Combining GPU Data-Parallel Computing with OpenGL

Mike Bailey

mjb@cs.oregonstate.edu Oregon State University



ACMSIGGRAPH





Oregon State University Computer Graphics

Mike Bailey

- Professor of Computer Science, Oregon State University
- Has worked at Sandia Labs, Purdue University, Megatek, San Diego Supercomputer Center (UC San Diego), and OSU
- Has taught over 5,000 students in his classes
- mjb@cs.oregonstate.edu



Topics

- Introduction to Data Parallel Computing
- Introduction to OpenGL Vertex Buffers
- OpenGL Compute Shaders
- OpenCL
- References



Introduction to Data Parallel Computing

The scenario – many pieces of data need to undergo the same operation:



Introduction to Data Parallel Computing

The scenario – many pieces of data need to undergo the same operation:



Introduction to Data Parallel Computing

The scenario – many pieces of data need to undergo the same operation:





Note: GPUs are designed to Handle Data Parallel Computing Well

Data Parallel / OpenGL Vertex Interoperability: The Basic Idea





In the Beginning of OpenGL ...

You listed the vertices individually:







Then Someone Noticed That You Were Transmitting and Processing Each Vertex Several Times...

For example:





A Little Background -- the OpenGL Rendering Context

The OpenGL Rendering Context contains all the characteristic information necessary to produce an image from geometry. This includes transformations, colors, lighting, textures, where to send the display, etc.



Some of these characteristics have a default value (e.g., lines are white, the display goes to the screen) and some have nothing (e.g., no textures exist)



More Background – What is an OpenGL "Object"?

An OpenGL Object is pretty much the same as a C++, C#, or Java object: it encapsulates a group of data items and allows you to treat them as a unified whole. For example, a Vertex Buffer Object *could* be defined in C++ by:

class VertexBufferObject	
<pre>{ enum dataType; void *memStart;</pre>	// int, float,
int memSize;	
};	

Then, you could create any number of Vertex Buffer Object instances, each with its own characteristics encapsulated within it. When you want to make that combination current, you just need to bring in **("bind")** that entire object. When you bind an object, all of its information comes with it.

Oregon State University Computer Graphics

More Background – How do you Create an OpenGL "Object"?

In C++, objects are pointed to by their address.

In OpenGL, objects are pointed to by an unsigned integer handle. You can assign a value for this handle yourself (not recommended), or have OpenGL generate one for you that is guaranteed to be unique. For example:

GLuint bufA;

glGenBuffers(1, &bufA);

This doesn't actually allocate memory for the buffer object yet, it just acquires a unique handle. To allocate memory, you need to bind this handle to the Context.



More Background -- "Binding" to the Context

The OpenGL term "binding" refers to "attaching" or "docking" (a metaphor which I find to be more visually pleasing) an OpenGL object to the Context. You can then assign characteristics, and they will "flow" through the Context into the object.





More Background -- "Binding" to the Context

When you want to use that Vertex Buffer Object, just bind it again. All of the characteristics will then be active, just as if you had specified them again.



Vertex Buffer Object

glBindBuffer(bufA, GL_ARRAY_BUFFER);



Vertex Buffers: Putting Data in the Buffer Object

glBufferData(type, numBytes, data, usage);

type is the type of buffer object this is:

GL_ARRAY_BUFFER to store floating point vertices, normals, colors, and texture coordinates

GL_ELEMENT_ARRAY_BUFFER to store integer vertex indices to connect for drawing

numBytes is the number of bytes to store in all. Not the number of numbers, but the number of *bytes*!

data is the memory address of (i.e., pointer to) the data to be transferred to the graphics card. This can be NULL, and the data can be transferred later.



Vertex Buffers: Putting Data in the Buffer Object

glBufferData(type, numbytes, data, usage);

usage is a hint as to how the data will be used: GL_xxx_yyy



where xxx should be one of:

STATICthis buffer will be written seldom from the CPUDYNAMICthis buffer will be written oftenSTATICthis buffer will be written oftenfrom the GPU

and yyy should be: DRAW this b

this buffer will be used for drawing





Vertex Buffers: Step #1 – Fill the Arrays

GLfloat Vertices[][3] =
{
 { { 1., 2., 3. },
 { 4., 5., 6. },
 ...
};

Vertex Buffers: Step #2 – Create the Buffers and Fill Them

glGenBuffers(1, &bufA);

glBindBuffer(bufA, GL_ARRAY_BUFFER);

glBufferData(GL_ARRAY_BUFFER, 3*sizeof(float)*numVertices, Vertices, GL_STATIC_DRAW);



