# GPGPU Programming

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### **Outline**

- Why GPGPU?
- Programmable Graphics Hardware
- Programming Systems
- Writing GPGPU Programs
- Examples
- References

- GPGPU
  - General-Purpose computation on GPU
  - GPU: Graphics Processing Unit
- GPU is probably today's most powerful computational hardware for the dollar
- Advancing at incredible rates
  - # of transistors:

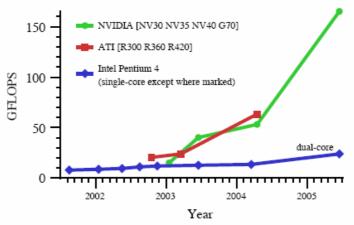
Intel P4 EE 178M v.s. nVIDIA 7800 302M

#### GPU





- Tremendous memory bandwidth and computational power
  - nVIDIA 6800 Ultra: 35.2GB/sec of memory bandwidth
  - ATI X800 XT: 63GFLOPS
  - Intel Pentium4 3.7GHz: 14.8 GFLOPS



- GPU is also accelerating quickly
  - CPU: 1.4x for every year
  - GPU:  $1.7x \sim 2.3x$  for every year
- The disparity in performance between GPU & CPU
  - CPU: optimized for high performance on sequential codes (caches & branch prediction)
  - GPU: higher arithmetic intensity for parallel nature



#### Flexible and programmable

- it fully supports vectorized floating-point operations at IEEE single precision
- high level languages have emerged
- additional levels of programmability are emerging with every generation of GPU (about every 18 months)
- an attractive platform for general-purpose computation

#### Applications

- scientific computing
- signal processing image processing video processing audio processing
- physically-based simulation
- visualization

- ...

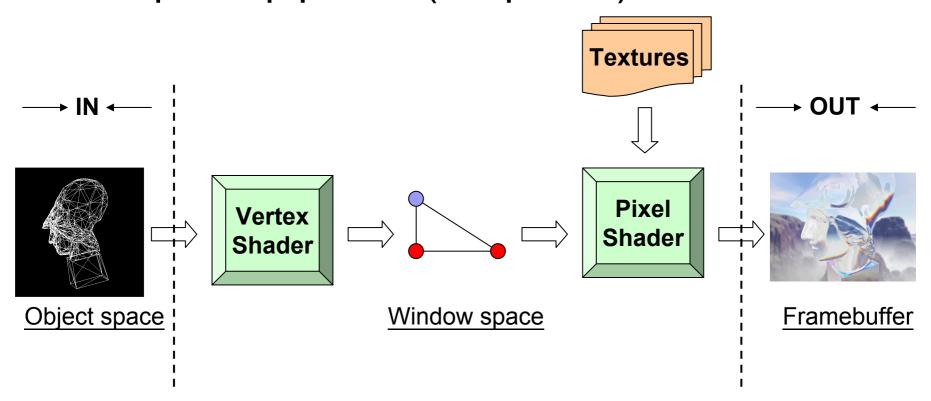
#### Limitations and difficulties

- the arithmetic power of the GPU is a result of its highly specialized architecture (parallelism)
- no integer data operands
- no bit-shift and bitwise operations
- no double-precision arithmetic
- an unusual programming model
- these difficulties are intrinsic to the nature of graphics hardware, not simply a result of immature technology

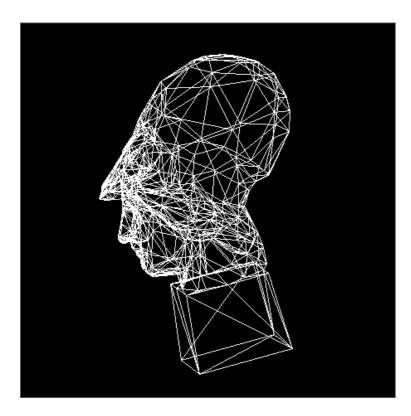
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Graphics pipeline (simplified)

