

# Synchronization 3 and GPUs

**CS 3410, Spring 2014**

Computer Science

Cornell University

See P&H Chapter: 6.7

# Administrivia

## Next 3 weeks

- Prelim2 Thu May 1<sup>st</sup> : 7:30-9:30
  - Olin 155: Netid [a-g]\*
  - Uris G01: Netid [h-z]\*
- Proj3 tournament: Mon May 5 5pm-7pm (Pizza!)
- Proj4 design doc meetings May 5-7 (doc ready for mtg)

## Final Project for class

- Proj4 due Wed May 14
- Proj4 demos: May 13 and 14
- Proj 4 release: in labs this week
- **Remember: No slip days for PA4**

# Academic Integrity

All submitted work must be your own

- OK to study together, but do not share soln's
- Cite your sources

Project groups submit joint work

- Same rules apply to projects at the group level
- Cannot use of someone else's soln

Closed-book exams, no calculators

- Stressed? Tempted? Lost?
  - Come see us before due date!

Plagiarism in any form will not be tolerated

# Synchronization

- Threads
- Critical sections, race conditions, and mutexes
- Atomic Instructions
  - HW support for synchronization
  - Using sync primitives to build concurrency-safe data structures
- Example: thread-safe data structures
- Language level synchronization
- Threads and processes

# Synchronization in MIPS

Load linked: `LL rt, offset(rs)`

Store conditional: `SC rt, offset(rs)`

- Succeeds if location not changed since the LL
  - Returns 1 in rt
- Fails if location is changed
  - Returns 0 in rt

Any time a processor intervenes and modifies the value in memory between the LL and SC instruction, the SC returns 0 in \$t0

Use this value 0 to try again

# Mutex from LL and SC

## Linked load / Store Conditional

m = 0; // 0 means lock is free; otherwise, if m == 1, then lock locked

```
mutex_lock(int m) {  
    while(test_and_set(&m)){}  
}
```

```
int test_and_set(int *m) {  
    {  
        old = *m;  
        *m = 1;  
    } LL SC Atomic  
    return old;  
}
```

# Mutex from LL and SC

## Linked load / Store Conditional

```
m = 0;
```

```
mutex_lock(int *m) {  
    while(test_and_set(m)){  
    }  
}
```

```
int test_and_set(int *m) {
```

```
    try:
```

```
        LI $t0, 1
```

```
        LL $t1, 0($a0)
```

```
        SC $t0, 0($a0)
```

```
        BEQZ $t0, try
```

```
        MOVE $v0, $t1
```

```
}
```

# Mutex from LL and SC

```
m = 0;
```

```
mutex_lock(int *m) {
```

```
    test_and_set:
```

```
        LI $t0, 1
```

```
        LL $t1, 0($a0)
```

```
        BNEZ $t1, test_and_set
```

```
        SC $t0, 0($a0)
```

```
        BEQZ $t0, test_and_set
```

```
}
```

```
mutex_unlock(int *m) {
```

```
    *m = 0;
```

```
}
```



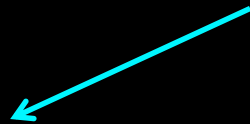
# Mutex from LL and SC

```
m = 0;
mutex_lock(int *m) {
    test_and_set:
        LI $t0, 1
        LL $t1, 0($a0)
        BNEZ $t1, test_and_set
        SC $t0, 0($a0)
        BEQZ $t0, test_and_set
}
mutex_unlock(int *m) {
    SW $zero, 0($a0)
}
```

This is called a

Spin lock

Aka spin waiting



# Mutex from LL and SC

m = 0;

```
mutex_lock(int *m) {
```

Time Step	Thread A	Thread B	Thread A \$t0	Thread A \$t1	Thread B \$t0	Thread B \$t1	Mem M[\$a0]
0							0
1	try: LI \$t0, 1	try: LI \$t0, 1					
2	LL \$t1, 0(\$a0)	LL \$t1, 0(\$a0)					
3	BNEZ \$t1, try	BNEZ \$t1, try					
4	SC \$t0, 0(\$a0)	SC \$t0, 0 (\$a0)					
5	BEQZ \$t0, try	BEQZ \$t0, try					
6							

# Mutex from LL and SC

m = 0;

```
mutex_lock(int *m) {
```

Time Step	Thread A	Thread B	Thread A \$t0	Thread A \$t1	Thread B \$t0	Thread B \$t1	Mem M[\$a0]
0							0
1	try: LI \$t0, 1	try: LI \$t0, 1	1		1		0
2	LL \$t1, 0(\$a0)	LL \$t1, 0(\$a0)	1	0	1	0	0
3	BNEZ \$t1, try	BNEZ \$t1, try	1	0	1	0	0
4	SC \$t0, 0(\$a0)	SC \$t0, 0 (\$a0)	0	0	1	0	1
5	BEQZ \$t0, try	BEQZ \$t0, try	0	0	1	0	1
6							

# Mutex from LL and SC

m = 0;

```
mutex_lock(int *m) {
```

Time Step	Thread A	Thread B	Thread A \$t0	Thread A \$t1	Thread B \$t0	Thread B \$t1	Mem M[\$a0]
0							0
1	try: LI \$t0, 1	try: LI \$t0, 1	1		1		0
2	LL \$t1, 0(\$a0)	LL \$t1, 0(\$a0)	1	0	1	0	0
3	BNEZ \$t1, try	BNEZ \$t1, try	1	0	1	0	0
4	SC \$t0, 0(\$a0)	SC \$t0, 0 (\$a0)	0	0	1	0	1
5	BEQZ \$t0, try	BEQZ \$t0, try	0	0	1	0	1
6	try: LI \$t0, 1	Critical section					

# Summary

Need parallel abstraction like for multicore

Writing correct programs is hard

- Need to prevent data races

Need critical sections to prevent data races

- Mutex, mutual exclusion, implements critical section

- Mutex often implemented using a lock abstraction

Hardware provides synchronization primitives such as LL and SC (load linked and store conditional) instructions to efficiently implement locks

# Topics

## Synchronization

- Threads
- Critical sections, race conditions, and mutexes
- Atomic Instructions
  - HW support for synchronization
  - Using sync primitives to build concurrency-safe data structures
- Example: thread-safe data structures
- Language level synchronization
- Threads and processes

# Next Goal

How do we use synchronization primitives to build concurrency-safe data structure?

Let's look at a ring buffer

# Attempt#1: Producer/Consumer

Access to **shared data** must be synchronized

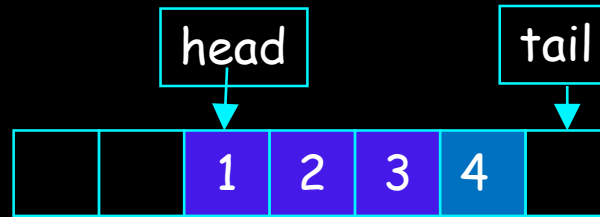
- goal: enforce datastructure **invariants**

```
// invariant:
```

```
// data is in A[h ... t-1]
```

```
char A[100];
```

```
int h = 0, t = 0;
```



```
// producer: add to list tail
```

```
void put(char c) {
```

```
    // Need: check if list full
```

```
    A[t] = c;
```

```
    t = (t+1)%n;
```

```
}
```

```
// consumer: take from list head
```

```
char get() {
```

```
    while (empty()) { };
```

```
    char c = A[h];
```

```
    h = (h+1)%n;
```

```
    return c;
```

```
}
```



# Testing the invariant

Various ways to implement empty()

1.  $h == t$

but then the put has to be careful

2. could be a separate boolean

...