Vertex Buffers: Step #3 – Activate the Array Types That You Will Use

glEnableClientState(type)

where *type* can be any of:

GL_VERTEX_ARRAY GL_COLOR_ARRAY GL_NORMAL_ARRAY GL_SECONDARY_COLOR_ARRAY GL_TEXTURE_COORD_ARRAY

- Call this as many times as you need to enable all the arrays that you will need.
- There are other types, too.
- To deactivate a type, call:

```
glDisableClientState( type )
```

Vertex Buffers: Step #4 – To Draw, First Bind the Buffers

glBindBuffer(bufA, GL_ARRAY_BUFFER);

glBindBuffer(bufB, GL_ELEMENT_ARRAY_BUFFER);



Vertex Buffers: Step #5 – Specify the Data

glVertexPointer(size, type, stride, rel_address);	
glColorPointer(size, type, stride, rel_address);	
glNormalPointer(type, stride, rel_address);	
glSecondaryColorPointer(size, type, stride, rel_address);	
glTexCoordPointer(size, type, stride, rel_address);	

size is the spatial dimension, and can be: 2, 3, or 4

type can be: G



Vertex Data
Color Data
VS.
Vertex Data
Color Data
Vertex Data
Color Data
Vertex Data
Color Data

stride is the byte offset between consecutive entries in the array (0 means tightly packed)

rel_address, the 4th argument, is the relative byte address from the start of the buffer where the first element of this part of the data lives. Most of the time you use *(void *)0*



Vertex Buffers: Step #6 – Specify the Connections



If the vertices are not in order:

```
GLuint TriIndices[ ][3] =
{
           \{0, 1, 2\},\
           {0,3,4}
};
glDrawElements( GL_TRIANGLES, 6, GL_UNSIGNED_INT, TriIndices );
```

If all the vertices are in order:

glDrawArrays(GL_TRIANGLES, 0, 6);



Vertex Buffers: Writing Data Directly into a Vertex Buffer

Map the buffer from GPU memory into the memory space of the application:

glBindBuffer(bufA, GL ARRAY BUFFER); glBufferData(GL_ARRAY_BUFFER, 3*sizeof(float)*numVertice(s, NULL, &L_STATIC_DRAW); float * vertexArray = glMapBuffer(GL ARRAY BUFFER, usage);

usage is an indication how the data will be used:

GL_READ_ONLY GL_WRITE_ONLY GL_READ_WRITE the vertex data will be read from, but not written to the vertex data will be written to, but not read from the vertex data will be read from *and* written to

You can now use *vertexArray[]* like any other floating-point array.

When you are done, be sure to call:

glUnMapBuffer(GL_ARRAY_BUFFER);



OpenGL Compute Shaders



OpenGL Compute Shader – the Basic Idea





If I Know GLSL, What Do I Need to Do Differently to Write a Compute Shader?

Not much:

- 1. A Compute Shader is created just like any other GLSL shader, except that its type is GL_COMPUTE_SHADER (duh...). You compile it and link it just like any other GLSL shader program.
- 2. A Compute Shader must be in a shader program all by itself. There cannot be vertex, fragment, etc. shaders in there with it.
- 3. A Compute Shader has access to uniform variables and buffer objects, but cannot access any pipeline variables such as attributes or variables from other stages. It stands alone.
- 4. A Compute Shader needs to declare the number of work-items in each of its work-groups in a special GLSL *layout* statement.



More information on items 3 and 4 are coming up . . .

The Example We Are Going to Use Here is a *Particle System*



Setting up the Shader Storage Buffer Objects in Your C Program

```
#define NUM PARTICLES
                                  1024*1024
                                                          // total number of particles to move
#define WORK GROUP SIZE
                                                          // # work-items per work-group
                                          128
struct pos
{
                                  // positions
           float x, y, z, w;
};
struct vel
{
           float vx, vy, vz, vw; // velocities
};
struct color
ł
           float r, g, b, a;
                                  // colors
};
// need to do the following for both position, velocity, and colors of the particles:
GLuint posSSbo;
GLuint velSSbo
GLuint colSSbo;
```



Note that .w and .vw are not actually needed. But, by making these structure sizes a multiple of 4 floats, it doesn't matter if they are declared with the std140 or the std430 qualifier. I think this is a good thing. (is it?)