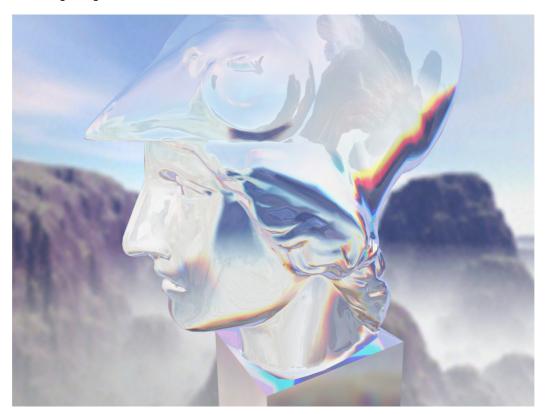


#### Graphics pipeline

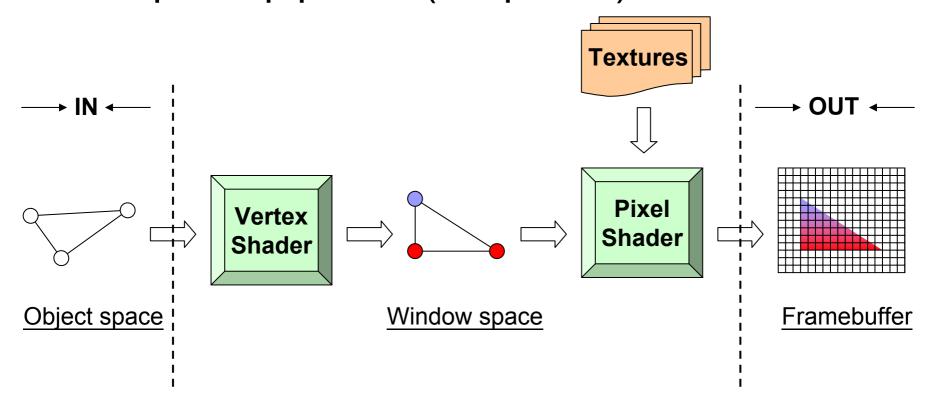


```
v -1943.297363 -281.849670 435.762909
v -2081.436035 -281.723267 363.743317
v -1445.912109 281.329681 644.545166
....
vn -0.221051 0.258340 -0.940424
vn -0.220863 0.258493 0.940426
vn -0.220848 0.030928 -0.974818
....
f 1421//3282 1268//3464 1425//3646
f 1266//4180 1425//3646 1268//3464
f 1266//4180 1264//4343 1425//3646
f 1424//3294 1425//3646 1264//4343
f 1264//4343 1262//4275 1424//3294
...
```

#### Graphics pipeline



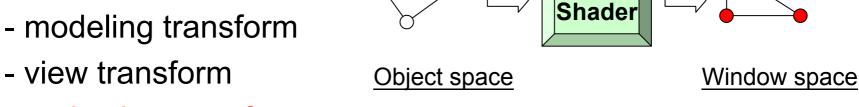
Graphics pipeline (simplified)





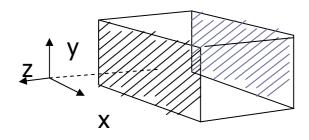
- Vertex shader:

  - projection transform



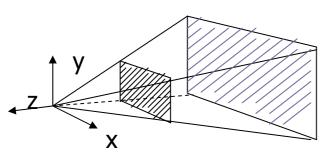
- Projection transform
  - orthogonal projection
  - perspective projection

