

# High-Performance Scientific Computing

## Lecture 11: GPU Performance, Applications

MATH-GA 2011 / CSCI-GA 2945 · November 21, 2012

# Today

Tool of the day: Advanced Version Control

GPU performance

# Outline

Tool of the day: Advanced Version Control

GPU performance

# Version control demo time

# Outline

Tool of the day: Advanced Version Control

## GPU performance

- Less control, more data

- GPUs and Latency

- Understanding GPUs

# Outline

Tool of the day: Advanced Version Control

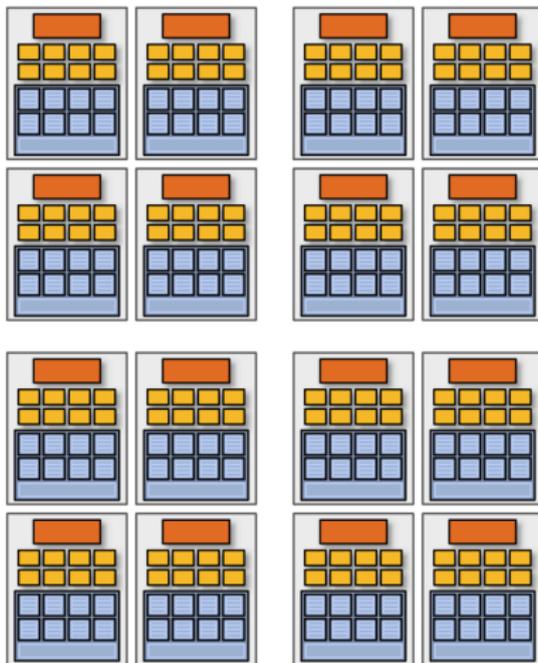
## GPU performance

Less control, more data

GPUs and Latency

Understanding GPUs

# Gratuitous Amounts of Parallelism!



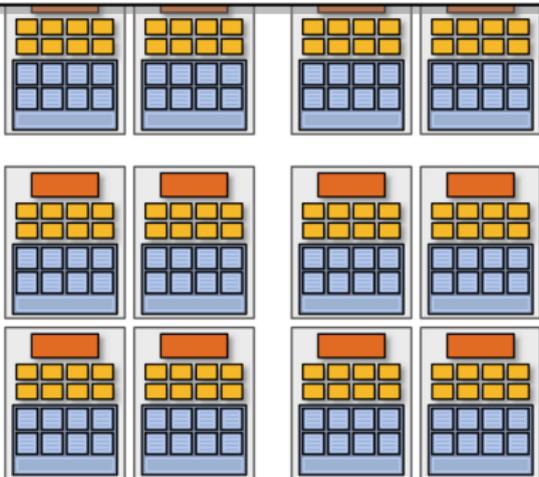
Credit: Kayvon Fatahalian (Stanford)

# Gratuitous Amounts of Parallelism!

Example:

128 instruction streams in parallel

16 independent groups of 8 synchronized streams



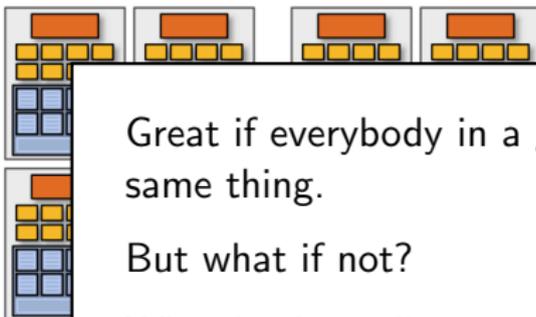
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# Gratuitous Amounts of Parallelism!

