

# General Purpose Graphics Processing Unit

## GPGPU

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# Outline

## 1 GPU

- Introduction
- Performance analysis

## 2 Programming model

- The graphics programming model
- GPGPU programming model

## 3 Conclution

- Conclution

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1

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2

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## Conclution

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# What is a GPU?

GPU = Graphics Processing Unit

## Purpose

- Draw graphics on the monitor

## What scientists what with it?

- Non graphics application (ie. numerical simulations)

Why?

Enormous floating point power

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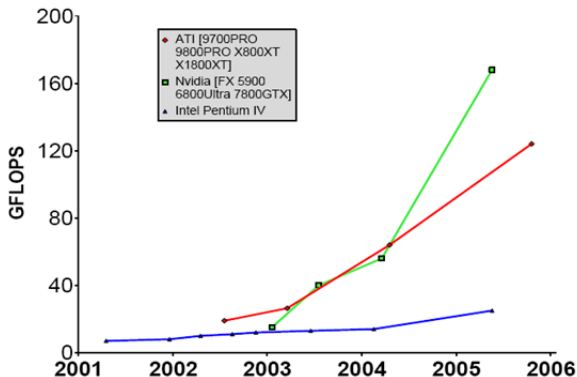
## What scientists what with it?

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Why?

Enormous floating point power

# Floating point increment



(Data courtesy of Ian Buck, Mike Houston)



# Performance analysis

## CPU

- Annual growth  $\approx 1.5x \rightarrow$  Decade growth  $\approx 60x$
- Follows Moore's law

## GPU

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- Annual growth  $\approx 2.9x \rightarrow$  Decade growth  $\approx 1000x$
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# Performance analysis

## Why are they so fast?

- Parallel architecture optimized for floating point arithmetic
  - 2-48 pipelines
  - $\approx 20$  flops/pipeline pr. clock!
  - 650 MHz
- Data is read and write **only**
- High memory bandwidth

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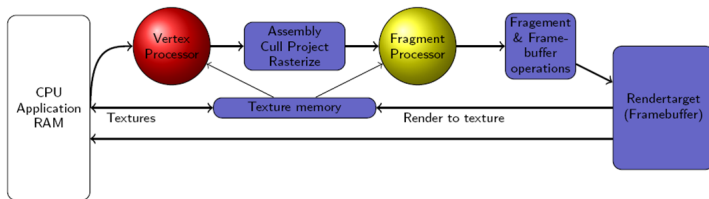
## 2 Programming model

- The graphics programming model
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# The graphics pipeline

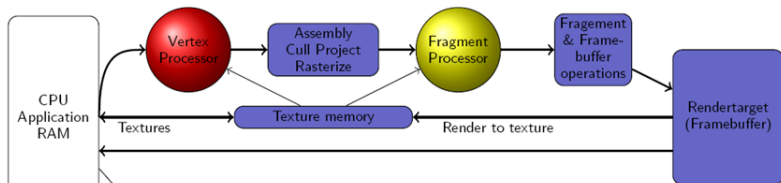


The GPU acts as a **stream** computer

Given a stream of data, it executes the same operation on every data element



## The graphics programming model



## The CPU:

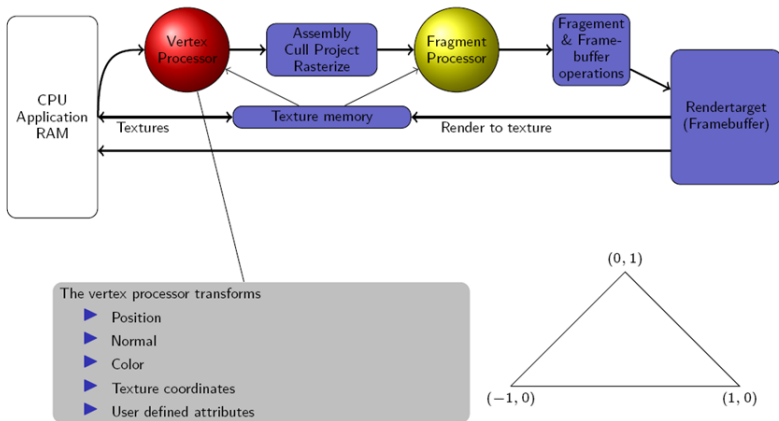
- ▶ Uploads shaders
- ▶ Uploads textures
- ▶ Sends geometry
- ▶ Executes the pipeline

```

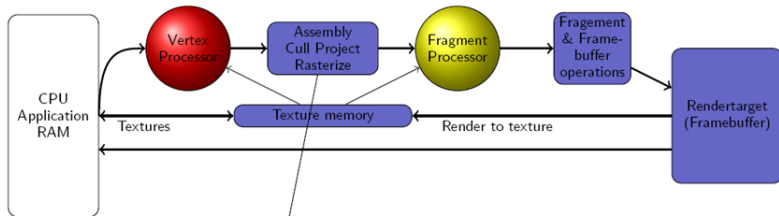
glBindTexture( tex, GL_TEXTURE_2D );
glUseProgram( progID );
glBegin( GL_TRIANGLES );
glNormal3f( 0.0, -0.35, 0.67 );
glVertex3f( -1.0, 0.0, 0.0 );
glNormal3f( 0.001, -0.49, -0.62 );
glVertex3f( 1.0, 0.0, 0.0 );
:
:
glEnd();
glFlush();

