

Programming with OpenACC directives

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1. Introduction to cuSOLVER library (Dense LAPACK, Sparse LAPACK)

The cuSOLVER library is a high-level package based on the cuBLAS and cuSPARSE libraries. Each library can be used alone or in conjunction with other toolkit libraries. The purpose of cuSolver is to provide useful features of the CUDA version of LAPACK, such as least squares solver for dense matrices, sparse matrices, general matrix factorization and trigonometry for eigenvalue solvers. In addition, cuSOLVER also provides a new refactoring library that helps solve sequences of matrices that share sparse patterns.

As of PGI 17.10, the only licensed product that provides a Fortran Interface to the cuSOLVER library (cusolverDn.mod) is **for Linux**. Please note that the Fortran Interface Module is not provided for the Windows version at this time. Note that if you create a Fortran interface module, it can also be used on Windows.

The first part of cuSOLVER, called **cuSolverDN**, provides useful utilities such as dense matrix factorization, solution routines such as LU, QR, SVD, and LDLT, and matrix and vector permutations. Provides functionality similar to so-called LAPACK routines.

Second, **cuSolverSP** provides a new set of sparse routines based on sparse QR decomposition. Since not all matrix factorizations have parallel sparsity patterns, the cuSolverSP library also provides a CPU path for handling sequential-like matrices. For matrices with high parallelism, GPU paths provide higher performance. The library is designed to be called from C and C++, but is also easily available from Fortran via the OpenACC + PGI Fortran Module.

The third one is **cuSolverRF**. This is a refactorization package for sparse matrices that can provide very good performance when solving sequences of matrices where only the coefficients are changed and the sparsity pattern remains the same. (Not explained on this page)

cuSolverDN library (Dense LAPACK)

The cuSolverDN library is designed to solve dense linear systems.

$$Ax = b$$
 Here, coefficient matrix $A \in R$, right-hand side vector $b \in R$, solution vector $x \in R$

The cuSolverDN library provides partial pivoting on QR decomposition and LU to handle general matrices A that may be asymmetric, and Cholesky decomposition routines are also provided for symmetric/Hermitian matrices. In addition, for symmetric indefinite matrices, Bunch-Kaufman (LDL) decomposition is provided. The cuSolverDN library also provides useful bidiagonalization routines and singular value decomposition (SVD).

The cuSolverDN library targets LAPACK's computationally intensive and common routines and provides an API compatible with LAPACK, making it easy to migrate existing LAPACK-based programs. A user can use his cuSolverDN to accelerate these time-consuming routines and keep existing code compatible with her LAPACK usage without significant changes.

cuSolverSP library (Sparse LAPACK)

The cuSolverSP library is primarily designed to solve sparse linear systems and least squares problems.

$$Ax = b$$

 $x = argmin||A*z - b||$

Here, coefficient matrix $A \in R$, right-hand side vector $b \in R$, and solution vector $x \in R$. For linear systems, m = n is required.

The core algorithm is based on sparse QR decomposition. Enter matrix A in CSR format. If matrix A is symmetric/Hermitian, the user must provide the full matrix. That is, you need to fill in the missing bottom or top. If matrix A is symmetric positive definite and the user only needs to solve for his Ax = b, the Cholesky decomposition will work, but the user can substitute can.

On top of the linear and least squares solvers, the cuSolverSP library provides a simple eigenvalue solver based on the shift-inverse power method and a function to count the number of eigenvalues contained in a box in the complex plane.

2. cuSolverDN: Cholesky decomposition of Hermitian positive definite matrix (equivalent to LAPACK zpotrf)

The cuSOLVER library is based on the cuBLAS and cuSPARSE libraries, supports matrix factorization and triangulation routines for dense matrices, sparse least squares solvers and eigenvalue solvers, and provides a refactoring library to help solve sequences of matrices with covariance matrices. provide.

Optimized cuSolverDN type routines (cuSolverSP and cuSolverRF type (will be supported in a future release). This same cuSolver library is built using the PGI compiler and is also compatible with the PGI OpenMP runtime, so it can also be called from PGI OpenACC C/C++.

The following example is an example of using <u>cuSolverDN</u>: <u>dense LAPACK Function from OpenACC</u> <u>Fortran/C++</u> and <u>CUDA Fortran</u>.

The programming response differs depending on which programming model is used to manage device memory for arrays and variables, but here we will explain how to declare a device array on the CUDA Fortran side, and how to declare an array on the OpenACC side. An example of this is shown below.

The example below is the result using **PGI 17.10 version**. If you want to check the version you are using, specify the -V command option as follows.

```
$ pgfortran -V
pgfortran 17.10-0 64-bit target on x86-64 Linux -tp haswell
PGI Compilers and Tools
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```

<u>Dense Linear Solver - cusolverDnZpotrf() with CUDA Fortran</u>

An example of the Cholesky decomposition of a Hermitian positive definite matrix is shown. It is equivalent to LAPACK's ZPOTRF routine. A is an n×n Hermitian matrix, and only the lower or upper parts are meaningful. The following example is a program using cuSOLVER from CUDA Fortran. As a PGI Fortran MODULE interface, it is necessary to specify cublas_v2 and cusolverDn in the USE statement. For input parameter CUBLAS_FILL_MODE_LOWER, only the lower triangular part of A is

processed and replaced by the lower triangular Cholesky coefficient L. (A = L * L) The workspace pointed to by the input parameter Workspace must be provided. The input parameter Lwork is the size of the work area, returned by potrf_bufferSize(). Note that the dense matrix A must be input in column-major order.

<u>CUDA Fortran + cuSOLVER(cusolverDnZpotrf)</u>

```
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!
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```

```
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! DEALINGS IN THE SOFTWARE.
program main
  use cublas v2
  use cusolverDn
 use cudafor
 implicit none
 integer, parameter :: n=3
  complex(8) :: a(n,n)
  complex(8), device :: a_d(n,n)
  complex(8), device , allocatable :: workspace d(:)
  integer, device :: devInfo d
  integer :: istat, Lwork
  type(cusolverDnHandle) :: h
  a(1,1) = 25.0; a(1,2) = 15.0; a(1,3) = -5.0
  a(2,1) = a(1,2); a(2,2) = 18.0; a(2,3) = 0.0
  a(3,1) = a(1,3); a(3,2) = a(2,3); a(3,3) = 11.0
  a d = a
!handle creation
  istat = cusolverDnCreate(h)
  if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'handle creation failed'
! Working buffer size calculation
  istat = cusolverDnZpotrf_bufferSize(h, &
       CUBLAS_FILL_MODE_LOWER, n, a_d, n, Lwork)
  if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'cusolverDnZpotrf buffersize failed'
 allocate(workspace_d(Lwork))
! Cholesky decomposition
  istat = cusolverDnZpotrf(h, CUBLAS FILL MODE LOWER, &
       n, a d, n, workspace d, Lwork, devInfo d)
  if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'cusolverDnZpotrf failed'
  istat = devInfo d
  if (istat /= 0) write(*,*) 'Cholesky factorization failed'
  istat = cusolverDnDestroy(h)
  if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'handle destruction failed'
  a = a_d
  write(*,"(3(f0.0,SP,f0.0,'i',2x))") a(1,:)
  write (*,"(3(f0.0,SP,f0.0,'i',2x))") a (2,:)
  write(*,"(3(f0.0,SP,f0.0,'i',2x))") a(3,:)
end program main
```

It is necessary to compile and link with -acc -Mcudalib=cusolver,cublas and -Mcuda options as compile options.

Compile & run

```
$ pgfortran -fast -Minfo -Mcuda=cc60,cc35,cuda8.0 -Mcudalib=cusolver,cublas testDn.
main:
    60, Loop unrolled 3 times (completely unrolled)
    61, Loop unrolled 3 times (completely unrolled)
    62, Loop unrolled 3 times (completely unrolled)
$ ./a.out
5.+0.i +15.+0.i -5.+0.i
3.+0.i +3.+0.i +0.+0.i
-1.+0.i +1.+0.i +3.+0.i
```

Dense Linear Solver - cusolverDnZpotrf() with OpenACC Fortran

Rewrite the above CUDA Fortran program using OpenACC. As a PGI Fortran MODULE interface, it is necessary to specify cublas_v2 and cusolverDn in the USE statement. You can use the CUDA math library just by using OpenACC directives, without having to worry about memory allocation on the device side. This means that it is easy to port existing Fortran programs.

One thing to keep in mind with the OpenACC directive is that if the actual argument passed when calling a (library) routine written in CUDA Fortran or CUDA C is a "device pointer", **host_data use_device** is used to <u>inform the compiler of this.</u> () use. If you use this directive correctly, porting an existing program-based program using OpenACC should not be a big burden.

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<u>OpenACC Fortran + cuSOLVER(cusolverDnZpotrf)</u>

```
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! DEALINGS IN THE SOFTWARE.
program main
 use cublas v2
 use cusolverDn
 use cudafor
 implicit none
```

```
integer, parameter :: n=3
 complex(8) :: a(n,n)
!!! complex(8), device :: a_d(n,n)
                                              ! No need to declare device variables
!!! complex(8), device, allocatable :: workspace_d(:)
!!! integer, device :: devInfo_d
 complex(8), allocatable :: workspace_d(:)
 integer :: devInfo d
 integer :: istat, Lwork
 type(cusolverDnHandle) :: h
 a(1,1) = 25.0; a(1,2) = 15.0; a(1,3) = -5.0
 a(2,1) = a(1,2); a(2,2) = 18.0; a(2,3) = 0.0
 a(3,1) = a(1,3); a(3,2) = a(2,3); a(3,3) = 11.0
!!! a_d = a
  istat = cusolverDnCreate(h)
  if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'handle creation failed'
!$acc data copy(a) create(workspace d)
!$acc host data use device(a)
  istat = cusolverDnZpotrf bufferSize(h, &
      CUBLAS FILL MODE LOWER, n, a, n, Lwork)
!$acc end host data
  if (istat /= CUSOLVER STATUS SUCCESS) &
      write(*,*) 'cusolverDnZpotrf buffersize failed'
 print *, "working space (bytes) =", Lwork
 allocate(workspace d(Lwork))
!$acc enter data copyin(workspace d) copyin(devInfo d)
!$acc host data use device(a, workspace d, devInfo d)
 istat = cusolverDnZpotrf(h, CUBLAS_FILL_MODE_LOWER, &
      n, a, n, workspace d, Lwork, devInfo d)
!$acc end host data
  if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'cusolverDnZpotrf failed'
!$acc exit data copyout(devInfo d)
!$acc exit data delete(workspace d)
!$acc end data
 istat = devInfo d
 if (istat /= 0) write(*,*) 'Cholesky factorization failed'
 istat = cusolverDnDestroy(h)
 if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'handle destruction failed'
!!! a = a d
 write(*,"(3(f0.0,SP,f0.0,'i',2x))") a(1,:)
 write(*,"(3(f0.0,SP,f0.0,'i',2x))") a(2,:)
 write(*,"(3(f0.0,SP,f0.0,'i',2x))") a(3,:)
end program main
```

It is necessary to compile and link with —acc, —Mcudalib=cusolver,cublas, and —Mcuda options as compile options. In addition to OpenACC's —acc option, the —Mcuda option is required to tell the linker the list of CUDA—related system libraries.

```
$ pgf90 -fast -Minfo -acc -ta=tesla,cc60,cc35,cuda8.0 -Mcudalib=cusolver,cublas opena
main:
          48, Generating copy(a(:,:))
                Generating create(workspace_d(:))
               60, Generating enter data copyin(devinfo_d,workspace_d(:))
                70, Generating exit data copyout(devinfo_d)
                71, Generating exit data delete(workspace_d(:))
                84, Loop unrolled 3 times (completely unrolled)
                85, Loop unrolled 3 times (completely unrolled)
                86, Loop unrolled 3 times (completely unrolled)
$ ./a.out
working space (bytes) = 1
5.+0.i +15.+0.i -5.+0.i
3.+0.i +3.+0.i +0.+0.i
-1.+0.i +1.+0.i +3.+0.i
```

<u>Dense Linear Solver - cusolverDnZpotrf with OpenACC C++</u>

Rewrite the Fortran program above using PGI C++ OpenACC instead of the NVIDIA nvcc compiler. You can also create C/C++ programs that use OpenACC and NVIDIA CUDA libraries. In the example below, when referencing the NVIDIA cuSOLVE library from a C++ program, the complex number type must be declared using a CUDA complex number type (for example, cuDoubleComplex, etc.). C++ std:complex template complex If you make a declaration with , type matching of the cuSOLVE routine argument could not be done, so it is safe to use the CUDA complex type. In addition, the numerical arrangement of cuSOLVER's "dense matrix" is column-major order (Fortran type).

<u>OpenACC + cusolverDnDsyevd (DnZpotrf.cpp)</u>

```
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! DEALINGS IN THE SOFTWARE.
* How to compile (assume cuda is installed at /usr/local/cuda-9.0/)
 * pgc++ -I/usr/local/cuda-9.0/include DnZpotrf.cpp -acc -ta=tesla,cc60,cc35 -Mcudalib=cusolver
 * /
```

```
#include <stdio.h>
#include <stdlib.h>
#include <assert.h>
#include <cusolverDn.h>
void printD_CMatrix(int m, int n, const cuDoubleComplex *A, int lda, const char* name)
    for (int row = 0; row < m; row++) {
        for(int col = 0; col < n; col++) \{
            cuDoubleComplex Areg = A[row + col*lda];
            printf("%s(%d,%d) = %f %f\n", name, row+1, col+1, cuCreal(Areg), cuCimag(Areg));
    }
}
int main(int argc, char*argv[])
   cusolverDnHandle t cusolverH = NULL;
   cusolverStatus t cusolver status = CUSOLVER STATUS SUCCESS;
   const int m = 3;
   const int lda = m;
/* | 25 15 -5 |
* A = | 15180 |
 * | -5 0 11 |
 */
   cuDoubleComplex *A; // input
   int *devInfo = NULL;
   cuDoubleComplex *work = NULL;
   int lwork = 0;
   A = (cuDoubleComplex *) malloc (sizeof(cuDoubleComplex) * lda * m);
    devInfo = (int *) malloc (sizeof(int));
// step 1: create cusolver/cublas handle
   cusolver status = cusolverDnCreate(&cusolverH);
// step 2: set A
   A[0] = make cuDoubleComplex(25.0,0.0);
   A[3] = make\_cuDoubleComplex(15.0,0.0);
   A[6] = make_cuDoubleComplex(-5.0,0.0);
   A[1] = A[3];
   A[4] = make cuDoubleComplex(18.0, 0.0);
   A[7] = make_cuDoubleComplex(0.0,0.0);
   A[2] = A[6];
   A[5] = A[7];
   A[8] = make_cuDoubleComplex(11.0,0.0);
    printD CMatrix(m, m, A, lda, "A");
    printf("====\n");
// step 3: query working space of syevd
    cublasFillMode t uplo = CUBLAS FILL MODE LOWER;
#pragma acc data copy(A[0:lda*m], devInfo[0:1])
#pragma acc host_data use_device(A)
 {
    cusolver status = cusolverDnZpotrf bufferSize(
        cusolverH,
        uplo,
       m,
        A,
        lda,
        &lwork);
  }
```

```
assert (cusolver status == CUSOLVER STATUS SUCCESS);
    work = (cuDoubleComplex *) malloc(sizeof(cuDoubleComplex)*lwork);
    printf("Lwork = %d\n",lwork);
#pragma acc enter data create(work[0:lwork])
// step 4: compute spectrum
#pragma acc host data use device(A, work, devInfo)
    cusolver status = cusolverDnZpotrf(
        cusolverH,
        uplo,
        m,
        Α,
        lda.
        work,
        lwork,
        devInfo);
#pragma acc wait
#pragma acc exit data delete(work)
    printf("DevInfo = %d\n", devInfo[0]);
    printf("A = (base 1) \n");
    printD CMatrix(m, m, A, lda, "A result");
    printf("====\n");
// free resources
   if (A) free(A);
   if (devInfo) free(devInfo);
    if (work) free (work);
    if (cusolverH) cusolverDnDestroy(cusolverH);
    return 0;
```

If you want to use cuSOLVER with the PGI C/C++ OpenACC compiler, compile using the C/C++ include files bundled with the NVIDIA CUDA Toolkit (the PGI compiler includes cuSOLVER/cuBLAS libraries for C/C++). include files such as are not bundled). The example here is written assuming that CUDA 9.0 is implemented under /usr/local/cuda-9.0. It is necessary to compile and link with the – I/usr/local/cuda-9.0/include -acc -ta=tesla -Mcudalib=cusolver option as a compile option. (For CUDA 8.0)

pgc++ -l/usr/local/cuda-8.0/include DnZpotrf.cpp -acc -ta=tesla,cc60,cc35 -Mcudalib=cusolver - Minfo=accel -O2

(For CUDA 9.0)

pgc++ - I/usr/local/cuda-9.0/include DnZpotrf.cpp -acc -ta=tesla,cc60,cc35 -Mcudalib=cusolver - Minfo=accel -O2

```
[kato@photon32 C]$ pgc++ -I/usr/local/cuda-9.0/include DnZpotrf.cpp -acc -ta=tesla,cc60,cc35
-Mcudalib=cusolver -Minfo=accel -O2
main:
    64, Generating copy(A[:9],devInfo[:1])
    84, Generating enter data create(work[:lwork])
    97, Generating exit data delete(work[:1])
[kato@photon32 C]$ a.out
A(1,1) = 25.000000 0.0000000
```

```
A(1,2) = 15.000000 0.000000
A(1,3) = -5.000000 0.000000
A(2,1) = 15.000000 0.000000
A(2,2) = 18.000000 0.000000
A(2,3) = 0.000000 0.000000
A(3,1) = -5.000000 0.000000
A(3,2) = 0.000000 0.000000
A(3,3) = 11.000000 0.000000
Lwork = 1
DevInfo = 0
A = (base 1)
A(1,1) = 5.000000 0.000000
A(1,2) = 15.000000 0.0000000
A(1,3) = -5.000000 0.000000
A(2,1) = 3.000000 0.000000
A(2,2) = 3.000000 0.000000
A(2,3) = 0.000000 0.000000
A(3,1) = -1.000000 0.000000
A(3,2) = 1.000000 0.000000
A(3,3) = 3.000000 0.000000
```

3. cuSolverDN: Linear solver using Cholesky decomposition of symmetric positive definite matrices (equivalent to LAPACK Dpotrs)

This is an example of the use of a double-precision solver (cusolverDnDpotrs) that solves a symmetric positive definite matrix using Cholesky decomposition. Cholesky decomposition uses the cusolverDnDpotrf routine to solve a system of linear equations using cusolverDnDpotrs. Note that RHS (right side) is solved by giving multiple vectors. Note that the dense matrix A must be input in columnmajor order.

