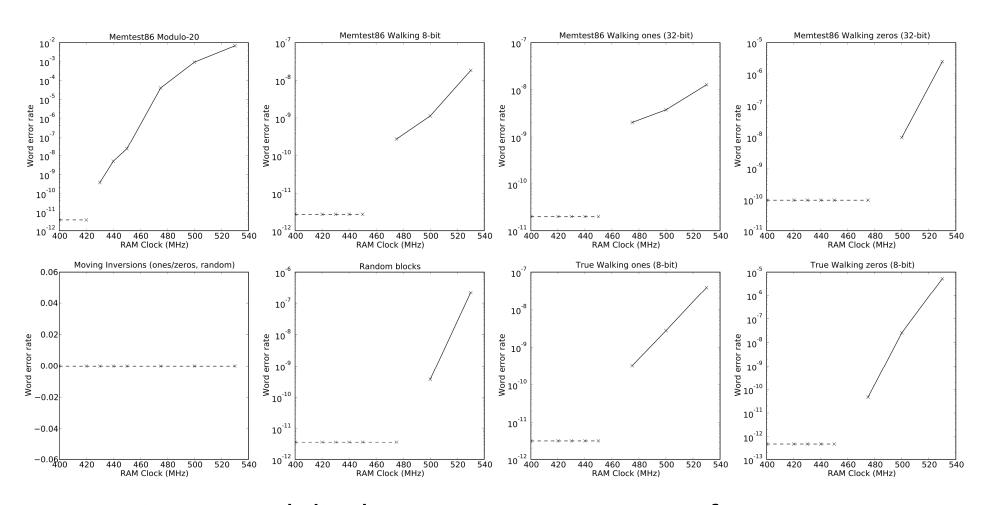
- 93,000 iterations on 700 MiB on GeForce 8800GTX
- >180,000 iters on 320MiB on each of 8 x Tesla C870

No errors ever detected.

#### MemtestG80 – Validation

- Positive control verify that it does throw errors in situations that generate errors
- Overclocking generates memory errors (violation of timing constraints; loss of signal integrity)
- Tested GeForce 9500GT (memory clock = 400MHz) at 400, 420, 430, 440, 450, 475, 500, 530 MHz
  - 20 iterations for each frequency (only 10 @ 530MHz)
  - Cooled down and reset to 400MHz between tests

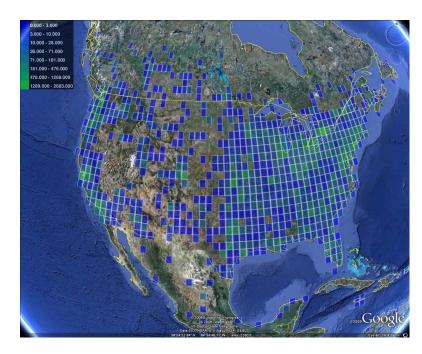
### MemtestG80 - Validation

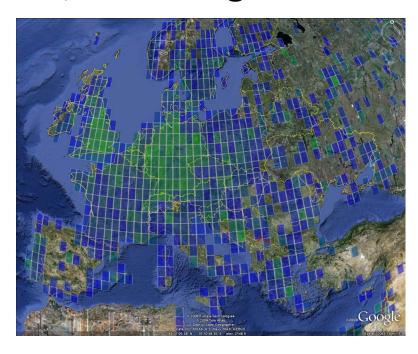


Positive control displays pattern sensitivity of memory tests

### Methodology – Folding@home

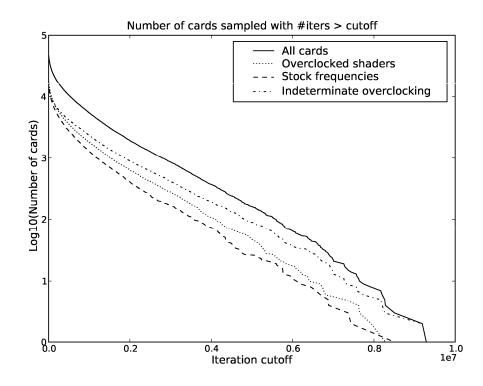
- Expect a low error rate and environment sensitivity,
   so must sample many cards in diverse environments
- Ran for ~7 months over 50,000+ NVIDIA GPUs on Folding@home (>840 TB-hr of testing)
- >97% of data tested 64 MiB RAM, k=512 logic LCG