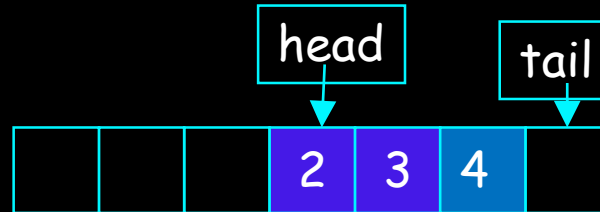
# Attempt#1: Producer/Consumer

```
// invariant:
```

```
// data is in A[h ... t-1]
```

```
char A[100];
```

```
int h = 0, t = 0;
```



```
// producer: add to list tail // consumer: take from list head
```

```
void put(char c) {.....
```

```
    A[t] = c;
```

```
    t = (t+1)%n;
```

```
}
```

```
char get() {
```

```
    while (empty()) { };
```

```
    char c = A[h];
```

```
    h = (h+1)%n;
```

```
    return c;
```

Error: could miss an update to **t** or **h** due to lack of synchronization

Current implementation will **break invariant**:

only produce if not full and only consume if not empty

***Need to synchronize access to shared data***

# Attempt#2: Protecting an invariant

```
// invariant: (protected by mutex m)
// data is in A[h ... t-1]
pthread_mutex_t *m = pthread_mutex_create();
char A[100];
int h = 0, t = 0;

// consumer: take from list head
char get() {
    pthread_mutex_lock(m);
    while(empty()) {}
    char c = A[h];
    h = (h+1)%n;
    pthread_mutex_unlock(m);
    return c;
}
```

Rule of thumb: all access and updates that can affect invariant become critical sections

# Attempt#2: Protecting an invariant

```
// invariant: (protected by mutex m)
```

```
// data is in A[h ... t-1]
```

```
pthread_mutex_t *m = pthread_mutex_create();
```

```
char A[100];
```

```
int h = 0, t = 0;
```

**BUG: Can't wait while holding lock**



```
// consumer: take from list head
```

```
char get() {
```

```
    pthread_mutex_lock(m);
```

```
    while(empty()) {}
```

```
    char c = A[h];
```

```
    h = (h+1)%n;
```

```
    pthread_mutex_unlock(m);
```

```
    return c;
```

```
}
```

**Rule of thumb: all access and updates that can affect invariant become critical sections**

# Guidelines for successful mutexing

# Insufficient locking can cause **races**

- Skimping on mutexes? Just say no!

But poorly designed locking can cause **deadlock**

**P1:** lock(m1);      **P2:** lock(m2);      **Circular**  
lock(m2);      lock(m1);      **Wait**

- Know why you are using mutexes!
- Acquire locks in a consistent order to avoid cycles
- Use lock/unlock like braces (match them lexically)
  - `lock(&m); ...; unlock(&m)`
  - Watch out for return, goto, and function calls!
  - Watch out for exception/error conditions!

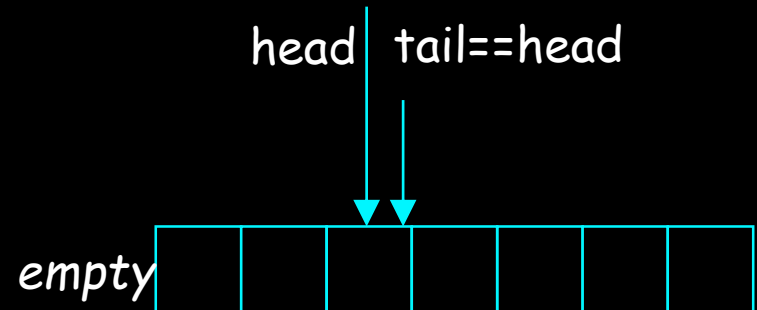
# Attempt#3: Beyond mutexes

Writers must check for full buffer  
& Readers must check if for empty buffer

- ideal: don't busy wait... go to sleep instead

```
char get() {  
    while (empty()) { };  
    lock (L);  
    char c = A[h];  
    h = (h+1)%n;  
    unlock (L);  
    return c;  
}
```

Cannot check condition while  
Holding the lock,  
BUT, empty condition may no  
longer hold in critical section



Dilemma: Have to check while holding lock

# Attempt#3: Beyond mutexes

Writers must check for full buffer

& Readers must check if for empty buffer

- ideal: don't busy wait... go to sleep instead

```
char get() {  
    lock (L);  
    while (empty()) { };  
    char c = A[h];  
    h = (h+1)%n;  
    unlock (L);  
    return c;  
}
```

Dilemma: Have to check while holding lock,  
but cannot wait while holding lock

# Attempt#4: Beyond mutexes

Writers must check for full buffer

& Readers must check if for empty buffer

- ideal: don't busy wait... go to sleep instead

```
char get() {  
    do {  
        lock (L);  
        if (!empty()) {  
            c = A[h];  
            h = (h+1)%n;  
        }  
        unlock (L);  
    } while (empty);  
    return c;  
}
```



# Language-Level Synchronization

## Condition variables

- Wait for condition to be true

- Thread sleeps while waiting

- Can wake up one thread or all threads

Monitors, ...

# Summary

Hardware Primitives: test-and-set, LL/SC, barrier, ...  
... used to build ...

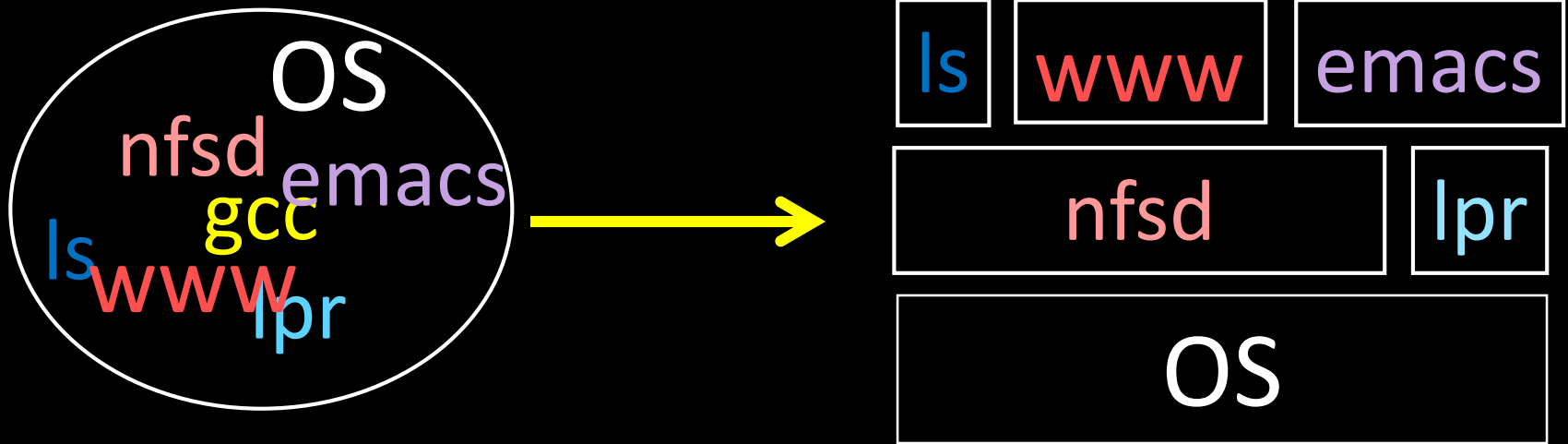
Synchronization primitives: mutex, semaphore, ...  
... used to build ...