<u>OpenACC Fortran + cusolverDnDpotrf, cusolverDnDpotrs (Solver.f90)</u>

```
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! DEALINGS IN THE SOFTWARE.
program main
 use cublas v2
 use cusolverDn
 use cudafor
 implicit none
```

```
integer, parameter :: n=5, nrhs=3
 integer, parameter :: lda=n, ldb=n
 integer :: i
 real(8) :: a(lda,n)
 real(8) :: b(ldb, nrhs)
 real(8), allocatable :: workspace d(:)
 integer :: devInfo d
 integer :: istat, Lwork
 type(cusolverDnHandle) :: h
 data a /3.14, 0.00, 0.00, 0.00, 0.00, &
         0.17, 0.79, 0.00, 0.00, 0.00, &
         -0.90, 0.83, 4.53, 0.00, 0.00, &
         1.65,-0.65,-3.70, 5.32, 0.00, &
         -0.72, 0.28, 1.60, -1.37, 1.98/
 data b /-7.29, 9.25, 5.99, -1.94, -8.30, &
           6.11, 2.90, -5.05, -3.80, 9.66, &
           0.59, 8.88, 7.57, 5.57, -1.67/
 print *, "Matrix A"
 do i = 1, n
 write(*,"(5(f8.2,2x))") a(i,:)
 end do
 print *, "RHS"
 do i = 1, n
 write(*,"(5(f8.2,2x))") b(i,:)
 end do
 istat = cusolverDnCreate(h)
 if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'handle creation failed'
!$acc data copy(a,b) create(workspace d)
 !$acc host data use device(a)
   istat = cusolverDnDpotrf_bufferSize(h, &
         CUBLAS FILL MODE LOWER, n, a, n, Lwork)
  !$acc end host data
   if (istat /= CUSOLVER STATUS_SUCCESS) &
         write(*,*) 'cusolverDnDpotrf buffersize failed'
   print *, "working space (bytes) =", Lwork
   allocate(workspace_d(Lwork))
 !$acc enter data copyin(workspace d) copyin(devInfo d)
 !$acc host_data use_device(a, b, workspace_d, devInfo_d)
   istat = cusolverDnDpotrf(h, CUBLAS_FILL_MODE_UPPER, &
            n, a, lda, workspace_d, Lwork, devInfo_d)
   istat = cusolverDnDpotrs(h, CUBLAS FILL MODE UPPER, &
             n, nrhs, a, lda, b, ldb, devInfo d)
 !$acc end host data
   if (istat /= CUSOLVER STATUS SUCCESS) &
         write(*,*) 'cusolverDnDpotrs failed'
 !$acc exit data copyout(devInfo_d)
 !$acc exit data delete(workspace d)
!$acc end data
 istat = devInfo d
 if (istat /= 0) write(*,*) 'Cholesky Solver failed'
 istat = cusolverDnDestroy(h)
 if (istat /= CUSOLVER STATUS SUCCESS) &
       write (*, *) 'handle destruction failed'
 print *, "Cholesky factorization"
```

```
do i = 1, n
write(*,"(5(f8.2,2x))") a(i,:)
end do
print *, "Solution"
do i = 1, n
write(*,"(5(f8.2,2x))") b(i,:)
end do
end program main
```

```
$ pgf90 -c -02 -Minfo -ta=tesla,cuda9.0,cc35,cc60 -Mcudalib=cusolver,cublas -Kieee solver.f9\phi
main:
     47, Loop not vectorized/parallelized: contains call
     48, Loop unrolled 5 times (completely unrolled)
     51, Loop not vectorized/parallelized: contains call
     52, Loop unrolled 3 times (completely unrolled)
     59, Generating copy(a(:,:))
         Generating create (workspace d(:))
         Generating copy(b(:,:))
     70, Generating enter data copyin(devinfo_d,workspace d(:))
     82, Generating exit data copyout (devinfo d)
     83, Generating exit data delete(workspace d(:))
     94, Loop not vectorized/parallelized: contains call
     95, Loop unrolled 5 times (completely unrolled)
     98, Loop not vectorized/parallelized: contains call
     99, Loop unrolled 3 times (completely unrolled)
$ pgf90 -o a.out solver.o -Mcuda -acc -ta=tesla,cuda9.0,cc35,cc60 -Mcudalib=cusolver,cublas
$a.out.
Matrix A
    3.14 0.17 -0.90 1.65 -0.72
    0.00 0.79 0.83 -0.65 0.28
    0.00 0.00 4.53 -3.70 1.60
    0.00 0.00 0.00 5.32 -1.37
    0.00 0.00 0.00 0.00 1.98
 RHS
   -7.29 6.11 0.59
   9.25 2.90 8.88
   5.99 -5.05 7.57
   -1.94 -3.80 5.57
   -8.30 9.66 -1.67
 working space (bytes) = 2
 Cholesky factorization
   1.77 0.10 -0.51 0.93 -0.41
    0.00 0.88 0.99 -0.84 0.36
    0.00 0.00 1.81 -1.32 0.57
    0.00 0.00 0.00 1.42 0.05
   0.00 0.00 0.00 0.00 1.16
 Solution
  -6.02 3.95 -3.14
  15.62 4.32 13.05
   3.02 -8.25 4.91
   3.25 -4.83 6.11
   -8.78 9.04 -3.57
```

4. cuSolverDN: Linear system solver using LU decomposition (equivalent to LAPACK Dgetrs)

This is an example of using a double-precision linear solver (cusolverDnDgetrs) that uses LU decomposition to solve a Dense Matrix. Cholesky decomposition uses the cusolverDngetrf routine to solve a system of linear equations using cusolverDnSgetrs. Note that RHS (right side) is solved by

giving multiple vectors. Note that the dense matrix A must be input in column-major order.

<u>OpenACC Fortran + cusolverDnDpotrf, cusolverDnDpotrs (Solver.f90)</u>

```
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program main
 use cublas v2
 use cusolverDn
 use cudafor
  implicit none
  integer, parameter :: m=5, n=3, nrhs=2
  integer, parameter :: lda=m, ldb=m
 integer :: i, max mn
 real(8) :: a(lda,n)
 real(8) :: b(ldb, nrhs)
 integer, allocatable :: devIpiv(:)
 real(8), allocatable :: workspace d(:)
 integer :: devInfo d
 integer :: istat, Lwork
 type(cusolverDnHandle) :: h
  data a /1.00, 2.00, 3.00, 4.0, 5.0,&
          1.00, 3.00, 5.00, 2.0, 4.0,&
          1.00, 4.00, 2.00, 5.0, 3.0/
 data b /-10.0, 12.00, 14.0, 16.0, 18.0,&
           -3.0, 14.0, 12.0, 16.0,16.0/
 print *, "Matrix A"
  do i = 1, m
 write(*,"(5(f8.2,2x))") a(i,:)
 end do
 print *, "RHS"
  do i = 1, m
 write(*,"(5(f8.2,2x))") b(i,:)
 end do
 \max mn = \max (m, n)
 allocate (devIpiv(max mn))
  istat = cusolverDnCreate(h)
  if (istat /= CUSOLVER STATUS SUCCESS) &
       write (*, *) 'handle creation failed'
!$acc data copy(a,b) create(workspace_d) copyout(devIpiv)
  !$acc host data use device(a)
    istat = cusolverDnDgetrf bufferSize(h, &
```

```
m, n, a, lda, Lwork)
  !$acc end host data
   if (istat /= CUSOLVER STATUS SUCCESS) &
         write(*,*) 'cusolverDnDgetrf buffersize failed'
    print *, "working space (bytes) =", Lwork
    allocate(workspace d(Lwork))
  !$acc enter data copyin(workspace d) copyin(devInfo d)
  !$acc host_data use_device(a, b, workspace_d, devInfo_d, devIpiv)
   istat = cusolverDnDgetrf(h, &
            m, n, a, lda, workspace d, devIpiv, devInfo d)
    istat = cusolverDnDgetrs(h, CUBLAS OP N, &
             n, nrhs, a, lda, devIpiv, b, ldb, devInfo_d)
  !$acc end host data
    if (istat /= CUSOLVER STATUS SUCCESS) &
         write(*,*) 'cusolverDnDgetrs failed'
  !$acc exit data copyout(devInfo d)
  !$acc exit data delete(workspace d)
!$acc end data
 istat = devInfo d
 if (istat /= 0) write(*,*) 'LU Solver failed'
 istat = cusolverDnDestroy(h)
 if (istat /= CUSOLVER STATUS SUCCESS) &
       write(*,*) 'handle destruction failed'
 print *, "LU factorization"
 do i = 1, m
 write(*,"(5(f8.2,2x))") a(i,:)
 end do
 print *, "Pivot Indices"
 print *, devIpiv(:)
 print *, "Solution"
 do i = 1, m
 write(*,"(5(f8.2,2x))") b(i,:)
 end do
end program main
```

```
$ pqf90 -c -02 -Minfo -ta=tesla,cuda9.0,cc35,cc60 -Mcudalib=cusolver,cublas -Kieee solver.f90
     45, Loop not vectorized/parallelized: contains call
     46, Loop unrolled 3 times (completely unrolled)
     49, Loop not vectorized/parallelized: contains call
     50, Loop unrolled 2 times (completely unrolled)
     60, Generating copy(a(:,:))
         Generating copyout(devipiv(:))
         Generating create (workspace d(:))
         Generating copy(b(:,:))
     71, Generating enter data copyin(devinfo_d,workspace_d(:))
     83, Generating exit data copyout(devinfo d)
     84, Generating exit data delete(workspace d(:))
     95, Loop not vectorized/parallelized: contains call
     96, Loop unrolled 3 times (completely unrolled)
    101, Loop not vectorized/parallelized: contains call
    102, Loop unrolled 2 times (completely unrolled)
pgf90 -o a.out solver.o -Mcuda -acc -ta=tesla,cuda9.0,cc35,cc60 -Mcudalib=cusolver,cublas
$a.out
Matrix A
   1.00 1.00 1.00
    2.00 3.00 4.00
    3.00 5.00 2.00
    4.00 2.00 5.00
```

```
5.00 4.00 3.00
RHS
 -10.00 -3.00
 12.00 14.00
 14.00 12.00
 16.00 16.00
 18.00 16.00
working space (bytes) = 18
LU factorization
  5.00 4.00 3.00
  0.60 2.60 0.20
  0.40 0.54 2.69
  0.80 -0.46 1.00
   0.20 0.08 0.14
Pivot Indices
          5 3 3 0 0
Solution
   2.00 1.20
   1.14 0.74
  1.14 2.34
 16.00 16.00
 -10.00 -3.00
```

<u>5. cuSolverDN: Eigenvalue solver for symmetric matrices (equivalent to LAPACK Dsyevd)</u>

Use a solver (cusolverDnDsyevd) to find eigenvalues and eigenvectors for a symmetric dense matrix. The following example is the same process as <u>D.1. Standard Symmetric Dense Eigenvalue Solvern</u> written in Fortran OpenACC and C++ OpenACC.

Dense Linear Solver - cusolverDnDsyevd with OpenACC Fortran

Compute the eigenvalues and eigenvectors of a symmetric (Hermitian) $n \times n$ matrix A. The standard symmetric eigenvalue problem is expressed by the following formula.

$$A * V = V * \Lambda$$

where Λ is the actual n×n diagonal matrix. V is an n×n unitary matrix. The diagonal elements of Λ are the ascending eigenvalues of A. The cusolverDnDsyevd solver needs to provide a work space (d_work) in advance, so it is necessary to use the syevd_bufferSize function to find the lwork size. If output parameter devInfo = -i (less than zero), it indicates that the i-th parameter is incorrect. If devInfo = i (greater than zero), it means that i off-diagonal elements of the tridiagonal did not converge to zero during internal calculation. Note that the dense matrix A must be input in column-major order.

OpenACC + cusolverDnDsyevd (syevd.f90)

```
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! pgf90 -acc -O2 -Minfo -ta=tesla,cc60,cc35 -Mcuda -Mcudalib=cusolver syevd.f90
program main
 use cusolverDn
  implicit none
  integer,parameter :: prc = SELECTED REAL KIND(15,305)
 integer, parameter :: idbg = 1 ! debug write enable
 integer, parameter :: m = 3, lda = m
 type(cusolverDnHandle) :: cusolver H
 integer :: cusolver status
 integer :: status1, ierr code
 integer :: i, j
! | 3.5 0.5 0 |
! A = | 0.5 3.5 0 |
! | 0 0 2 |
! lambda = (/2.0, 3.0, 4.0 /) exact eigenvalues
 real(prc), allocatable, dimension(:) :: A
 real(prc), allocatable, dimension(:) :: lambda
 real(prc), allocatable, dimension(:) :: V ! eigenvectors
 real(prc), allocatable, dimension(:) :: W ! eigenvaluse
 real(prc), allocatable, dimension(:) :: d work
  integer::devInfo
  integer :: Lwork
 allocate ( A(lda*m), V(lda*m), W(m) )
 allocate ( lambda(m) )
 Lwork = 0
! set a data
 A(1:lda*m) = (/3.5, 0.5, 0, 0.5, 3.5, 0, 0, 0, 2.0/)
! step 1 create cusolver/cublas handle
  cusolver status = cusolverDnCreate(cusolver H)
   if (idbg == 1) then
      if (cusolver_status /= CUSOLVER_STATUS_SUCCESS) print *, "step1 cusolver status = ", cusol
    end if
!$acc data copy(A, devInfo) copyout(W)
!$acc host_data use_device(A, W)
! step 2 working space of syevd
  cusolver_status = cusolverDnDsyevd_bufferSize (cusolver H, CUSOLVER EIG MODE VECTOR, &
                    CUSOLVER EIG MODE VECTOR, m, A, lda, W, Lwork)
!$acc end host data
    if (idbq == 1) then
     if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step2 cusolver status = ", cusol
    end if
! step 3 d work buffer allocated
```

```
allocate(d work(Lwork), stat=ierr code) ! words
      if (idbg == 1) print *, "step5: alloc ierr code = ", ierr code
!$acc enter data copyin(d_work)
! step 4 compute spectrum = eigen{vectors, valuse}
! $acc host data use device(A, W, d work, devInfo)
  cusolver_status = cusolverDnDsyevd (cusolver_H, CUSOLVER_EIG_MODE_VECTOR, &
                    CUSOLVER_EIG_MODE_VECTOR, m, A, lda, W, d_work, Lwork, devInfo)
!$acc end host data
!$acc exit data delete(d work)
!$acc end data
 print *, "Output parameter devInfo =", devInfo
    if (idbg == 1) then
      if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step4 cusolver status = ", cusol
    end if
! copy [A].output to [V] (eigenvectors)
 V = A
! atep 5 print out
 !Eigenvalues
 print *, "Eigenvalue : "
 do i = 1, m
  print *, "W(",i,") = ", w(i)
 end do
 !Eigenvectors
 print *, "Eigenvector : "
 do i = 1, m
   do j = 1, m
      print (1x,a,i5,a,i5,1x,a4,F15.7)', "(",i,",",j,") = ", V(i+(j-1)*lda)
    end do
  end do
 deallocate (A, V, W, d work)
 end program main
```

It is necessary to compile and link with the -acc -Mcudalib=cusolver -Mcuda option as a compile option .

```
[kato@photon32 Dens_Eigen]$ pgf90 -acc -02 -Minfo -ta=tesla,cc60,cc35 -Mcuda -Mcudalib=cusolver
main:
     57, Generated vector simd code for the loop
         Residual loop unrolled 1 times (completely unrolled)
     65, Generating copy(a(:))
        Generating copyout (w(:))
        Generating copy (devinfo)
     81, Generating enter data copyin(d_work(:))
     88, Generating exit data delete(d work(:))
     98, Generated vector simd code for the loop
         Residual loop unrolled 1 times (completely unrolled)
    103, Loop not vectorized/parallelized: contains call
    110, Loop not vectorized/parallelized: contains call
[kato@photon32 Dens Eigen]$ a.out
 step5: alloc ierr_code = 0
Output parameter devInfo = 0
Eigenvalue:
 W(1) = 2.00000000000000
```

<u>Dense Linear Solver - cusolverDnDsyevd with OpenACC C++</u>

Rewrite the above Fortran program using PGI C++ OpenACC.

