

# Introduction to OpenACC

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

## The Standard for GPU Directives

- Simple:** Directive are the easy path to accelerate compute intensive applications
- Open:** OpenACC is an open GPU directives standard, making GPU programming straightforward and portable across parallel and multi-core processors
- Powerful:** GPU directives allow complete access to the massive parallel power of a GPU



## High Level

- Compiler directives to specify parallel regions in C & Fortran
  - Offload parallel regions
  - 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

## High Level . . . with low-level access

- Programming model allows programmers to start simple
- Compiler gives additional guidance
  - Loop mappings, data location and other performance details
- Compatible with other GPU languages and libraries
  - Interoperate between CUDA C/Fortran and GPU libraries
  - e.g. CUFFT, CUBLAS, CUSPARSE, etc



- Directives are easy and powerful.
- Avoid restructuring of existing code for production applications.
- Focus on expressing parallelism.

OpenACC is not GPU Programming

OpenACC is Expressing Parallelism in your  
code

## Serial Code

```
program saxpy

  implicit none
  integer, parameter :: dp = selected_real_kind(15)
  integer, parameter :: ip = selected_int_kind(15)
  integer(ip) :: i,n
  real(dp),dimension(:),allocatable :: x, y
  real(dp) :: a,start_time, end_time

  n=500000000
  allocate(x(n),y(n))

  x = 1.0d0
  y = 2.0d0
  a = 2.0

  call cpu_time(start_time)
  do i = 1, n
    y(i) = y(i) + a * x(i)
  end do
  call cpu_time(end_time)
  deallocate(x,y)

  print '(a,f8.6)', 'SAXPY Time: ', end_time - start_time

end program saxpy
```



## OpenMP Code

```
program saxpy

  implicit none
  integer, parameter :: dp = selected_real_kind(15)
  integer, parameter :: ip = selected_int_kind(15)
  integer(ip) :: i,n
  real(dp),dimension(:),allocatable :: x, y
  real(dp) :: a,start_time, end_time

  n=500000000
  allocate(x(n),y(n))
  !$omp parallel sections
  !$omp section
  x = 1.0
  !$omp section
  y = 1.0
  !$omp end parallel sections
  a = 2.0

  call cpu_time(start_time)
  !$omp parallel do default(shared) private(i)
  do i = 1, n
    y(i) = y(i) + a * x(i)
  end do
  !$omp end parallel do
  call cpu_time(end_time)
  deallocate(x,y)

  print '(a,f8.6)', 'SAXPY Time: ', end_time - start_time

end program saxpy
```

## OpenACC Code

```
program saxpy

  use omp_lib

  implicit none
  integer :: i,n
  real,dimension(:),allocatable :: x, y
  real :: a,start_time, end_time

  n=500000000
  allocate(x(n),y(n))
  a = 2.0
  !$acc data create(x,y) copyin(a)
  !$acc parallel
  x(:) = 1.0
  !$acc end parallel
  !$acc parallel
  y(:) = 1.0
  !$acc end parallel

  start_time = omp_get_wtime()
  !$acc parallel loop
  do i = 1, n
    y(i) = y(i) + a * x(i)
  end do
  !$acc end parallel loop
  end_time = omp_get_wtime()
  !$acc end data
  deallocate(x,y)

  print '(a,f15.6,a)', 'SAXPY Time: ', end_time - start_time, 'in secs'

end program saxpy
```



## CUDA Fortran Code

```
module mymodule
contains
  attributes(global) subroutine saxpy(n, a, x, y)
    real :: x(:), y(:), a
    integer :: n, i
    attributes(value) :: a, n
    i = threadIdx%x+(blockIdx%x-1)*blockDim%x
    if (i<=n) y(i) = a*x(i)+y(i)
  end subroutine saxpy
end module mymodule

program main
  use cudafor; use mymodule
  integer, parameter :: n = 100000000
  real, device :: x_d(n), y_d(n)
  real, device :: a_d
  real :: start_time, end_time

  x_d = 1.0
  y_d = 2.0
  a_d = 2.0

  call cpu_time(start_time)
  call saxpy<<<4096, 256>>>(n, a, x_d, y_d)
  call cpu_time(end_time)

  print '(a,f15.6,a)', 'SAXPY Time: ', end_time - start_time, 'in secs'
end program main
```