Example:

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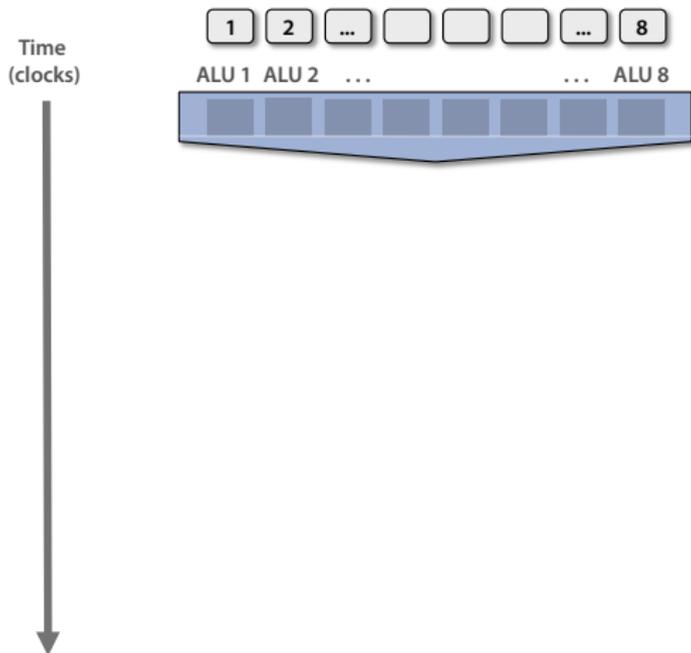


Great if everybody in a group does the same thing.

But what if not?

What leads to divergent instruction streams?

