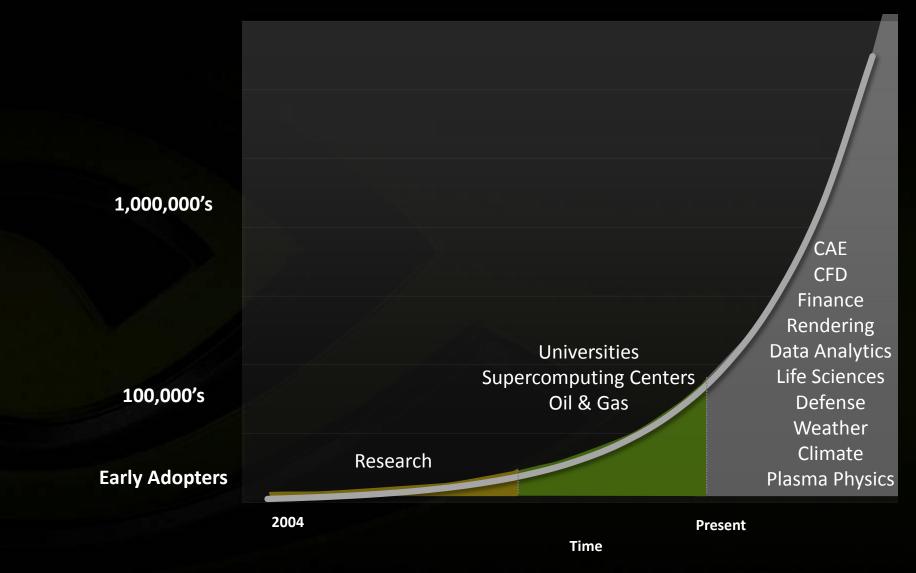


GPUs Reaching Broader Set of Developers



3 Ways to Accelerate Applications with GPUs

Applications

Libraries

Directives

Programming Languages

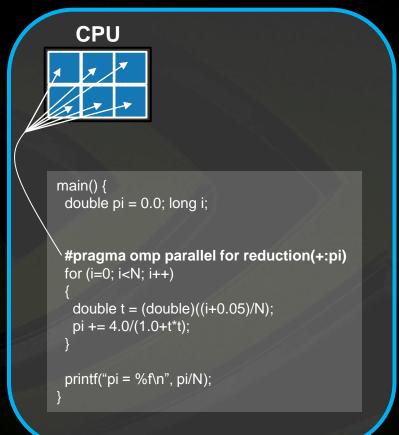
"Drop-in"
Acceleration

Quickly Accelerate Existing Applications Maximum Performance

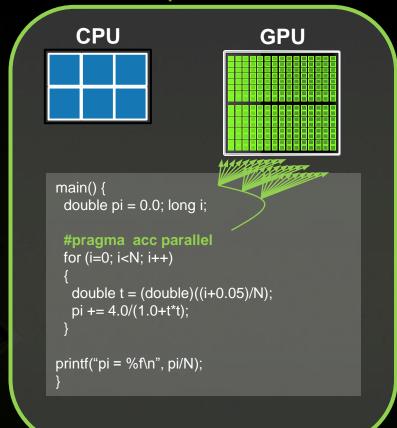
Directives: Add A Few Lines of Code



OpenMP



OpenACC



OpenACC: Open Programming Standard for Parallel Computing











"OpenACC will enable programmers to easily develop portable applications that maximize the performance and power efficiency benefits of the hybrid CPU/GPU architecture of Titan."



Oak Ridge National Lab

Easy, Fast, Portable

"OpenACC is a technically impressive initiative brought together by members of the OpenMP Working Group on Accelerators, as well as many others. We look forward to releasing a version of this proposal in the next release of OpenMP."



Michael Wong CEO, OpenMP Directives Board

OpenACC



- Compiler directives to specify parallel regions in C, C++, Fortran
 - OpenACC compilers offload parallel regions from host to accelerator
 - Portable across OSes, host CPUs, accelerators, and compilers
- Create high-level heterogeneous programs
 - Without explicit accelerator initialization,
 - Without explicit data or program transfers between host and accelerator
- Programming model allows programmers to start simple
 - Enhance with additional guidance for compiler on loop mappings, data location, and other performance details

OpenACC Specification and Website



Full OpenACC 1.0 Specification available online

http://www.openacc-standard.org

- Quick reference card also available
- First implementations to appear mid-2012
- Current PGI, Cray, and CAPS compilers all have accelerator directives (precursors to OpenACC)

The OpenACC™ API QUICK REFERENCE GUIDE

The OpenACC Application Program Interface describes a collection of compiler directives to specify loops and regions of code in standard C, C++ and Fortran to be offloaded from a host CPU to an attached accelerator, providing portability across operating systems, host CPUs and accelerators.