Language Constructs: monitors, signals, ...

**PRELIM 2 CONTENT TILL HERE**

# Abstraction of Processes

How do we cope with lots of activity?



Simplicity? Separation into **processes**

Reliability? **Isolation**

Speed? Program-level **parallelism**

# Process and Program

## Process

OS abstraction of a running computation

- The unit of execution
- The unit of scheduling
- Execution state  
+ address space

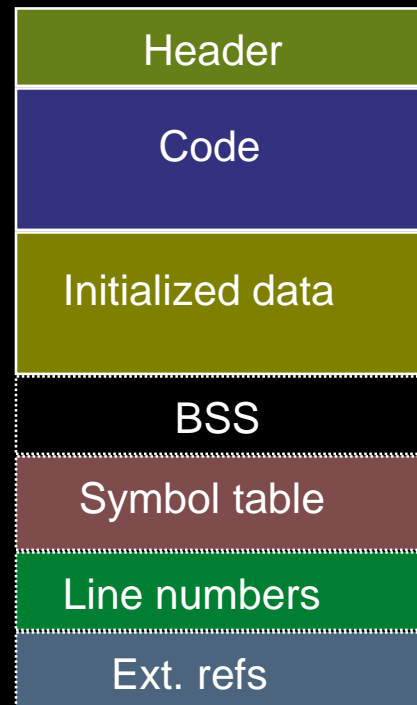
From process perspective

- a virtual CPU
- some virtual memory
- a virtual keyboard, screen,  
...

## Program

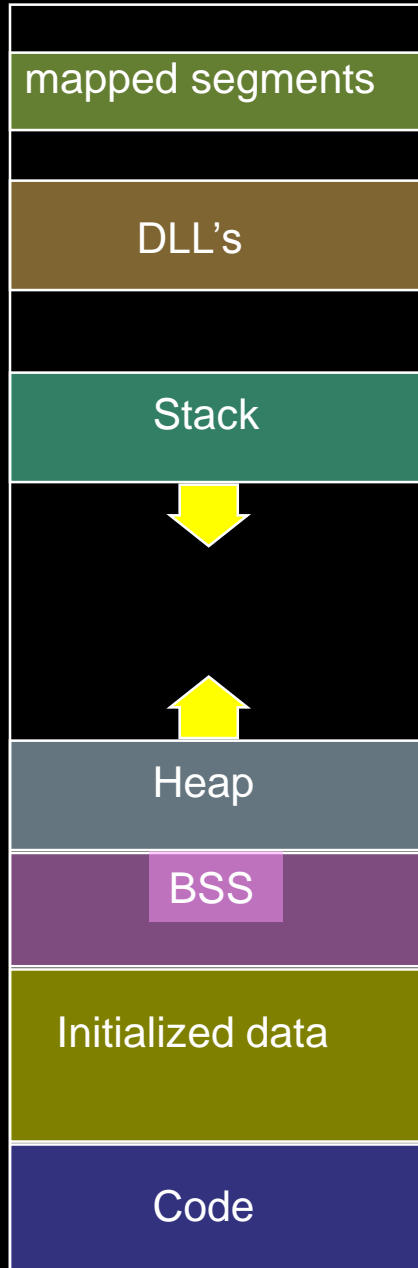
“Blueprint” for a process

- Passive entity (bits on disk)
- Code + static data

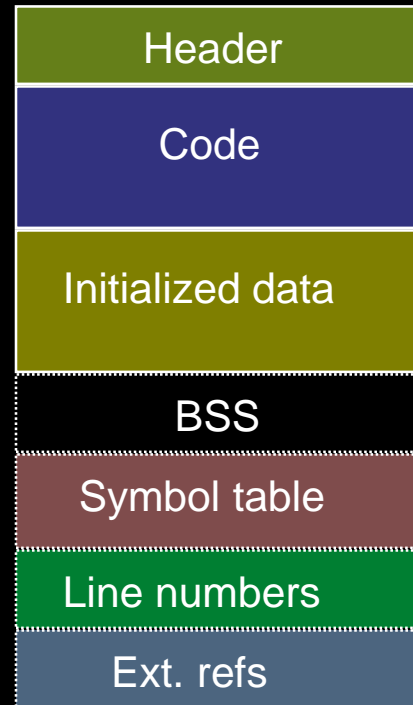


# Process and Program

## Process



## Program



# Role of the OS

## Role of the OS

### Context Switching

- Provides illusion that every process owns a CPU

### Virtual Memory

- Provides illusion that process owns some memory

### Device drivers & system calls

- Provides illusion that process owns a keyboard, ...

To do:

How to start a process?

How do processes communicate / coordinate?

# How to create a process?

Q: How to create a process?

A: Double click

After boot, OS starts the first process

...which in turn creates other processes

- parent / child → the process tree



# pstree example

```
$ pstree | view -
```

```
init-+-NetworkManager-+-dhclient
```

```
    |-apache2
```

```
    |-chrome-+-chrome
```

```
    |         `--chrome
```

```
    |-chrome---chrome
```

```
    |-clementine
```

```
    |-clock-applet
```

```
    |-cron
```

```
    |-cupsd
```

```
    |-firefox---run-mozilla.sh---firefox-bin-+-plugin-cont
```

```
    |-gnome-screensaver
```

```
    |-grep
```

```
    |-in.tftpd
```

```
    |-ntpd
```

```
    `--sshd---sshd---sshd---bash-+-gcc---gcc---cc1
```

```
                                   |-pstree
```

```
                                   |-vim
```

```
                                   `--view
```

# Processes Under UNIX

Init is a special case. For others...

Q: How does parent process create child process?

A: `fork()` system call

`int fork()` returns TWICE!