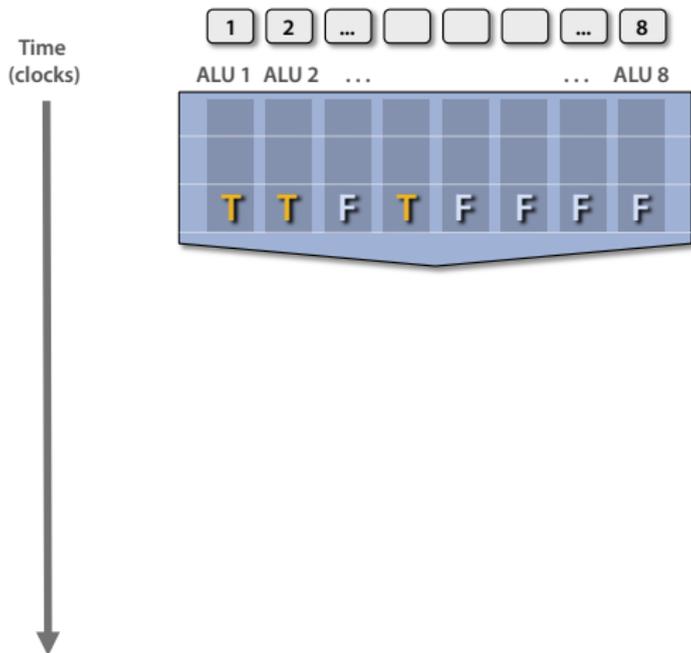
# Branches



```
<unconditional  
shader code>  
  
if (x > 0) {  
    y = pow(x, exp);  
    y *= Ks;  
    refl = y + Ka;  
} else {  
    x = 0;  
    refl = Ka;  
}  
  
<resume unconditional  
shader code>
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Credit: Kayvon Fatahalian (Stanford)

# Branches



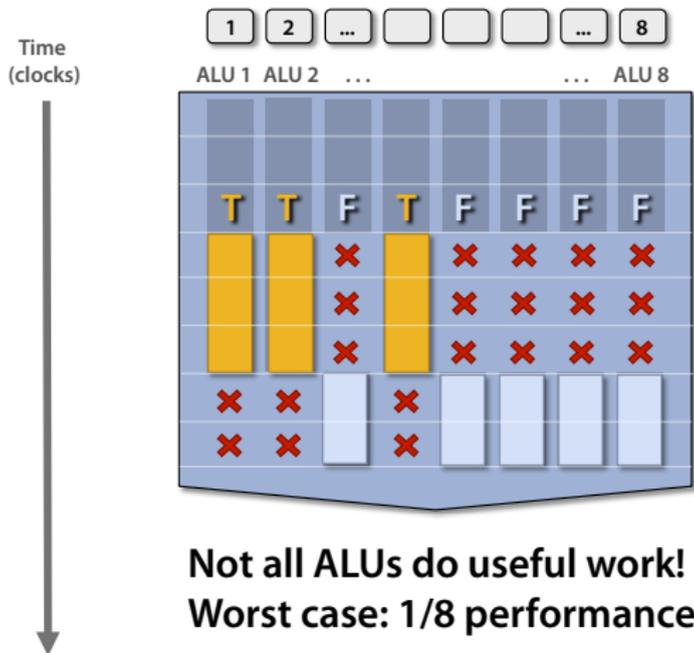
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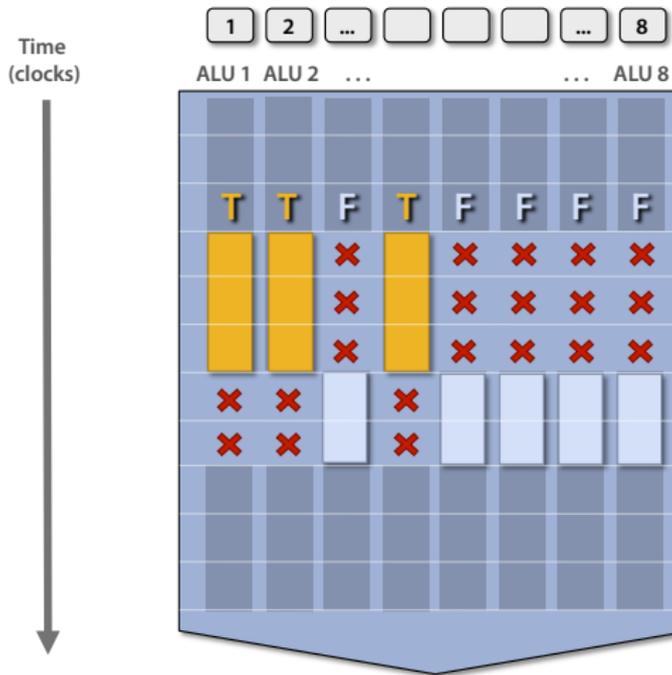