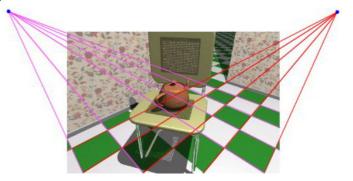
Orthogonal projection





Perspective projection

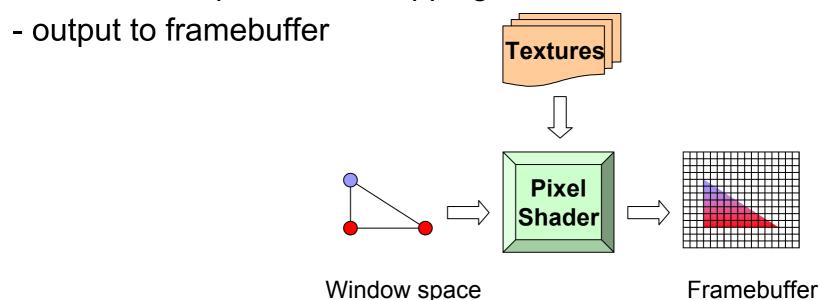






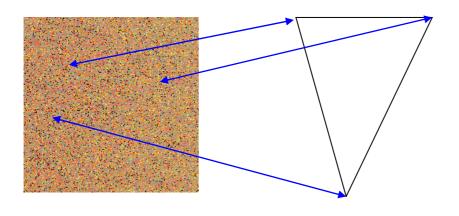
#### Pixel shader

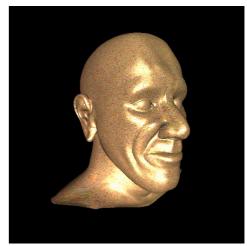
- per pixel operation
- texture lookup / texture mapping



Texture mapping







- GPGPU programming model
  - use the pixel shader as the computation engine
  - CPU / GPU analogies:

Data Array => Texture

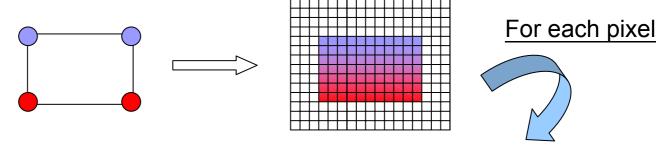
Memory Read => Texture Lookup

Loop body => Shader Program

Memory Write => Render to framebuffer

- restricted I/O: arbitrary read, limited write
- program invocation

Program invocation



```
for (int j = 1; j < height - 1; ++j)
                                                  void advect (float2
                                                                               : WPOS ,
                                                                          xNew : COLOR,
                                                          out float4
                                                      uniform float
                                                                          dt, // time step
   // get velocity at this cell
                                                      uniform float
                                                                          dx, // grid scale
   Vec2f v = qrid (x, y);
                                                      uniform samplerRECT u, // velocity
                                                     uniform samplerRECT x) // state
   // trace backwards along velocity field
   float x = (i - (v.x * time step / dx));
                                                    // trace backwards along velocity field
   float v = (j - (v.v * time step / dv));
                                                    float2 pos = ub - dt * f2texRECT (u , uv) / dx;
   grid(x,y) = gridbilerp(x,y);
                                                                                               Cg
                                                    xNew = f4texRECTbilerp (x, pos);
                                    C++
```

### **Outline**

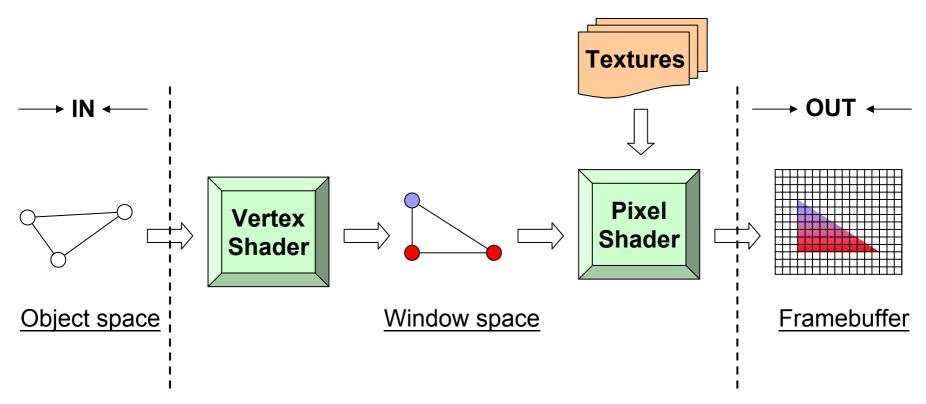
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## **Programming Systems**