## Compile

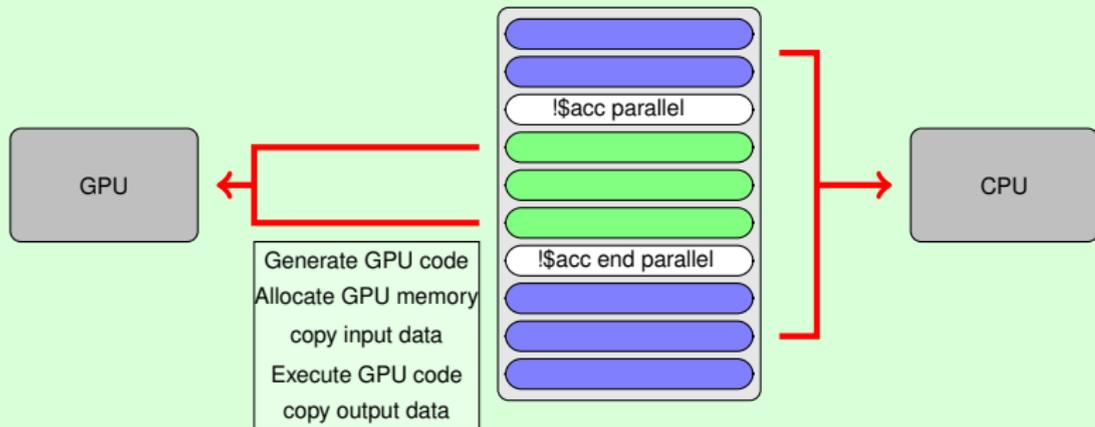
```
[apacheco@philip038 2013-LONI]$ pgf90 -o saxpy saxpy.f90
[apacheco@philip038 2013-LONI]$ pgf90 -mp -o saxpy_omp saxpy_omp.f90
[apacheco@philip038 2013-LONI]$ pgf90 -acc -ta=nvidia -o saxpy_acc saxpy_acc.f90
[apacheco@philip038 2013-LONI]$ pgf90 -o saxpy_cuda saxpy.cuf
```

## Speed Up

Algorithm	Device	Time (s)	Speedup
Serial	Xeon X5650	0.231282	1
OpenMP (12 threads)	Xeon X5650	0.063231	3.6x
OpenACC	M2070	0.014329	16.1x
CUDA	M2070	0.006901	33.5x



- Application code runs on the CPU (sequential, shared or distributed memory)
- OpenACC directives indicate that the following block of compute intensive code needs to be offloaded to the GPU or accelerator.



- Program directives
  - Syntax
    - C/C++: `#pragma acc <directive> [clause]`
    - Fortran: `!$acc <directive> [clause]`
  - Regions
  - Loops
  - Synchronization
  - Data Structure
  - ...
- Runtime library routines

- if (condition)
- async (expression)
- data management clauses
  - copy(...), copyin(...), copyout(...)
  - create(...), present(...)
  - present\_or\_copy{,in,out}(...) or pcopy{,in,out}(...)
  - present\_or\_create(...) or pcreate(...)
- reduction(operator:list)



- System setup routines
  - `acc_init(acc_device_nvidia)`
  - `acc_set_device_type(acc_device_nvidia)`
  - `acc_set_device_num(acc_device_nvidia)`
- Synchronization routines
  - `acc_async_wait(int)`
  - `acc_async_wait_all()`



C: `#pragma acc kernels [clause]`

Fortran `!$acc kernels [clause]`

- The kernels directive expresses that a region may contain parallelism and the compiler determines what can be safely parallelized.
- The compiler breaks code in the kernel region into a sequence of kernels for execution on the accelerator device.
- For the codes on the right, the compiler identifies 2 parallel loops and generates 2 kernels.
- **What is a kernel?** A function that runs in parallel on the GPU.
- When a program encounters a kernels construct, it will launch a sequence of kernels in order on the device.

```
!$acc kernels
do i = 1, n
  x(i) = 1.0
  y(i) = 2.0
end do

do i = 1, n
  y(i) = y(i) + a * x(i)
end do
!$acc end kernels

#pragma acc kernels
{
  for (i = 0; i < n; i++) {
    x[i] = 1.0 ;
    y[i] = 2.0 ;
  }

  for (i = 0; i < n; i++) {
    y[i] = a*x[i] + y[i];
  }
}
```



- The **parallel** directive identifies a block of code as having parallelism.
- Compiler generates a parallel kernel for that loop.

