## 1 SUMMARY

Given an $M \times N$ matrix $A$ with $N \ll M$, HSL_MP82 computes its thin QR factorization or economic singular value decomposition (SVD). Such a matrix $A$ with many more rows than columns is termed a tall-skinny matrix. The thin QR factorization of $A$ is given by

$$
A=Q R,
$$

where $Q$ is an $M \times N$ orthonormal matrix and $R$ is an $N \times N$ upper triangular matrix. Three different methods for computing this factorization are offered: CholQR2, shifted-CholQR2 and TSQR. The latter optionally avoids storing $Q$ explicitly. The economic SVD of $A$ is given by

$$
A=U \Sigma V^{T}
$$

where $U$ is an $M \times N$ orthonormal matrix, $V$ is an $N \times N$ orthonormal matrix and $\Sigma$ is a $N \times N$ diagonal matrix with non negative entries. It is computed using the Gram SVD algorithm.

ATTRIBUTES — Version: 1.0.1 (03 May 2023). Interfaces: Fortran. Types: Real (single, double). Original date: November 2021. Uses: BLAS subroutines _gemm, _syrk, _trsm, _trmm, and the LAPACK subroutines _potrf, _syev, _geqrt, _gemqrt, _tpqrt, _tpmqrt, _lacpy. Origin: Hussam Al Daas, Rutherford Appleton Laboratory. Language: Fortran 95. Parallelism: Uses MPI.

## 2 HOW TO USE THE PACKAGE

### 2.1 MPI and data distribution

MPI is used by HSL_MP82 to provide parallelism for distibuted memory environments. Prior to calling any of the package routines, the user must choose the number of processors, $P$, to run on and must initialize MPI by calling MPI_INIT on each processor. The processors must be inside a communicator comm that is passed as an argument to the packages. The ranks of the processors in comm must be $0,1, \ldots, P-1$, and the root processor is the one of rank 0 .

The user is responsible for distributing the matrix $A$ across the $P \geq 1$ processors before calling the package. It must be distributed in a block-row-panel fashion. That is, each processor must own one or more rows of $A$ with no redundancy, i.e., each row of $A$ must be owned by one and only one processor. Let $\Omega_{1}, \ldots, \Omega_{P}$ be a nontrivial disjoint partition of $\{1, \ldots, M\}$ i.e., $\{1, \ldots, M\}=\cup_{i=1}^{P} \Omega_{i}, \Omega_{i} \neq \phi$, and $\Omega_{i} \cap \Omega_{j}=\phi$ for $i \neq j$. $A$ must be distributed such that processor $i$ owns the submatrix $A_{i}=A\left(\Omega_{i}, 1: N\right)$ of size $M_{i} \times N$, where $M_{i}=\left|\Omega_{i}\right|$ (and $M_{i} \geq N$ if TSQR is the chosen method). Thus there exists a permutation matrix $\mathcal{P}$ of size $M \times M$ such that

$$
\mathcal{P} A=\left(\begin{array}{c}
A_{1} \\
\vdots \\
A_{P}
\end{array}\right)
$$

The R factor is stored redundantly on all processors. The computed Q factor has the same distribution pattern as $A$

$$
\mathcal{P} Q=\left(\begin{array}{c}
Q_{1} \\
\vdots \\
Q_{P}
\end{array}\right)
$$

where $Q_{i}=Q\left(\Omega_{i}, 1: N\right)$ is the local matrix owned by processor $i$. If the option not to hold the Q factor explicitly is selected and $Q$ is applied to a $N \times k$ matrix $C$, for $k \leq N$, the resulting matrix $B=Q C$ is also of the form

$$
\mathscr{P} B=\left(\begin{array}{c}
B_{1} \\
\vdots \\
B_{P}
\end{array}\right)
$$

where $B_{i}=B\left(\Omega_{i}, 1: k\right)$ is the local matrix owned by processor $i$.
If an economic SVD is computed, the matrix containing the left singular vectors has the same distribution pattern as $A$

$$
\mathcal{P} U=\left(\begin{array}{c}
U_{1} \\
\vdots \\
U_{P}
\end{array}\right)
$$

where $U_{i}=U\left(\Omega_{i}, 1: N\right)$ is the local matrix owned by processor $i$. The singular values (the diagonal values of $\Sigma$ ) and the right singular vectors $V$ are stored redundantly on all processors.

### 2.2 Notation

In the rest of the document $\mathbf{u}$ stands for the machine precision $\left(\approx 10^{-8}\right.$ for single precision and $\approx 10^{-16}$ for double precision). The 2 -norm condition number of the matrix $A$ is referred to as $\kappa_{2}(A)$; it is equal to the ratio between the largest and smallest singular values of the matrix $A$.