- High-level language
  - write the GPU program
  - nVIDIA Cg / Microsoft HLSL / OpenGL Shading Language
- 3D library
  - build the graphics pipeline
  - OpenGL / Direct3D
- Debugging tool
  - few / none

## **Programming Systems**

Cg and OpenGL will be used in this tutorial



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- OpenGL and Cg will be used as examples
- OpenGL
  - cross platforms
  - growing actively in the extension form
- Cg (C for graphics)
  - cross graphics APIs
  - cross graphics hardware

- System requirements for demo programs
  - Cg compiler:

http://developer.nvidia.com/object/cg\_toolkit.htm

GLUT: <a href="http://www.xmission.com/~nate/glut.html">http://www.xmission.com/~nate/glut.html</a>

- GLEW: <a href="http://glew.sourceforge.net/">http://glew.sourceforge.net/</a>

- platform: Win32

- IDE: Microsoft Visual C++ .Net 2003

- GPU: nVIDIA 6600 (or higher)

with driver v77.72 (or newer)

http://www.nvidia.com/

#### Installation

- Cg: download "Cg Installer" and install it
- in Visual C++, add new paths for include files and library files in Tools\Options\Projects
- include files:
  - C:\Program Files\NVIDIA Corporation\Cg\include
- library files:
  - C:\Program Files\NVIDIA Corporation\Cg\lib
- link with cg.lib and cggl.lib



#### Installation

- GLUT: download "glut-3.7.6-bin.zip" and put related files in proper directories

header file: C:\\$(VCInstallDir)\include\gl

library file: C:\\$(VCInstallDir)\lib

- dll file: C:\WINDOWS\system32

- link with glut32.lib



#### Installation

GLEW: download binaries and put related files in proper directories

header file: C:\\$(VCInstallDir)\include\gl

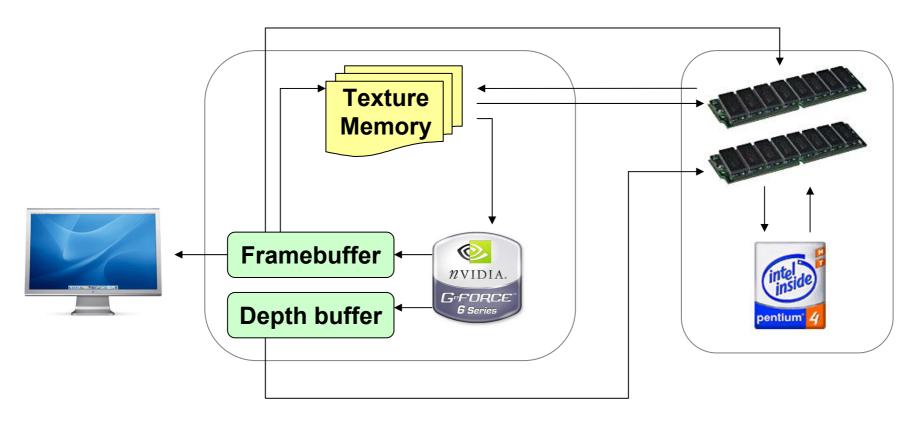
- library file: C:\\$(VCInstallDir)\lib

- dll file: C:\WINDOWS\system32

- link with glew32.lib

- Syntax highlight in Visual C++ .Net 2003
  - copy the usertype.dat file to
     Microsoft Visual Studio .Net 2003\Common7\IDE
  - open up the registry editor and go to HKEY\_LOCAL\_MACHINE\SOFTWARE\Microsoft\ VisualStudio\7.1\Languages\File Extensions
  - copy the default value from the .cpp key
  - create a new key under the File Extensions with the name of .cg
  - paste the value you just copied info the default value