```

## The graphics programming model

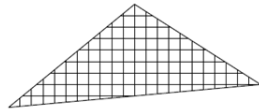


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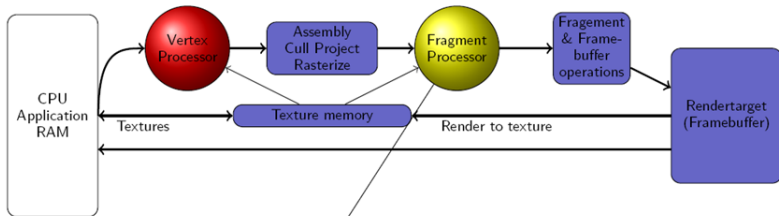


- ▶ Vertices are assembled into primitives
- ▶ Primitives are clipped
- ▶ Vertices are projected into window coordinates
- ▶ Primitives are rasterized into fragments
- ▶ Attributes are interpolated across primitives

(a fragment is a *meta-pixel* is has depth as well as  $(x, y)$ -coordinate)



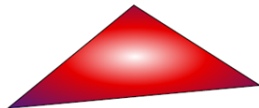
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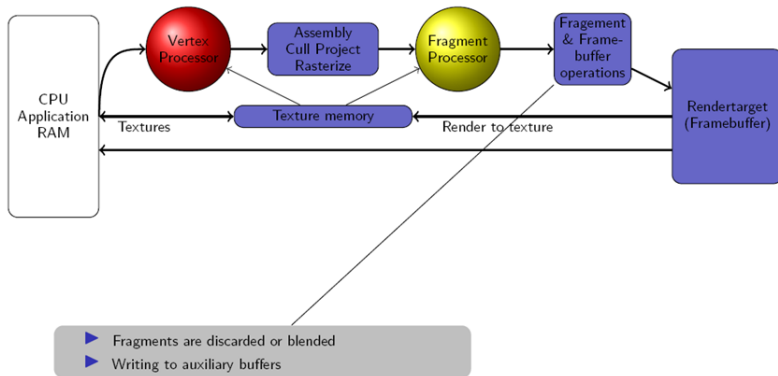
The fragment processor:

- calculates the final color and depth

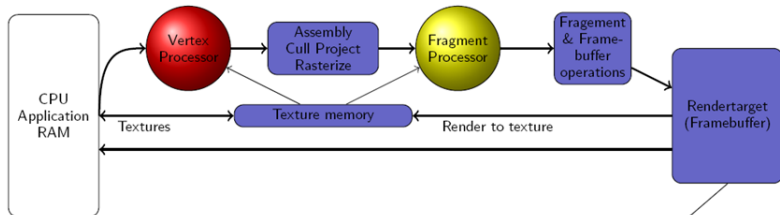
This usually involves texture lookup and viewport calculations based on attributes from the vertex proce



## The graphics programming model



# Looping



Finally all primitives are displayed!

# Mapping computational concepts to the GPU

## CPU

- Array
- Inner loop
- Feedback
- Computational invocation
- Computational domain

## GPU

- Texture
- Fragment shader
- Render to texture
- Geometry rasterization
- Texture coordinates

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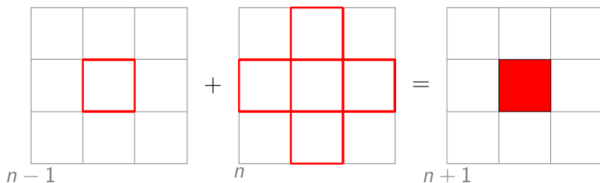
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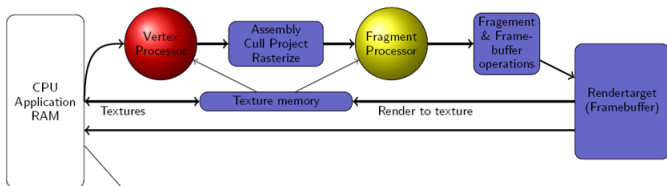
# The heat equation