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Branch demo time

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**GPUs and Latency**

Understanding GPUs

# GPUs vs Latency

## Problem

Memory still has very high latency...

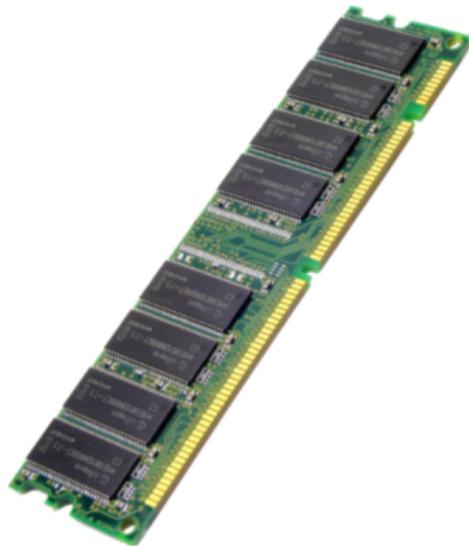
... as do many other things...

... but we've removed most of the hardware that helps us deal with that.

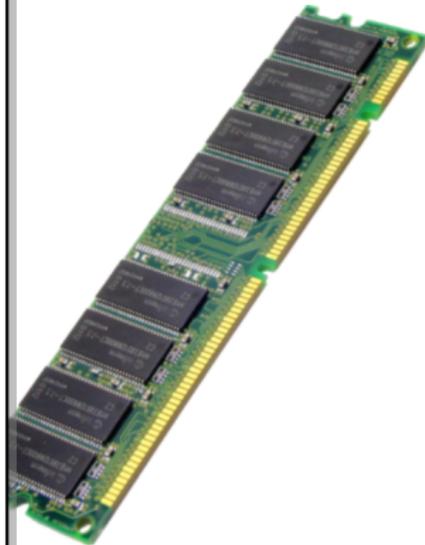
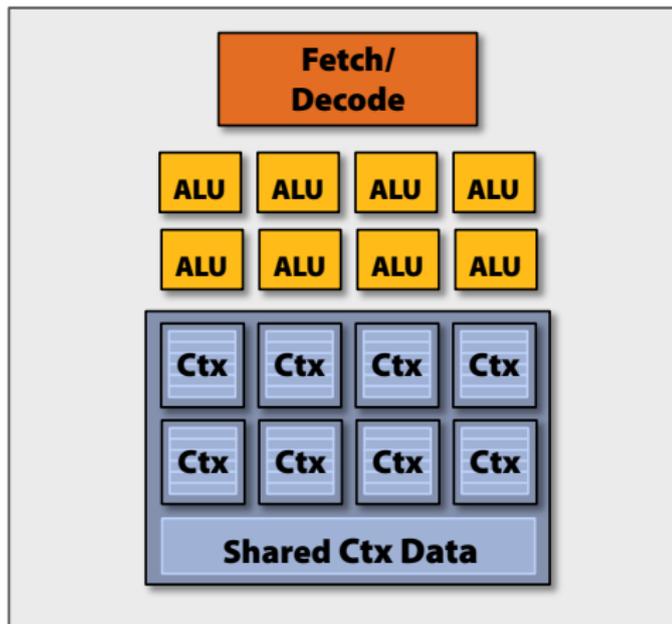
We've removed

- caches
- branch prediction
- out-of-order execution