Architecture (traditional)



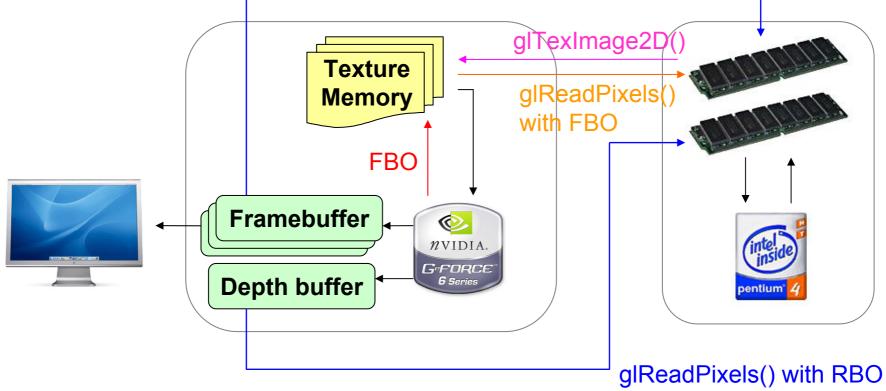
Architecture (traditional) glReadPixels() glTexImage2D **Texture** glGetTexImage **Memory** glCopyTexSubImage2D() Framebuffer NVIDIA. G\*FORCE **Depth buffer** glReadPixels()

- Uploading is fast
  - uploading: glTexImage2D()
- Downloading is extremely slow
  - downloading: glReadPixels(), glGetTexImage()
- GPU can only render to framebuffer and depth buffer
  - if one wants to store the output in a texture, glCopyTexSubImage2D() must be called

Architecture (traditional) glReadPixels() glTexImage2D **Texture** glGetTexImage **Memory** glCopyTexSubImage2D() Framebuffer NVIDIA. G\*FORCE **Depth buffer** glReadPixels()

Architecture (new)

glReadPixels() with RBO



- Uploading is fast (glTexImage2D)
- Downloading is getting fast
  - with FBO / RBO extensions, glReadPixels() is speeding up (forget about PBO – Pixel Buffer Object)
- GPU is able to render not only to framebuffer and depth buffer, but also to textures
  - with FBO and MRT extensions
  - forget about pBuffer and RenderTexture



#### OpenGL extensions used:

rectangle texture (NPOT texture)

- floating-point texture (prevent [0, 1] clamping)

- multi-texture (multiple textures)

- framebuffer object (FBO, for rendering to texture)

- renderbuffer object (RBO, for fast downloading)

- multiple render targets (MRT, for multiple outputs)

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#### Examples

#### 6 examples

#### OpenGL:

- 1. texture mapping
- 2. texture mapping with FBO and RBO

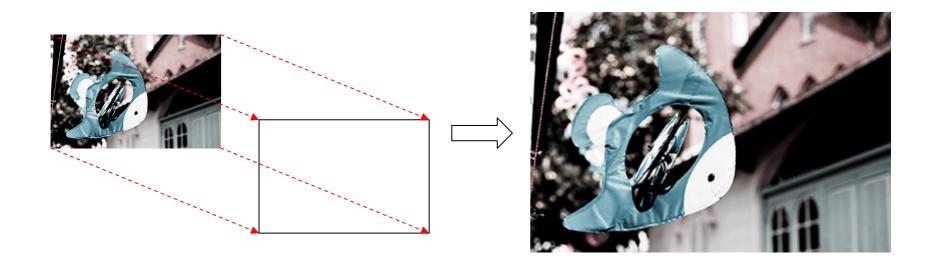
#### OpenGL and Cg:

- 3. image warping
- 4. image blurring
- 5. image blending
- 6. MRT

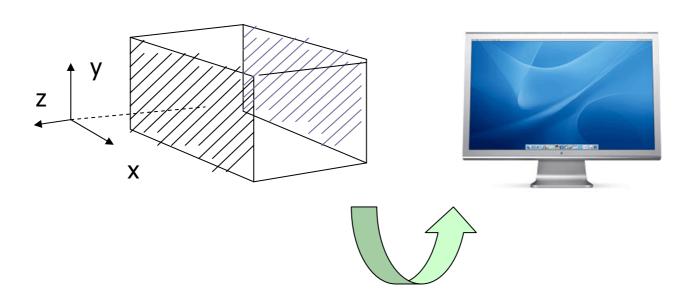
- Texture mapping
  - OpenGL introduction
  - GLUT and WGL
  - rectangle texture
  - image I/O for GPU



Texture mapping



Viewport transformation



- Texture creation
  - generate a texture
  - setup the texture properties
  - upload an image from the main memory to the GPU

Architecture (traditional) glReadPixels() glTexImage2D **Texture** glGetTexImage **Memory** glCopyTexSubImage2D() **Framebuffer** NVIDIA. G\*FORCE **Depth buffer** glReadPixels()

- Texture mapping with FBO and RBO
  - render to texture with FBO
  - fast downloading with RBO



Architecture (traditional) glReadPixels() glTexImage2D **Texture** glGetTexImage **Memory** glCopyTexSubImage2D() **Framebuffer** NVIDIA. G\*FORCE **Depth buffer** glReadPixels()

Architecture (semi-new)

glReadPixels() with RBO glTexImage2D **Texture** gIReadPixels( **Memory** with FBO **FBO** Framebuffer **(** NVIDIA. G\*FORCE **Depth buffer** glReadPixels() with RBO

#### FBO creation

- generate an FBO
- generate a texture
- associate the texture with the FBO

#### RBO creation

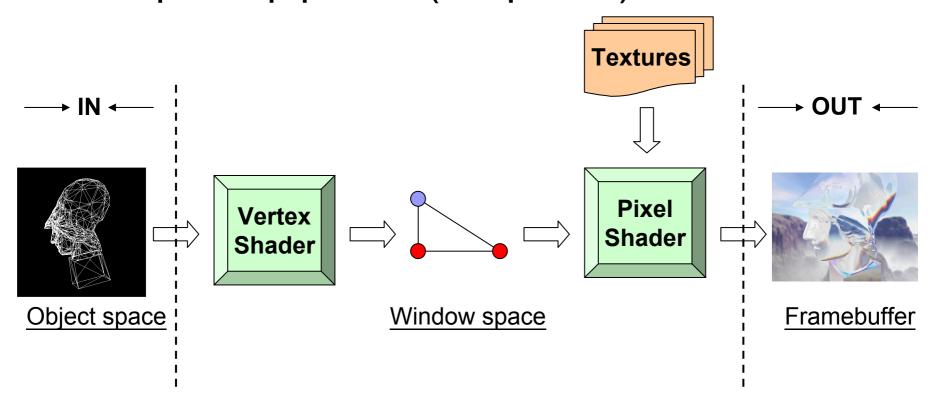
- generate an RBO
- allocate memory for the RBO
- associate the RBO with the FBO

- Image warping and image blurring
  - Cg introduction
  - environment setup
  - Cg runtime
  - Cg standard library





Graphics pipeline (simplified)



#### Cg runtime

 environment setting, program compiling/loading, and parameters passing

#### Cg standard library

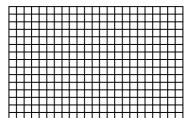
- mathematical functions
- geometric functions
- texture map funcitons

#### Forward warping

- straight forward
- holes in the destination image



- make sure that there would be no holes in the destination image
- interpolation is needed



x M<sup>-1</sup> to lookup











- Image blurring
  - box filter
  - the value of a destination pixel is the weighted average of its neighboring pixels in the source image