## Example

The heat equation:  $\frac{\partial^2 u}{\partial t^2} = \nabla^2 u$



# The heat equation

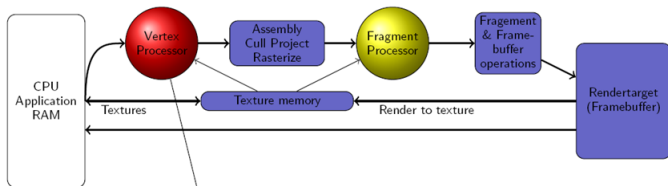


For every timestep

- ▶ Binds the previous rendertargets as textures
- ▶ Set up a
- ▶ Draws a single quad

```
glUseProgram( waveequation );  
glUniform1i( 0, n_minus );  
glUniform1i( 1, n );  
glDrawBuffers( 1, &n_plus );  
glBegin( GL_QUADS );  
glVertex2f( 0.0, 0.0 );  
glVertex2f( 1.0, 0.0 );  
glVertex2f( 1.0, 1.0 );  
glVertex2f( 0.0, 1.0 );  
glEnd();  
swap( n_plus, n_minus );  
swap( n_minus, n );
```

# The heat equation

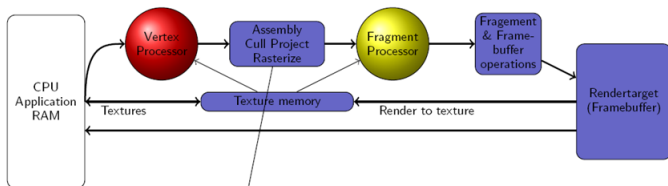


The vertex processor:

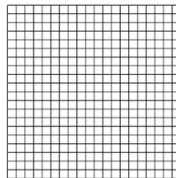
- ▶ Calculates texture coordinates
- ▶ Passes everything trough

```
varying vec4 Xcoord;  
varying vec4 Ycoord;  
  
Xcoord=glMultiTexCoord0.yxxx +  
vec4(0.0,0.0,-1.0,1.0)  
Ycoord=glMultiTexCoord0.xyyy +  
vec4(0.0,0.0,-1.0,1.0);  
gl_Position = ftransform();
```

# The heat equation

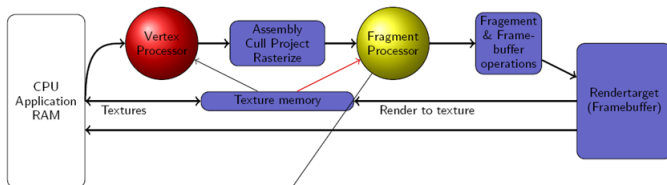


- ▶ The geometry is rasterized into pixels
- ▶ Texture coordinates are interpolated





# The heat equation



The fragment shader calculates our expression

$$u_{i,j}^{n+1} = 2u_{i,j}^n - u_{i,j}^{n-1} + \frac{k}{h^2} (u_{i+1,j}^n + u_{i-1,j}^n + u_{i,j+1}^n + u_{i,j-1}^n - 4u_{i,j}^n)$$

Textures are used as arrays

```

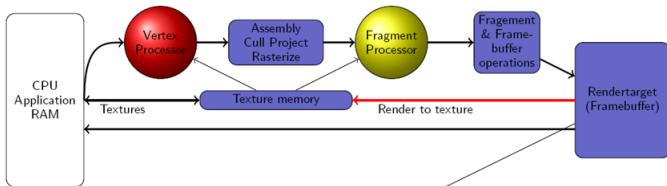
varying vec4 Xcoord;
varying vec4 Ycoord;

uniform sampler2D n;
uniform sampler2D n_minus;

vec4 tex = texture2D(n, Xcoord.yx);
vec4 tex0 = texture2D(n, Xcoord.wx);
vec4 tex1 = texture2D(n, Xcoord.xz);
vec4 tex2 = texture2D(n, Ycoord.xw);
vec4 tex3 = texture2D(n, Ycoord.xz);
vec4 texL = texture2D(n_minus, Xcoord.yx);

gl_FragData[0] = (2.0 * tex - texL +
(2.0/4.0)*(tex0 + tex1 + tex2 + tex3 -
4.0*tex));
  
```

# The heat equation



- ▶ Our computation is written to a texture
- ▶ It can immediately be reused in the next step
- ▶ No data is transferred to the CPU
- ▶ Nothing is displayed on screen

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# Well suited applications

- Large data sets
- High parallelism
- Minimal dependencies between data elements
- High arithmetic intensity
- Lots of work to do without CPU intervention

# Application ported to the GPU

- Matrix Algebra
- Partial Differential Equations
- Image processing
- Fast Fourier Transform
- Ray Tracing
- Geometric computing
- Databases

# Advantages and disadvantages

## Advantages

- flops, Gflops, **Tflops**
- Sony PS3 graphics chip  
RSX has 1.8 Tflops!

## Disadvantages

- Programming model is inherently parallel
- Programming model is tied to graphics
- Limited to 32-bit floating point
- Rapidly evolving architectures
- Largely secret architectures

# End

Questions?