C: `#pragma acc parallel [clauses]`

Fortran: `!$acc parallel [clauses]`

```
!$acc parallel
do i = 1, n
  x(i) = 1.0
  y(i) = 2.0
end do

do i = 1, n
  y(i) = y(i) + a * x(i)
end do
!$acc end parallel

#pragma acc parallel
{
  for (i = 0; i < n; i++){
    x[i] = 1.0 ;
    y[i] = 2.0 ;
  }

  for (i = 0; i < n; i++){
    y[i] = a*x[i] + y[i];
  }
}
```



- Loops are the most likely targets for Parallelizing.
- The Loop directive is used within a parallel or kernels directive indentifying a loop that can be executed on the accelerator device.

C: `#pragma acc loop [clauses]`

Fortran: `!$acc loop [clauses]`

- The loop directive can be combined with the enclosing parallel or kernels

C: `#pragma acc kernels loop [clauses]`

Fortran: `!$acc parallel loop [clauses]`

- The loop directive clauses can be used to optimize the code. This however requires knowledge of the accelerator device.

Clauses: gang, worker, vector, num\_gangs,  
num\_workers

```
!$acc loop
do i = 1, n
    y(i) = y(i) + a * x(i)
end do
!$acc end loop

#pragma acc loop
for (i = 0; i < n; i++){
    y[i] = a*x[i] + y[i];
}
```

## PARALLEL

- Requires analysis by programmer to ensure safe parallelism.
- Straightforward path from OpenMP

## KERNELS

- Compiler performs parallel analysis and parallelizes what it believes is safe.
- Can cover larger area of code with single directive.

Both approaches are equally valid and can perform equally well.

## ● C:

```
pgcc -acc [-Minfo=accel] [-ta=nvidia] -o saxpyc_acc saxpy_acc.c
```

## ● Fortran 90:

```
pgf90 -acc [-Minfo=accel] [-ta=nvidia] -o saxpyf_acc saxpy_acc.f90
```

## Compiler Output

```
[apache@mikel nodateregion]$ pgcc -acc -ta=nvidia,time -Minfo=accel -o saxpyc_acc saxpy_acc.c
main:
 19, Generating copyin(x[0:500000000])
    Generating copy(y[0:500000000])
    Generating compute capability 1.0 binary
    Generating compute capability 2.0 binary
 21, Loop is parallelizable
    Accelerator kernel generated
 21, #pragma acc loop gang, vector(128) /* blockIdx.x threadIdx.x */
    CC 1.0 : 10 registers; 44 shared, 0 constant, 0 local memory bytes
    CC 2.0 : 15 registers; 0 shared, 60 constant, 0 local memory bytes
[apache@mikel nodateregion]$ pgf90 -acc -ta=nvidia,time -Minfo=accel -o saxpyf_acc saxpy_acc.f90
saxpy:
 17, Accelerator kernel generated
 17, CC 1.0 : 7 registers; 40 shared, 4 constant, 0 local memory bytes
    CC 2.0 : 15 registers; 0 shared, 56 constant, 0 local memory bytes
 18, !$acc loop gang, vector(256) ! blockIdx%x threadIdx%x
 17, Generating copy(y(1:500000000))
    Generating copyin(x(1:500000000))
    Generating compute capability 1.0 binary
    Generating compute capability 2.0 binary
[apache@mikel nodateregion]$
```