# Example

```
main(int ac, char **av) {  
    int x = getpid(); // get current process ID from OS  
    char *hi = av[1]; // get greeting from command line  
    printf("I'm process %d\n", x);  
    int id = fork();  
    if (id == 0)  
        printf("%s from %d\n", hi, getpid());  
    else  
        printf("%s from %d, child is %d\n", hi, getpid(), id);  
}
```

\$ gcc -o strange strange.c  
\$ ./strange "Hey"  
I'm process 23511  
Hey from 23512  
Hey from 23511, child is 23512

# Inter-process Communication

Parent can pass information to child

- In fact, *all parent data* is passed to child
- But isolated after (copy-on-write ensures changes are invisible)

Q: How to continue communicating?

A: Invent OS “IPC channels” : send(msg), recv(),

...

# Inter-process Communication

Parent can pass information to child

- In fact, *all parent data* is passed to child
- But isolated after (C-O-W ensures changes are invisible)

Q: How to continue communicating?

A: Shared (Virtual) Memory!

# Processes and Threads

# Processes and Threads

## Process

OS abstraction of a running computation

- The unit of execution
- The unit of scheduling
- Execution state  
+ address space

From process perspective

- a virtual CPU
- some virtual memory
- a virtual keyboard, screen,  
...

## Thread

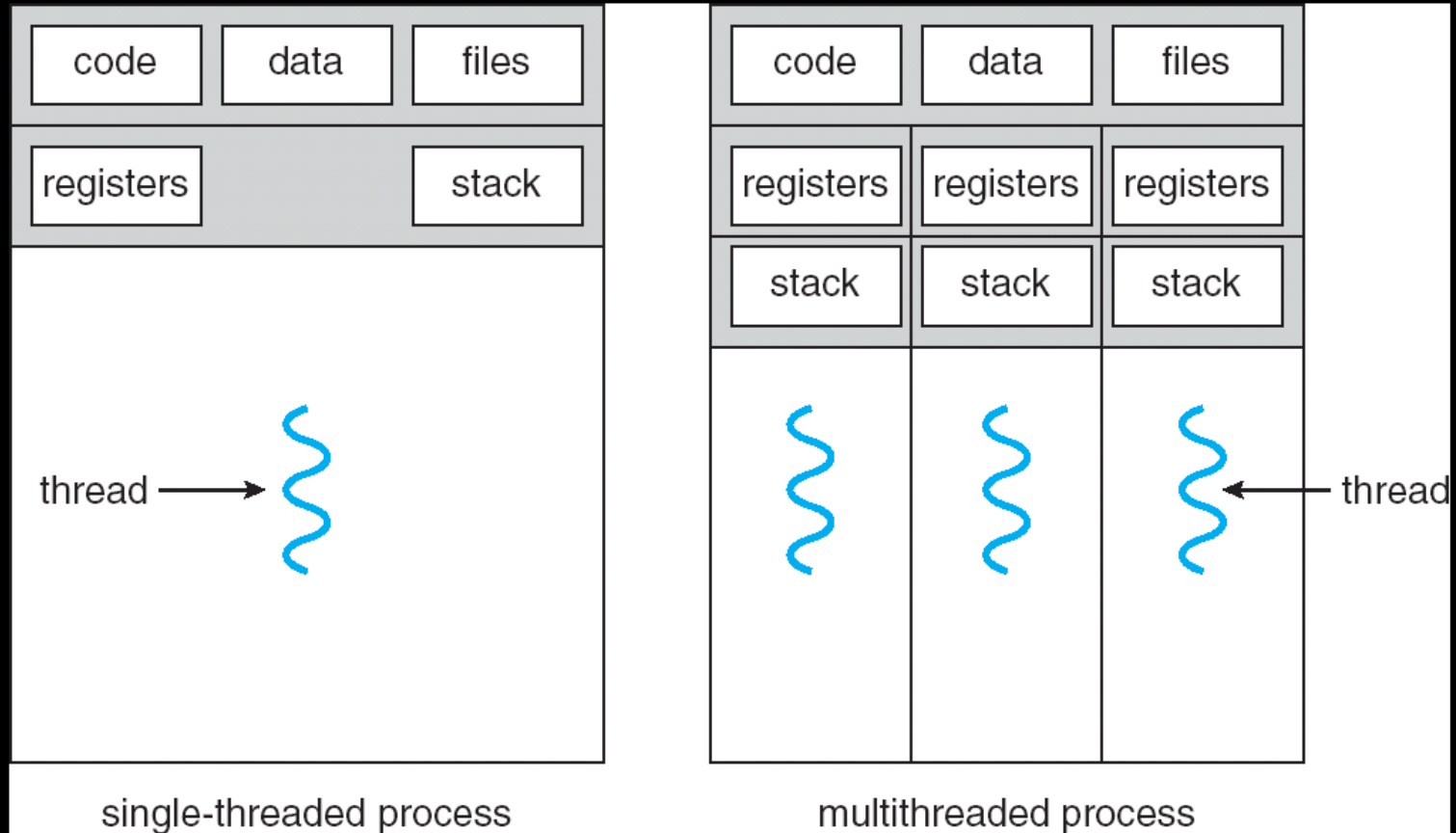
OS abstraction of a single thread of control

- The unit of scheduling
- Lives in one single process

From thread perspective

- one virtual CPU core on a virtual multi-core machine

# Multithreaded Processes





# Threads

```
#include <pthread.h>
```

```
int counter = 0;
```

```
void PrintHello(int arg) {  
    printf("I'm thread %d, counter is %d\n", arg, counter++);  
    ... do some work ...  
    pthread_exit(NULL);  
}
```

```
int main () {  
    for (t = 0; t < 4; t++) {  
        printf("in main: creating thread %d\n", t);  
        pthread_create(NULL, NULL, PrintHello, t);  
    }  
    pthread_exit(NULL);  
}
```

# Threads versus Fork

in main: creating thread 0

I'm thread 0, counter is 0

in main: creating thread 1

I'm thread 1, counter is 1

in main: creating thread 2

in main: creating thread 3

I'm thread 3, counter is 2

I'm thread 2, counter is 3

# Summary

Processes and Threads are the abstraction that we use to write parallel programs

Fork and Join and Interprocesses communication (IPC) can be used to coordinate processes

Threads are used to coordinate use of shared memory within a process

GPUs

# The supercomputer in your laptop

GPU: Graphics processing unit

Very basic till about 1999

Specialized device to accelerate display

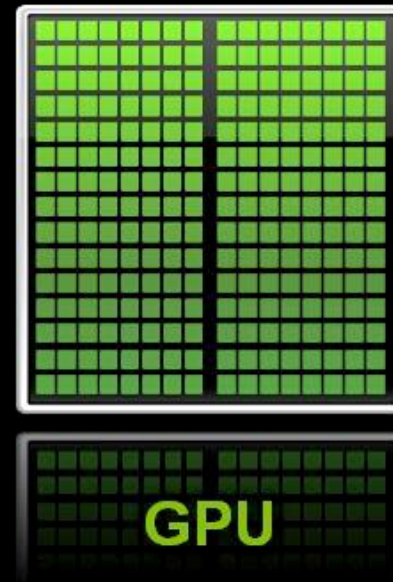
Then started changing into a full processor