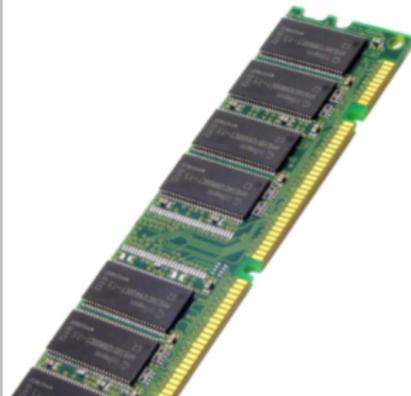
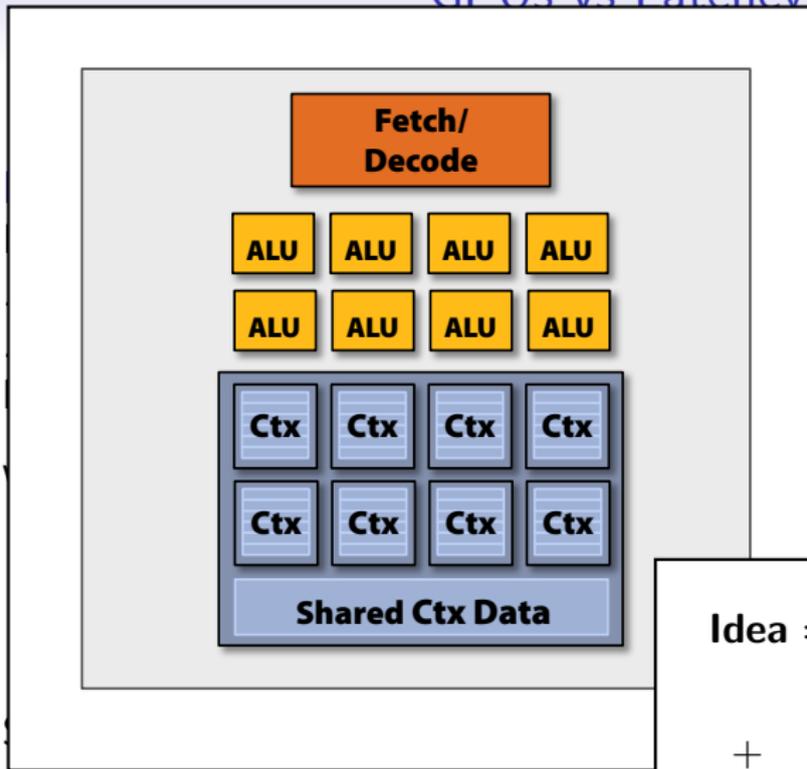
So what now?



# GPUs vs Latency



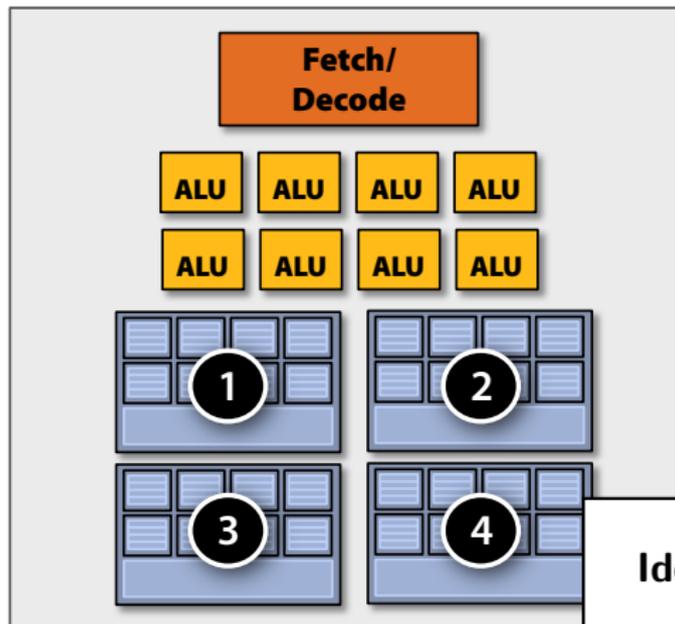
# GPUs vs Latency



## Idea #3

Even more parallelism  
+ Some extra memory  
= A solution!

## GPUs vs Latency



### Idea #3

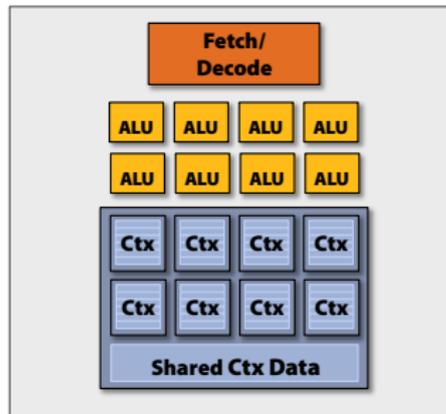
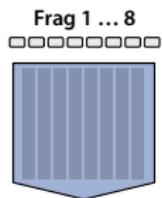
- Even more parallelism
- + Some extra memory

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- = A solution!

# Hiding Memory Latency

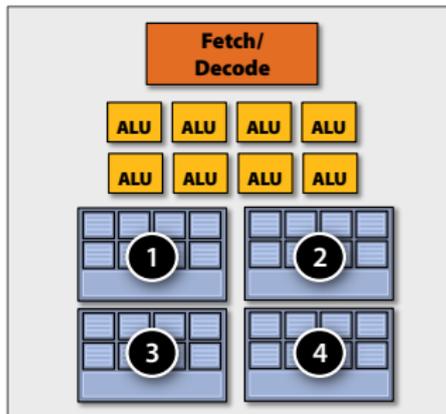