#### Cg language

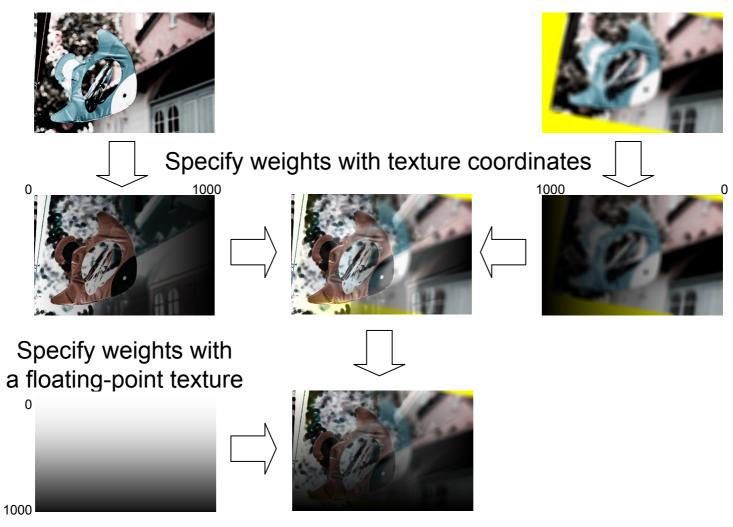
- Image blending
  - floating-point texture
  - multi-texture

#### Floating-point texture

- get more precision (16-bit or 32-bit) than only 8-bit
- especially useful in GPGPU

#### Multi-texture

- inherent in Cg for multi-texture accessing
- what counts is the multi-texture "coordinates"
- send more information to the GPU
- linear-interpolated data



Depth buffer readback







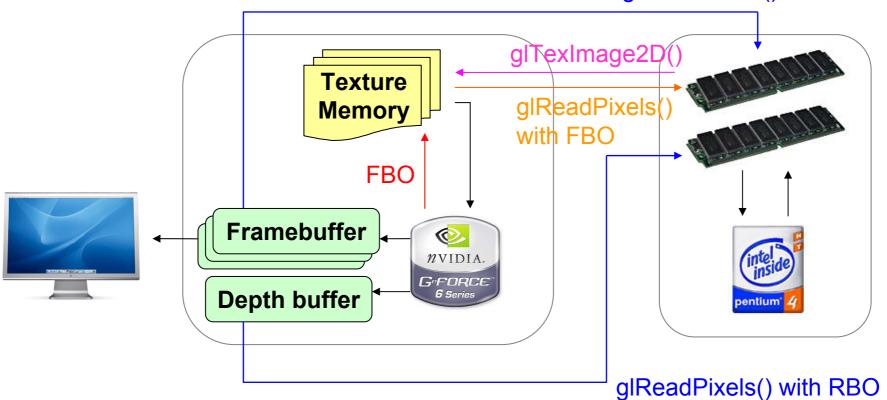
- not really useful since another FBO/RBO is needed
- Floating-point texture readback
  - glReadPixels() must be inside the FBO
  - use GL\_NEAREST for a floating-point texture

Architecture (semi-new)

glReadPixels() with RBO glTexImage2D **Texture** gIReadPixels( **Memory** with FBO **FBO** Framebuffer **(** NVIDIA. G\*FORCE **Depth buffer** glReadPixels() with RBO