2000-...: Frontier times

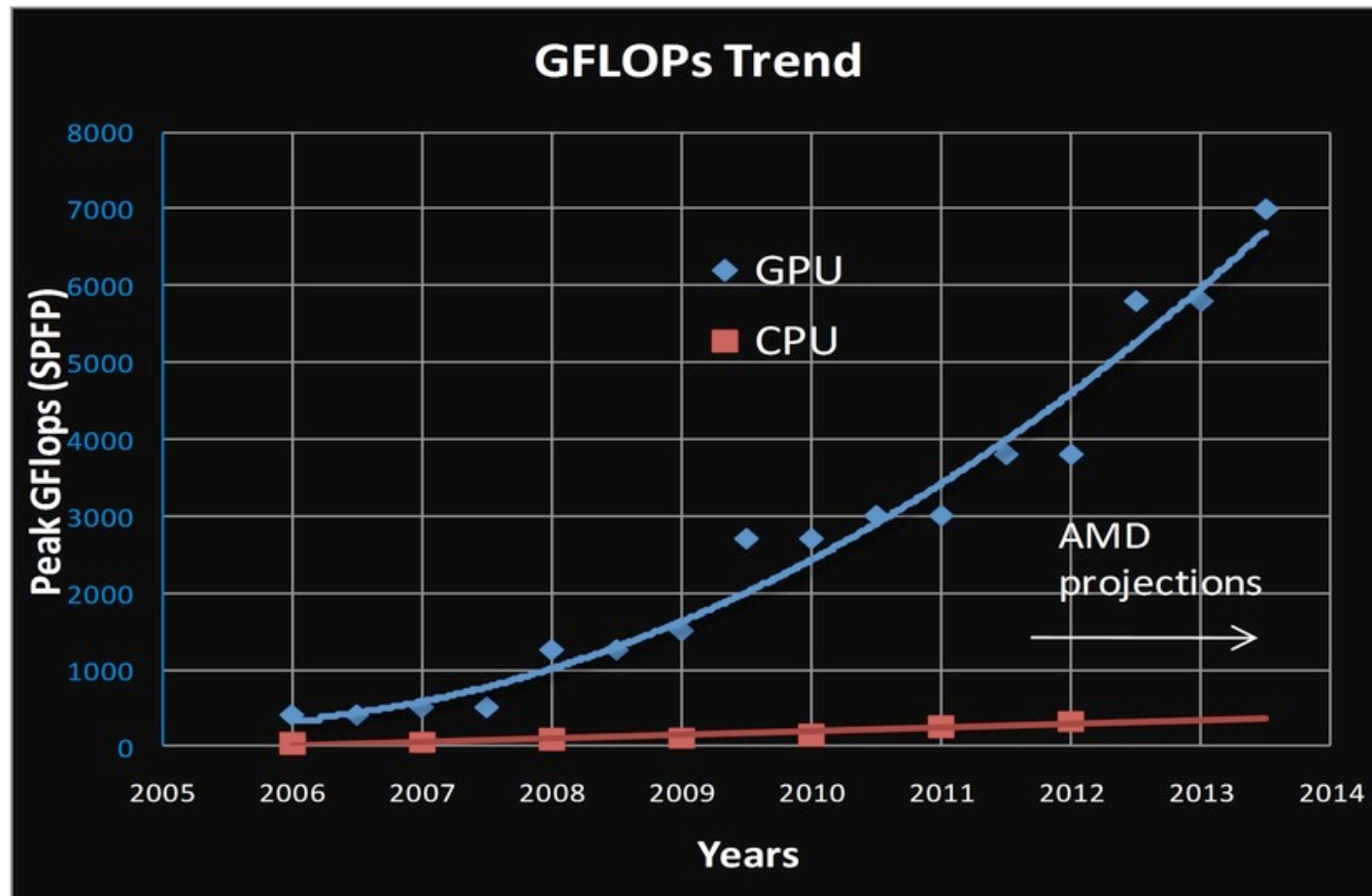
# Parallelism

CPU: Central Processing Unit

GPU: Graphics Processing Unit



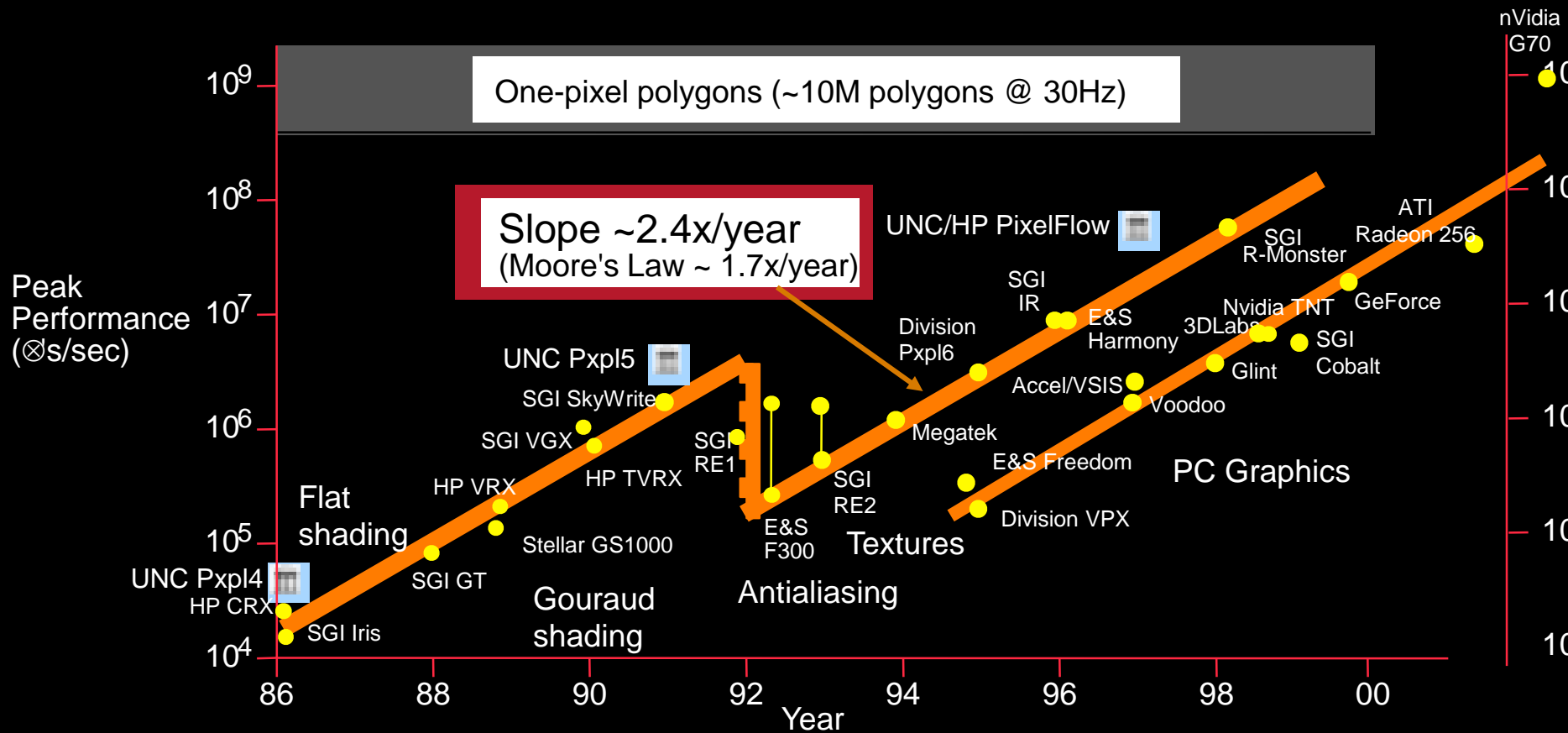
# GPU-type computation offers higher GFlops