- The PGI compiler provides automatic instrumentation when `PGI_ACC_TIME=1` at runtime
- You can also obtain automatic instrumentation by using the `-ta=nvidia,time` compiler flag.

```
[apacheco@mike381 nodataregion]$ ./saxpyc_acc
```

```
Accelerator Kernel Timing data
```

```
/work/apacheco/2013-LONI/openmp/saxpy/nodataregion/saxpy_acc.c
```

```
main
```

```
19: region entered 1 time
```

```
time(us): total=9,195,380 init=7,246,895 region=1,948,485
```

```
kernels=58,028 data=1,835,336
```

```
w/o init: total=1,948,485 max=1,948,485 min=1,948,485 avg=1,948,485
```

```
21: kernel launched 1 times
```

```
grid: [65535] block: [128]
```

```
time(us): total=58,028 max=58,028 min=58,028 avg=58,028
```

```
SAXPY Time: 9.195481
```

```
[apacheco@mike381 nodataregion]$ ./saxpyf_acc
```

```
Accelerator Kernel Timing data
```

```
/work/apacheco/2013-LONI/openmp/saxpy/nodataregion/saxpy_acc.f90
```

```
saxpy
```

```
17: region entered 1 time
```

```
time(us): total=9,180,978 init=7,254,065 region=1,926,913
```

```
kernels=59,013 data=1,923,915
```

```
w/o init: total=1,926,913 max=1,926,913 min=1,926,913 avg=1,926,913
```

```
17: kernel launched 1 times
```

```
grid: [65535] block: [256]
```

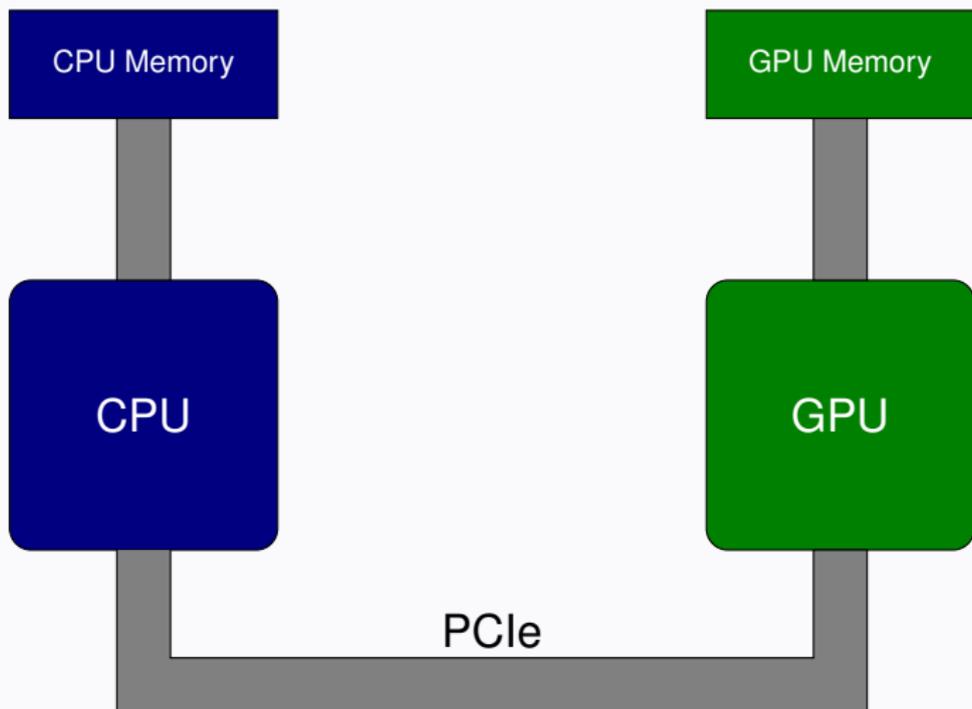
```
time(us): total=59,013 max=59,013 min=59,013 avg=59,013
```