<u>OpenACC + cusolverDnDsyevd (syevd.cpp)</u>

```
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 * How to compile (assume cuda is installed at /usr/local/cuda-9.0/)
 * pgc++ -I/usr/local/cuda-9.0/include syevd.cpp -acc -ta=tesla,cc60,cc35 -Mcudalib=cusolver -Mi
 */
#include <stdio.h>
#include <stdlib.h>
#include <assert.h>
#include <cusolverDn.h>
void printMatrix(int m, int n, const double*A, int lda, const char* name)
    for (int row = 0; row < m; row++) {
        for (int col = 0; col < n; col++) {
            double Areg = A[row + col*lda];
            printf("%s(%d,%d) = %f\n", name, row+1, col+1, Areg);
        }
    }
int main(int argc, char*argv[])
```

```
cusolverDnHandle t cusolverH = NULL;
   cusolverStatus_t cusolver_status = CUSOLVER STATUS SUCCESS;
   const int m = 3;
   const int lda = m;
/* | 3.5 0.5 0 |
* A = | 0.5 3.5 0 |
 * | 0 0 2 |
* /
// double lambda[m] = { 2.0, 3.0, 4.0}; /* Exact eigenvalues */
   double *A; // ibput
    double *V; // eigenvectors
   double *W; // eigenvalues
   int *devInfo = NULL;
    double *work = NULL;
   int lwork = 0;
   A = (double *) malloc (sizeof(double) * lda * m);
   V = (double *) malloc (sizeof(double) * lda * m);
   W = (double *) malloc (sizeof(double) * m);
    devInfo = (int *) malloc (sizeof(int));
// step 1: create cusolver/cublas handle
   cusolver status = cusolverDnCreate(&cusolverH);
// step 2: set A
   A[0] = 3.5; A[1] = 0.5; A[2] = 0.0;
    A[3] = 0.5; A[4] = 3.5; A[5] = 0.0;
   A[6] = 0.0; A[7] = 0.0; A[8] = 2.0;
   printMatrix(m, m, A, lda, "A");
   printf("====\n");
// step 3: query working space of syevd
    cusolverEigMode_t jobz = CUSOLVER_EIG_MODE_VECTOR; // compute eigenvalues and eigenvectors.
    cublasFillMode t uplo = CUBLAS FILL MODE LOWER;
#pragma acc data copy(A[0:lda*m], devInfo[0:1]) copyout(W[0:m])
#pragma acc host_data use_device(A, W)
    cusolver status = cusolverDnDsyevd bufferSize(
       cusolverH,
       jobz,
       uplo,
       m,
        Α,
        lda,
        &lwork);
    assert (cusolver status == CUSOLVER STATUS SUCCESS);
    work = (double *) malloc(sizeof(double)*lwork);
    printf("Lwork = %d\n", lwork);
#pragma acc enter data create(work[0:lwork])
// step 4: compute spectrum
#pragma acc host data use device(A, W, work, devInfo)
    cusolver status = cusolverDnDsyevd(
       cusolverH,
        jobz,
        uplo,
```

```
m,
        A,
        lda,
        W,
        work,
        lwork,
        devInfo);
#pragma acc wait
#pragma acc exit data delete(work)
    printf("DevInfo = %d\n", devInfo[0]);
   printf("eigenvalue = (base 1), ascending order\n");
    for (int i = 0; i < m; i++) {
        printf("W[%d] = %E\n", i+1, W[i]);
// print eigenvecvtors
    for (int i = 0; i < m*m; i++) {
      V[i] = A[i];
   printf("V = (base 1) \n");
   printMatrix(m, m, V, lda, "V");
   printf("=====\n");
// free resources
    if (A) free(A);
    if (W) free(W);
    if (devInfo) free (devInfo);
    if (work) free (work);
    if (cusolverH) cusolverDnDestroy(cusolverH);
// cudaDeviceReset();
    return 0;
}
```

If you want to use cuSOLVER with the PGI C/C++ OpenACC compiler, compile using the C/C++ include files bundled with the NVIDIA CUDA Toolkit (the PGI compiler includes cuSOLVER/cuBLAS libraries for C/C++). include files such as are not bundled). The example here is written assuming that CUDA 9.0 is implemented under /usr/local/cuda-9.0. It is necessary to compile and link with the – I/usr/local/cuda-9.0/include -acc -ta=tesla -Mcudalib=cusolver option as a compile option. (For CUDA 8.0)

pgc++ -l/usr/local/cuda-8.0/include syevd.cpp -acc -ta=tesla,cc60,cc35 -Mcudalib=cusolver - Minfo=accel -O2 (For CUDA 9.0)

pgc++ - I/usr/local/cuda-9.0/include syevd.cpp -acc -ta=tesla,cc60,cc35 -Mcudalib=cusolver - Minfo=accel -O2

```
[kato@photon32 C]$ pgc++ -I/usr/local/cuda-9.0/include syevd.cpp -acc -ta=tesla,cc60,cc35
-Mcudalib=cusolver -Minfo=accel -O2
main:
    65, Generating copyout(W[:3])
        Generating copy(devInfo[:1],A[:9])
    87, Generating enter data create(work[:lwork])
    103, Generating update self(devInfo[:1])
        Generating exit data delete(work[:1])
[kato@photon32 C]$ a.out
```

```
A(1,1) = 3.500000
A(1,2) = 0.500000
A(1,3) = 0.000000
A(2,1) = 0.500000
A(2,2) = 3.500000
A(2,3) = 0.000000
A(3,1) = 0.000000
A(3,2) = 0.000000
A(3,3) = 2.000000
Lwork = 83
DevInfo = 0
eigenvalue = (base 1), ascending order
W[1] = 2.000000E+00
W[2] = 3.000000E+00
W[3] = 4.000000E+00
V = (base 1)
V(1,1) = 0.000000
V(1,2) = -0.707107
V(1,3) = 0.707107
V(2,1) = 0.000000
V(2,2) = 0.707107
V(2,3) = 0.707107
V(3,1) = 1.000000
V(3,2) = 0.000000
V(3,3) = 0.000000
```

<u>6. cuSolverDN: Dense matrix linear solver using QR decomposition (equivalent to LAPACK Dgeqrf)</u>

An example of using QR decomposition to solve a dense matrix linear system is shown. The following example is the same process as <u>C.1. QR Factorization Dense Linear Solver</u> written in Fortran OpenACC. Note that the dense matrix A must be input in <u>column-major order</u>.

QR Factorization Dense Linear Solver with OpenACC Fortran

Solve the following linear system using QR decomposition.

$$Ax = b$$

The program below shows an example of a 3 x 3 dense matrix (regular matrix).

$$A = \begin{pmatrix} 1.0 & 2.0 & 3.0 \\ 4.0 & 5.0 & 6.0 \\ 2.0 & 1.0 & 1.0 \end{pmatrix}$$

Use cuSOLVE routines (geqrf,ormqr) and cuBLAS routines (trsm).

```
Step 1: A = Q*R by geqrf.
Step 2: B := Q^T*B by ormqr.
Step 3: solve R*X = B by trsm.
```

<u>OpenACC + cuSOLVE-geqrf,ormqr,trsm (ormqr.f90)</u>

```
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```

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! DEALINGS IN THE SOFTWARE.
! pgf90 -acc -02 -Minfo=accel -ta=tesla,cc60,cc35 -Mcudalib=cusolver,cublas
!-Mcuda ormqr.f90
program main
 use cublas v2
 use cusolverDn
 implicit none
 integer,parameter :: prc = SELECTED REAL KIND(15,305)
 integer, parameter :: idbg = 1 ! debug write enable
  integer, parameter :: m = 3, lda =m, ldb = m
 integer, parameter :: nrhs = 1 ! number of right hand side vectors
 real(prc) :: one = 1.0d0
 type(cusolverDnHandle) :: cusolver H
 type(cublasHandle) :: cublas H
 integer :: cusolver status
 integer :: cublas status
 integer :: status1, ierr code
 integer :: i, j
! | 1 2 3 |
! A = | 456 |
! | 2 1 1 |
! x = (1 \ 1 \ 1) exact solution
! b = (6 15 4)
 real(prc), allocatable, dimension(:) :: A
 real(prc), allocatable, dimension(:) :: B
 real(prc), allocatable, dimension(:) :: Xc ! solution matrix from GPU
 real(prc), allocatable, dimension(:) :: tau
 real(prc), allocatable, dimension(:) :: d work
  integer::devInfo
 integer :: Lwork
 allocate ( A(lda*m), B(ldb*nrhs), Xc(ldb*nrhs) )
 allocate ( tau(m) )
 Lwork = 0
! set a data
  A(1:lda*m) = (/1.0, 4.0, 2.0, 2.0, 5.0, 1.0, 3.0, 6.0, 1.0/)
  B(1:ldb*nrhs) = (/6.0, 15.0, 4.0/)
! print A
 print *, "A ====="
 do i = 1, m
    do j = 1, m
       print '(1x,a,i5,a,i5,1x,a4,F15.7)', "(",i,",",j,") = ", A(i+(j-1)*lda)
```

```
end do
 end do
! print B
 print *, "B ====="
 do i = 1, ldb
   do j = 1, 1
      print '(1x,a,i5,a,i5,1x,a4,F15.7)', "(",i,",",j,") = ", B(i)
    end do
 end do
! step 1 create cusolver/cublas handle
 cusolver status = cusolverDnCreate(cusolver H)
 cublas status = cublasCreate(cublas H)
   if (idbg == 1) then
      if (cusolver_status /= CUSOLVER_STATUS_SUCCESS) print *, "step1 cusolver_status = ", cusol
      if (cublas status /= CUBLAS STATUS SUCCESS ) print *, "step1 cublas status = ", cublas status
    end if
!$acc data copy(A, B, devInfo) create(tau)
! step 2 query working space of geqrf and ormqr
!$acc host data use device(A)
 cusolver status = cusolverDnDgeqrf bufferSize(cusolver H, &
                   m, m, A, lda, Lwork)
!$acc end host data
   if (idbg == 1) then
      if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step2 cusolver status = ", cusol
! step 3 d work buffer allocated
    allocate(d work(Lwork), stat=ierr_code) ! words
      if (idbg == 1) then
       if (ierr code /= 0) print *, "step3: alloc ierr code = ", ierr code
      end if
    print *, "Lwork = ", Lwork
!$acc enter data copyin(d work)
! step 4 compute QR factorization
!$acc host data use device(A, tau, d work, devInfo)
 cusolver_status = cusolverDnDgeqrf(cusolver_H, &
                    m, m, A, lda, tau, d_work, Lwork, devInfo)
!$acc end host data
!$acc update self(devInfo)
 print *, "after geqrf: devInfo =", devInfo
! step 5: compute Q^T*B
!$acc host_data use_device(A, B, tau, d_work, devInfo)
 cusolver status = cusolverDnDormqr(cusolver H, CUBLAS SIDE LEFT, CUBLAS OP T, &
                   m, nrhs, m, A, lda, tau, B, ldb, d work, Lwork, devInfo)
!$acc end host data
!$acc update self(devInfo)
   print *, "after ormqr: devInfo =", devInfo
    if (idbg == 1) then
     if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step5 cusolver status = ", cusol
    end if
! step 6: compute x = R \setminus Q^T*B
!$acc host data use device(A, B)
  cublas status = cublasDtrsm v2(cublas H, CUBLAS SIDE LEFT, CUBLAS FILL MODE UPPER, CUBLAS PP
                   CUBLAS_DIAG_NON_UNIT, m, nrhs, one, A, lda, B, ldb)
!$acc end host data
!$acc exit data delete(tau, d work)
!$acc end data
```

It is necessary to compile and link with the -acc -Mcudalib=cusolver,cublas -Mcuda -ta=tesla option as a compile option.

Compile & run

```
[kato@photon32 QRf]$ pgf90 -acc -O2 -Minfo=accel -ta=tesla,cc60,cc35,cuda8.0
-Mcudalib=cusolver,cublas -Mcuda ormgr.f90
main:
     88, Generating copy(a(:),b(:))
        Generating create(tau(:))
        Generating copy(devinfo)
    107, Generating enter data copyin(d work(:))
   114, Generating update self(devinfo)
   123, Generating update self(devinfo)
    136, Generating exit data delete(tau(:), d work(:))
[kato@photon32 QRf]$ a.out
 A =====
 (1, 1) = 1.0000000
 (1, 2) = 2.0000000
 (1, 3) = 3.0000000
 (2, 1) = 4.0000000
 (2, 2) = 5.0000000
 (2, 3) = 6.0000000
 (3, 1) = 2.0000000
 (3, 2) = 1.0000000
 (3, 3) = 1.0000000
 В =====
 (1, 1) = 6.0000000
 (2, 1) = 15.0000000
 (3, 1) = 4.0000000
Lwork = 15
 after gegrf: devInfo = 0
 after ormqr: devInfo = 0
Result ========
 (1, 1) = 1.0000000
 (2, 1) = 1.0000000
 (3, 1) = 1.0000000
```

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7. cuSolverDN: Orthogonalization by QR decomposition (equivalent to LAPACK

<u>Dgegrf, Dorggr)</u>

An example of orthogonalization calculation using QR decomposition is shown. The following example is the same process as <u>C.2. orthogonalization</u> written in Fortran OpenACC. Note that the dense matrix A must be input in <u>column-major order</u>.

Orthgonalization by QR Factorization with OpenACC Fortran

Use CUDA Library to calculate "orthogonalization" by QR decomposition.

$$A = Q * R$$

The program below shows an example of a 3 \times 2 dense matrix.

$$A = \begin{pmatrix} 1.0 & 2.0 \\ 4.0 & 5.0 \\ 2.0 & 1.0 \end{pmatrix}$$

Use cuSOLVE routines (geqrf, orgqr).

Step 1: A = Q*R by geqrf.

Step 2: form Q by orgqr.

Step 3: check if Q is unitary or not.

OpenACC + cuSOLVE-gegrf,orggr (ortho.f90)

```
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! THE AUTHORS OR COPYRIGHT HOLDERS BE LIABLE FOR ANY CLAIM, DAMAGES OR OTHER
! LIABILITY, WHETHER IN AN ACTION OF CONTRACT, TORT OR OTHERWISE, ARISING
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! DEALINGS IN THE SOFTWARE.
! pgf90 -acc -02 -Minfo=accel -ta=tesla,cc60,cuda8.0 -Mcudalib=cusolver,cublas
! -Mcuda ormqr.f90 -Mcuda
program main
 use cublas v2
 use cusolverDn
  implicit none
 integer,parameter :: prc = SELECTED REAL KIND(15,305)
 integer, parameter :: idbg = 1 ! debug write enable
 integer, parameter :: m = 3, n = 2, lda =m
 real(prc) :: beta = 1.0d0, alpha = -1.0d0
 type(cusolverDnHandle) :: cusolver_H
  type(cublasHandle) :: cublas H
  integer :: cusolver status, cusolver status2
  integer :: cublas status
```

```
integer :: status1, ierr code
 integer :: i, j
! | 1 2 |
! A = | 45 |
! | 2 1 |
! x = (1 \ 1 \ 1) exact solution
! b = (6 15 4)
 real(prc), allocatable, dimension(:) :: A
 real(prc), allocatable, dimension(:) :: Q ! orthonormal columns
 real(prc), allocatable, dimension(:) :: R ! R = I - Q**T*Q
 real(prc) :: R nrm2
 real(prc), allocatable, dimension(:) :: tau
 real(prc), allocatable, dimension(:) :: d work
 integer::devInfo
 integer :: Lwork
 integer :: Lwork_geqrf
 integer :: Lwork orgqr
 allocate ( A(lda*n), Q(lda*n), R(n*n) )
 allocate ( tau(m) )
 Lwork = 0
 Lwork gearf = 0
 Lwork orgqr = 0
! set a data
 A(1:lda*n) = (/1.0, 4.0, 2.0, 2.0, 5.0, 1.0/)
! print A
 print *, "A ====="
 do i = 1, m
   do j = 1, n
      print '(1x,a,i5,a,i5,1x,a4,F15.7)', "(",i,",",j,") = ", A(i+(j-1)*lda)
    end do
 end do
! step 1 create cusolver/cublas handle
 cusolver status = cusolverDnCreate(cusolver H)
 cublas status = cublasCreate(cublas H)
    if (idbg == 1) then
     if (cusolver_status /= CUSOLVER_STATUS_SUCCESS) print *, "step1 cusolver_status = ", cusol
      if (cublas status /= CUBLAS STATUS SUCCESS ) print *, "step1 cublas status = ", cublas sta
!$acc data copy(A, devInfo) create(R, tau)
! step 2 query working space of geqrf and ormqr
!$acc host_data use_device(A)
 cusolver status = cusolverDnDgeqrf bufferSize(cusolver H, &
                   m, n, A, lda, Lwork geqrf)
  cusolver_status2= cusolverDnDorgqr_bufferSize(cusolver_H, &
                   m, n, n, A, lda, tau, Lwork_orgqr)
!$acc end host data
   Lwork = max(Lwork_geqrf, Lwork_orgqr)
   print *, "Lwork geqrf, Lwork orgqr, Lwork = ", Lwork geqrf, Lwork orgqr, Lwork
    if (idbg == 1) then
      if (cusolver_status /= CUSOLVER_STATUS_SUCCESS) print *, "step2 cusolver_status = ", cusol
     if (cusolver_status2/= CUSOLVER_STATUS_SUCCESS) print *, "step2 cusolver_status2= ", cusol
    end if
! step 3 d work buffer allocated
```

```
allocate(d work(Lwork), stat=ierr code) ! words
   if (idbg == 1) then
     if (ierr code /= 0) print *, "step3: alloc ierr code = ", ierr code
    end if
!$acc enter data copyin(d work)
! step 4 compute QR factorization
!$acc host data use device(A, tau, d work, devInfo)
   cusolver_status = cusolverDnDgeqrf(cusolver_H, &
                     m, n, A, lda, tau, d_work, Lwork, devInfo)
!$acc end host data
!$acc update self(devInfo)
   print *, "after geqrf: devInfo =", devInfo
! step 5: compute Q
!$acc host data use device(A, tau, d work, devInfo)
    cusolver status = cusolverDnDorgqr(cusolver H, &
                     m, n, n, A, lda, tau, d work, Lwork, devInfo)
!$acc end host_data
!$acc update self(A, devInfo)
   print *, "after orgqr: devInfo =", devInfo
   if (idbg == 1) then
     if (cusolver_status /= CUSOLVER_STATUS_SUCCESS) print *, "step5 cusolver_status = ", cusol
! step 6: copy A to Q ... orthonormal columns
   Q = A
! print O
   print *, "Q ======"
    do i = 1, m
     do j = 1, n
       print '(1x,a,i5,a,i5,1x,a4,F15.7)', "(",i,",",j,") = ", Q(i+(j-1)*lda)
      end do
    end do
! step 7: measure R = I - Q**T*Q
   R = 0.0
   do i = 1, n
     R(i + n*(i-1)) = 1.0 ! R(i,i) = 1
    end do
!$acc update device(R)
! R = -Q^{**}T^{*}Q + I (Q^{**}T = CUBLAS OP T, Q = CUBLAS OP T)
!$acc host_data use_device(A, R)
    cublas_status = cublasDgemm_v2(cublas_H, CUBLAS_OP_T, CUBLAS_OP_N, &
                 n, n, m, alpha, A, lda, A, lda, beta, R, n)
!$acc end host data
!$acc update self(R)
   if (idbg == 1) then
     if (cublas status /= CUBLAS STATUS SUCCESS) print *, "step7 cublas status = ", cublas $tat
    end if
   R nrm2 = 0.0d0
!$acc host_data use_device(R)
    cublas_status = cublasDnrm2_v2(cublas_H, n*n, R, 1, R_nrm2)
!$acc end host data
!$acc exit data delete(tau, d work)
!$acc end data
! atep 5 print |I - Q**T*Q|
    print *, "Result ==== |I - Q**T*Q| === "
```

```
print '(1x, a, 2x, D16.6)', '|I - Q**T*Q| =', R_nrm2

deallocate(A, R, tau, d_work)

end program main
```

It is necessary to compile and link with the -acc -Mcudalib=cusolver,cublas -Mcuda -ta=tesla option as a compile option.