(Source: Sam Naffziger, AMD)

# GPUs: Faster than Moore's Law

## Moore's Law is for Wimps?!



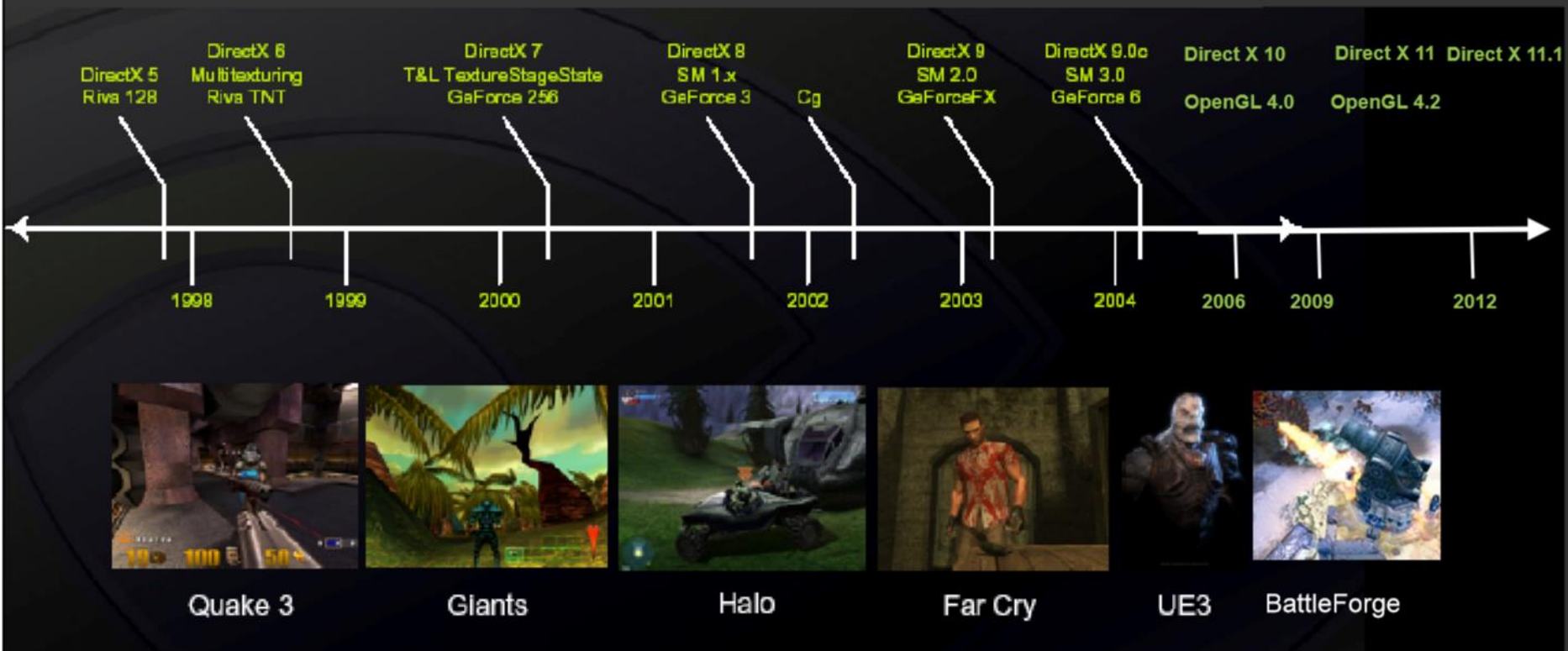
Graph courtesy of Professor John Poulton (from Eric Haines)



# Programmable Hardware

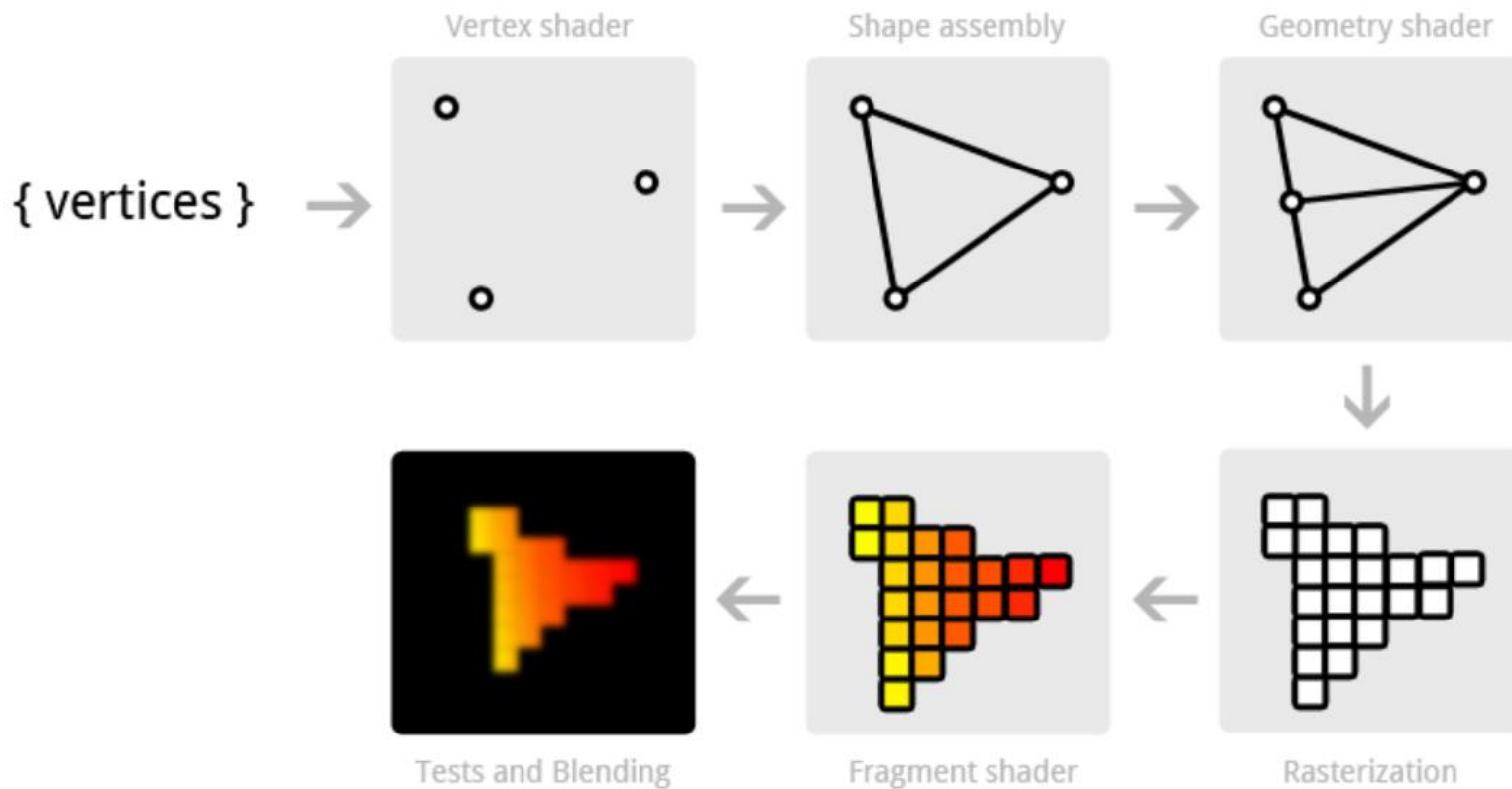
- Started in 1999
- Flexible, programmable
  - Vertex, Geometry, Fragment Shaders
- And much faster, of course
  - 1999 GeForce256: 0.35 Gigapixel peak fill rate
  - 2001 GeForce3: 0.8 Gigapixel peak fill rate
  - 2003 GeForceFX Ultra: 2.0 Gigapixel peak fill rate
  - ATI Radeon 9800 Pro : 3.0 Gigapixel peak fill rate
  - 2006 NV60: ... Gigapixel peak fill rate
  - 2009 GeForce GTX 285: 10 Gigapixel peak fill rate
  - 2011
    - GeForce GTC 590: 56 Gigapixel peak fill rate
    - Radeon HD 6990: 2x26.5
  - 2012
    - GeForce GTC 690: 62 Gigapixel/s peak fill rate