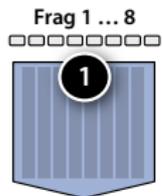
Time  
(clocks)



Credit: Kayvon Fatahalian (Stanford)

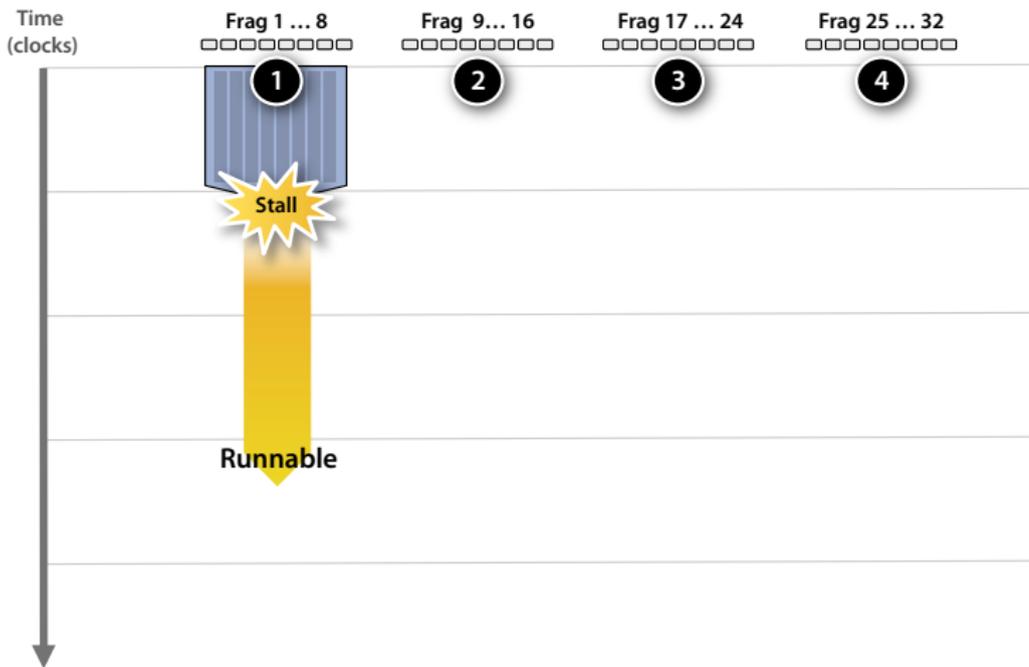
# Hiding Memory Latency

Time  
(clocks)



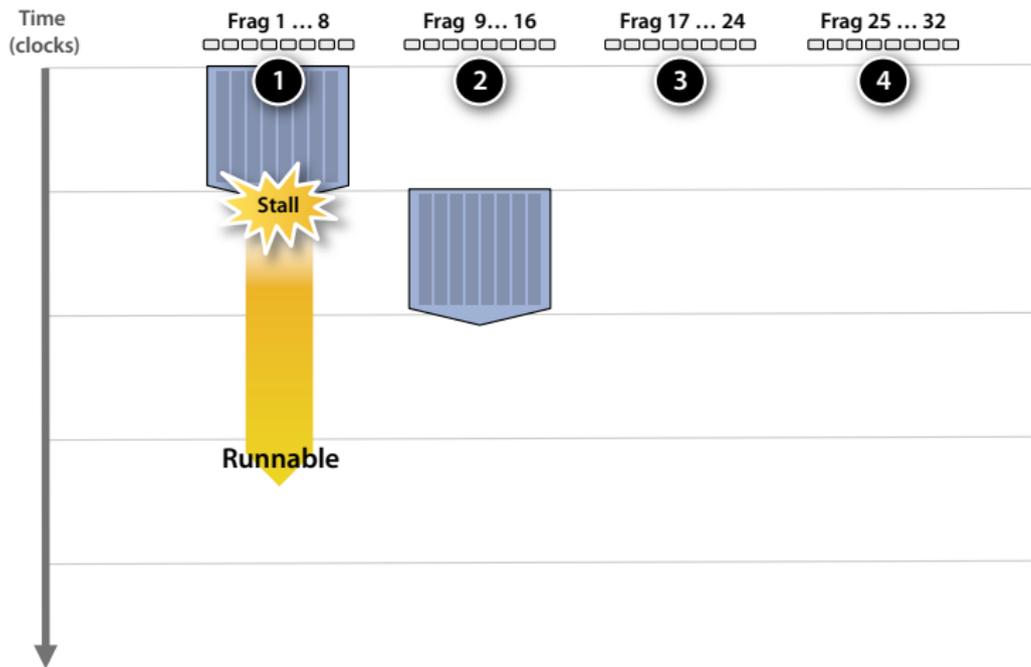
Credit: Kayvon Fatahalian (Stanford)

# Hiding Memory Latency



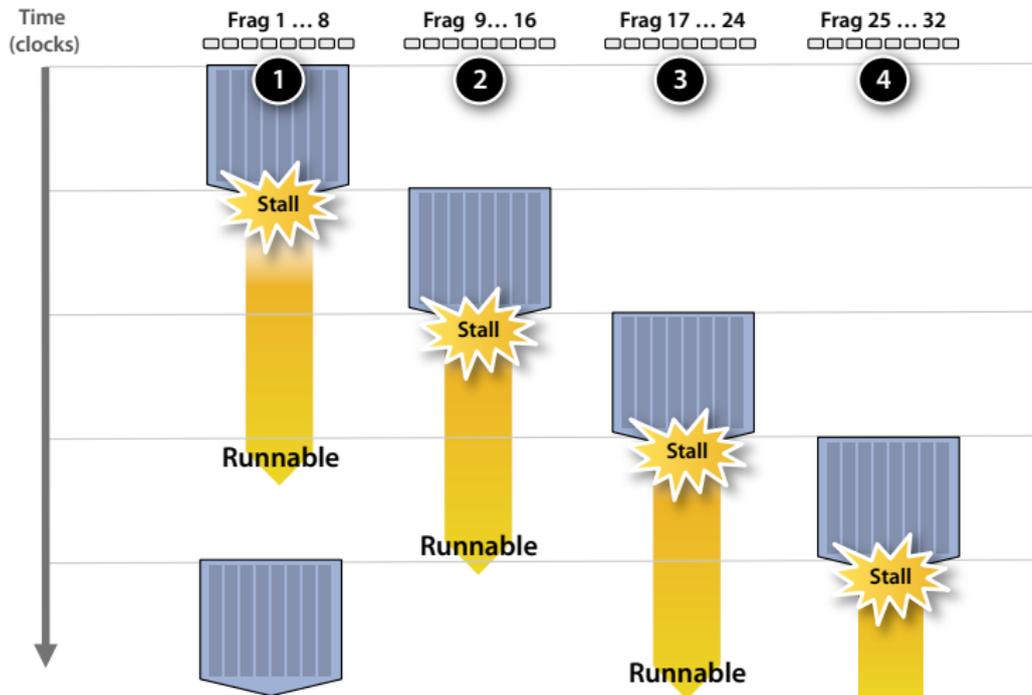
Credit: Kayvon Fatahalian (Stanford)

# Hiding Memory Latency



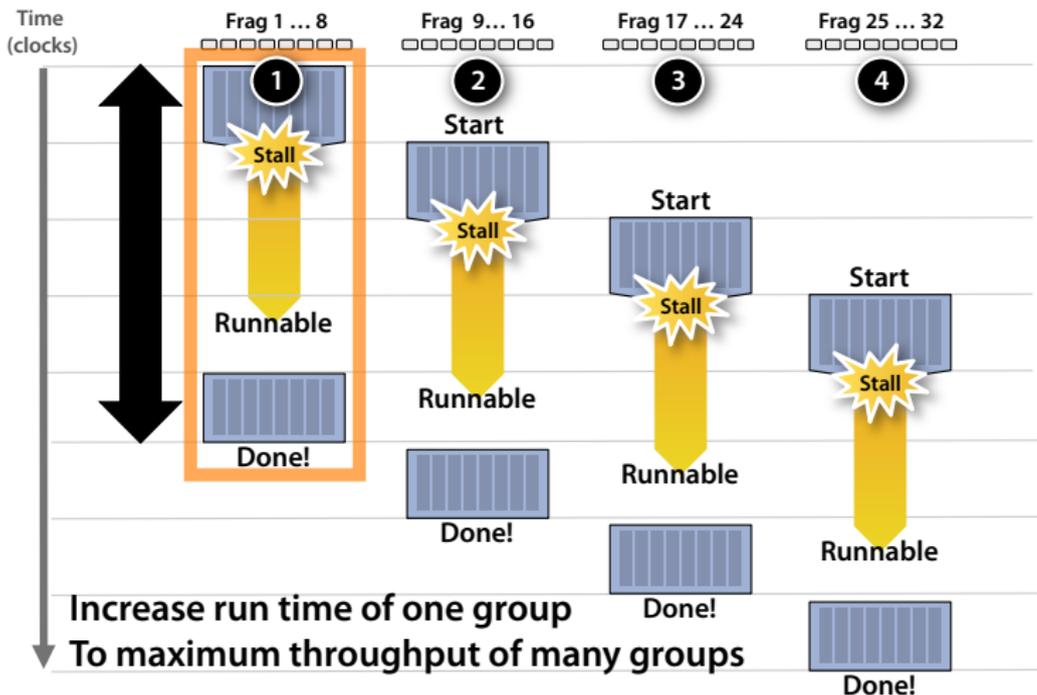
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# Hiding Memory Latency



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## GPUs and latency demo

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## Comparing architectures

	GF100	GF104	GK104	GCN	Units
# Warps/Wavefronts	48	48	64	40	W.Item
Warp Size	32	32	32	64	
SP FLOP/clock	64	96	384	128	MHz
Clock	700	650	823	925	
Reg File	128	128	256	256	kiB
Lmem	64	64	64	64	kiB
Lmem BW	64	64	128	128	B/clock

## Architecture by the numbers demo

# Questions?

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