Most OpenACC directives apply to the immediately following structured block or loop; a structured block is a single statement or a compound statement (C or C++) or a sequence of statements (Fortran) with a single entry point at the top and a single exit at the bottom.







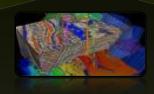
PGI

Version 1.0, November 2011

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Small Effort. Real Impact.





Large Oil Company

3x in 7 days

Solving billions of equations iteratively for oil production at world's largest petroleum reservoirs



Univ. of Houston

Prof. M.A. Kayali

20x in 2 days

Studying magnetic systems for innovations in magnetic storage media and memory, field sensors, and biomagnetism



Uni. Of Melbourne

Prof. Kerry Black

65x in 2 days

Better understand complex reasons by lifecycles of snapper fish in Port Phillip Bay



Ufa State Aviation

Prof. Arthur Yuldashev

7x in 4 Weeks

Generating stochastic geological models of oilfield reservoirs with borehole data



GAMESS-UK

Dr. Wilkinson, Prof. Naidoo

10x

Used for various fields such as investigating biofuel production and molecular sensors.

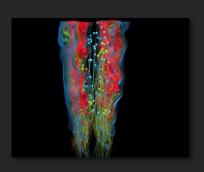
Focus on Exposing Parallelism



With Directives, tuning work focuses on exposing parallelism, which makes codes inherently better

Example: Application tuning work using directives for new Titan system at ORNL

S3DResearch more efficient combustion with next-generation fuels





CAM-SE
Answer questions about specific climate change adaptation and mitigation scenarios

- Tuning top 3 kernels (90% of runtime)
- 3 to 6x faster on CPU+GPU vs. CPU+CPU
- But also improved all-CPU version by 50%

- Tuning top key kernel (50% of runtime)
- 6.5x faster on CPU+GPU vs. CPU+CPU
- Improved performance of CPU version by 100%

A simple example (Jacobi relaxation)



```
Iterate until
while ( error > tol && iter < iter max ) {</pre>
                                                               converged
    error=0.f;
                                                            Iterate across
    for ( int j = 1; j < n-1; j++) {
                                                          elements of matrix
        for(int i = 1; i < m-1; i++) {
             Anew[j][i] = 0.25f * (A[j][i+1] + A[j][i-1]
                                   + A[j-1][i] + A[j+1][i]);
             error = max(error, abs(Anew[j][i] - A[j][i]);
                                                  Calculate new value
    for ( int j = 1; j < n-1; j++) {
                                                   from neighbours
        for( int i = 1; i < m-1; i++ ) {
             A[j][i] = Anew[j][i];
    } }
    iter++;
```

OpenMP CPU Implementation



```
while ( error > tol && iter < iter max ) {</pre>
    error=0.f;
#pragma omp parallel for shared(m, n, Anew, A)
    for ( int j = 1; j < n-1; j++) {
        for(int i = 1; i < m-1; i++) {
            Anew[j][i] = 0.25f * (A[j][i+1] + A[j][i-1]
                                 + A[j-1][i] + A[j+1][i]);
            error = max(error, abs(Anew[j][i] - A[j][i]);
#pragma omp parallel for shared(m, n, Anew, A)
    for ( int j = 1; j < n-1; j++) {
        for( int i = 1; i < m-1; i++ ) {
            A[j][i] = Anew[j][i];
    } }
    iter++;
```

Parallelise loops across CPU cores

OpenACC GPU Implementation



```
#pragma acc data copy(A, Anew)
while ( error > tol && iter < iter max ) {</pre>
    error=0.f;
#pragma acc parallel
    for( int j = 1; j < n-1; j++) {
        for(int i = 1; i < m-1; i++) {
            Anew[j][i] = 0.25f * (A[j][i+1] + A[j][i-1]
                                 + A[j-1][i] + A[j+1][i]);
            error = max(error, abs(Anew[j][i] - A[j][i]);
#pragma acc parallel
    for ( int j = 1; j < n-1; j++) {
        for( int i = 1; i < m-1; i++ ) {
            A[j][i] = Anew[j][i];
    } }
    iter++;
```

Copy arrays into GPU within region

Parallelize loops with GPU kernels

Data automatically copied back to at end of region

Speed Up



Implementation	Device	Time (s)	Speedup
Single-threaded CPU	Xeon X5550	33.42	
Multi-threaded CPU (8 threads)	Xeon X5550	17.81	1.88x
GPU accelerated	Tesla M2090	8.27	2.15x