# Evolution of GPU



# Around 2000

## Fixed function pipeline

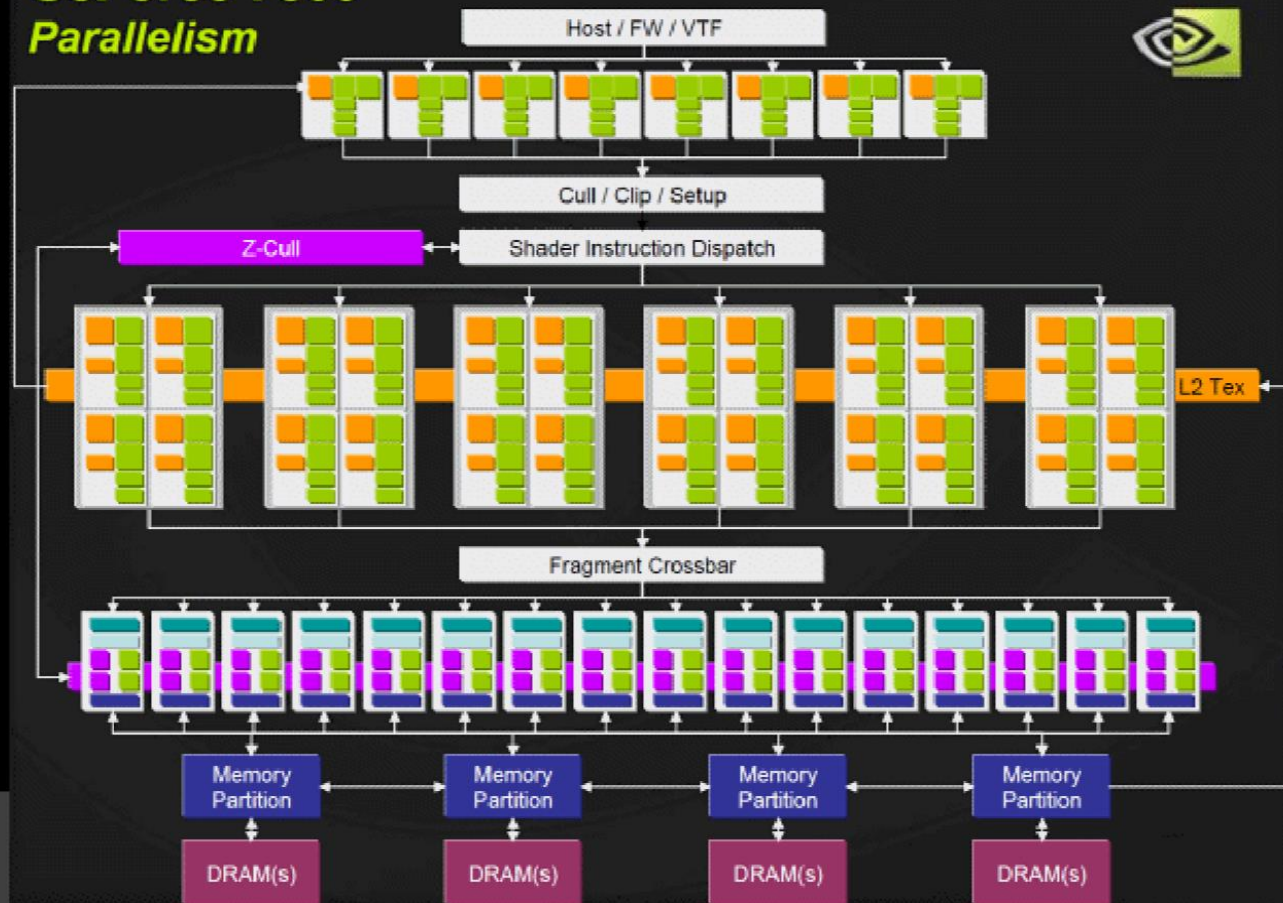


# Around 2005

## Programmable vertex and pixel processors

### G70 (Based on NV40): 2005

#### GeForce 7800 Parallelism





# Post 2006: Unified Architecture



# Why?

- Parallelism: thousands of cores
- Pipelining
- Hardware multithreading
- Not multiscale caching
  - Streaming caches
- Throughput, not latency



# Flynn's Taxonomy

Single Instruction Single Data (SISD)	Multiple Instruction Single Data (MISD)
Single Instruction Multiple Data (SIMD)	Multiple Instruction Multiple Data (MIMD)