Compile & run

```
[kato@photon32 Ortho]$ pgf90 -acc -Minfo=accel -ta=tesla,cc60,cc35,cuda8.0
-Mcudalib=cusolver,cublas ortho.f90 -Mcuda
main:
    85, Generating copy(a(:), devinfo)
         Generating create(r(:),tau(:))
   109, Generating enter data copyin(d_work(:))
   116, Generating update self(devinfo)
   125, Generating update self(a(:), devinfo)
   148, Generating update device(r(:))
    155, Generating update self(r(:))
   166, Generating exit data delete(tau(:), d work(:))
[kato@photon32 Ortho]$ a.out
 (1, 1) = 1.0000000
 (1, 2) = 2.0000000
 (2, 1) = 4.0000000
 (2, 2) = 5.0000000
 (3, 1) = 2.0000000
 (3, 2) = 1.0000000
 Lwork gegrf, Lwork orggr, Lwork = 14 2 14
 after gegrf: devInfo = 0
 after orgqr: devInfo = 0
 0 ======
 (1, 1) = -0.2182179
 (1, 2) = 0.5345225
 (2, 1) = -0.8728716
 (2, 2) = 0.2672612
 (3, 1) = -0.4364358
 (3, 2) = -0.8017837
 Result ==== |I - Q**T*Q| ===
 |I - Q**T*Q| = 0.450975D-15
```

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8. cuSolverDN: Singular value decomposition including singular vector calculation (by QR) (equivalent to LAPACK Dgesvd)

This is an example of performing singular value decomposition on a matrix whose components are complex numbers or real numbers. Here, we will show an example that deals with real numbers. Corresponds to **LAPACK's dgesvd routine**. Singular value decomposition is used in the fields of signal processing and statistics. The example below is the same process as <u>F.1. SVD with singular vectors</u> written in Fortran OpenACC. Note that the dense matrix A must be input in <u>column-major order</u>.

The program below shows an example of a 3 x 2 dense matrix. SVD is expressed by the following formula. Here Σ is an m×n matrix that is zero except for its min(m,n) diagonal elements, U is an m×m unitary matrix, and V is an n×n unitary matrix. The diagonal elements of Σ are singular values of A. They are real numbers, not negative numbers, and are returned in descending order. The first min (m,

n) columns of U and V are the left and right singular vectors of A. The cusolverDnDgesvd routine uses the QR algorithm. There is also cusolverDngesvdj, which has the same functionality. However, the latter is solved using the Jacobian method. If you are targeting small or medium-sized matrices, you may be able to enjoy high GPU performance due to the parallelism of the Jacobian method. Furthermore, using the Jacobi method is convenient for obtaining an approximate solution up to a certain level of accuracy. Here, we will show an example of singular value decomposition (SVD), which is solved using the QR algorithm.

$$A = U * \Sigma * V^{H}$$

$$A = \begin{pmatrix} 1.0 & 2.0 \\ 4.0 & 5.0 \\ 2.0 & 1.0 \end{pmatrix}$$

Implement the following three calculation steps.

Step 1: Perform A = U*S*VT singular value decomposition.

Step 2: Verify the singular values.

Step 3: Calculate the residual error AU*S*VT using cuBLAS.

When calculating the residual error in Step 3, use the BLAS NVIDIA extention function. Since this is not included in PGI Fortran's Interface Module, I created a module called module cuBLASext to interface Fortran with the cuBLAS function.

<u>OpenACC + cuSOLVER-cusolverDnDgesvd (svd_simgular.f90)</u>

```
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! THE AUTHORS OR COPYRIGHT HOLDERS BE LIABLE FOR ANY CLAIM, DAMAGES OR OTHER
! LIABILITY, WHETHER IN AN ACTION OF CONTRACT, TORT OR OTHERWISE, ARISING
! FROM, OUT OF OR IN CONNECTION WITH THE SOFTWARE OR THE USE OR OTHER
! DEALINGS IN THE SOFTWARE.
module cuBLASext
! NVIDIA extension : the BLAS-extension functions
! because PGI Fortran don't include NVIDIA extention BLAS module.
use cublas v2
interface cublasDdgmm
  integer(c_int) function cublasDdgmm( handle, side_mode, m, n, &
                                        A, lda, x , incx , C, ldc) &
                                        bind(C, name="cublasDdgmm")
  use iso c binding
```

```
import cublasHandle
 type(cublasHandle), value :: handle
 integer(c_int), value :: side_mode, m, n, lda, ldc, incx
 real(c_double), device :: A(*), C(*)
 real(c_double), device :: x(*)
 end function cublasDdgmm
end interface cublasDdgmm
end module cuBLASext
module aux_routine
contains
subroutine print D matrix(m, n, a, lda)
integer :: m, n, i, j
real(8) :: a(*)
do i=1, m
 do j=1, n
   print "(5(,i5,1x,i5,2x,f10.6,2x))", i, j, a(i+(j-1)*lda)
  end do
end do
end subroutine print D matrix
end module aux routine
program main
 use cublas v2
 use cuBLASext
 use cusolverDn
 use aux routine
  implicit none
 integer, parameter :: m=3, n=2
 integer, parameter::lda = m
 integer, parameter :: idbg = 1
 real(8), parameter :: one = 1.d0, minus one = -1.d0
 real(8) :: a (lda*n) ! column-major format with dimensions mxn
 real(8) :: u (lda*m) ! m by m unitary matrix
 real(8) :: vt(lda*n) ! n by n unitary matrix
 real(8) :: w (lda*n) ! w = s*vt
  real(8), allocatable, dimension(:) :: s ! singular values
  real(8), allocatable, dimension(:) :: rwork ! min(m,n)-1
  real(8), allocatable :: workspace d(:)
 real(8) :: S_exact(n)
 real(8) :: err, diff_s, diff_fro
 integer :: devInfo d
 integer :: istat, Lwork
 integer :: i
 character*1 :: jobu, jobvt
 type(cusolverDnHandle) :: cusolver_H
 type(cublasHandle) :: cublas H
  integer :: cusolver status
  integer :: cublas status
! | 1 2 |
! a = | 45 |
! | 2 1 |
 allocate(s(1:min(m,n)))
 allocate (rwork(1:min(m,n)-1))
 Lwork = 0
! set a data
 a(1:lda*n) = (/1.0, 4.0, 2.0, 2.0, 5.0, 1.0/)
! Exact SV numbers
  S_exact(1:n) = (/7.065283497082729d0, 1.040081297712078d0/)
  cusolver status = cusolverDnCreate(cusolver H)
```

```
if (cusolver status /= CUSOLVER STATUS SUCCESS) &
      print *, 'handle creation failed'
 cublas status = cublasCreate(cublas H)
 if (cublas_status /= CUBLAS STATUS SUCCESS ) &
      print *, "cublas_status = ", cublas_status
!$acc data copy(a) create(s, u, vt, devInfo d, workspace d, rwork, w)
        ! Step 1: compute A = U*S*VT
 !$acc host data use device(a)
       istat = cusolverDnDgesvd bufferSize(cusolver H, m, n, Lwork)
 !$acc end host data
        if (istat /= CUSOLVER_STATUS_SUCCESS) &
                write(*,*) 'cusolverDnDgesvd bufferSize failed'
        print *, "working space (words) =", Lwork
        allocate(workspace d(Lwork))
 !$acc enter data copyin(workspace d) copyin(devInfo d)
        jobu = 'A' ! all m columns of U
        jobvt= 'A' ! all m columns of VT
        !$acc host_data use_device(a, s, u, vt, devInfo_d, workspace_d, rwork)
         istat = cusolverDnDgesvd (cusolver_H, jobu, jobvt, &
                  m, n, a, lda, s, u, lda, vt, lda, workspace d, Lwork, rwork, devInfo d)
        !$acc end host data
        !$acc wait
         if (istat /= CUSOLVER STATUS SUCCESS) &
                   write(*,*) 'cusolverDnDgesvd failed', istat
        ! copyout u, vt, s, devInfo d to host
        !$acc update self(u, vt, s, devInfo d)
       !print
       print *, "After gesvd: devInfo_d =", devInfo_d
        if (devInfo d /= 0) write(*,*) 'SVD operation failed'
       print *, "S="
       call print D matrix(n, 1, s, 0)
       print *, "U="
       call print D matrix(m, m, u, lda)
       print *, "VT="
       call print D matrix(n, n, vt, lda)
       istat = cusolverDnDestroy(cusolver H)
       if (istat /= CUSOLVER STATUS SUCCESS) &
                 write(*,*) 'handle destruction failed'
        ! Step 2: check accuracy of singular value
        diff s = 0.d0
        diff fro = 0.d0
        do i = 1, n
         err = abs(s(i) - s exact(i))
         diff_s = max( err, diff_s )
        end do
        print '(1x, a, d17.5)', "|S - S exact| = ", diff s
        ! Step 3: measure residual AU*S*VT
        ! w = s*vT
        !$acc host_data use_device(s, vt, w)
         cublas status = cublasDdgmm(cublas H, CUBLAS SIDE LEFT, n, n, &
                                                 vt, lda, s, 1, w, lda)
        !$acc end host data
```

```
if (idbg == 1) then
         !$acc update self(w)
          print *, "W="
          call print_D_matrix(n, n, w, lda)
        end if
    ! Original A matrix is copied to device
        !$acc update device(a)
        ! a := -u*w + a
        !$acc host data use device(a, u, w)
          cublas status = cublasDgemm v2(cublas H, CUBLAS OP N, CUBLAS OP N, &
                     m, n, n, minus one, u, lda, w, lda, one, a, lda)
          cublas status = cublasDnrm2 v2(cublas H, lda*n, a, 1, diff fro)
        !$acc end host_data
        if (idbg == 1) then
          !$acc update self(a)
          print *, "A = "
         call print D matrix(m, n, a, lda)
        print '(1x, a, d17.5)', "|A - U*S*VTt| = ", diff fro
  !$acc exit data delete(workspace d)
!Sacc end data
end program main
```

It is necessary to compile and link with the -acc -Mcudalib=cusolver,cublas -Mcuda -ta=tesla option as a compile option.

```
$ make run
pgf90 -c -02 -Minfo -ta=tesla,cuda9.0,cc35,cc60 -Mcudalib=cusolver,cublas -Kieee -acc -Mcuda svc
print d matrix:
     47, Loop not vectorized/parallelized: contains call
main:
     92, Loop unrolled 6 times (completely unrolled)
        Loop not vectorized: loop count too small
     95, Loop unrolled 2 times (completely unrolled)
    104, Generating create(rwork(:),s(:),u(:))
         Generating copy(a(:))
         Generating create(w(:),workspace_d(:),devinfo_d,vt(:))
    117, Generating enter data copyin(workspace_d(:),devinfo_d)
    132, Generating update self(devinfo d,vt(:),u(:),s(:))
    152, Loop unrolled 2 times (completely unrolled)
    167, Generating update self(w(:))
    173, Generating update device(a(:))
   183, Generating update self(a(:))
   190, Generating exit data delete (workspace d(:))
==== Program run =====
a.out
working space (words) = 131
 After gesvd: devInfo_d = 0
    1 1 7.065283
    2 1 1.040081
   1 1 -0.308219
   1 2 0.488195
    1 3 0.816497
    2 1 -0.906133
```

```
2 2 0.110706
  2 3 -0.408248
  3 1 -0.289695
  3 2 -0.865685
  3 3 0.408248
  1 1 -0.638636
  1 2 -0.769509
  2 1 -0.769509
  2 2 0.638636
|S - S = act| = 0.22204D-15
  1 1 -4.512143
  1 2 -5.436800
  2 1 -0.800352
  2 2 0.664233
  1 1 0.000000
  1 2 0.000000
  2 1 0.000000
  2 2 0.000000
  3 1 0.000000
  3 2 0.000000
|A - U*S*VTt| = 0.23604D-14
```

9. cuSolverDN: Singular value decomposition including singular vector calculation (by Jacobi) (equivalent to LAPACK Dgesvd)

In the previous section, we showed an example of <u>solving singular value decomposition using the QR algorithm</u>. Here, we will show an example of performing singular value decomposition using the Jacobian method. If you are targeting small and medium–sized matrices, which corresponds to **LAPACK's dgesvd routine**, **you may be able to enjoy high GPU performance due to the parallelism of the Jacobian method.** Furthermore, using the Jacobi method is convenient for obtaining an approximate solution up to a certain level of accuracy. The example below is the same process as <u>F.2. SVD with singular vectors (via Jacobi method</u>) written in Fortran OpenACC. Note that the dense matrix A must be input in <u>column–major order</u>.

The program below shows an example of a 3 x 2 dense matrix. SVD is expressed by the following formula. Here Σ is an m×n matrix that is zero except for its min(m,n) diagonal elements, U is an m×m unitary matrix, and V is an n×n unitary matrix. The diagonal elements of Σ are singular values of A. They are real numbers, not negative numbers, and are returned in descending order. The first min (m, n) columns of U and V are the left and right singular vectors of A.

$$A = U * \Sigma * V^{H}$$

$$A = \begin{pmatrix} 1.0 & 2.0 \\ 4.0 & 5.0 \\ 2.0 & 1.0 \end{pmatrix}$$

The Fortran interface module (cusolverDn.mod) for cuSOLVER provided by PGI 17.7 does not include an Interface to the CUDA C/C++ cuSOLVER library to use the singular value decomposition routine cusolverDnDgesvdj using the Jacobian method. I understand. That's why I made it myself. We defined

an Interface for using the C library in the module cusolverDn_gesvdj module shown below. This allows cuSOLVER's cusolverDnDgesvdj routine to be used from Fortran.

In the program example below, a stream tag is created using cusolverDnSetStream(), so that the cusolverDN library task can be run redundantly in the CUDA stream. Since this program is a single stream, this act itself is meaningless, but by using CUDA streams, the program can be configured to perform multiple library tasks. This is just a demonstration of how to use CUDA streams. When using CUDA streams, it is important to note that it is necessary to use the cudaDeviceSynchronize() function to synchronize at points where subsequent processing must be synchronized. Note that this function requires direct use of the CUDA (Fortran) API and cannot be synchronized using !\$acc wait at the OpenACC level.