Over 2x speed compared to 8-Core OpenMP code with just 3 directives. Note: tested with PGI Accelerator directives

Jacobi Relaxation (Fortran)



Iterate until converged

```
iter = 0
do while (err .gt tol .and. iter .gt. iter max)
  iter = iter + 1
  err = 0.0
                                                       Calculate new value
                         Iterate across
                       elements of matrix
                                                        from neighbours
  do j=1,m
    do i=1,n
      Anew(i,j) = 0.25 * (A(i+1,j) + A(i-1,j) + A(i,j-1) + A(i,j+1)
      err = max(err, abs(Anew(i,j)-A(i,j)))
    end do
  end do
  if (mod(iter, 100).eq.0 .or. iter.eq.1) print*, iter, err
  A = Anew
end do
```

OpenMP CPU Implementation (Fortran)



```
iter = 0
do while (err .gt tol .and. iter .gt. iter max)
                                                        Parallelise code
                                                         inside region
  iter = iter + 1
  err = 0.0
!$omp parallel do shared(m,n,Anew,A) reduction(max:err)
  do j=1, m
    do i=1,n
      Anew(i,j) = 0.25 * (A(i+1,j) + A(i-1,j) + A(i,j-1) + A(i,j+1)
      err = max(err, abs(Anew(i,j)-A(i,j)))
    end do
                                                Close off region
  end do
!$omp end parallel do
  if( mod(iter,100).eq.0 ) print*, iter, err
 A = Anew
end do
```

OpenACC GPU Implementation (Fortran)



```
Copy arrays into GPU
!$acc data copy(A,Anew)
                                         memory within region
iter = 0
do while (err .gt tol .and. iter .gt. iter max)
  iter = iter + 1
  err = 0.0
                                                         Parallelise code
!$acc parallel reduction( max:err )
                                                          inside region
  do j=1,m
    do i=1,n
      Anew(i,j) = 0.25 * (A(i+1,j) + A(i-1,j) + A(i,j-1) + A(i,j+1)
      err = max(err, abs(Anew(i,j)-A(i,j)))
    end do
                                                         Close off parallel
  end do
                                                             region
!$acc end parallel
  if( mod(iter,100).eq.0 ) print*, iter, err
!$acc parallel
 A = Anew
!$acc end parallel
                                               Close off data region,
end do
                                                  copy data back
!$acc end data
```

NVIDIA Corporation 2012

Finding Parallelism in your code



- (Nested) for loops are best for parallelization
- Large loop counts needed to offset GPU/memcpy overhead
- Iterations of loops must be independent of each other
- Compiler must be able to figure out sizes of data regions
 - Can use directives to explicitly control sizes
- Pointer arithmetic should be avoided if possible
 - Use subscripted arrays, rather than pointer-indexed arrays.
- Function calls within accelerated region must be inlineable.

Tips and Tricks



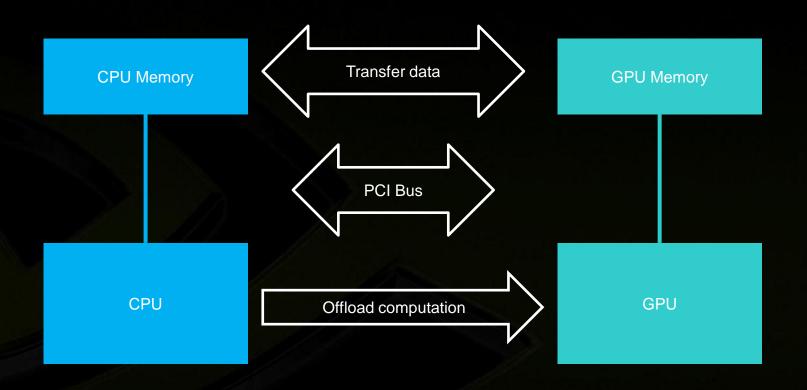
- (PGI) Use time option to learn where time is being spent
 - -ta=nvidia,time
- Eliminate pointer arithmetic
- Inline function calls in directives regions
- Use contiguous memory for multi-dimensional arrays
- Use data regions to avoid excessive memory transfers
- Conditional compilation with _OPENACC macro



OPENACC CONCEPTS

Basic Concepts





For efficiency, decouple data movement and compute off-load

Directive Syntax



!\$acc directive [clause [,] clause] ...]
Often paired with a matching end directive surrounding a structured code block
!\$acc end directive

C
#pragma acc directive [clause [,] clause] ...]
Often followed by a structured code block



DATA MANAGEMENT

Data Construct



Fortran

```
!$acc data [clause ...]
    structured block
!$acc end data
```

General Clauses

```
if( condition )
async( expression )
```

C

```
#pragma acc data [clause ...]
     { structured block }
```

Manage data movement. Data regions may be nested.