Setting up the Shader Storage Buffer Objects in Your C Program

```
glGenBuffers( 1, &posSSbo);
glBindBuffer( GL_SHADER_STORAGE_BUFFER, posSSbo );
glBufferData(GL_SHADER_STORAGE_BUFFER, NUM_PARTICLES * sizeof(struct pos), NULL, GL_STATIC_DRAW);
GLint bufMask = GL MAP WRITE BIT | GL MAP INVALIDATE BUFFER BIT ;
                                                                           // the invalidate makes a big difference when re-writing
struct pos *points = (struct pos *) glMapBufferRange(GL SHADER STORAGE BUFFER, 0, NUM PARTICLES * sizeof(struct pos), bufMask);
for( int i = 0; i < NUM PARTICLES; i++ )
                                                 Shader Storage
{
                                                 Buffer Object
         points[ i ].x = Ranf( XMIN, XMAX );
         points[ i ].y = Ranf( YMIN, YMAX );
         points[ i ].z = Ranf( ZMIN, ZMAX );
         points[ i].w = 1.;
glUnmapBuffer( GL_SHADER_STORAGE_BUFFER );
glGenBuffers( 1, &velSSbo);
glBindBuffer( GL_SHADER_STORAGE_BUFFER, velSSbo );
glBufferData( GL SHADER STORAGE BUFFER, NUM PARTICLES * sizeof(struct vel), NULL, GL STATIC DRAW );
struct vel *vels = (struct vel *) glMapBufferRange(GL SHADER STORAGE BUFFER, 0, NUM PARTICLES * sizeof(struct vel), bufMask);
for( int i = 0; i < NUM PARTICLES; i++ )
                                                      Shader Storage
                                                      Buffer Object
         vels[ i ].vx = Ranf( VXMIN, VXMAX );
         vels[ i ].vy = Ranf( VYMIN, VYMAX );
         vels[ i ].vz = Ranf( VZMIN, VZMAX );
         vels[i].vw = 0.:
glUnmapBuffer(GL_SHADER_STORAGE_BUFFER);
```



Oregon State The same would possibly need to be done for the color shader storage buffer object

The Data Needs to be Divided into Large Quantities call *Work-Groups*, each of which is further Divided into Smaller Units Called *Work-Items*

20 total items to compute:





The Similarity in Diagrams is not a Coincidence!





The Data Needs to be Divided into Large Quantities call Work-Groups, each of which is further Divided into Smaller Units Called Work-Items

20x12 (=240) total items to compute:





The Similarity in Diagrams is not a Coincidence!







Running the Compute Shader from the Application

void glDispatchCompute(num_groups_x, num_groups_y, num_groups_z);





If the problem is 2D, then num_groups_z = 1 If the problem is 1D, then num_groups_y = 1 and

num_groups_z = 1

Invoking the Compute Shader in Your C Program

Shader Storage glBindBufferBase(GL SHADER STORAGE BUFFER, 4, posSSbo); **Buffer Object** glBindBufferBase(GL_SHADER_STORAGE_BUFFER, 5, velSSbo); glBindBufferBase(GL_SHADER_STORAGE_BUFFER, 6, colSSbo); glUseProgram(MyComputeShaderProgram); glDispatchCompute(NUM PARTICLES / WORK GROUP SIZE, 1, 1); glMemoryBarrier(GL_SHADER_STORAGE_BARRIER_BIT); glUseProgram(MyRenderingShaderProgram); glBindBuffer(GL_ARRAY_BUFFER, posSSbo); glVertexPointer(4, GL FLOAT, 0, (void *)0); glEnableClientState(GL_VERTEX_ARRAY); glDrawArrays(GL_POINTS, 0, NUM_PARTICLES); glDisableClientState(GL_VERTEX_ARRAY); glBindBuffer(GL_ARRAY_BUFFER, 0); The Compute Shader Moves the Particles by Recomputing the Position and Velocity Buffers The OpenGL Rendering Draws the Particles by Reading the Position Buffer

Oregon State University Computer Graphics

Special Pre-set Variables in the Compute Shader

in	uvec3	gl_NumWorkGroups ;	Same numbers as in the <i>glDispatchCompute</i> call
const	t uvec3	gl_WorkGroupSize ;	Same numbers as in the <i>layout</i> local_size_*
in	uvec3	gl_WorkGroupID ;	Which workgroup this thread is in
in	uvec3	gl_LocalInvocationID ;	Where this thread is in the current workgroup
in	uvec3	gl_GlobalInvocationID ;	Where this thread is in <i>all</i> the work items
in	uint	gl_LocalInvocationIndex ;	1D representation of the gl_LocalInvocationID (used for indexing into a shared array)