# Methodology – Folding@home

- We achieve good sampling over the NVIDIA consumer product line, and a few pro cards as well.
- Sampled similar numbers of stock and (shader) overclocked boards

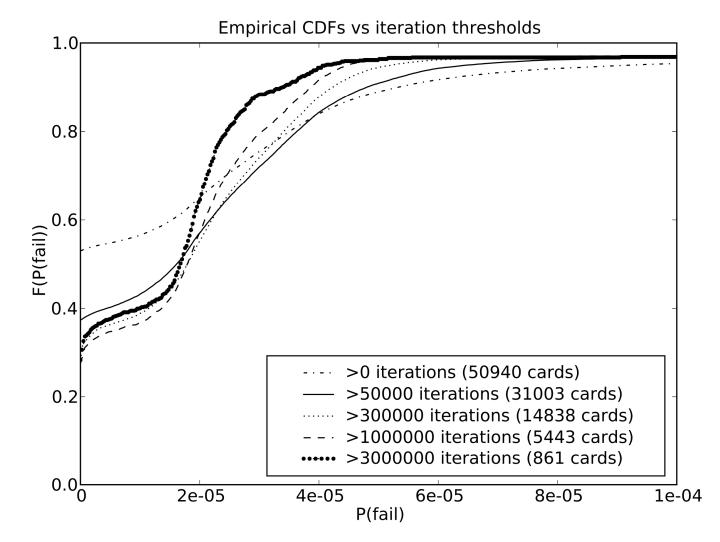


Card Family	# cards $\geq$ 300,000 iter.
Consumer graphics cards	17648 total
GeForce GTX	5520
GeForce 8800	5478
GeForce 9800/GTS	4923
GeForce 9600	1516
Other Desktop GeForce	181
Mobile GeForce	30
Professional graphics cards	89 total
Quadro FX	83
Quadroplex 2200	6
Dedicated GPGPU cards	37 total
Tesla T10	27
Tesla C1060	10

#### Results

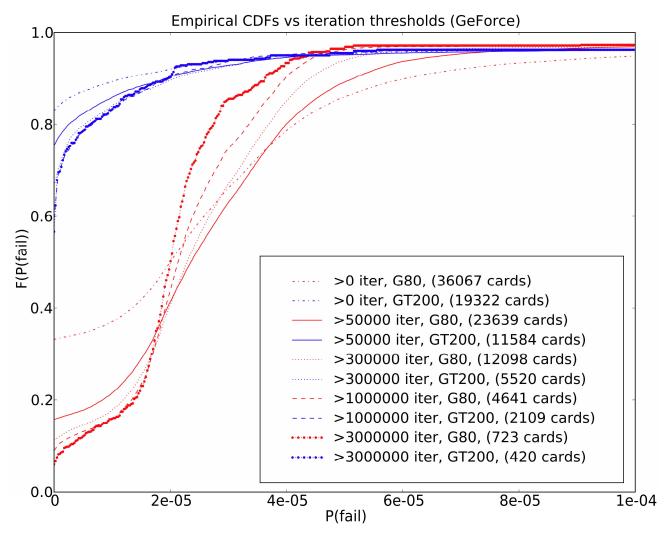
- We call a failure if any test in a MemtestG80 iteration failed (ignore exact WER)
- Model: each card has its own probability of error (test failure) =  $P_f$ . Cards are drawn iid from an underlying distribution  $P(P_f)$
- What is the distribution of failure probabilities?