<u>OpenACC + cuSOLVER-cusolverDnDgesvdj (jacobi_svd.f90)</u>

```
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! and/or sell copies of the Software, and to permit persons to whom the
! Software is furnished to do so, subject to the following conditions:
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! all copies or substantial portions of the Software.
! THE SOFTWARE IS PROVIDED "AS IS", WITHOUT WARRANTY OF ANY KIND, EXPRESS OR
! IMPLIED, INCLUDING BUT NOT LIMITED TO THE WARRANTIES OF MERCHANTABILITY,
! FITNESS FOR A PARTICULAR PURPOSE AND NONINFRINGEMENT. IN NO EVENT SHALL
! THE AUTHORS OR COPYRIGHT HOLDERS BE LIABLE FOR ANY CLAIM, DAMAGES OR OTHER
! LIABILITY, WHETHER IN AN ACTION OF CONTRACT, TORT OR OTHERWISE, ARISING
! FROM, OUT OF OR IN CONNECTION WITH THE SOFTWARE OR THE USE OR OTHER
! DEALINGS IN THE SOFTWARE.
module cusolverDn gesvdj
 use cudafor
  use cusolverDN
  type gesvdjInfo
   type(c_ptr) :: svInfo
  end type gesvdjInfo
! cusolverDnCreateGesvdjInfo(info)
  interface
     integer(c_int) function cusolverDnCreateGesvdjInfo(info) bind(C,name='cusolverDnCreateGesvc
       import gesvdjInfo
       type(gesvdjInfo) :: info
     end function cusolverDnCreateGesvdjInfo
  end interface
! cusolverDnXgesvdjSetTolerance(info, tolerance)
  interface
     integer(c int) function cusolverDnXgesvdjSetTolerance(info, tolerance) &
     bind(C, name='cusolverDnXgesvdjSetTolerance')
       use iso_c_binding
      import gesvdjInfo
       type(gesvdjInfo) :: info
       real(c double), value :: tolerance
     end function cusolverDnXgesvdjSetTolerance
  end interface
```

```
! cusolverDnXgesvdjSetMaxSweeps(info, max sweeps)
 interface
    integer(c int) function cusolverDnXgesvdjSetMaxSweeps(info, max sweeps) &
    bind(C, name='cusolverDnXgesvdjSetMaxSweeps')
      use iso c binding
      import gesvdjInfo
      type(gesvdjInfo) :: info
      integer(c int), value :: max sweeps
    end function cusolverDnXgesvdjSetMaxSweeps
 end interface
! cusolverDnDgesvdj bufferSize
 interface
    integer(c_int) function cusolverDnDgesvdj_bufferSize(cusolver_Hndl, jobz, econ, &
    m, n, a, lda, s, u, ldu, v, ldv, lwork, info) bind(C, name='cusolverDnDgesvdj bufferSize|)
      use iso c binding
      import cusolverDnHandle
      import gesvdjInfo
      type(cusolverDnHandle), value :: cusolver Hndl
      integer(c int), value :: jobz
      integer(c int), value :: econ, m, n, lda, ldu, ldv
      real(c double), device :: a(*), s(*), u(*), v(*)
      type(gesvdjInfo) :: info
    end function cusolverDnDgesvdj bufferSize
 end interface
! cusolverDnDqesvdj
 interface
    integer(c int) function cusolverDnDgesvdj(cusolver Hndl, jobz, econ, &
    m, n, a, lda, s, u, ldu, v, ldv, work, lwork, devinfo, info ) bind(C, name='cusolverDnDgesvc
      use iso c binding
      import cusolverDnHandle
      import gesvdjInfo
      type(cusolverDnHandle), value :: cusolver Hndl
      integer(c int), value :: jobz
      integer(c int), value :: econ, m, n, lda, ldu, ldv
      real(c double), device :: a(*), s(*), u(*), v(*), work(*)
      integer(c int) :: devinfo
      type(gesvdjInfo) :: info
    end function cusolverDnDgesvdj
 end interface
! cusolverDnXgesvdjGetSweeps
 interface
    integer(c int) function cusolverDnXgesvdjGetSweeps(cusolver Hndl, info, executed sweeps) &
    bind(C, name='cusolverDnXgesvdjGetSweeps')
      use iso_c_binding
      import cusolverDnHandle
      import gesvdjInfo
      type(cusolverDnHandle), value :: cusolver Hndl
      type(gesvdjInfo) :: info
      integer(c_int) :: executed_sweeps
    end function cusolverDnXgesvdjGetSweeps
 end interface
! cusolverDnXgesvdjGetResidual
 interface
    integer(c int) function cusolverDnXgesvdjGetResidual(cusolver Hndl, info, residual) &
    bind(C, name='cusolverDnXgesvdjGetResidual')
      use iso c binding
      import cusolverDnHandle
      import gesvdjInfo
      type(cusolverDnHandle), value :: cusolver Hndl
      type(gesvdjInfo) :: info
      real(c double) :: residual
    end function cusolverDnXgesvdjGetResidual
 end interface
```

```
end module cusolverDn gesvdj
module aux_routine
contains
subroutine print D matrix(m, n, a, lda)
integer :: m, n, i, j
real(8) :: a(*)
do i=1, m
 do j=1, n
   print "(5(,i5,1x,i5,2x,D20.14,2x))", i, j, a(i+(j-1)*lda)
 end do
end do
end subroutine print D matrix
end module aux routine
program main
 use cudafor ! cudaStreamCreateWithFlags in the cudafor.mod
 use cusolverDn
 use cusolverDn gesvdj
 use aux routine
 implicit none
 integer, parameter :: m=3, n=2
 integer, parameter::lda = m
 integer, parameter :: idbg = 1
 real(8), parameter :: one = 1.d0, minus one = -1.d0
 real(8) :: a (lda*n) ! column-major format with dimensions mxn
 real(8) :: u (lda*m) ! m by m unitary matrix
 real(8) :: vt(lda*n) ! n by n unitary matrix
 real(8), allocatable, dimension(:) :: s ! singular value
 real(8), allocatable :: workspace d(:)
 real(8) :: S exact(n)
 real(8) :: err, diff s
 integer :: devInfo d
  integer :: istat, Lwork
 integer :: i
! configuration of GESVDJ
 real(8) :: tol
 integer :: max sweeps
 integer, parameter :: econ=0 ! econ = 1 for economy size
! numerical results of GESVDJ
 real(8) :: residual
 integer :: executed_sweeps
!cuda library variables
 type(cusolverDnHandle) :: cusolver H
  type(gesvdjInfo) :: gesvdj_params
 integer :: jobz
 integer(kind=cuda_stream_kind) :: stream
 integer :: cusolver status
 integer :: cublas_status
! | 1 2 |
! a = | 45 |
! | 2 1 |
! cusolverDnDgesvdj() argument list
! jobz CUSOLVER EIG MODE NOVECTOR: compute singular values only
! CUSOLVER EIG MODE VECTOR: compute singular value and singular vectors
!econ econ = 1 for economy size
! m nubmer of rows of A, 0 <= m
```

```
! n number of columns of A, 0 \le n
! a m-by-n
!lda leading dimension of A
! s min(m,n)
! the singular values in descending order
! u m-by-m if econ = 0
! m-by-min(m,n) if econ = 1
! ldu leading dimension of U, ldu \geq \max(1, m)
!vt n-by-n if econ = 0
!n-by-min(m,n) if econ = 1
!ldv leading dimension of V, ldv \geq \max(1, n)
!Initialize
 allocate(s(1:min(m,n)))
 Lwork = 0
 tol = 1.d-7
 max sweeps = 15
 residual = 0.d0
 executed sweeps = 0
 jobz = CUSOLVER EIG MODE VECTOR
 print *,"Eigmode=", jobz
 print *, "tol =", tol
 print *, "max sweeps =", max sweeps
 print *, "econ = ", econ
! set a data
 a(1:lda*n) = (/1.0, 4.0, 2.0, 2.0, 5.0, 1.0/)
 print *, "A="
 call print D matrix(m, n, a, lda)
! Exact SV numbers
  S = (7.065283497082729d0, 1.040081297712078d0/)
!$acc data copy(a) create(s, u, vt, devInfo d)
        ! Step 1: create handle and stream
    cusolver status = cusolverDnCreate(cusolver H)
    if (cusolver_status /= CUSOLVER STATUS SUCCESS) &
        print *, 'handle creation failed'
    ! set a CUDA Lib stream -- when performing several small independent computations (run in as
    ! you explicitly need to set cudaDeviceSynchronize() at an appropriate place by CUDA-API
    istat = cudaStreamCreateWithFlags(stream, cudaStreamNonBlocking)
   istat = cusolverDnSetStream(cusolver H, stream)
    ! step 2 : configure gesvdj, Tolerance, Max sweeps
    istat = cusolverDnCreateGesvdjInfo(gesvdj params)
    istat = cusolverDnXgesvdjSetTolerance(gesvdj params, tol)
    istat = cusolverDnXgesvdjSetMaxSweeps(gesvdj_params, max_sweeps)
        ! Step 3: query workspace of SVD, allocate workspace d(Lwork)
  !$acc host_data use_device(a, s, u, vt)
        istat = cusolverDnDgesvdj_bufferSize(cusolver_H, jobz, econ, &
            m, n, a, lda, s, u, lda, vt, lda, Lwork, gesvdj_params)
  !$acc end host data
        if (istat /= CUSOLVER STATUS SUCCESS) &
                 write(*,*) 'cusolverDnDgesvdj_bufferSize failed'
        print *, "working space (words) =", Lwork
        allocate(workspace d(Lwork))
  !$acc enter data copyin(workspace d) copyin(devInfo d)
```

```
! step 4 : compute SVD
        !$acc host_data use_device(a, s, u, vt, devInfo_d, workspace_d)
         istat = cusolverDnDgesvdj (cusolver_H, jobz, econ, &
                   m, n, a, lda, s, u, lda, vt, lda, workspace_d, Lwork, devInfo_d, gesvdj_paran
        !$acc end host data
    ! Synchronize for cusolverDnDgesvdj completion (required)
     istat =cudaDeviceSynchronize()
                                                      ! CUDA-API, it can't use a OpenACC wait dir
      if (istat /= CUSOLVER STATUS SUCCESS) &
        write(*,*) 'cusolverDnDgesvd failed', istat
    ! copyout u, vt, s, devInfo d to host
      !$acc update self(s, u, vt, devInfo d)
        ! Step 5: measure residual |A - U*S*V**H| F
    istat = cusolverDnXgesvdjGetSweeps(cusolver H, gesvdj params, executed sweeps)
    istat = cusolverDnXgesvdjGetResidual(cusolver H, gesvdj params, residual)
  !$acc exit data delete(workspace d)
!$acc end data
        ! print out
        print *, "After gesvd: devInfo d =", devInfo d
        if (devInfo d == 0) then
         write(*,*) 'SVD operation was converged'
        else if (devInfo d < 0) then
         write(*,*) -devInfo d, "d-th parameter is wrong"
          stop
        else
          write(*,*) "WARNING: gesvdj does not converge ", devInfo d
        end if
       print *, "Singular values ="
        call print D matrix(n, 1, s, 0)
        print *, "\overline{U} = left singular vectors"
        call print D matrix(m, m, u, lda)
        print *, "VT = right singular vectors"
        call print D matrix(n, n, vt, lda)
       ! check accuracy of singular value
        diff s = 0.d0
        do i = 1, n
         err = abs(s(i) - s exact(i))
         diff_s = max( err, diff_s )
         end do
         print '(1x, a, d17.5)', "|S - S exact| = ", diff s
        ! measure residual AU*S*VT**H
        print '(1x, a, d17.5)',"|A - U*S*V**H| = ", residual
        print '(1x, a, I5)', "number of executed sweeps = ", executed sweeps
        istat = cusolverDnDestroy(cusolver H)
        if (istat /= CUSOLVER STATUS SUCCESS) &
                 write(*,*) 'handle destruction failed'
end program main
```

It is necessary to compile and link with the -acc -Mcudalib=cusolver -Mcuda -ta=tesla options as compile options .

Compile & run

```
$ make run
pgf90 -c -02 -Minfo -ta=tesla,cuda9.0,cc35,cc60 -Mcudalib=cusolver,cublas -Kieee -acc -Mcuda jac
print d matrix:
    126, Loop not vectorized/parallelized: contains call
    210, Loop unrolled 6 times (completely unrolled)
         Loop not vectorized: loop count too small
    215, Loop unrolled 2 times (completely unrolled)
    217, Generating create(devinfo d,s(:),vt(:),u(:))
         Generating copy(a(:))
    249, Generating enter data copyin(workspace d(:), devinfo d)
    264, Generating update self(vt(:),u(:),s(:),devinfo d)
    271, Generating exit data delete(workspace d(:))
    296, Loop unrolled 2 times (completely unrolled)
pgf90 -o a.out jacobi svd.o -ta=tesla,cuda9.0,cc35,cc60 -Mcudalib=cusolver -acc -Mcuda
==== Program run =====
a.out
Eigmode=1
tol = 9.9999999999995E-008
max sweeps = 15
econ = 0
    1 1 0.1000000000000D+01
   1 2 0.2000000000000D+01
    2 1 0.4000000000000D+01
    2 2 0.5000000000000D+01
    3 1 0.2000000000000D+01
    3 2 0.1000000000000D+01
 working space (words) = 3168
After gesvd: devInfo_d = 0
 SVD operation was converged
 Singular values =
    1 1 0.70652834970827D+01
    2 1 0.10400812977121D+01
{\tt U} = {\tt left} \ {\tt singular} \ {\tt vectors}
   1 1 0.30821892063279D+00
    1 2 -.48819507401990D+00
    1 3 0.81649658092773D+00
    2 1 0.90613333377729D+00
    2 2 -.11070553170904D+00
    2 3 -.40824829046386D+00
    3 1 0.28969549251172D+00
    3 2 0.86568461633075D+00
    3 3 0.40824829046386D+00
 VT = right singular vectors
    1 1 0.63863583713640D+00
    1 2 0.76950910814953D+00
    2 1 0.76950910814953D+00
     2 -.63863583713640D+00
 |S - S = 2.88818D-15
 |A - U*S*V**H| = 0.36550D-14
 number of executed sweeps = 1
```

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10. cuSolverSP: Parallel direct sparse solver (CSR QR decomposition)

PGI 17.7 provided a Fortran MODULE interface for the cuSolverDN type routines, but not yet for the cuSolverSP and cuSolverRF type libraries. I believe that it will be provided in the future, but here I will create a Fortran MODULE interface for cuSolverSP and present an example program that performs

sparse QR decomposition. The example used here is a version of Batched Sparse QR example 1 shown in the NVIDIA cuSOLVER reference manual, which was rewritten by the author in his Fortran language. Note that the library here uses a "batch processing routine" that solves multiple linear systems. A technical explanation of the batch solver used here can also be found on the NVIDIA Parallel FORALL: Parallel Direct Solvers with cuSOLVER: Batched QR blog.

```
A_i\,x_i\,=\,b_i \mbox{A = } \mid \mbox{1 }\mid \mbox{ Prepare multiple Marices A (small perturbations).} \mbox{A = } \mid \mbox{2 }\mid \mbox{ for batch processing } \mid \mbox{3 }\mid \mbox{0.1 }0.1\mbox{0.1 }0.1\mbox{4 }\mid
```

I will post how to use this program from CUDA Fortran and OpenACC Fortran.

The programming response differs depending on which programming model is used to manage device memory for arrays and variables, but here we will explain how to declare a device array on the CUDA Fortran side, and how to declare an array on the OpenACC side. An example of this is shown below.

Batched Sparse QR example with CUDA Fortran

As of PGI 17.7, a Fortran Module interface to the cuSOLVER SP (sparse) library developed in the CUDA C language is not provided, so I created it myself (cusolver_mod.cuf) as shown below. This is an interface to mediate the binding between C and Fortran. In the future, if the PGI compilation system provides a Fortran MODULE for cuSOLVER SP (possibly available with use cusplverSP), the following cusolver_mod.cuf routine will no longer be needed. First, we will present an example of coding using CUDA Fortran. After this, I will show an example of modifying this program and coding it using OpenACC. Please refer to the specifications of the batch library routine (cusolverSpXcsrqrBatched()) used here. In the explanation of the argument specifications for this function, there is a distinction between host and device, which indicates which side the variable is placed on. By looking at this, you can tell whether or not you need to handle it as a device variable.

Fortran Module Interface for cuSOLVER SP QR (cusolver mod.cuf)

```
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! and/or sell copies of the Software, and to permit persons to whom the
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! THE AUTHORS OR COPYRIGHT HOLDERS BE LIABLE FOR ANY CLAIM, DAMAGES OR OTHER
! LIABILITY, WHETHER IN AN ACTION OF CONTRACT, TORT OR OTHERWISE, ARISING
! FROM, OUT OF OR IN CONNECTION WITH THE SOFTWARE OR THE USE OR OTHER
! DEALINGS IN THE SOFTWARE.
module cuSOLVER SP QR
```

```
use cudafor
 use cusparse
 enum, bind(C) ! cusolverStatus_t
   enumerator :: CUSOLVER_STATUS_SUCCESS=0
    enumerator :: CUSOLVER_STATUS_NOT_INITIALIZED=1
    enumerator :: CUSOLVER STATUS ALLOC FAILED=2
    enumerator :: CUSOLVER STATUS INVALID VALUE=3
    enumerator :: CUSOLVER STATUS ARCH MISMATCH=4
    enumerator :: CUSOLVER STATUS MAPPING ERROR=5
   enumerator :: CUSOLVER STATUS EXECUTION FAILED=6
   enumerator :: CUSOLVER STATUS INTERNAL ERROR=7
   enumerator :: CUSOLVER STATUS MATRIX TYPE NOT SUPPORTED=8
   enumerator::CUSOLVER STATUS NOT SUPPORTED = 9
   enumerator :: CUSOLVER_STATUS_ZERO_PIVOT=10
    enumerator :: CUSOLVER STATUS INVALID LICENSE=11
 enum, bind(C) ! cusolverEigType t
   enumerator :: CUSOLVER EIG TYPE 1=1
   enumerator :: CUSOLVER EIG TYPE 2=2
   enumerator :: CUSOLVER EIG TYPE 3=3
 type cusolverSpContext
       type(c_ptr) :: cusolverSpHandle
 end type cusolverSpContext
 type csrqrInfo
   type(c ptr) :: Info
  end type csrqrInfo
 type cusolverSpHandle
   type(c ptr) :: SpHandle
 end type cusolverSpHandle
! cusolverSpCreate
  interface
    integer(c int) function cusolverSpCreate(handle) bind(C,name='cusolverSpCreate')
      import cusolverSpHandle
       type(cusolverSpHandle) :: handle
     end function cusolverSpCreate
 end interface
! cusolverSpDestroy
 interface
     integer(c int) function cusolverSpDestroy(handle) bind(C,name='cusolverSpDestroy')
      import cusolverSpHandle
      type(cusolverSpHandle), value :: handle
     end function cusolverSpDestroy
 end interface
! cusolverSpCreateCsrqrInfo
  interface
     integer(c int) function cusolverSpCreateCsrqrInfo(info) bind(C,name='cusolverSpCreateCsrqrl
      import csrqrInfo
      type(csrqrInfo) :: info
    end function cusolverSpCreateCsrqrInfo
 end interface
! cusolverSpDestroyCsrqrInfo
 interface
     integer(c_int) function cusolverSpDestroyCsrqrInfo(info) bind(C,name='cusolverSpDestroyCsrq
      import csrarInfo
       type(csrqrInfo) :: info
     end function cusolverSpDestroyCsrqrInfo
 end interface
!cusolverSpDcsrqrBufferInfoBatched
interface cusolverSpDcsrgrBufferInfoBatched
  integer(c int) function cusolverSpDcsrqrBufferInfoBatched( cusolver Hndl, m, n, nnzA, &
     descrA, csrValA, csrRowPtrA, csrColIndA, BatchSize, info, internalDataInBytes, workspaceInE
```

```
bind(C, name="cusolverSpDcsrqrBufferInfoBatched")
 use iso c binding
 import cusolverSpHandle, cusparseMatDescr, csrqrInfo
 type(cusolverSpHandle), value :: cusolver_Hndl
 type(cusparseMatDescr), value :: descrA
 type(csrqrInfo), value :: info
 integer(c_int), value :: m, n, nnzA, batchSize
 real(c_double), device :: csrValA(*)
!! !pgi$ ignore tkr (d) csrRowPtrA, (d) csrColIndA
 integer(c int), device :: csrRowPtrA(*), csrColIndA(*)
!! !pgi$ ignore tkr (k) internalDataInBytes, (k) workspaceInBytes
 integer(8) :: internalDataInBytes, workspaceInBytes
 end function cusolverSpDcsrqrBufferInfoBatched
end interface cusolverSpDcsrqrBufferInfoBatched
! cusolverSpXcsrqrAnalysis
!interface cusolverSpXcsrqrAnalysis
! integer(c int) function cusolverSpXcsrqrAnalysis( cusolver Hndl, m, n, nnzA, &
! descrA, csrRowPtrA, csrColIndA, info ) &
! bind(C, name="cusolverSpXcsrqrAnalysis")
! use iso c binding
! import cusolverSpHandle, cusparseMatDescr, csrqrInfo
! type(cusolverSpHandle), value :: cusolver Hndl
! type(cusparseMatDescr), value :: descrA
! type(csrqrInfo), value :: info
! integer(c_int), value :: m, n, nnzA
!!pgi$ ignore tkr (d) csrRowPtrA, (d) csrColIndA
! integer(c int), device :: csrRowPtrA(*), csrColIndA(*)
! end function cusolverSpXcsrqrAnalysis
!end interface cusolverSpXcsrqrAnalysis
! cusolverSpXcsrqrAnalysisBatched
interface cusolverSpXcsrqrAnalysisBatched
 integer(c_int) function cusolverSpXcsrqrAnalysisBatched( cusolver Hndl, m, n, nnzA, &
                 descrA, csrRowPtrA, csrColIndA, info ) &
                 bind(C, name="cusolverSpXcsrqrAnalysisBatched")
 use iso c binding
 import cusolverSpHandle, cusparseMatDescr, csrqrInfo
 type(cusolverSpHandle), value :: cusolver_Hndl
 type(cusparseMatDescr), value :: descrA
 type(csrqrInfo), value :: info
 integer(c_int), value :: m, n, nnzA
!! !pgi$ ignore tkr (d) csrRowPtrA, (d) csrColIndA
 integer(c int), device :: csrRowPtrA(*), csrColIndA(*)
 \verb|end| function| cusolverSpXcsrqrAnalysisBatched|
end interface cusolverSpXcsrqrAnalysisBatched
! cusolverSpDcsrqrsvBatched
interface cusolverSpDcsrqrsvBatched
 integer(c int) function cusolverSpDcsrqrsvBatched( cusolver Hndl, m, n, nnzA, &
                 descrA, csrValA, csrRowPtrA, csrColIndA, b, x, BatchSize, info, pBuffer ) &
                 bind(C, name="cusolverSpDcsrqrsvBatched")
 use iso c binding
 import cusolverSpHandle, cusparseMatDescr, csrqrInfo
 type(cusolverSpHandle), value :: cusolver_Hndl
 type(cusparseMatDescr), value :: descrA
 type(csrqrInfo), value :: info
 integer(c_int), value :: m, n, nnzA, Batchsize
 real(c_double), device :: csrValA(*)
!! !pgi$ ignore tkr (d) csrRowPtrA, (d) csrColIndA
  integer(c int), device :: csrRowPtrA(*), csrColIndA(*)
  real(c double), device :: b(*), x(*)
!! !pgi$ ignore_tkr pBuffer
 character(c char), device :: pBuffer(*)
 end function cusolverSpDcsrqrsvBatched
end interface cusolverSpDcsrqrsvBatched
```

```
end module cuSOLVER_SP_QR
```

Next, the driver routine (main.cuf) for Batched Sparse QR decomposition is illustrated. The matrix CSR format is input in row-major order.