$0 \leq gl_WorkGroupID \leq gl_NumWorkGroups - 1$	
$0 \leq gl_LocalInvocationID \leq gl_WorkGroupSize - 1$	
gl_GlobalInvocationID = gl_WorkGroupID * gl_WorkGroupSize + gl_LocalInvocation	nID
gl_LocalInvocationIndex = gl_LocalInvocationID.z * gl_WorkGroupSize.y * gl_WorkGroup gl_LocalInvocationID.y * gl_WorkGroupSize.x gl_LocalInvocationID.x	pSize.x + +



The Particle System Compute Shader -- Setup







The Particle System Compute Shader – The Physics





The Particle System Compute Shader – How About Introducing a Bounce?



Oregon State University Computer Graphics

The Particle System Compute Shader – How About Introducing a Bounce?

```
uint gid = gI GlobalInvocationID.x;
                                                  // the .y and .z are both 1 in this case
vec3 p = Positions[ gid ].xyz;
                                                             p' = p + v \cdot t + \frac{1}{2}G \cdot t^{2}v' = v + G \cdot t
vec3 v = Velocities[ gid ].xyz;
vec3 pp = p + v^*DT + .5^*DT^*DT^*G;
vec3 vp = v + G^*DT;
if( IsInsideSphere(pp, SPHERE) )
                                                     Graphics Trick Alert: Making the bounce
                                                     happen from the surface of the sphere is
{
     vp = BounceSphere( p, v, SPHERE );
                                                     time-consuming. Instead, bounce from the
                                                     previous position in space. If DT is small
     pp = p + vp^*DT + .5^*DT^*DT^*G;
                                                     enough, nobody will ever know...
Positions[ gid ].xyz = pp;
Velocities[ gid ].xyz = vp;
```



The Bouncing Particle System Compute Shader – What Does It Look Like?





Oregon State University Computer Graphics

OpenCL Computing Shaders



Either OpenGL or OpenCL Can Manipulate the Vertex Buffer at a Time, but not Both: All of this Happens on the GPU





Oregon State University Computer Graphics

1. Program Header

<pre>#include <stdio.h> #define _USE_MATH_DEFINES #include <math.h> #include <string.h> #include <stdlib.h> #include <ctype.h> #include <ctype.h> #include <omp.h></omp.h></ctype.h></ctype.h></stdlib.h></string.h></math.h></stdio.h></pre>
#ifdef WIN32 #include <windows.h> #endif</windows.h>
#ifdef WIN32 #include "glew.h" #endif
<pre>#include <gl gl.h=""> #include <gl glu.h=""> #include "glut.h" #include "glui.h"</gl></gl></pre>
#include "cl.h" #include "cl_gl.h"



Structures We Will Use to Fill the Vertex Buffers

```
// structs we will need later:
struct xyzw
{
    float x, y, z, w;
};
struct rgba
{
    float r, g, b, a;
};
```



OpenCL Global Variables

size_t GlobalWorkSize[3] = size_t LocalWorkSize[3] =	{ NUM_PA { LOCAL_	ARTICLES, 1, 1 }; _SIZE, 1, 1 };
gluint gluint struct xyzw * cl_mem cl_mem cl_mem	hPobj; hCobj; hVel; dPobj; dCobj; dVel;	 // host opengl object // host opengl object // host c array // device memory buffer // device memory buffer // device memory buffer
cl_command_queue cl_device_id cl_kernel cl_platform_id cl_program	CmdQue Device; Kernel; Platform; Program	ue; ;



A Deceptively-Simple Main Program





Setting up OpenCL: Querying the Existence of an OpenCL Extension





Querying the Existence of an OpenCL Extension

```
bool
IsCLExtensionSupported( const char *extension )
     // see if the extension is bogus:
     if (extension == NULL || extension [0] == ' (0'))
          return false:
     char * where = (char *) strchr( extension, '');
     if( where != NULL )
          return false;
     // get the full list of extensions:
     size_t extensionSize;
     clGetDeviceInfo( Device, CL DEVICE EXTENSIONS, 0, NULL, & extensionSize );
     char *extensions = new char [ extensionSize ];
     clGetDeviceInfo( Device, CL_DEVICE_EXTENSIONS, extensionSize, extensions, NULL );
     for( char * start = extensions ; ; )
          where = (char *) strstr( (const char *) start, extension );
          if (where == 0)
               delete [] extensions;
               return false;
          }
          char * terminator = where + strlen(extension); // points to what should be the separator
          if( *terminator == ' ' || *terminator == '\0' || *terminator == '\r' || *terminator == '\n' )
               delete [] extensions;
               return true;
          }
          start = terminator;
```

