# SCC Reproducibility Challenge: Symmetric Block-Cyclic Distribution: Fewer Communications Leads to Faster Dense Cholesky Factorization

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# Main messages of the paper

## 2DBC is not optimal for symmetric operations

■ Symmetric Block Cyclic distribution induces fewer communications

## Fewer communications results in lower execution time

■ Shown experimentally with Chameleon, on 15 to 36 nodes with 36 cores each

# Instructions of the challenge

## Reproduce the main findings of the paper

- Cholesky factorization with SBC performs fewer communications than 2DBC
- This results in faster execution

Objectives: observe (1), check (2) on your own hardware

# Scalability issue

- Most teams have 3 nodes, whereas SBC starts to show gain for  $P \ge 6$ .
- To observe (1), you may have to set up several MPI processes per node (one per GPU?)
- You should try and report on several configurations (number of MPI processes per node)
- Because of different hardware, block size might need to be tuned differently

## Technical details

## Software environment

- Experiments in the paper use Chameleon, StarPU, OpenMPI, Intel MKL.
- Using another Cholesky implementation is accepted, if it can use an SBC distribution
- Latest Chameleon/StarPU has support for NVIDIA and AMD GPUs
- Development version of Chameleon has support for arbitrary custom data distribution (see https://solverstack.gitlabpages.inria.fr/chameleon/#doc-using-custom-distributions)

## Installing the software

- Git repository: https://gitlab.inria.fr/solverstack/chameleon.git
- Can be compiled with CMake
- Available in Debian, Brew (release) and Guix, Spack (can install the development version)
- Complete documentation at https://solverstack.gitlabpages.inria.fr/chameleon/#doc-install

## What is Chameleon?

## Quick presentation

- Chameleon is a C library which provides routines for high performance linear algebra
- Features:
  - LU, Cholesky, QR and LQ factorizations
  - Real and complex arithmetic in both single and double precision
  - Support for Linux and Mac OS/X (tested on AMD Zen(s), Intel x86-64 and IBM Power)
  - Generic interface with StarPU, PaRSEC, QUARK, OpenMP runtime systems
  - (with StarPU) exploit multiple GPUs through cuBLAS/hipBLAS
  - (with StarPU and MPI) exploit clusters of nodes with distributed memory
- The testing/ directory contains an executable for each operation (see https://solverstack.gitlabpages.inria.fr/chameleon/#doc-using-executables)

```
$ salloc --nodes=5 --time=01:00:00 --constraint p100 --exclusive --ntasks-per-node=2 --threads-per-core=1
$ export STARPU_MPI_STATS=1

$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 -P 5 --nowarmup --mtxfmt=1
[starpu_comm_stats][0] TOTAL: 2000000000.000000 B 19073.486328 MB 458.978424 B/s 0.000372
0;dpotrf;17;0;5;2;1;500;121;100000;100000;1804289383;0.000000e+00;4.253680e+01;7.836470e+03

$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 --custom=sbc.txt --nowarmup --mtxf
[starpu_comm_stats][0] TOTAL: 12060000256.000000 B 11501.312500 MB 283.743073 B/s 0.000230
```

0:dpotrf:17:0:5:1:1:500:121:100000:100000:1804289383:0.000000e+00:4.153677e+01:8.025138e+03

```
Allocate 5 nodes with SLURM
 salloc --nodes=5 --time=01:00:00 --constraint p100 --exclusive --ntasks-per-node=2 --threads-per-core=
 $ export STARPU_MPI_STATS=1
 $ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 -P 5 --nowarmup --mtxfmt=1
  [starpu_comm_stats][0] TOTAL: 2000000000.000000 B 19073.486328 MB
                                                                             458.978424 B/s
                                                                                                0.000372
 0:dpotrf:17:0:5:2:1:500:121:100000:100000:1804289383:0.000000e+00:4.253680e+01:7.836470e+03
 $ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 --custom=sbc.txt --nowarmup --mtx;
  [starpu_comm_stats][0] TOTAL: 12060000256.000000 B 11501.312500 MB
                                                                             283.743073 B/s
                                                                                                0.000230
 0:dpotrf:17:0:5:1:1:500:121:100000:100000:1804289383:0.000000e+00:4.153677e+01:8.025138e+03
```

2 MPI processes per node

#### Print stats about amount of communication

```
$ salloc --nodes=5 --time=01:00:00 --constraint p100 --exclusive --ntasks-per-node=2 --threads-per-core=2 export STARPU_MPI_STATS=1
```

```
$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 -P 5 --nowarmup --mtxfmt=1
[starpu_comm_stats][0] TOTAL: 20000000000.000000 B 19073.486328 MB 458.978424 B/s 0.000372
0;dpotrf;17;0;5;2;1;500;121;100000;100000;1804289383;0.000000e+00;4.253680e+01;7.836470e+03
```

```
$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 --custom=sbc.txt --nowarmup --mtxf
[starpu_comm_stats][0] TOTAL: 12060000256.000000 B 11501.312500 MB 283.743073 B/s 0.000230
0;dpotrf;17;0;5;1;1;500;121;100000;100000;1804289383;0.000000e+00;4.153677e+01;8.025138e+03
```