Batched Sparse QR main program (main.cuf)

```
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! copy of this software and associated documentation files (the "Software"),
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! THE SOFTWARE IS PROVIDED "AS IS", WITHOUT WARRANTY OF ANY KIND, EXPRESS OR
! IMPLIED, INCLUDING BUT NOT LIMITED TO THE WARRANTIES OF MERCHANTABILITY,
! FITNESS FOR A PARTICULAR PURPOSE AND NONINFRINGEMENT. IN NO EVENT SHALL
! THE AUTHORS OR COPYRIGHT HOLDERS BE LIABLE FOR ANY CLAIM, DAMAGES OR OTHER
! LIABILITY, WHETHER IN AN ACTION OF CONTRACT, TORT OR OTHERWISE, ARISING
! FROM, OUT OF OR IN CONNECTION WITH THE SOFTWARE OR THE USE OR OTHER
! DEALINGS IN THE SOFTWARE.
program main
 use cudafor
 use cusparse
 use cusolver SP QR
 implicit none
 integer, parameter :: idbg = 2 ! debug write enable
  integer, parameter :: m = 4, nnzA = 7
  integer, parameter :: batchsize = 4
  integer :: cusolver status
 integer :: status1, status2, status3, status4, status5
  type(cusolverSpHandle) :: cusolver_Hndl
  type(cusparseMatDescr) :: descrA
  type(csrqrInfo) :: info
 integer :: csrRowPtrA(m+1), csrColIndA(nnzA)
 integer, device :: d_csrRowPtrA(m+1), d_csrColIndA(nnzA)
  double precision :: csrValA(nnzA), b(m)
  double precision, device:: d csrValA(nnzA*batchsize), d b(m*batchsize), d x(m*batchsize)
 double precision :: csrValABatch(nnzA*batchsize), bBatch(m*batchsize), xbatch(m*batchsize)
 integer(8) :: size internal, size qr
 character(c char), device, allocatable :: pBuffer(:)
  !locals
 integer :: i, j, colidx, batchId
  integer::ierr code
  double precision :: eps, Areg, breg, xreg
  !Result
 integer :: row, baseA, start, end, col
 double precision :: csrValAj
  double precision :: sup res, r, Ax
```

```
!Random Number
 double precision :: rnd
 ! | 1 |
 ! A = | 2 |
 ! | 0.1 0.1 0.1 4 |
 ! CSR of A is based 1 indexing <==== caution (CUSPARSE INDEX BASE ONE)
 ! b = [1 1 1 1]
! step 1: data setting
   csrRowPtrA(1:m+1) = (/1, 2, 3, 4, 8/)
   csrColIndA(1:nnzA) = (/1, 2, 3, 1, 2, 3, 4/)
   csrValA(1:nnzA) = (/1.0d0, 2.0d0, 3.0d0, 0.1d0, 0.1d0, 0.1d0, 4.0d0/)
   b(1:m) = (/1.0d0, 1.0d0, 1.0d0, 1.0d0/)
   print *, "sizeof(csrRowPtrA, d csrRowPtrA, csrColIndA, d csrColIndA)", &
              sizeof(csrRowPtrA(1)), sizeof(d csrRowPtrA(1)), sizeof(csrColIndA(1)), sizeof(d cs
! prepare Aj and bj on host
  do colidx = 1, nnzA
       Areg = csrValA(colidx)
        do batchId = 1, batchSize
          call random_number(rnd)
          eps = dble(mod(rnd, 100.d0) + 1.0d0) * 1.0D-4
          csrValABatch((batchId-1)*nnzA + colidx) = Areq + eps
        enddo
  enddo
  do j = 1, m
       breq = b(j)
       do batchId = 1, batchSize
          call random number(rnd)
          eps = dble( mod(rnd, 100.d0) + 1.0d0 ) * 1.0D-4
          bBatch((batchId-1)*m + j) = breg + eps;
        enddo
   enddo
   if (idbg == 2) print *,"csrValABatch", csrValABatch
   if (idbg == 2) print *,"bBatch", bBatch
! step 2: create cusolver handle, qr info and matrix descriptor
   status1 = cusolverSpCreate(cusolver_Hndl)
         if (idbg == 1) print *, "status1 = ", status1
   status2 = cusparseCreateMatDescr(descrA)
         if (idbg == 1) print *, "status2 = ", status2
   status3 = cusparseSetMatType(descrA, CUSPARSE MATRIX TYPE GENERAL)
         if (idbg == 1) print *, "status3 = ", status3
   status4 = cusparseSetMatIndexBase(descrA, CUSPARSE_INDEX_BASE_ONE) ! base=1
         if (idbg == 1) print *, "status4 = ", status4
   status5 = cusolverSpCreateCsrqrInfo(info)
         if (idbg == 1) print *, "status5 = ", status5
! step 3: copy Aj and bj to device
   d csrValA = csrValABatch
   d_csrColIndA= csrColIndA
   d csrRowPtrA= csrRowPtrA
   d b = bBatch
! step 4: symbolic analysis
   cusolver status = cusolverSpXcsrqrAnalysisBatched( &
                      cusolver_Hndl, m, m, nnzA, descrA, d_csrRowPtrA, d_csrColIndA, info )
   if (idbq == 1) then
      if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step4 cusolver status = ", cusol
```

```
print *, 'error code = ' ,cusolver status, cudaGetErrorString( cudaGetLastError() )
! step 5: prepare working space
    cusolver status = cusolverSpDcsrqrBufferInfoBatched( &
                      cusolver Hndl, m, m, nnzA, descrA, d csrValA, d csrRowPtrA, d csrColIndA,
                      batchsize, info, size_internal, size_qr)
    if (idbg == 1) then
     if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step5 cusolver status = ", cusol
    end if
   print *, "numerical factorization needs internal data (bytes) =", size internal
    print *, "numerical factorization needs working space (bytes) =", size qr
    allocate(pBuffer(size_qr), stat=ierr_code) ! Bytes
  if (idbg == 1) print *, "step5: alloc ierr_code = ", ierr_code
! step 6: numerical factorization
    cusolver_status = cusolverSpDcsrqrsvBatched( &
                      cusolver Hndl, m, m, nnzA, &
                      descrA, d csrValA, d csrRowPtrA, d csrColIndA, &
                      d b, d x, &
                      batchSize, &
                      info, &
                      pBuffer)
    if (idbg == 1) then
      if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step6 cusolver status = ", cusol
      print *, 'error code = ' ,cusolver status, cudaGetErrorString( cudaGetLastError() )
    end if
! step 7: check residual
!xBatch = [x0, x1, x2, ...]
!copy into CPU mem
   xbatch = d x
    if (idbg == 2) print *, "xbatch=",xbatch
    print *, "****** Fortran Index Base is adjusted : BaseA = 0 ******************************
   baseA = 0
    print *, " ======== Residual CHECK ========="
    do batchId = 1 , batchsize
     ! measure |bj - Aj*Xj|
     sup res = 0.d0
      do row = 1, m
        start = csrRowPtrA(row ) - baseA
        end = csrRowPtrA(row+1) - baseA
        Ax = 0.d0
        do colidx = start, end-1
         col = csrColIndA(colidx) - baseA
         Areg = csrValAbatch((batchId-1)*nnzA + colidx) ! Areg = csrValAj(colidx)
         Xreg = xBatch((batchId-1)*m + col) ! Xreg = xj(col)
         Ax = Ax + Areg * Xreg
        end do
        r = bBatch((batchID-1)*m + row) - Ax ! r = bj(row) - Ax
        ! sup res = (sup_res > fabs(r))? sup_res : fabs(r);
        sup_res = max( abs(r), sup_res )
! if (sup res > abs(r)) then
! sup res = sup res
!else
```

Simply copying and pasting the Makefile below will result in a make execution error. The [tab] delimiter in the makefile description has been converted to a space, so it is necessary to explicitly change the space to a [tab]. (Example below)

```
main : main.f90
  [ tab ] pgf90 main.f90
```

Makefile (compilation method)

```
CC = nvcc
CFLAGS =
FC = pgf90
FFLAGS = -03 -Minfo -Mcuda=cuda8.0,cc35,cc60 -Mcudalib=cusparse
LDFLAGS = -Mcuda=cuda8.0,cc35,cc60
TARGET = SPsolve
INCLUDE =
LIBS = -lcusolver # -lgomp
\# On Ubuntu, the following library path and -lgomp may be required
# NVIDIA cuSOLVER library requires part of gcc's openmp library
#LDIR = -L/usr/lib/gcc/x86 64-linux-gnu/5
modfile = cusolver mod.cuf
SRC1 = main.cuf
# Define extensions to which suffix rules apply
.SUFFIXES: .cuf .cu .o
MODOBJ = $(modfile:.cuf=.o)
OBJ1 = \$(SRC1:.cuf=.o)
MOD1 = cusolver_sp_qr.mod
RUN : $ (TARGET)
                  @echo "===== Program run ====="
                  $ (TARGET)
$(TARGET): $(MODOBJ) $(OBJ1)
                  $(FC) -o $@ $^ $(LDFLAGS) $(LDIR) $(LIBS)
$(MOD1) : $(modfile)
                  $(FC) $(FFLAGS) -c $?
$(OBJ1): $(MOD1) $(SRC1)
.cuf.o:
                  $(FC) -c $(FFLAGS) $<
.CU.O:
                  $(CC) -c $(CFLAGS) $<
```

```
.PHONY: clean
clean:
    @echo 'Cleaning up...'
    rm -f *.o *.mod $(TARGET) *~
```

Compilation & execution results

```
[kato@photon32 QRtest1]$ make
pqf90 -c -O3 -Minfo -Mcuda=cuda8.0,cc35,cc60 -Mcudalib=cusparse cusolver mod.cuf
pgf90 -c -O3 -Minfo -Mcuda=cuda8.0,cc35,cc60 -Mcudalib=cusparse main.cuf
main:
     71, Loop unrolled 5 times (completely unrolled)
     72, Array assignment / Forall at line 73 fused
         Loop unrolled 7 times (completely unrolled)
         Loop not vectorized: loop count too small
     74, Loop unrolled 4 times (completely unrolled)
     82, Loop not vectorized/parallelized: contains call
         FMA (fused multiply-add) instruction(s) generated
     91, Loop not vectorized/parallelized: contains call
         FMA (fused multiply-add) instruction(s) generated
    172, Loop not vectorized/parallelized: contains call
    175, Outer loop unrolled 4 times (completely unrolled)
    180, Unrolled inner loop 4 times
         Generated 2 prefetch instructions for the loop
         Unrolled inner loop 4 times
         Generated 2 prefetch instructions for the loop
         Unrolled inner loop 4 times
         Generated 2 prefetch instructions for the loop
         Unrolled inner loop 4 times
         Generated 2 prefetch instructions for the loop
         FMA (fused multiply-add) instruction(s) generated
    203, Loop not vectorized/parallelized: contains call
pgf90 -o SPsolve cusolver mod.o main.o -Mcuda=cuda8.0,cc35,cc60 -lcusolver
==== Program run =====
SPsolve
sizeof(csrRowPtrA, d_csrRowPtrA, csrColIndA, d_csrColIndA) 4
            4 4 4
 csrValABatch 1.000190792295671 2.000179731460909
    3.000132064769846 0.1001762263696543 0.1001628016430586
   0.1001500500225553 4.000169009995976 1.000119069206783
    2.000163682999292 3.000144817609972 0.1001437479734487
  0.1001670186653253 0.1001425331039673 4.000182114792401
   1.000106716529557 2.000158878275024 3.000165795016470
   0.1001463869055930 0.1001628171802322 0.1001307016646178
    4.000187350713939 1.000180008450829 2.000115906560827
    3.000160754590159 0.1001700415717258 0.1001531034351497
   0.1001216954552562 4.000196496681088
 bBatch 1.000182450045416 1.000166538252814
    1.000186841054682 1.000110375401338 1.000145236365631
    1.000145251688474 1.000116588275369 1.000155851050659
    1.000125862765850 1.000112255030956 1.000187784792441
    1.000198703067770 1.000133737619532 1.000188679946082
   1.000142956695574 1.000175135506380
numerical factorization needs internal data (bytes) = 864
 numerical factorization needs working space (bytes) = 246528
 xbatch= 0.9999916593410789 0.5000383328163729
  0.3333809377259567 0.2041067826368187 1.000026164043516
  0.5000317024998334 0.3333561041470322 0.2041256247608860
    1.000019144193291 0.5000164066433919 0.3333775041545496
   0.2041369446005358 0.9999537374963444 0.5000653595450339
  0.3333631223478223 0.2041274097506157
 ****** Fortran Index Base is adjusted : BaseA = 0 ****************
  ======= Residual CHECK =========
batchId = 1 \sup |bj - Aj*xj| = 8.8817841970012523E-016
 batchId = 2 \sup |bj - Aj*xj| = 6.6613381477509392E-016
 batchId = 3 \sup |bj - Aj*xj| = 1.1102230246251565E-015
```

```
batchId = 4 \sup |bj - Aj*xj| = 4.4408920985006262E-016
======= Result X =========
x(1) = [1] 0.9999916593410789
x(1) = [2] 0.5000383328163729
x(1) = [3] 0.3333809377259567
x(1) = [4] 0.2041067826368187
x(2) = [1] 1.000026164043516
x(2) = [2] 0.5000317024998334
x(2) = [3] 0.3333561041470322
x(2) = [4] 0.2041256247608860
x(3) = [1] 1.000019144193291
x(3) = [2] 0.5000164066433919
x(3) = [3] 0.3333775041545496
x(3) = [4] 0.2041369446005358
x(4) = [1] 0.9999537374963444
x(4) = [2] 0.5000653595450339
x(4) = [3] 0.3333631223478223
x(4) = [4] 0.2041274097506157
```

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Batched Sparse QR example with OpenACC Fortran

For the Fortran Module for the cuSOLVER SP (sparse) library, use <u>the cusolver mod.cuf used above</u> as is, but please change the suffix of the file to cusolver_mod.f90. The driver routine (main.f90) for Batched Sparse QR decomposition using OpenACC is shown below.

One thing to keep in mind with the OpenACC directive is that if the actual argument passed when calling a (library) routine written in CUDA Fortran or CUDA C is a "device pointer", **host_data use_device** is used to <u>inform the compiler of this.</u> () use. If you use this directive correctly, porting an existing program-based program using OpenACC should not be a big burden.