{



Setting up OpenCL: The Interoperability Context

```
void
InitCL()
{
           . . .
// get the platform id:
status = clGetPlatformIDs( 1, &Platform, NULL );
PrintCLError( status, "clGetPlatformIDs: " );
// get the device id:
status = clGetDeviceIDs( Platform, CL_DEVICE_TYPE_GPU, 1, &Device, NULL );
PrintCLError( status, "clGetDeviceIDs: " );
// 3. create a special opencl context based on the opengl context:
cl_context_properties props[] =
{
           CL_GL_CONTEXT_KHR,
                                             (cl_context_properties) wglGetCurrentContext(),
           CL WGL HDC KHR,
                                             (cl_context_properties) wglGetCurrentDC(),
           CL_CONTEXT_PLATFORM,
                                              (cl_context_properties) Platform,
           0
};
cl context Context = clCreateContext( props, 1, &Device, NULL, NULL, &status );
PrintCLError( status, "clCreateContext: " );
      Oregon State University
       Computer Graphics
```

Setting up OpenCL: The Interoperability Context is Different for each OS



Setting up OpenCL





Setting the Initial Particle Parameters

```
void
ResetParticles()
{
          glBindBuffer( GL_ARRAY_BUFFER, hPobj );
          struct xyzw *points = (struct xyzw *) glMapBuffer( GL_ARRAY_BUFFER, GL_WRITE_ONLY );
          for( int i = 0; i < NUM_PARTICLES; i++ )
                     points[ i ].x = Ranf( XMIN, XMAX );
                     points[ i ].y = Ranf( YMIN, YMAX );
                     points[ i ].z = Ranf( ZMIN, ZMAX );
                     points[i].w = 1.;
          glUnmapBuffer( GL_ARRAY_BUFFER );
          glBindBuffer(GL ARRAY BUFFER, hCobj);
          struct rgba *colors = (struct rgba *) glMapBuffer( GL_ARRAY_BUFFER, GL_WRITE_ONLY );
          for( int i = 0; i < NUM_PARTICLES; i++ )
                     colors[i].r = Ranf(0., 1.);
                     colors[i].g = Ranf(0., 1.);
                     colors[i].b = Ranf(0., 1.);
                     colors[i].a = 1.;
          glUnmapBuffer(GL_ARRAY_BUFFER);
           . . .
```

Oregon State University Computer Graphics

Setting the Initial Particle Parameters





Setting-up the Device-Side Buffers

void InitCL() ł . . . // 5. create the opencl version of the velocity array: dVel = clCreateBuffer(Context, CL_MEM_READ_WRITE, 4*sizeof(float)*NUM_PARTICLES, NULL, &status); PrintCLError(status, "clCreateBuffer: "); // 6, write the data from the host buffers to the device buffers: status = clEngueueWriteBuffer(CmdQueue, dVel, CL FALSE, 0, 4*sizeof(float)*NUM PARTICLES, hVel, 0, NULL, NULL); PrintCLError(status, "clEneueueWriteBuffer: "); // 5. create the opencl version of the opengl buffers: dPobj = clCreateFromGLBuffer(Context, 0, hPobj, &status); PrintCLError(status, "clCreateFromGLBuffer (1)"); dCobj = clCreateFromGLBuffer(Context, 0, hCobj, &status); PrintCLError(status, "clCreateFromGLBuffer (2)");



Setup the Kernel Arguments...