Data Clauses



```
Allocates memory on GPU and copies data from
     (list)
copy
               host to GPU when entering region and copies data
               to the host when exiting region.
               Allocates memory on GPU and copies data from
copyin ( list )
               host to GPU when entering region.
copyout (list) Allocates memory on GPU and copies data to the
               host when exiting region.
               Allocates memory on GPU but does not copy.
create ( list )
present ( list ) Data is already present on GPU from another
               containing data region.
```

and present or copy[in|out], present or create, deviceptr.

Improved OpenACC GPU Implementation



movement

```
#pragma acc data copyin(A), create(Anew) -
                                                            Reduced data
while ( error > tol && iter < iter max ) {</pre>
    error=0.f;
#pragma acc parallel
    for( int j = 1; j < n-1; j++) {
        for(int i = 1; i < m-1; i++) {
            Anew[j][i] = 0.25f * (A[j][i+1] + A[j][i-1]
                                 + A[j-1][i] + A[j+1][i]);
            error = max(error, abs(Anew[j][i] - A[j][i]);
#pragma acc parallel
    for ( int j = 1; j < n-1; j++) {
        for( int i = 1; i < m-1; i++ ) {
            A[j][i] = Anew[j][i];
    } }
    iter++;
```

Improved OpenACC GPU Implementation



```
!$acc data copyin(A), create(Anew)
iter = 0
do while (err .gt tol .and. iter .gt. iter max)
 iter = iter + 1
  err = 0.0
!$acc parallel reduction( max:err )
  do j=1,m
    do i=1,n
     Anew(i,j) = 0.25 * (A(i+1,j)) + A(i-1,j) &
                          A(i, j-1) + A(i, j+1)
      err = max(err, abs(Anew(i,j)-A(i,j)))
    end do
  end do
!$acc end parallel
 if( mod(iter,100).eq.0 ) print*, iter, err
 A = Anew
end do
!$acc end data
```

Reduced data movement

Update Directive



Move data from GPU to host, or host to GPU.

Data movement can be conditional, and asynchronous.



WORK MANAGEMENT

Parallel Construct



Fortran

```
!$acc parallel [clause ...]
    structured block
!$acc end parallel
```

Clauses

```
if( condition )
async( expression )
num_gangs( expression )
num_workers( expression )
vector_length( expression )
```

C

```
#pragma acc parallel [clause ...]
     { structured block }
```

```
private( list )
firstprivate( list )
reduction( operator:list )
```

Any data clause

Parallel Clauses



```
Controls how many parallel gangs are
num gangs ( expression )
                            created (CUDA gridDim).
                            Controls how many workers are created
num workers ( expression )
                            in each gang (CUDA blockDim).
                            Controls vector length of each worker
vector length ( list )
                            (SIMD execution).
                            A copy of each variable in list is
private( list )
                            allocated to each gang.
                            private variables initialized from host.
firstprivate ( list )
                            private variables combined across
reduction( operator:list )
                            gangs.
```

More Parallelism (C)



```
#pragma acc data copyin(A), create(Anew)
while ( error > tol && iter < iter max ) {</pre>
    error=0.f;
#pragma acc parallel reduction( max:error
    for (int j = 1; j < n-1; j++) {
        for(int i = 1; i < m-1; i++) {
            Anew[j][i] = 0.25f * (A[j][i+1] + A[j][i-1]
                                 + A[j-1][i] + A[j+1][i]);
            error = max(error, abs(Anew[j][i] - A[j][i]);
#pragma acc parallel
    for ( int j = 1; j < n-1; j++) {
        for( int i = 1; i < m-1; i++ ) {
            A[j][i] = Anew[j][i];
    } }
    iter++;
```

Find maximum over all iterations

More Parallelism (Fortran)



```
!$acc data copyin(A), create(Anew)
iter = 0
do while ( err .gt tol .and. iter .gt. iter max )
 iter = iter + 1
 err = 0.0
!$acc parallel reduction( max:err
 do j=1,m
   do i=1,n
     Anew(i,j) = 0.25 * (A(i+1,j)) + A(i-1,j) &
                          A(i, j-1) + A(i, j+1)
      err = max(err, abs(Anew(i,j)-A(i,j)))
   end do
 end do
!$acc end parallel
 if( mod(iter,100).eq.0 ) print*, iter, err
!$acc parallel
 A = Anew
!$acc end parallel
end do
!$acc end data
```