Batched Sparse QR main program (main.f90)

```
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! and/or sell copies of the Software, and to permit persons to whom the
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! all copies or substantial portions of the Software.
! THE SOFTWARE IS PROVIDED "AS IS", WITHOUT WARRANTY OF ANY KIND, EXPRESS OR
! IMPLIED, INCLUDING BUT NOT LIMITED TO THE WARRANTIES OF MERCHANTABILITY,
! FITNESS FOR A PARTICULAR PURPOSE AND NONINFRINGEMENT. IN NO EVENT SHALL
! THE AUTHORS OR COPYRIGHT HOLDERS BE LIABLE FOR ANY CLAIM, DAMAGES OR OTHER
! LIABILITY, WHETHER IN AN ACTION OF CONTRACT, TORT OR OTHERWISE, ARISING
! FROM, OUT OF OR IN CONNECTION WITH THE SOFTWARE OR THE USE OR OTHER
! DEALINGS IN THE SOFTWARE.
program main
 use cusparse
 use cusolver SP QR
  implicit none
```

```
integer, parameter :: idbg = 2 ! debug write enable
 integer, parameter :: m = 4, nnzA = 7
 integer, parameter :: batchsize = 4
 integer :: cusolver_status
 integer :: status1, status2, status3, status4, status5
 type(cusolverSpHandle) :: cusolver_Hndl
 type(cusparseMatDescr) :: descrA
 type(csrqrInfo) :: info
 integer :: csrRowPtrA(m+1), csrColIndA(nnzA)
 double precision :: csrValA(nnzA), b(m)
 double precision :: csrValABatch(nnzA*batchsize), bBatch(m*batchsize), xbatch(m*batchsize)
 integer(8) :: size internal, size qr
 character(c char), allocatable :: pBuffer(:)
 !locals
 integer :: i, j, colidx, batchId
 integer::ierr code
 double precision :: eps, Areg, breg, xreg
 !Result
 integer :: row, baseA, start, end, col
 double precision :: csrValAj
 double precision :: sup res, r, Ax
 !Random Number
 double precision :: rnd
 ! | 1 |
 ! A = | 2 |
 ! | 3 |
 ! | 0.1 0.1 0.1 4 |
 ! CSR of A is based 1 indexing <==== caution (CUSPARSE INDEX BASE ONE)
 ! b = [1 1 1 1]
! step 1: data setting
   csrRowPtrA(1:m+1) = (/1, 2, 3, 4, 8/)
   csrColIndA(1:nnzA) = (/1, 2, 3, 1, 2, 3, 4/)
   csrValA(1:nnzA) = (/1.0d0, 2.0d0, 3.0d0, 0.1d0, 0.1d0, 0.1d0, 4.0d0/)
   b(1:m) = (/1.0d0, 1.0d0, 1.0d0, 1.0d0/)
   print *, "sizeof(csrRowPtrA, csrRowPtrA, csrColIndA, csrColIndA)", &
             sizeof(csrRowPtrA(1)), sizeof(csrRowPtrA(1)), sizeof(csrColIndA(1)), sizeof(csrCol
!!call RANDOM SEED()
! prepare Aj and bj on host
  do colidx = 1, nnzA
       Areg = csrValA(colidx)
        do batchId = 1, batchSize
          call random number(rnd)
          eps = dble(mod(rnd, 100.d0) + 1.0d0) * 1.0D-4
          csrValABatch((batchId-1)*nnzA + colidx) = Areg + eps
        enddo
  enddo
  do j = 1, m
       breg = b(j)
        do batchId = 1, batchSize
          call random number(rnd)
          eps = dble(mod(rnd,100.d0) + 1.0d0) * 1.0D-4
          bBatch((batchId-1)*m + j) = breg + eps;
        enddo
```

```
enddo
   xbatch = 0.d0 ! initilize
    if (idbg == 2) print *,"csrValABatch", csrValABatch
    if (idbg == 2) print *, "bBatch", bBatch
! step 2: create cusolver handle, qr info and matrix descriptor
    status1 = cusolverSpCreate(cusolver Hndl)
          if (idbg == 1) print *, "status1 = ", status1
    status2 = cusparseCreateMatDescr(descrA)
         if (idbg == 1) print *, "status2 = ", status2
    status3 = cusparseSetMatType(descrA, CUSPARSE MATRIX TYPE GENERAL)
          if (idbg == 1) print *, "status3 = ", status3
    status4 = cusparseSetMatIndexBase(descrA, CUSPARSE_INDEX_BASE_ONE) ! base=1
    if (idbg == 1) print *, "status4 = ", status4
    status5 = cusolverSpCreateCsrqrInfo(info)
         if (idbg == 1) print *, "status5 = ", status5
! step 3: copy Aj and bj to device
!d csrValA = csrValABatch
!d csrColIndA csrColIndA
! d csrRowPtrA= csrRowPtrA
!db = bBatch
! step 4: symbolic analysis
!$acc data copyin(csrValABatch, csrColIndA, csrRowPtrA) copyin(bBatch) copyout(xbatch)
!$acc host data use device(csrRowPtrA, csrColIndA)
    cusolver_status = cusolverSpXcsrqrAnalysisBatched( &
                      cusolver Hndl, m, m, nnzA, descrA, csrRowPtrA, csrColIndA, info )
!$acc end host data
    if (idbq == 1) then
      if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step4 cusolver status = ", cusol
! step 5: prepare working space
!$acc host_data use_device(csrValABatch, csrRowPtrA, csrColIndA)
    cusolver status = cusolverSpDcsrqrBufferInfoBatched( &
                      cusolver Hndl, m, m, nnzA, descrA, csrValABatch, csrRowPtrA, csrColIndA, {
                      batchsize, info, size internal, size qr)
!$acc end host_data
   if (idbg == 1) then
      if (cusolver_status /= CUSOLVER_STATUS_SUCCESS) print *, "step5 cusolver_status = ", cusol
    print *, "numerical factorization needs internal data (bytes) =", size internal
    print *, "numerical factorization needs working space (bytes) =", size qr
    allocate(pBuffer(size_qr), stat=ierr_code) ! Bytes
  if (idbg == 1) print *, "step5: alloc ierr_code = ", ierr_code
!$acc enter data copyin(pBuffer)
! step 6: numerical factorization
!$acc host data use device(csrValABatch, csrRowPtrA, csrColIndA, bBatch, xbatch, pBuffer)
    cusolver status = cusolverSpDcsrqrsvBatched( &
                       cusolver_Hndl, m, m, nnzA, &
                       descrA, csrValABatch, csrRowPtrA, csrColIndA, &
                      bBatch, xbatch, &
                      batchSize, &
                      info, &
```

```
pBuffer)
!$acc end host data
!$acc exit data delete(pBuffer)
!$acc end data
   if (idbg == 1) then
     if (cusolver status /= CUSOLVER STATUS SUCCESS) print *, "step6 cusolver status = ", cusol
! step 7: check residual
!xBatch = [x0, x1, x2, ...]
!copy into CPU mem
   if (idbg == 2) print *, "xbatch=",xbatch
   print *, "****** Fortran Index Base is adjusted : BaseA = 0 ********************
   baseA = 0
   print *, " ======== Residual CHECK ========="
   do batchId = 1 , batchsize
    ! measure |bj - Aj*Xj|
     sup res = 0.d0
     do row = 1, m
       start = csrRowPtrA(row ) - baseA
       end = csrRowPtrA(row+1) - baseA
       Ax = 0.d0
       do colidx = start, end-1
         col = csrColIndA(colidx) - baseA
         Areg = csrValAbatch((batchId-1)*nnzA + colidx) ! Areg = csrValAj(colidx)
         Xreq = xBatch((batchId-1)*m + col) ! Xreq = xj(col)
         Ax = Ax + Areg * Xreg
       end do
       r = bBatch((batchID-1)*m + row) - Ax ! r = bj(row) - Ax
       ! sup res = (sup res > fabs(r))? sup res : fabs(r);
       sup res = max(abs(r), sup res)
     print *, "batchId =", batchId," sup|bj - Aj*xj| =", sup_res
   end do
   print *, " ======== Result X ========="
   do batchId = 1 , batchsize
      do row = 1, m
         print *, "x(", batchId, ") = [", row,"]", xBatch((batchId-1)*m + row)
      end do
      print *, ""
   end do
end
```

Simply copying and pasting the Makefile below will result in a make execution error. The [tab] delimiter in the makefile description has been converted to a space, so it is necessary to explicitly change the space to a [tab]. (Here is an example) Be sure to specify the –Mcuda option in the makefile below to instruct the linker to specify the CUDA system library list.

```
main : main.f90
  [ tab ] pgf90 main.f90
```

Makefile (compilation method)

```
CC = nvcc
```

```
CFLAGS =
FC = pgf90
FFLAGS = -02 -Minfo -acc -ta=tesla,cuda8.0,cc35,cc60 -Mcudalib=cusparse -Mcuda
LDFLAGS = -acc -ta=tesla,cuda8.0,cc35,cc60 -Mcuda
TARGET = SPsolve
INCLUDE =
LIBS = -lcusolver # -lgomp
# On Ubuntu, the following library path and -lgomp may be required
#LDIR = -L/usr/lib/gcc/x86 64-linux-gnu/5
modfile = cusolver mod.f90
SRC1 = main.f90
# Define extensions to which suffix rules apply
.SUFFIXES: .f90 .cu .o
MODOBJ = \$ (modfile:.f90=.o)
OBJ1 = \$(SRC1:.f90=.o)
MOD1 = cusolver_sp_qr.mod
RUN : $ (TARGET)
                  @echo "===== Program run ====="
                  $ (TARGET)
$(TARGET): $(MODOBJ) $(OBJ1)
                  $(FC) -o $@ $^ $(LDFLAGS) $(LDIR) $(LIBS)
$(MOD1) : $(modfile)
                  $(FC) $(FFLAGS) -c $?
$(OBJ1): $(MOD1) $(SRC1)
.f90.o:
                  $(FC) -c $(FFLAGS) $<
.cu.o :
                  $(CC) -c $(CFLAGS) $<
.PHONY: clean
clean:
                @echo 'Cleaning up...'
            rm -f *.o *.mod $(TARGET) *~
```

```
[kato@photon32 OpenACC]$ make
pgf90 -c -02 -Minfo -acc -ta=tesla,cuda8.0,cc35,cc60 -Mcudalib=cusparse -Mcuda cusolver_mod. $\frac{1}{2}90$
pgf90 -c -O2 -Minfo -acc -ta=tesla,cuda8.0,cc35,cc60 -Mcudalib=cusparse -Mcuda main.f90
main:
     67, Loop unrolled 5 times (completely unrolled)
     68, Array assignment / Forall at line 69 fused
         Loop unrolled 7 times (completely unrolled)
         Loop not vectorized: loop count too small
     70, Loop unrolled 4 times (completely unrolled)
     79, Loop not vectorized/parallelized: contains call
         FMA (fused multiply-add) instruction(s) generated
     88, Loop not vectorized/parallelized: contains call
         FMA (fused multiply-add) instruction(s) generated
     95, Loop unrolled 16 times (completely unrolled)
    122, Generating copyin(csrrowptra(:),bbatch(:),csrcolinda(:))
         Generating copyout(xbatch(:))
         Generating copyin(csrvalabatch(:))
    150, Generating enter data copyin(pbuffer(:))
    163, Generating exit data delete(pbuffer(:))
    182, Loop not vectorized/parallelized: contains call
    185, Outer loop unrolled 4 times (completely unrolled)
    190, Unrolled inner loop 4 times
```

```
Generated 2 prefetch instructions for the loop
        Unrolled inner loop 4 times
        Generated 2 prefetch instructions for the loop
        Unrolled inner loop 4 times
        Generated 2 prefetch instructions for the loop
        Unrolled inner loop 4 times
        Generated 2 prefetch instructions for the loop
        FMA (fused multiply-add) instruction(s) generated
   208, Loop not vectorized/parallelized: contains call
pgf90 -o SPsolve cusolver_mod.o main.o -acc -ta=tesla,cuda8.0,cc35,cc60 -Mcuda -lcusolver
==== Program run =====
SPsolve
sizeof(csrRowPtrA, csrRowPtrA, csrColIndA, csrColIndA)
4 4 4 4 csrValABatch 1.000190792295671
                                       2.000179731460909
   3.000132064769846 0.1001762263696543 0.1001628016430586
                          4.000169009995976
3.000144817609972
  0.1001500500225553
                                                    1.000119069206783
  2.000163682999292
0.1001670186653253
                                                  0.1001437479734487
                          0.1001425331039673
                                                   4.000182114792401
   1.000106716529557
                           2.000158878275024
                                                    3.000165795016470
                          0.1001628171802322
  0.1001463869055930
                                                  0.1001307016646178
   4.000187350713939
                           1.000180008450829
                                                   2.000115906560827
   3.000160754590159
                          0.1001700415717258
                                                   0.1001531034351497
  0.1001216954552562
                           4.000196496681088
bBatch 1.000182450045416
                                1.000166538252814
                                                   1.000145236365631
   1.000186841054682 1.000110375401338
                                                    1.000155851050659
   1.000145251688474
                           1.000116588275369
   1.000125862765850
                            1.000112255030956
                                                     1.000187784792441
   1.000198703067770
                            1.000133737619532
                                                     1.000188679946082
                           1.000175135506380
   1.000142956695574
                                                                        864
numerical factorization needs internal data (bytes) =
                                                                     246528
numerical factorization needs working space (bytes) =
 xbatch= 0.9999916593410789 0.5000383328163729
  0.3333809377259567 0.2041067826368187
                                                   1.000026164043516
  0.5000317024998334
                          0.3333561041470322
                                                  0.2041256247608860
   1.000019144193291
                          0.5000164066433919
                                                   0.3333775041545496
  0.2041369446005358
0.3333631223478223
                          0.9999537374963444
                                                   0.5000653595450339
                          0.2041274097506157
 ****** Fortran Index Base is adjusted : BaseA = 0 ***************
 ======= Residual CHECK ========
              1 sup|bj - Aj*xj| = 8.8817841970012523E-016
batchId =
                    2 \sup|bj - Aj*xj| = 6.6613381477509392E-016
batchId =
                    3 \sup |bj - Aj*xj| = 1.1102230246251565E-015
batchId =
                   4 \sup |bj - Aj*xj| = 4.4408920985006262E-016
 ======= Result X =========
            1 )= [ 1 ] 0.9999916593410789
                             2 ] 0.5000383328163729
 x(
             1 )= [
                              3 ] 0.3333809377259567
             1 )= [
x(
             1 )= [
                               4 ]
                                    0.2041067826368187
 x (
              2 ) = [
                               1 ]
                                     1.000026164043516
 x (
                                   0.5000317024998334
              2 )= [
 x(
                               2]
             2 )= [
                               3 ]
                                   0.3333561041470322
 x (
             2 ) = [
                              4 ] 0.2041256247608860
 x (
             3 ) = [
                              1 ]
                                    1.000019144193291
x(
             3 ) = [
                              2 ] 0.5000164066433919
 x (
 x (
             3 )= [
                               3 ] 0.3333775041545496
              3 )= [
                               4 ] 0.2041369446005358
x (
             4 ) = [
                               1 ]
                                    0.9999537374963444
 x (
             4) = [
                               2]
                                    0.5000653595450339
 x (
                                   0.3333631223478223
              4 ) = [
                               3 ]
 x(
                               4 ]
              4) = [
                                    0.2041274097506157
 x (
```



11. cuFFT example with OpenACC Fortran

OpenACC による cuFFT ライブラリを使用した 2 次元 FFT のプログラムの例を以下に示す。acc data データ 領域の指定と acc host_data use_device でデバイスポインタを使用する変数を指定するだけで、FFT の処理が可能となる。

cuFFT example (cuFFT.f90)

```
program cufft2dTest
 use cufft
 use openacc
 integer, parameter :: m=768, n=512
 complex, allocatable :: a(:,:), b(:,:), c(:,:)
 real, allocatable :: r(:,:), q(:,:)
 integer :: iplan1, iplan2, iplan3, ierr
 allocate (a(m,n),b(m,n),c(m,n))
 allocate (r(m,n),q(m,n))
 a = 1; r = 1
 xmx = -99.0
 ierr = cufftPlan2D(iplan1,m,n,CUFFT C2C)
!$acc data copyin(a) create(b) copyout(c)
 !$acc host data use device(a,b,c)
 ierr = ierr + cufftExecC2C(iplan1,a,b,CUFFT FORWARD)
 ierr = ierr + cufftExecC2C(iplan1,b,c,CUFFT INVERSE)
 !$acc end host_data
 ! scale c
 !$acc kernels
 c = c / (m*n)
 !$acc end kernels
!$acc end data
 ! Check forward answer
 write(*,*) 'Max error C2C FWD: ', cmplx(maxval(real(b)) - sum(real(b)), &
                                          maxval(imag(b)))
 ! Check inverse answer
 write(*,*) 'Max error C2C INV: ', maxval(abs(a-c))
 ! Real transform
  ierr = ierr + cufftPlan2D(iplan2,m,n,CUFFT R2C)
 ierr = ierr + cufftPlan2D(iplan3,m,n,CUFFT C2R)
!$acc data copyin(r) copyout(q) create(b)
 !$acc host data use device(r,b,q)
 ierr = ierr + cufftExecR2C(iplan2,r,b)
 ierr = ierr + cufftExecC2R(iplan3,b,q)
 !$acc end host data
 !$acc kernels
 xmx = maxval(abs(r-q/(m*n)))
 !$acc end kernels
!$acc end data
 ! Check R2C + C2R answer
 write(*,*) 'Max error R2C/C2R: ', xmx
 ierr = ierr + cufftDestroy(iplan1)
 ierr = ierr + cufftDestroy(iplan2)
 ierr = ierr + cufftDestroy(iplan3)
 if (ierr.eq.0) then
```

```
print *,"test PASSED"
else
  print *,"test FAILED"
endif
end program cufft2dTest
```

コンパイルとリンクオプションには、必ず、-acc-Mcudalib=cufftを指定することが必要である。

コンパイル&実行結果

```
[kato@photon32 Example] $ pqf90 -acc -Minfo=accel -O2 -ta=tesla,cc60,cc35,cuda8.0 -Mcudalib=cufft
cufft2dtest:
     0, Accelerator kernel generated
        Generating Tesla code
     16, Generating copyin(a(:,:))
         Generating create(b(:,:))
         Generating copyout(c(:,:))
     24, Loop is parallelizable
        Accelerator kernel generated
         Generating Tesla code
         24, !$acc loop gang, vector(4) ! blockidx%y threadidx%y
             !$acc loop gang, vector(32) ! blockidx%x threadidx%x
     38, Generating copyin(r(:,:))
         Generating copyout(q(:,:))
         Generating create(b(:,:))
     45, Loop is parallelizable
         Accelerator scalar kernel generated
         Accelerator kernel generated
         Generating Tesla code
         45, !$acc loop gang, vector(4) ! blockidx%y threadidx%y
             !$acc loop gang, vector(32) ! blockidx%x threadidx%x
             Generating implicit reduction(max:r$r)
[kato@photon32 Example]$ a.out
Max error C2C FWD: (0.000000,0.000000)
Max error C2C INV:
                      0.000000
Max error R2C/C2R:
                       0.000000
 test PASSED
```