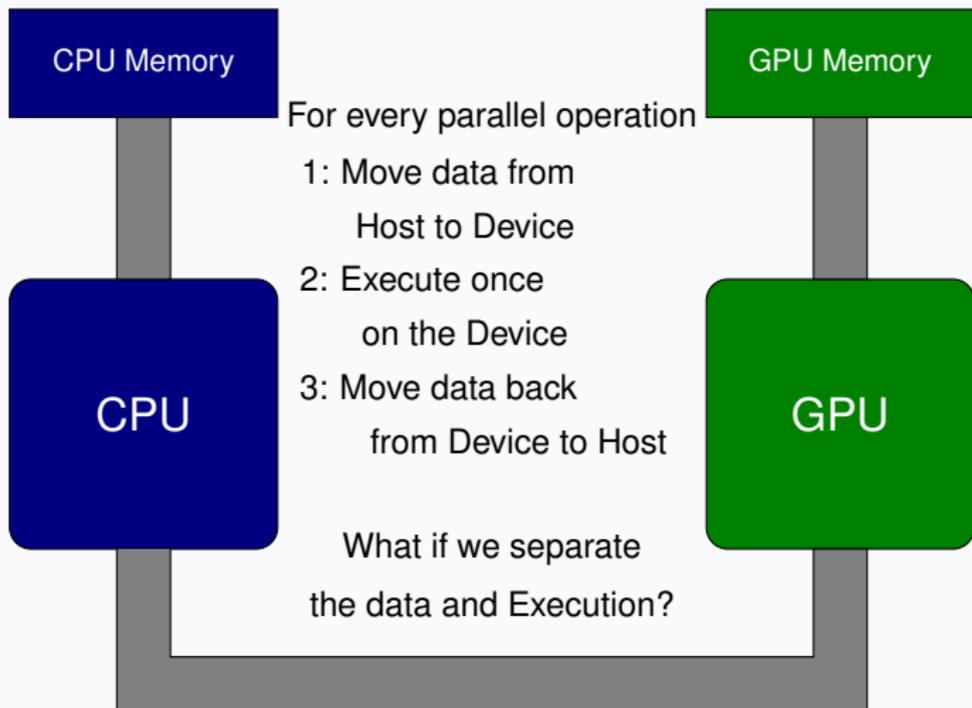
```
SAXPY Time: 9.181015
```

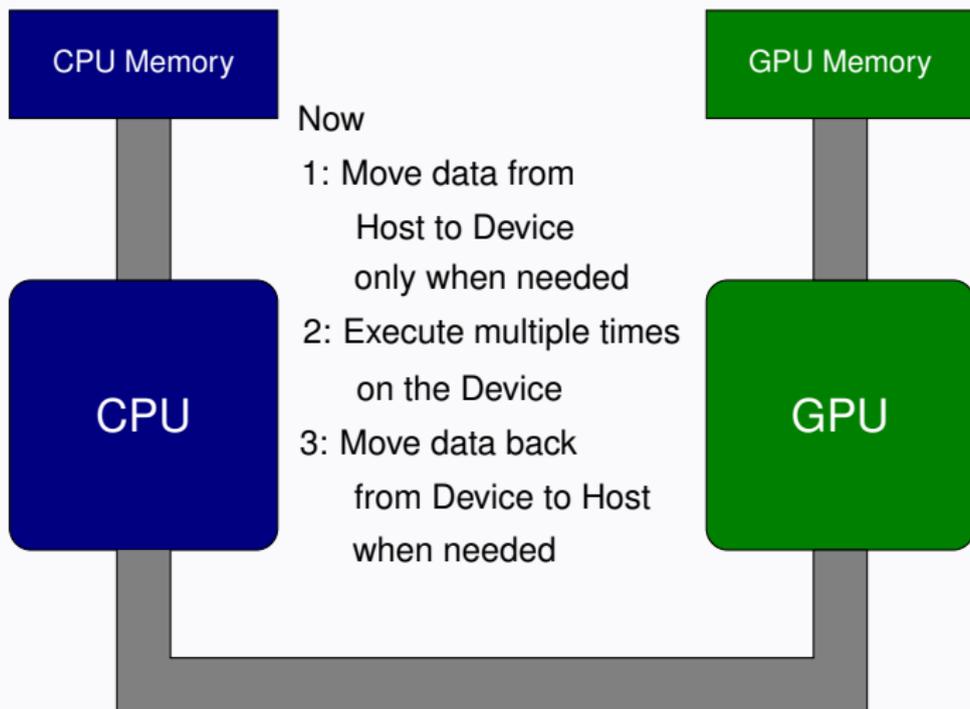


Execution	C		Fortran	
	Time	SpeedUp	Time	Speedup
Serial	0.511		0.993	
OpenMP (16 Threads)	0.186	2.75	0.244	4.07
OpenACC (M2090)	9.195	0.056	9.181	0.108

- What's going with OpenACC code?
- Why even bother with OpenACC if performance is so bad?







- The data construct defines a region of code in which GPU arrays remain on the GPU and are shared among all kernels in that region

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



Arrays used within the data region will remain on the GPU until the end of the data region.