Find maximum over all iterations

Add second parallel region inside data region

Kernels Construct



Fortran

```
!$acc kernels [clause ...]
    structured block
!$acc end kernels
```

Clauses

```
if( condition )
async( expression )
```

Any data clause

C

Kernels Construct



Each loop executed as a separate kernel on the GPU.

```
!$acc kernels
    do i=1,n
        a(i) = 0.0
        b(i) = 1.0
        c(i) = 2.0
    end do

do i=1,n
        a(i) = b(i) + c(i)
    end do

!$acc end kernels
```

Loop Construct



Fortran

```
!$acc loop [clause ...]
    loop
!$acc end loop
```

C

```
#pragma acc loop [clause ...]
{ loop }
```

Combined directives

```
!$acc parallel loop [clause ...]
!$acc kernels loop [clause ...]
```

```
!$acc parallel loop [clause ...]
!$acc kernels loop [clause ...]
```

Detailed control of the parallel execution of the following loop.

Loop Clauses

collapse(n)



```
seq
private( list )
reduction( operator:list )
```

Applies directive to the following n nested loops.

Executes the loop sequentially on the GPU.

A copy of each variable in list is created for each iteration of the loop.

private variables combined across iterations.

Loop Clauses Inside parallel Region



gang

worker

vector

Shares iterations across the gangs of the parallel region.

Shares iterations across the workers of the gang.

Execute the iterations in SIMD mode.

Loop Clauses Inside kernels Region



```
gang [( num_gangs )]
worker [( num_workers )]
vector [( vector_length )]
independent
```

Shares iterations across across at most num_gangs gangs.

Shares iterations across at most num_workers of a single gang.

Execute the iterations in SIMD mode with maximum vector_length.

Specify that the loop iterations are independent.

More Performance (C)



```
#pragma acc data copyin(A), create(Anew)
while ( error > tol && iter < iter max ) {</pre>
    error=0.f;
#pragma acc kernels loop reduction( max:error ), gang(32), worker(16)
    for( int j = 1; j < n-1; j++) {
#pragma acc loop gang(16), worker(32)
        for (int i = 1; i < m-1; i++) {
            Anew[j][i] = 0.25f * (A[j][i+1] + A[j][i-1]
                                 + A[j-1][i] + A[j+1][i]);
            error = max(error, abs(Anew[j][i] - A[j][i]);
    }}
#pragma acc kernels loop
    for ( int j = 1; j < n-1; j++) {
                                                             Combined 65%
#pragma acc loop gang(16), worker(32)
        for( int i = 1; i < m-1; i++ ) {
            A[j][i] = Anew[j][i];
    } }
    iter++;
```

faster than default schedule

More Performance (Fortran)



```
!$acc data copyin(A), create(Anew)
iter = 0
do while ( err .gt tol .and. iter .gt. iter max )
  iter = iter + 1
  err = 0.0
!$acc kernels loop reduction( max:err ), gang(32), worker(8)
  do j=1,m
    do i=1,n
      Anew(i,j) = 0.25 * (A(i+1,j)) + A(i-1,j) &
                           A(i, j-1) + A(i, j+1)
      err = max(err, abs(Anew(i,j)-A(i,j)))
    end do
  end do
!$acc end kernels loop
  if ( mod(iter, 100).eq.0 ) print*, iter, err
!$acc parallel
  A = Anew
!$acc end parallel
end do
!$acc end data
```

30% faster than default schedule



OTHER SYNTAX

Other Directives



cache Construct

host_data Construct

wait directive

declare directive

Cache data in software managed data cache (CUDA shared memory).

Makes the address of device data available on the host.

Waits for asynchronous GPU activity to complete.

Specify that data is to allocated in device memory for the duration of an implicit data region created during the execution of a subprogram.

Runtime Library Routines



Fortran

use openacc
#include "openacc_lib.h"

acc_get_num_devices
acc_set_device_type
acc_get_device_type
acc_set_device_num
acc_get_device_num
acc_get_device_num
acc_async_test
acc_async_test_all

C

#include "openacc.h"

acc_async_wait
acc_async_wait_all
acc_shutdown
acc_on_device
acc_malloc
acc_free

Environment and Conditional Compilation



ACC_DEVICE device

ACC DEVICE NUM num

OPENACC

Specifies which device type to connect to.

Specifies which device number to connect to.

Preprocessor directive for conditional compilation.