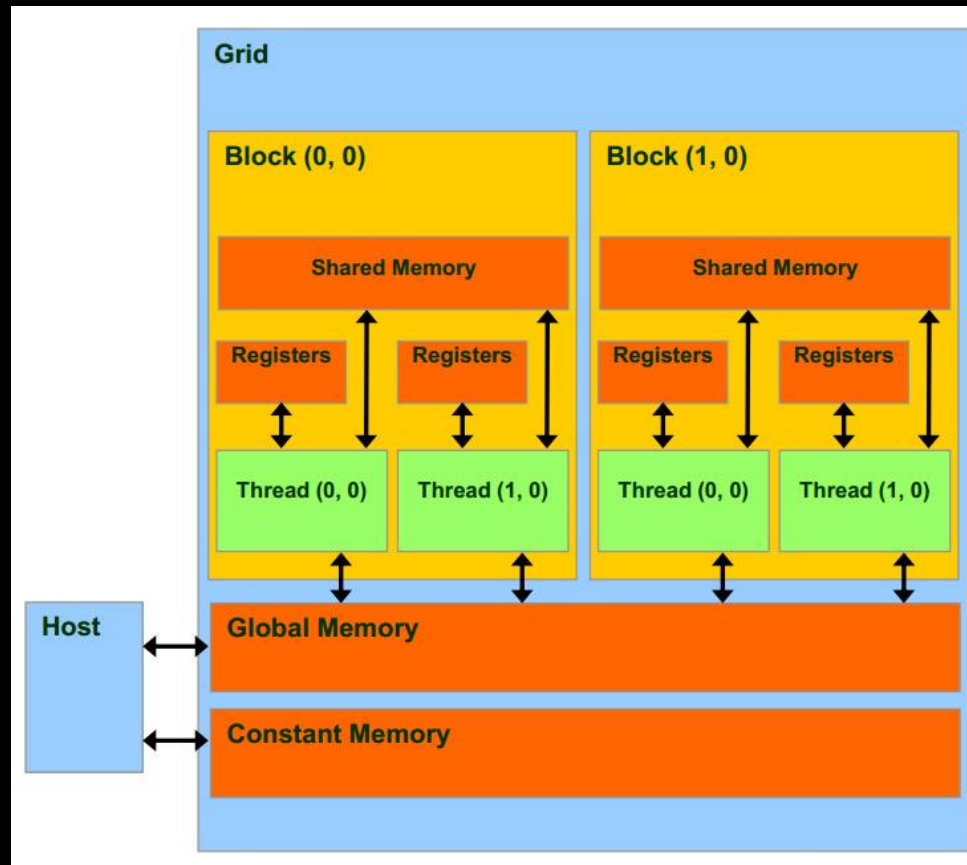


# MIMD array of SIMD procs

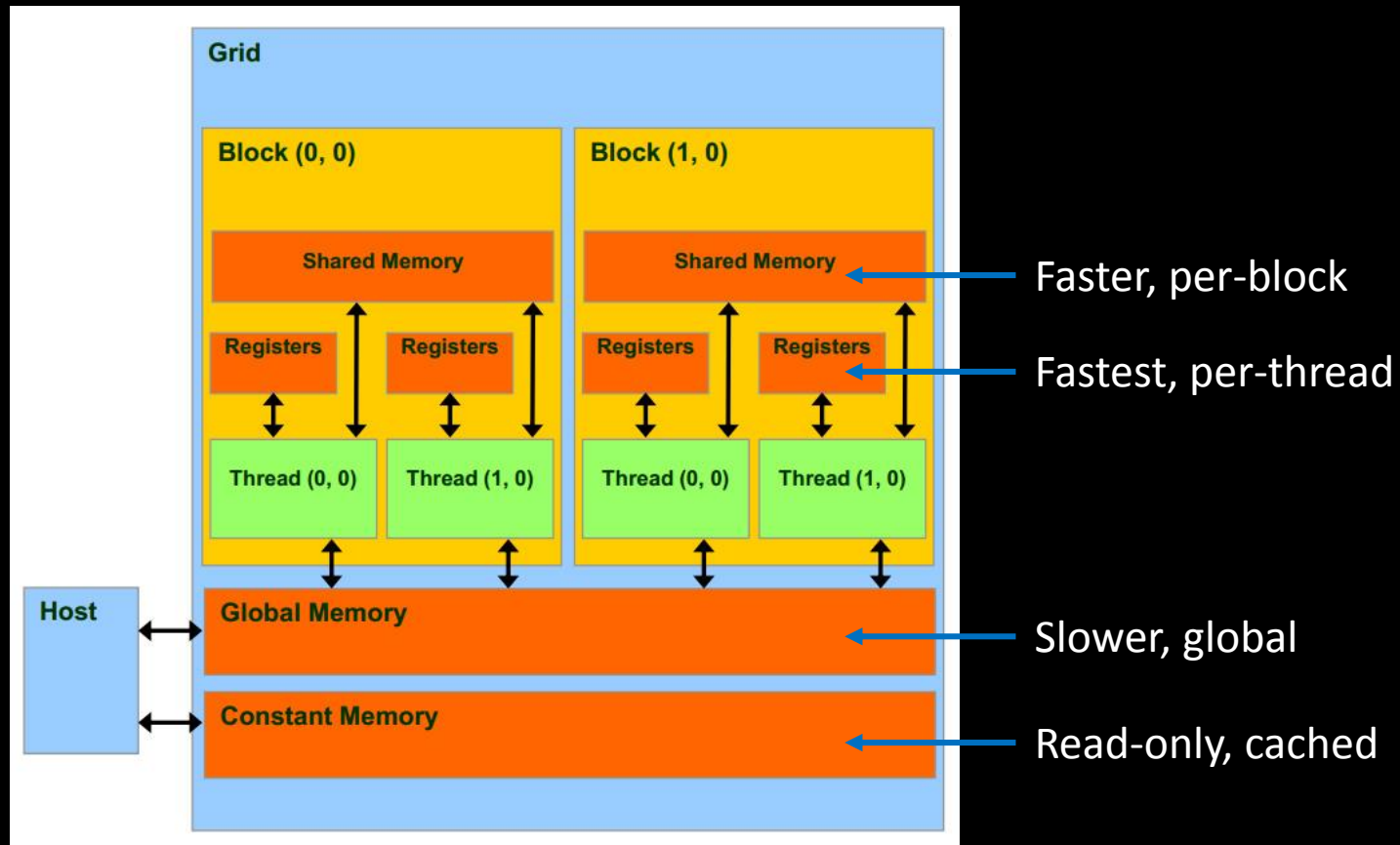




# Grids, Blocks, and Threads



# CUDA Memory



# Heterogeneous Computing



**Host:** the CPU and its memory



**Device:** the GPU and its memory

# Programming using CUDA

## Compute Unified Device Architecture

```
do_something_on_host();  
kernel<<<nBlk, nTid>>>(args);  
cudaDeviceSynchronize();  
do_something_else_on_host();
```



Highly parallel



# Hardware Thread Organization

Threads in a block are partitioned into warps

- All threads in a warp execute in a **Single Instruction Multiple Data**, or SIMD, fashion
- All paths of conditional branches will be taken
- Warp size varies, many graphics cards have 32

NO guaranteed execution ordering between warps

# Branch Divergence

Threads in one warp execute very different branches  
Significantly harms the performance!

Simple solution:

- Reordering the threads so that all threads in each block are more likely to take the same branch
- Not always possible