- `copy(list)` Allocates memory on GPU and copies data from host to GPU when entering region and copies data to the host when exiting region.
  - `copyin(list)` Allocates memory on GPU and copies data from host to GPU when entering region.
  - `copyout(list)` Allocates memory on GPU and copies data to the host when exiting region.
  - `create(list)` Allocates memory on GPU but does not copy.
  - `present(list)` Data is already present on GPU from another containing data region.
- Other clauses: `present_or_copy[in|out]`, `present_or_create`, `deviceptr`.



- Compiler sometime cannot determine size of arrays
  - Must specify explicitly using the data clauses and array "shape"

C `#pragma acc data copyin(a[0:size]), copyout(b[s/4:3*s/4])`

Fortran `!$acc data copyin(a(1:size)), copyout(b(s/4:3*s/4))`

- Note: data clauses can be used on data, parallel or kernels



- Used to update existing data after it has changed in its corresponding copy (e.g. update device copy after host copy changes).
- Move data from GPU to host, or host to GPU.
- Data movement can be conditional and asynchronous.

- Fortran

```
!$acc update [clause ...]
```

- C

```
#pragma acc update [clause ...]
```

- Clause

- `host(list)`
- `device(list)`
- `if(expression)`
- `async(expression)`



```

program saxpy
  use omp_lib

  implicit none
  integer :: i, n
  real, dimension(:), allocatable :: x, y
  real :: a, start_time, end_time

  n=50000000
  allocate(x(n),y(n))
  a = 2.0
  !$acc data create(x,y) copyin(a)
  !$acc parallel
  x(:) = 1.0
  !$acc end parallel
  !$acc parallel
  y(:) = 1.0
  !$acc end parallel

  start_time = omp_get_wtime()
  !$acc parallel loop
  do i = 1, n
    y(i) = y(i) + a * x(i)
  end do
  !$acc end parallel loop
  end_time = omp_get_wtime()
  !$acc end data
  deallocate(x,y)

  print '(a,i15.6,a)', 'SAXPY Time: ', end_time - start_time, 'in secs'
end program saxpy

```

```

#include <stdio.h>
#include <time.h>
#include <omp.h>

int main() {
  long long int i, n=500000000;
  float a=2.0;
  float x[n];
  float y[n];
  double start_time, end_time;

  a = 2.0;
  #pragma acc data create(x[0:n],y[0:n]) copyin(a)
  {
    #pragma acc kernels loop
    for (i = 0; i < n; i++){
      x[i] = 1.0;
      y[i] = 2.0;
    }

    start_time = omp_get_wtime();
    #pragma acc kernels loop
    {
      for (i = 0; i < n; i++){
        y[i] = a*x[i] + y[i];
      }
      end_time = omp_get_wtime();
    }

    printf ("SAXPY Time: %f\n", end_time - start_time);
  }
}

```

Execution	C		Fortran	
	Time	SpeedUp	Time	Speedup
Serial	0.511		0.993	
OpenMP (16 Threads)	0.186	2.75	0.244	4.07
OpenACC (M2090)	0.058	8.81	0.059	16.83

C

Execution	Time	SpeedUp	GFlops/s
Serial	6.226		0.964
OpenMP 16 CPUs	0.444	14.022	13.03
OpenACC	0.175	35.577	34.265

Fortran

Execution	Time	SpeedUp	GFlops/s
Serial	7.113		0.844
OpenMP 16 CPUs	0.494	14.399	12.146
OpenACC	0.257	27.677	23.346



```

program matrix_mul

implicit none

integer, parameter :: dp = selected_real_kind(14)
integer :: i, j, k
integer, parameter :: nra=1500, nca=2000, ncb=1000
real(dp) :: a(nra,nca), b(nca,ncb), c(nra,ncb)
real(dp) :: flops, sum
real(dp) :: init_time, start_time, end_time
integer :: c1, c2, c3, cr
integer, dimension(8) :: value

flops = 2d0 * float(nra) * float(nca) * float(ncb)

!$acc data create(a,b,c)
call date_and_time(VALUES=value)
init_time = float(value(6)*60) + float(value(7)) + float(value(8))/1000d0
c = 0d0

do i = 1, nra
  do j = 1, nca
    a(i, j) = 1 + j
  end do
end do

do i = 1, nca
  do j = 1, ncb
    b(i, j) = 1 + j
  end do
end do

call date_and_time(VALUES=value)
start_time = float(value(6)*60) + float(value(7)) + float(value(8))/1000d0
!$acc parallel loop private(sum)
do j = 1, ncb
  do k = 1, ncb
    sum = 0d0
    !$acc loop reduction(+:sum)
    do i = 1, nra
      sum = sum + a(i, j) * b(j, k)
    end do
    c(i, k) = sum
  end do
end do
!$acc end parallel loop
call date_and_time(VALUES=value)
end_time = float(value(6)*60) + float(value(7)) + float(value(8))/1000d0
!$acc end data
print '(a,f8.3,a,f8.3,a,f7.3)', "Init Time: ", start_time - init_time, &
' Calc Time: ', end_time - start_time, &
' GFlops: ', ld=9 * flops/(end_time - start_time)

end program matrix_mul