#### Cholesky with 100k x 100k matrix, block size 500

```
$ salloc --nodes=5 --time=01:00:00 --constraint p100 --exclusive --ntasks-per-node=2 --threads-per-core=:
$ export STARPU_MPI_STATS=1

$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 -P 5 --nowarmup --mtxfmt=1
[starpu_comm_stats][0] TOTAL: 20000000000.000000 B 19073.486328 MB 458.978424 B/s 0.000372
0;dpotrf;17;0;5;2;1;500;121;100000;100000;1804289383;0.0000000e+00;4.253680e+01;7.836470e+03

$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 --custom=sbc.txt --nowarmup --mtxf
```

```
$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 --custom=sbc.txt --nowarmup --mtxf
[starpu_comm_stats][0] TOTAL: 12060000256.000000 B 11501.312500 MB 283.743073 B/s 0.000230
0;dpotrf;17;0;5;1;1;500;121;100000;100000;1804289383;0.000000e+00;4.153677e+01;8.025138e+03
```

```
$ salloc --nodes=5 --time=01:00:00 --constraint p100 --exclusive --ntasks-per-node=2 --threads-per-core=1
$ export STARPU_MPI_STATS=1

$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 -P 5 -nowarmup --mtxfmt=1
[starpu_comm_stats][0] TOTAL: 2000000000.000000 B 19073.486328 MB 458.978424 B/s 0.000372
0;dpotrf;17;0;5;2;1;500;121;100000;100000;1804289383;0.000000e+00;4.253680e+01;7.836470e+03

$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 --custom=sbc.txt --nowarmup --mtxf
[starpu_comm_stats][0] TOTAL: 12060000256.000000 B 11501.312500 MB 283.743073 B/s 0.000230
0;dpotrf;17;0;5;1:1:500;121:100000;100000:1804289383;0.000000e+00:4.153677e+01:8.025138e+03
```

P = 5 for the 2D Block Cyclic distribution (5  $\times$  2)

```
Computation time (s)
                                  Total communication
$ salloc --nodes=5 --time=01:00:00 --constraint p100 --exclusive --ntasks-per-node=2 --threads-per-core=
$ export STARPU_MPI_STATS=1
$ mpiexec --map-by socket chameleon dtesting - potrf -n 100000 -b 500 - 5 --nowarmup --mtxfmt=1
[starpu_comm_stats][0] TOTAL: (2000000000.000000 B)
                                                        19073.486328 MB 458.978424 B/s
                                                                                               0.000372
0:dpotrf:17:0:5:2:1:500:121:100000:100009:180428583:0.000000e+00:4.253680e+01:7.836470e+03
$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 --custom=sbc.txt --nowarmup --mtx;
[starpu_comm_stats][0] TOTAL:
                                12060000256.000000 B
                                                        11501.312500 MB
                                                                            283.743073 B/s
                                                                                               0.000230
0:dpotrf:17:0:5:1:1:500:121:100000:100000:1804289383:0.000000e+00:4.153677e+01:8.025138e+03
```

```
$ salloc --nodes=5 --time=01:00:00 --constraint p100 --exclusive --ntasks-per-node=2 --threads-per-core=
$ export STARPU_MPI_STATS=1
$ mpiexec --map-by socket chameleon_dtesting -o potrf -n 100000 -b 500 -P 5 --nowarmup --mtxfmt=1
[starpu_comm_stats][0] TOTAL:
                                20000000000.000000 B 19073.486328 MB
                                                                            458.978424 B/s
                                                                                                0.000372
0:dpotrf:17:0:5:2:1:500:121:100000:100000:1804289383:0.000000e+00:4.253680e+01:1.836470e+03
$ mpiexec --map-by socket chameleon dtesting o patrf -n 100000 -b 500 (-custom=sbc.txt) --nowarmup --mtx
                                                        11501.312500 MB 283.743073 B/s
[starpu_comm_stats][0] TOTAL:
                               (12060000256.000000 B)
                                                                                               0.000230
0;dpotrf;17;0;5;1;1;500;121;100000;100000,1004259383;0.000000e+00;4.153677e+01;8.025138e+03
                                 Fewer communications
                                                                Slightly lower time
```

Custom SBC distribution

## Rubric

## Baseline expectations

- Install & experiment
- Observe communication reduction
- Observe & quantify the speedup relative to your hardware

## Above & Beyond

- Have fun, be creative, do science!
- Do not attempt to do everything: doing simple and relevant experiments correctly is best

## Report structure (4 to 6 pages)

- Present your architecture
- Describe your experiments (succesful or failed)
- Provide results and interpretations

# Instructions of the challenge – extensions

### Possible extensions

- Analyze the effect of different process placement to fit the SBC distribution
- Measure energy usage to see if fewer communications result in lower energy
- Compare several Cholesky implementations
- Compare measurements of amount of communications versus what the theory predicts (for both 2DBC and SBC)
- Beyond Cholesky factorization: observe (1) and (2) for POSV (factorize+solve) and/or POTRI
- Explore 2.5D algorithms (requires more MPI processes)
- Explore other distributions (https://inria.hal.science/hal-04093162, https://inria.hal.science/hal-04013708)
- Probably many other possibilities, be creative and curious!

# Questions?

## Contact us if you need more information

- Ask questions on the Discourse server https://discourse.studentclustercompetition.us/
- The sooner, the better, we might not be available immediately
- Our timezones: mostly French time (Paris), J. Langou is in Denver