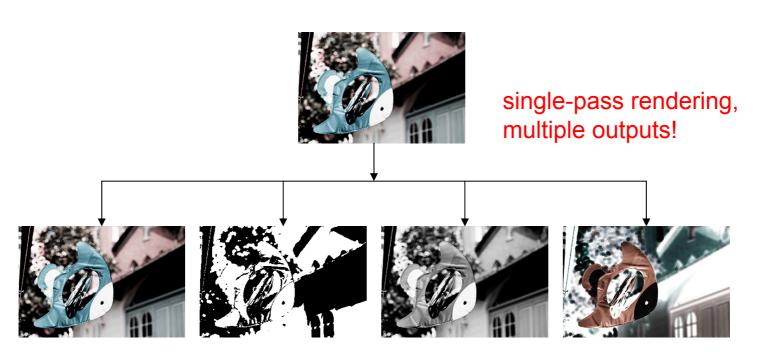
Architecture (new)

glReadPixels() with RBO



#### MRT

- multiple render targets



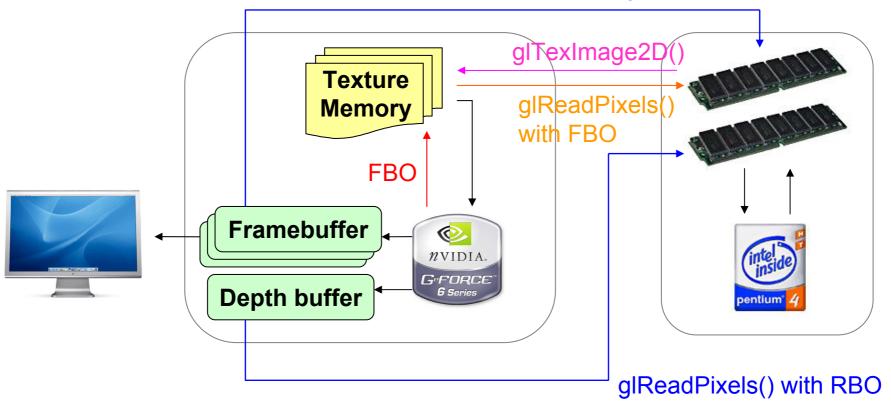
- The format of the render targets must be the same
- Associate different color attachments with the FBO
- MRT operation
  - use glDrawBuffers() to activate the MRT
  - use glReadBuffer() to specify the buffer for readback

#### Pixel format review

- clamp-free and truly floating-point range are available while GL\_RGBA32F\_ARB or GL\_RGBA16F\_ABR with GL\_FLOAT uploading and/or downloading are used
- uploading with GL\_UNSIGNED\_BYTE will cause [0, 255] => [0, 1] no matter what the internal format is
- without the floating-point texture, what read back with GL\_FLOAT would be clamped to [0, 1]

Architecture (new)

glReadPixels() with RBO



### Examples

#### Tips for GPU programming

- balance the loading between CPU and GPU
- use branch judiciously
- data type with lower precision
- reduce the I/O between CPU and GPU, especially for downloading
- SIMD operation
- do not forget the standard library
- linear-interpolation property

### Examples

- Conclusion for the procedure of GPGPU programming
  - 1. wrap data as textures
  - 2. draw a quadrangle
  - 3. invocate fragment programs
  - 4. store GPU outputs as a texture for multi-pass calculation (then go back to step 2)
  - 5. output the final result to framebuffer or read it back to main memory

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#### Paper

- A Survey of General-Purpose Computation on Graphics Hardware, EUROGRAPHICS 2005

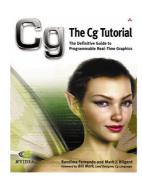
#### Website

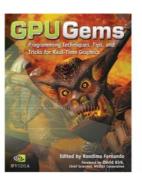
- nVIDIA: <a href="http://developer.nvidia.com">http://developer.nvidia.com</a> (nVIDIA SDK)

- GPGPU: http://www.gpgpu.org

#### Book

- The Cg Tutorial
- GPU Gems 1 & 2









#### Documentation

- Cg User Manual
- NVIDIA GPU Programming Guide





#### Human Resource (Graphics Group)

- Wan-Chun Ma, firebird@cmlab
- Cheng-Han Tu, toshock@cmlab
- Pei-Lun Lee, <a href="mailto:ypcat@cmlab">ypcat@cmlab</a>