```

```

#include <stdio.h>
#include <stdlib.h>
#include <time.h>

#define dt(start, end) ((end.tv_sec - start.tv_sec) + \
1/1000000.0*(end.tv_usec - start.tv_usec))

int main() {
  int i, j, k;
  int nra=1500, nca=2000, ncb=1000;
  double a[nra][nca], b[nca][ncb], c[nra][ncb];
  struct timeval icalc, scalc, ecalc;
  double flops, sum, timing;

  flops = 2.0 * nra * nca * ncb;

  #pragma acc data create(a,b,c)
  {
    gettimeofday(&icalc, NULL);
    for (i = 0; i < nra; i++){
      for (j = 0; j < nca; j++){
        a[i][j] = (double)(i+j);
      }
    }
    for (j = 0; j < nca; j++){
      for (k = 0; k < ncb; k++){
        b[j][k] = (double)(i+j);
      }
    }
    for (i = 0; i < nra; i++){
      for (k = 0; k < ncb; k++){
        c[i][k] = 0.0;
      }
    }

    gettimeofday(&scalc, NULL);
    #pragma acc parallel loop private(sum)
    for (i = 0; i < nra; i++){
      for (k = 0; k < ncb; k++){
        sum = 0.0;
        #pragma acc loop seq
        for (j = 0; j < nca; j++){
          sum = sum + a[i][j] * b[j][k];
        }
        c[i][k] = sum;
      }
    }
    gettimeofday(&ecalc, NULL);
  }
  timing = dt(scalc, ecalc);
  printf("Init Time: %6.3f Calc Time: %6.3f GFlops: %7.3f\n", dt(icalc, scalc), timing, 1
e-9*flops/timing);
}

```

- Reduction clause is allowed on *parallel* and *loop* constructs

### Fortran

```
!$acc parallel reduction(operation: var)  
  structured block with reduction on var  
!$acc end parallel
```

### C

```
#pragma acc kernels reduction(operation: var) {  
  structured block with reduction on var  
}
```

- Redo Calculation of Pi in OpenACC and compare timing results with serial and OpenMP.

- OpenACC gives us more detailed control over parallelization
  - Via **gang**, **worker** and **vector** clauses
- By understanding more about specific GPU on which you're running, using these clauses may allow better performance.
- By understanding bottlenecks in the code via profiling, we can reorganize the code for even better performance.



- (Nested) for/do loops are best for parallelization
- Large loop counts are best
- Iterations of loops must be independent of each other
  - To help compiler: restrict keyword (C), independent clause
  - Use subscripted arrays, rather than pointer-indexed arrays
- Data regions should avoid wasted bandwidth
  - Can use directive to explicitly control sizes
- Various annoying things can interfere with accelerated regions.
  - Function calls within accelerated region must be inlineable.
  - No IO



- High-level. No involvement of OpenCL, CUDA, etc
- Single source. No forking off a separate GPU code. Compile the same program for accelerators or serial, non-GPU programmers can play along.
- Efficient. Experience shows very favorable comparison to low-level implementations of same algorithms.
- Performance portable. Supports GPU accelreators and co-processors from multiple vendors, current and future versions.
- Incremental. Developers can port and tune parts of their application as resources and profiling dictates. No wholesale rewrite required. Which can be quick.



Lecture derived from slides and presentations by

- Michael Wolfe, PGI
- Jeff Larkin, NVIDIA
- John Urbanic, PSC

Search for OpenACC presentations at the GPU Technology Conference Website for further study

<http://www.gputechconf.com/gtcnew/on-demand-gtc.php>