### Results



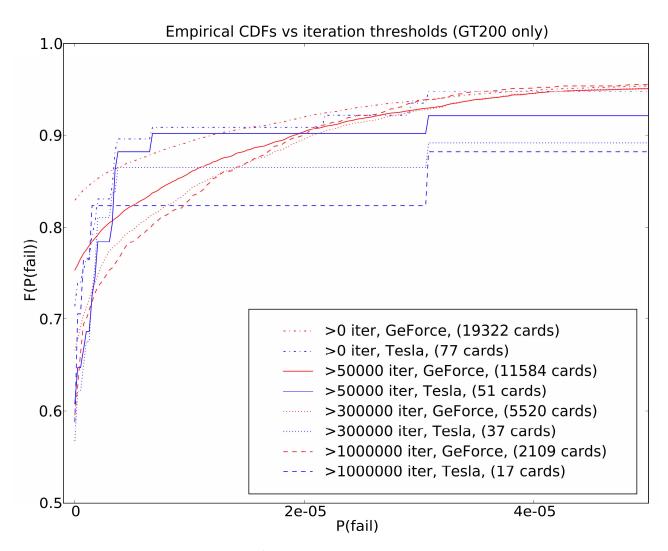
Population of failing cards has a mode around  $P_f = 2x10^{-5} = ^4 failures/week$ 

### **Analysis – Breakdown by Architecture**



GT200 has typical  $P_f = 2.2 \times 10^{-6}$  (one-tenth of G80!) Both archs. show monotonic decline in zero-error populations.

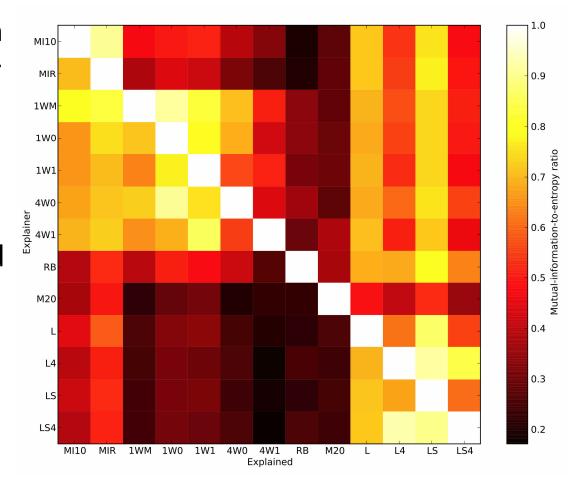
### Analysis – GeForce vs Tesla



Tesla traces are rougher from poorer sampling, but appear to represent same error distribution as GeForce data.

### **Analysis – Test Mutual Information**

- Consider mutual information between tests as a nonlinear covariance measure.
- Mod-20 test is unique
- Random blocks test is a good logic workout
- Logic tests measure a failure mode distinct from memory tests



### What about "Fermi"?

- NVIDIA's new Fermi (GF100) architecture adds SECDED ECC (disabled in consumer GeForce line?), GDDR5 memory bus ECC, and L1/L2 caches
- Does Fermi redesign affect architectural vulnerability (error rate or error type)?
  - G80/GT200 typically failed on Mod-20 test first
- FAH test does not run (yet) on Fermi; used standalone MemtestG80 w/reporting capabilities
  - In-house: 1 GeForce GTX 480, 1 Tesla C2050
  - Public: 44 GeForce GTX 470, 43 GeForce GTX 480

#### Results – Fermi

- Tesla: no app-level errors seen, at least one doublebit error reported by ECC
- **GeForce**: most cards exhibited memory errors observed in-house  $P_f = 1.6 \times 10^{-5}$ 
  - Non-overclocked cards vulnerable to 8-bit walking zeros
  - RAM-overclocked first failed 8- or 32-bit walking zeros
  - Core/shader-overclocked failed random blocks
- Very different vulnerabilities than G80/GT200 but problems still exist!

### Acknowledgments

Pande lab, Stanford University



Simbios (NIH Roadmap GM072970)



NVIDIA



Folding@home donors



### Summary

- Wrote MemtestG80 to test for GPU memory errors.
- Verified proper operation of MemtestG80 with negative and positive control tests.
- Ran MemtestG80 on over 50,000 GPUs, 840+ TB-hr
- 2/3 of tested GPUs exhibit pattern-sensitive soft errors
- Architecture makes a difference: GT200 is much more reliable than G80; GF100 introduces a new set of vulnerabilities
- GT200 Tesla cards on FAH performed similarly to GeForces (but GF100 ECC seems to make a difference on Tesla C20xx)

#### **Conclusions**

 Sufficiently high hard error rate (2%) that explicit testing is warranted.

 Some form of ECC appears to be crucial for reliable GPGPU computation.

https://simtk.org/home/memtest

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