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12. cuRAND example (乱数発生)

cuRAND example from OpenACC Host Code

OpenACC による cuRAND ライブラリを使用したプログラムの例(XORWOW乱数)を以下に示す。ホストプログラムから CUDA ライブラリを利用するため、デバイス側で使用するデータのみを OpenACC の acc data で指定し、acc host_data use_device でデバイス側で使用する変数を指定するだけで利用可能となる。なお、curand 関数を使用するルーチンでは必ず use curand(インタフェース)を指定することが必要である。

cuRAND test from OpenACC Host Code (cuRand.f90)

```
program testcurand
! compile with the flags -ta=tesla -Mcuda -Mcudalib=curand
call cur1(1000, .true.); call cur1(1000, .false.)
call cur2(1000, .true.); call cur2(1000, .false.)
call cur3(1000, .true.); call cur3(1000, .false.)
```

```
end
!
subroutine curl(n, onhost)
use curand ! 必ず指定すること
integer :: a(n)
                 ! 整数
type(curandGenerator) :: g
integer(8) nbits
logical onhost, passing
a = 0
passing = .true.
                    ! host 側のライブラリも提供している
if (onhost) then
 istat = curandCreateGeneratorHost(g, CURAND RNG PSEUDO XORWOW)
 istat = curandGenerate(g, a, n)
 istat = curandDestroyGenerator(g)
                     ! GPU 側処理
else
 !$acc data copy(a)
 istat = curandCreateGenerator(q,CURAND RNG PSEUDO XORWOW)
  !$acc host data use device(a)
 istat = curandGenerate(g, a, n)
 !$acc end host data
 istat = curandDestroyGenerator(g)
 !$acc end data
endif
nbits = 0
do i = 1, n
 if (i.lt.10) print *,i,a(i)
 nbits = nbits + popcnt(a(i))
end do
print *, "Should be roughly half the bits set"
nbits = nbits / n
if ((nbits .lt. 12) .or. (nbits .gt. 20)) then
 passing = .false.
else
 print *, "nbits is ", nbits, " which passes"
endif
if (passing) then
 print *,"Test PASSED"
else
 print *,"Test FAILED"
endif
end
subroutine cur2(n, onhost)
use curand
real :: a(n)
             ! 単精度
type(curandGenerator) :: g
logical onhost, passing
a = 0.0
passing = .true.
if (onhost) then
 istat = curandCreateGeneratorHost(g,CURAND RNG PSEUDO XORWOW)
  istat = curandGenerate(g, a, n)
 istat = curandDestroyGenerator(g)
else
 !$acc data copy(a)
 istat = curandCreateGenerator(g, CURAND RNG PSEUDO XORWOW)
 !$acc host_data use_device(a)
 istat = curandGenerate(g, a, n)
 !$acc end host_data
 istat = curandDestroyGenerator(g)
  !$acc end data
endif
print *, "Should be uniform around 0.5"
do i = 1, n
 if (i.lt.10) print *,i,a(i)
 if ((a(i).lt.0.0) .or. (a(i).gt.1.0)) passing = .false.
end do
rmean = sum(a)/n
```

```
if ((rmean .lt. 0.4) .or. (rmean .gt. 0.6)) then
 passing = .false.
else
 print *,"Mean is ",rmean," which passes"
endif
if (passing) then
 print *,"Test PASSED"
else
 print *,"Test FAILED"
endif
end
subroutine cur3(n, onhost)
use curand
real(8) :: a(n) ! 倍精度
type(curandGenerator) :: g
logical onhost, passing
a = 0.0d0
passing = .true.
if (onhost) then
 istat = curandCreateGeneratorHost(g, CURAND RNG PSEUDO XORWOW)
 istat = curandGenerate(q, a, n)
 istat = curandDestroyGenerator(g)
else
 !$acc data copy(a)
 istat = curandCreateGenerator(g,CURAND RNG PSEUDO XORWOW)
 !$acc host data use_device(a)
 istat = curandGenerate(q, a, n)
 !$acc end host data
 istat = curandDestroyGenerator(g)
 !$acc end data
endif
do i = 1, n
 if (i.lt.10) print *,i,a(i)
 if ((a(i).lt.0.0d0) .or. (a(i).gt.1.0d0)) passing = .false.
end do
rmean = sum(a)/n
if ((rmean .lt. 0.4d0) .or. (rmean .gt. 0.6d0)) then
 passing = .false.
 print *,"Mean is ",rmean," which passes"
endif
if (passing) then
 print *,"Test PASSED"
 print *,"Test FAILED"
endif
end
```

コンパイルとリンクオプションには、必ず、-acc -Mcudalib=curand を指定することが必要である。また、 システム CUDA ライブラリもリンクする必要があるため、-Mcuda オプションも必須となる。

```
-133303299
           5
              -321518802
              1917059131
              -1428853312
               472148682
           9
               2019573489
Should be roughly half the bits set
nbits is
                               16 which passes
Test PASSED
             -1115749450
           1
              -339329097
           3
               167591721
           4
              -133303299
           5
              -321518802
           6
              1917059131
              -1428853312
               472148682
               2019573489
           9
Should be roughly half the bits set
nbits is
                                16 which passes
Test PASSED
Should be uniform around 0.5
           1
              0.7402194
           2
              0.9209938
              3.9020490E-02
           3
           4
              0.9689629
           5
              0.9251406
               0.4463501
              0.6673192
              0.1099307
              0.4702186
Mean is
           0.5014752
                          which passes
Test PASSED
Should be uniform around 0.5
           1 0.7402194
           2
              0.9209938
           3
              3.9020490E-02
              0.9689629
           4
           5
              0.9251406
              0.4463501
              0.6673192
              0.1099307
              0.4702186
Mean is
           0.5014752
                          which passes
Test PASSED
              0.4384508447184235
           1
              0.4603647022031429
           2
           3
              0.2502147080176417
           4
              0.4947437677616333
               5.3011123716805220E-002
              0.3376992580306317
              0.3967625188337749
              0.8744186605648221
              0.4821668323147305
           0.5150273
Mean is
                         which passes
Test PASSED
           1
              0.4384508447184235
              0.4603647022031429
           2
           3
              0.2502147080176417
              0.4947437677616333
               5.3011123716805220E-002
              0.3376992580306317
              0.3967625188337749
              0.8744186605648221
              0.4821668323147305
Mean is
           0.5150273
                         which passes
Test PASSED
```

cuRAND example from OpenACC device code

OpenACC の計算領域で cuRAND のデバイスルーチン・ライブラリ関数(curand_uniform等)を使用する場合の例である。これは、ホストプログラム上で使用するものではなく、device 側専用のルーチンである。以下のプログラムでは、module mtests の中で、OpenACC によるデバイスコードを定義している。これは、グローバルサブルーチンとして他のルーチンから利用できる。ここでの技術的な留意点は、PGI Fortran 専用のcuRAND OpenACC 専用 MODULE インタフェース(openacc_curand) を use 文で指定する必要があるという点である。PGI は、cuRand 関数に対して openacc routine ディレクティブを指定した Fortran MODULE を提供している。

cuRAND test from OpenACC device Code (cuRand2.f90)

```
module mtests
 integer, parameter :: n = 1000
 contains
   subroutine testrand( a, b )
   use openacc_curand ! OpenACC用のcurand I/F 必ず指定する
   real :: a(n), b(n)
   type(curandStateXORWOW) :: h
   integer(8) :: seed, seq, offset
   !$acc parallel num_gangs(1) vector_length(1) copy(a,b) private(h)
                         ! この時点でデバイスが側に処理が移る。 a, b 配列ともにデバイスヘコピー
   seed = 12345
   seq = 0
   offset = 0
   call curand init(seed, seq, offset, h)
                    ! 以下のループは sequential 実行
   !$acc loop seq
   do i = 1, n
     a(i) = curand uniform(h)
     b(i) = curand normal(h)
   end do
   !$acc end parallel ! この時点で a(n), b(n) の値はホスト側に戻される
   return
   end subroutine
end module mtests
program t
use mtests
real :: a(n), b(n), c(n)
logical passing
a = 1.0
b = 2.0
passing = .true.
                  ! ホスト側から call する。引数a, b はホスト上の配列を渡す
call testrand(a,b)
c = a
print *, "Should be uniform around 0.5"
do i = 1, n
 if (i.lt.10) print *,i,c(i)
 if ((c(i).lt.0.0) .or. (c(i).gt.1.0)) passing = .false.
end do
rmean = sum(c)/n
if ((rmean .lt. 0.4) .or. (rmean .gt. 0.6)) then
 passing = .false.
else
 print *,"Mean is ",rmean," which passes"
print *,"Should be normal around 0.0"
nc1 = 0;
nc2 = 0;
```

```
do i = 1, n
 if (i.lt.10) print *,i,c(i)
  if ((c(i) .gt. -4.0) .and. (c(i) .lt. 0.0)) nc1 = nc1 + 1
 if ((c(i) .gt. 0.0) .and. (c(i) .lt. 4.0)) nc2 = nc2 + 1
end do
print *,"Found on each side of zero ",nc1,nc2
if (abs(nc1-nc2) .gt. (n/10)) npassing = .false.
rmean = sum(c, mask=abs(c).lt.4.0)/n
if ((rmean .lt. -0.1) .or. (rmean .gt. 0.1)) then
 passing = .false.
else
 print *, "Mean is ", rmean, " which passes"
endif
if (passing) then
 print *,"Test PASSED"
 print *,"Test FAILED"
endif
end program
```

コンパイルとリンクオプションには、-acc -Mcudalib=cusparse -Mcuda のオプションの指定が必要である。OpenACC 領域内で cuRAND ライブラリを利用する場合は、PGI Fortran OpenACC 専用の cuRAND のデバイスルーチン・ライブラリをリンクする必要があるため、リンクオプションに注意が必要である。リンク時にNVIDIA LLVM 配下のリンク環境を使うのではなく、従来のリンケージ処理を行うために、-ta=tesla,**nollvm**サブオプションの指定が必要となる。

```
[kato@photon32 cuRAND]$ pgf90 -acc -Minfo=accel -O2 -ta=tesla,cc60,cc35,cuda8.0,nollvm cuRand2.
testrand:
    10, Generating copy(b(:),a(:))
        Accelerator kernel generated
         Generating Tesla code
         16, !$acc loop seq
     10, CUDA shared memory used for h
[kato@photon32 cuRAND]$ a.out
 Should be uniform around 0.5
           1 0.2988985
               0.4019704
            3
               0.7425825
           4
               0.7073491
               0.5512256
               0.4850157
               9.7107515E-02
               0.3596036
               0.5777864
Mean is
           0.4975990
                        which passes
 Should be normal around 0.0
                1.348672
           1
            2 -0.3331721
            3
                1.273486
            4
               -1.008033
              -0.6210795
              -0.5052772
                1.598479
                1.133891
            8
            9
               -1.831225
Found on each side of zero
                                     469
                                                   531
Mean is
           4.2783763E-02 which passes
 Test PASSEDD
```

13. cuSPARSE from OpenACC Host Code

ホスト用プログラムからデバイス側で処理する cuSPARSE ライブラリの利用例を示す。

cuSPARSE ルーチンの処理には直接関係ないが、以下の例では、cusparseSetStream を使って個々の cuSPARSE ライブラリルーチンによって使われる stream をセットしている。これを行うことで、対象となるハンドル h の cuSPARSE 関数は分離された stream で処理され、GPU 上で自動的なオーバラップ処理が可能となる。このアプローチはとりわけ、シングルタスクの実行が相対的に小さな場合で GPU 内の処理容量を満たさないような時に有効である。あるいは、計算とデータ転送が並行に行われるような場面で使用される。

cuSPARSE from OpenACC Host Code (cuSPARSE.f90)

```
program sparseMatVec
   integer n
   n = 25 ! \# rows/cols in dense matrix
   call sparseMatVecSub1(n)
   n = 45 ! \# rows/cols in dense matrix
   call sparseMatVecSub1(n)
end program
subroutine sparseMatVecSub1(n)
 use openacc
 use cusparse
 implicit none
 integer n
 ! dense data
 real(4), allocatable :: Ade(:,:), x(:), y(:)
 ! sparse CSR arrays
 real(4), allocatable :: csrValA(:)
 integer, allocatable :: nnzPerRowA(:), csrRowPtrA(:), csrColIndA(:)
 allocate (Ade (n,n), x(n), y(n))
 allocate(csrValA(n))
 allocate(nnzPerRowA(n), csrRowPtrA(n+1), csrColIndA(n))
 call sparseMatVecSub2(Ade, x, y, csrValA, nnzPerRowA, csrRowPtrA, &
                                                          csrColIndA, n)
 deallocate (Ade)
 deallocate(x)
 deallocate(y)
 deallocate(csrValA)
 deallocate (nnzPerRowA)
 deallocate (csrRowPtrA)
 deallocate(csrColIndA)
end subroutine
subroutine sparseMatVecSub2(Ade, x, y, csrValA, nnzPerRowA, csrRowPtrA, &
                                                              csrColIndA, n)
 use openacc
 use cusparse
 implicit none
 ! dense data
 real(4) :: Ade(n,n), x(n), y(n)
  ! sparse CSR arrays
```

```
real(4) :: csrValA(n)
integer :: nnzPerRowA(n), csrRowPtrA(n+1), csrColIndA(n)
integer :: n, nnz, status, i
type(cusparseHandle) :: h
type(cusparseMatDescr) :: descrA
! parameters
real(4) :: alpha, beta
! result
real(4) :: xerr
! initalize CUSPARSE and matrix descriptor
status = cusparseCreate(h)
if (status /= CUSPARSE STATUS SUCCESS) &
    write(*,*) 'cusparseCreate error: ', status
status = cusparseCreateMatDescr(descrA)
status = cusparseSetMatType(descrA, &
    CUSPARSE MATRIX TYPE GENERAL)
status = cusparseSetMatIndexBase(descrA, &
    CUSPARSE INDEX BASE ONE)
status = cusparseSetStream(h, acc get cuda stream(acc async sync)) ! cusparseが利用する一つのcu
!$acc data create(Ade, x, y, csrValA, nnzPerRowA, csrRowPtrA, csrColIndA)
! Initialize matrix (upper circular shift matrix) ! Circulant matrix
!$acc kernels
Ade = 0.0
do i = 1, n-1
 Ade(i, i+1) = 1.0
end do
Ade(n,1) = 1.0
! Initialize vectors and constants
do i = 1, n
  x(i) = i
enddo
y = 0.0
!$acc end kernels
!$acc update host(x)
write(*,*) 'Original vector:'
write(*,'(5(1x,f7.2))') x
! convert matrix from dense to csr format
!$acc host data use device(Ade, nnzPerRowA, csrValA, csrRowPtrA, csrColIndA)
status = cusparseSnnz_v2(h, CUSPARSE_DIRECTION_ROW, &
    n, n, descrA, Ade, n, nnzPerRowA, nnz)
status = cusparseSdense2csr(h, n, n, descrA, Ade, n, &
    nnzPerRowA, csrValA, csrRowPtrA, csrColIndA)
!$acc end host data
! A is upper circular shift matrix
! y = alpha*A*x + beta*y
alpha = 1.0
beta = 0.0
!$acc host_data use_device(csrValA, csrRowPtrA, csrColIndA, x, y)
status = cusparseScsrmv(h, CUSPARSE_OPERATION_NON_TRANSPOSE, &
     n, n, n, alpha, descrA, csrValA, csrRowPtrA, &
     csrColIndA, x, beta, y)
!$acc end host data
!$acc wait
write(*,*) 'Shifted vector:'
write(*,'(5(1x,f7.2))') y
! shift-down y and add original x
```

```
! A' is lower circular shift matrix
  ! x = alpha*A'*y + beta*x
 beta = -1.0
 !$acc host_data use_device(csrValA, csrRowPtrA, csrColIndA, x, y)
 status = cusparseScsrmv(h, CUSPARSE OPERATION TRANSPOSE, &
       n, n, n, alpha, descrA, csrValA, csrRowPtrA, &
       csrColIndA, y, beta, x)
  !$acc end host_data
 !$acc kernels
 xerr = maxval(abs(x))
  !$acc end kernels
 !$acc end data
 write(*,*) 'Max error = ', xerr
 if (xerr.le.1.e-5) then
   write(*,*) 'Test PASSED'
   write(*,*) 'Test FAILED'
  endif
end subroutine
```

コンパイルとリンクオプションには、-acc -Mcudalib=cusparse -Mcuda が必要となる。

```
[kato@photon32 cuSPARSE]$ pgf90 -Minfo=accel -acc -02 -ta=tesla,cc60,cuda8.0 -Mcudalib=cusparse
sparsematvecsub2:
     0, Accelerator kernel generated
        Generating Tesla code
    74, Generating create(nnzperrowa(:),x(:),y(:),csrrowptra(:),csrvala(:),csrcolinda(:),ade(:,
    78, Loop is parallelizable
        Accelerator kernel generated
        Generating Tesla code
        78, !$acc loop gang, vector(4) ! blockidx%y threadidx%y
            !$acc loop gang, vector(32) ! blockidx%x threadidx%x
    79, Loop is parallelizable
        Accelerator kernel generated
        Generating Tesla code
        79, !$acc loop gang, vector(128) ! blockidx%x threadidx%x
    81, Accelerator scalar kernel generated
    85, Loop is parallelizable
        Accelerator kernel generated
        Generating Tesla code
        85, !$acc loop gang, vector(128) ! blockidx%x threadidx%x
    88, Loop is parallelizable
        Accelerator kernel generated
        Generating Tesla code
        88, !$acc loop gang, vector(128) ! blockidx%x threadidx%x
    91, Generating update self(x(:))
   128, Loop is parallelizable
        Accelerator scalar kernel generated
        Accelerator kernel generated
        Generating Tesla code
       128, !$acc loop gang, vector(128) ! blockidx%x threadidx%x
            Generating implicit reduction(max:x$r)
[kato@photon32 cuSPARSE]$ a.out
Original vector:
                           4.00
   1.00
           2.00
                   3.00
                  8.00
                          9.00
                                 10.00
   6.00
           7.00
                 13.00
                         14.00
  11.00
         12.00
                                  15.00
         17.00
  16.00
                 18.00
                         19.00
                                 20.00
  21.00
         22.00 23.00 24.00
                                 25.00
Shifted vector:
   0.00
           0.00
                   0.00
                         0.00
                                  0.00
```

```
0.00
        0.00
                0.00
                        0.00
                                0.00
  0.00
        0.00
                0.00
                       0.00
                              0.00
                         0.00
  0.00
         0.00
                0.00
                                0.00
         0.00
                 0.00
                         0.00
  0.00
                                0.00
            0.000000
Max error =
Test PASSED
Original vector:
  1.00
         2.00
                 3.00
                         4.00
                                 5.00
         7.00
  6.00
                         9.00
                 8.00
                                10.00
 11.00 12.00
               13.00
                       14.00
                                15.00
 16.00 17.00
               18.00
                       19.00
                                20.00
 21.00
        22.00
               23.00
                        24.00
                               25.00
        27.00
               28.00
                       29.00
 26.00
                               30.00
                       34.00
 31.00
        32.00
               33.00
                               35.00
 36.00
        37.00
               38.00
                       39.00
                               40.00
 41.00 42.00 43.00 44.00 45.00
Shifted vector:
  0.00 0.00 0.00 0.00 0.00
  0.00 0.00 0.00 0.00 0.00
  0.00 0.00 0.00 0.00 0.00
  0.00 0.00 0.00 0.00 0.00
  0.00 0.00 0.00 0.00 0.00
  0.00 0.00 0.00 0.00 0.00
  0.00 0.00 0.00 0.00 0.00
  0.00 0.00 0.00 0.00 0.00
  0.00 0.00 0.00 0.00 0.00
Max error = 0.000000
Test PASSED
```

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