... to Match the Kernel's Parameter List



The "Idle Function" Tells OpenCL to Do Its Computing

void Animate()	
۱ ۱	// acquire the vertex buffers from opengl:
	glutSetWindow(MainWindow); glFinish();
	cl_int status = clEnqueueAcquireGLObjects(CmdQueue, 1, &dPobj, 0, NULL, NULL); PrintCLError(status, "clEnqueueAcquireGLObjects (1) : "); status = clEnqueueAcquireGLObjects(CmdQueue, 1, &dCobj, 0, NULL, NULL); PrintCLError(status, "clEnqueueAcquireGLObjects (2) : ");
	double time0 = omp_get_wtime();
	// 11. enqueue the Kernel object for execution:
	cl_event wait; status = clEnqueueNDRangeKernel(CmdQueue, Kernel, 1, NULL, GlobalWorkSize, LocalWorkSize, 0, NULL, &wait); PrintCLError(status, "clEnqueueNDRangeKernel: ");
	status = clWaitForEvents(1, &wait); PrintCLError(status, "clWaitForEvents: ");
	double time1 = omp_get_wtime(); ElapsedTime = time1 - time0;
	clFinish(CmdQueue); clEnqueueReleaseGLObjects(CmdQueue, 1, &dCobj, 0, NULL, NULL); PrintCLError(status, "clEnqueueReleaseGLObjects (1): "); clEnqueueReleaseGLObjects(CmdQueue, 1, &dPobj, 0, NULL, NULL); PrintCLError(status, "clEnqueueReleaseGLObject (2): ");
}	glutSetWindow(MainWindow); glutPostRedisplay();

Redrawing the Scene: The Particles





Oregon State University Computer Graphics

13. Clean-up



Oregon State University Computer Graphics

particles.cl

```
kernel
void
Particle( global point * dPobj, global vector * dVel, global color * dCobj )
{
                                                           // particle #
           int gid = get_global_id(0);
           point p = dPobj[gid];
           vector v = dVel[gid];
           point pp = p + v^*DT + .5^*DT^*DT^*G;
                                                           // p'
           vector vp = v + G^*DT;
                                                           // v'
           pp.w = 1.;
           vp.w = 0.;
           if( IsInsideSphere(pp, Sphere1) )
           ł
                       vp = BounceSphere( p, v, Sphere1 );
                       pp = p + vp^*DT + .5^*DT^*DT^*G;
           }
           dPobj[gid] = pp;
           dVel[gid] = vp;
```



particles.cl

```
typedef float4 point;
typedef float4 vector;
typedef float4 color;
typedef float4 sphere;
constant float4 G
                        = (float4) (0., -9.8, 0., 0.);
constant float DT
                        = 0.1;
constant sphere Sphere1 = (sphere)(-100., -800., 0., 600.);
vector
Bounce(vector in, vector n)
{
           n.w = 0.;
           n = normalize(n);
           vector out = in -2. * n * dot( in.xyz, n.xyz );
           out.w = 0.;
           return out;
```



particles.cl



Performance



Oregon State University Computer Graphics

How Do You Choose Between Compute Shaders and OpenCL?

OpenCL and Compute Shaders are *great*! They do a super job of using the GPU for general-purpose data-parallel computing. So, how do you choose between Compute Shaders and OpenCL? Here's what I think:

- OpenCL requires installing a separate driver and separate libraries. While this is not a huge deal, it does take time and effort. Compute Shaders are "just there" as part of OpenGL 4.3.
- OpenCL is more feature-rich than OpenGL compute shaders.
- Compute Shaders use the GLSL language, something that all OpenGL programmers should already be familiar with (or will be soon).
- Compute shaders use the same context as does the OpenGL rendering pipeline. There is no need to acquire and release the context as OpenGL+OpenCL must do.
- Calls to OpenGL compute shaders appear to be more lightweight than calls to OpenCL kernels are. This should result in better performance.
- Using OpenCL is more involved. It requires more setup (queries, platforms, devices, queues, kernels, etc.). Compute Shaders are more convenient. They just flow in with the graphics.



How Do You Choose Between Compute Shaders and OpenCL?

The bottom line is that I use OpenCL for the big, bad stuff. But, for lighterweight data-parallel computing, I've been using the Compute Shaders.

An example of a lighter-weight data-parallel graphics-related application is a **particle system**.

An example of a bigger, badder data-parallel graphics-related application is a **volume toolkit**.



References

• Dave Shreiner, Graham Sellers, John Kessenich, and Bill Licea-Kane, *OpenGL Programming Guide, 8th Edition*, 2013.

- Peter Pacheco, An Introduction to Parallel Programming, Morgan-Kaufmann, 2011.
- Aaftah Munshi, Benedict Gaster, Timothy Mattson, James Fung, and Dan Ginsburg, *OpenCL Programming Guide* Addison-Wesley, 2012.

• Benedict Gaster, Lee Howes, David Kaeli, Perhaad Mistry, and Dana Schaa, *Heterogeneous Computing with OpenCL*, Morgan-Kaufmann, 2012.