### 2.3 Calling sequences

Access to the package requires a USE statement of the form
Single precision version
USE HSL_MP82_single

## Double precision version

USE HSL_MP82_double
If it is required to use more than one module at the same time, the derived types (Section 2.4) must be renamed in one of the use statements.

The following procedures are available to the user:
(a) MP82_qr computes the thin QR factorization.
(b) MP 82_mqr can only be called if the TSQR method was selected on the call to MP82_qr. In this case, it applies the Q factor to one or more vectors of length $N$.
(a) MP82_svd computes the economic SVD factorization.
(c) MP82_finalise frees memory that has been allocated by the package.

### 2.4 The derived data types

For each problem, the user must employ the derived types defined by the module to declare scalars of the types MP82_keep, MP82_control and MP82_info. The following pseudocode illustrates this.

```
use HSL_MP82_double
type (MP82_keep) :: keep
type (MP82_control) :: control
type (MP82_info) :: info
```

The components of MP82_control and MP82_info are explained in Sections 2.5.7, and 2.5.8. The components of MP 82 _keep are private and must be passed unchanged between calls.

### 2.5 Argument lists and calling sequences

### 2.5.1 Optional arguments

We use square brackets [ ] to indicate OPTIONAL arguments. Since we reserve the right to add additional optional arguments in future releases of the code, we strongly recommend that optional arguments be called by keyword, not by position.

### 2.5.2 Integer, real, and package types

INTEGER denotes default integer. REAL denotes default real if the single precision version is being used and double precision real if the double precision is being used. We use the term package type to mean default real if the single precision version is being used, double precision real for the double precision version.

### 2.5.3 Thin-QR decomposition

Given $A$ as described in Section 2.1, the thin QR decomposition of $A$ can be computed by a call of the form

```
call MP82_qr(comm, job, m, n, a, lda, r, ldr, keep, control, info[, shift])
```

comm is a scalar INTENT (IN) argument of type INTEGER that holds the MPI communicator. It must be initialized prior to the first call to a subroutine in the HSL MP82 package. It defines the set of processors to be used by the HSL_MP82 package. Before each subroutine call, the user must have completed all tasks involving comm (or involving any other communicator that overlaps comm). It must not be altered between calls. Note that the code may be run using a single processor.
job is a scalar INTENT (IN) argument of type INTEGER that specifies the method to be used.

```
job = -1 CholQR2
job = 1 shifted-CholQR2
job = -2 TSQR with implicit representation of the Q factor
job = 2 TSQR with explicit representation of the Q factor
```

m is a scalar INTENT (IN) argument of type INTEGER that holds the number of local rows of $A$ ( $\mathrm{m}=M_{i}$, the size of $\Omega_{i}$, see Section 2.1).

Restriction: $m \geq 1$. If $\mid$ job $\mid=2, m \geq n$.
n is a scalar INTENT (IN) argument of type INTEGER that holds the number $N$ of columns in $A$. It must be the same on all processors.

Restriction: $\mathrm{n} \geq 1$.
a is a rank-2 array INTENT (INOUT) argument of package type with extents at least $m, n$ that on entry holds the local matrix $A\left(\Omega_{i},:\right)$, see Section 2.1. On exit, a holds the following:

## if info\%flag $=0$

if job $\in\{-1,1,2\}$ then a holds the local rows of the Q factor, $Q\left(\Omega_{i},:\right)$.
if job $=-2$ then a holds the Householder vectors of $A\left(\Omega_{i},:\right)$ as part of the implicit representation of the $Q$ factor of $A$.
if info\%flag $<0$ and info\%flag $\neq-21$ then a is unchanged.
if infooflag $=-21$ then a contains the local rows of a matrix $Q, Q\left(\Omega_{i},:\right)$, that may not be orthonormal but satisfy $\|A-Q R\|_{2}=O(\mathbf{u})\|A\|_{2}$, where $R$ is the matrix held in r .
lda is a scalar INTENT (IN) argument of type INTEGER that holds the leading dimension of a.
Restriction: lda $\geq \mathrm{m}$.
$r$ is a rank-2 array INTENT (OUT) argument of package type with extents at least $n, n$. On exit, $r$ holds the following:
if info\%flag $=0$ then $r$ holds the R factor, see Sections 1 and 2.1.
if info $\circ f l a g<0$ and info $\% f l a g \neq-21$ then $r$ was not accessed
if infooflag $=-21$ then $r$ contains an upper triangular matrix $R$ that may not be equal to an R factor of the QR decomposition of $A$ but satisfies $\|A-Q R\|_{2}=O(\mathbf{u})\|A\|_{2}$, where $Q$ is the matrix held in a.
ldr is a scalar INTENT (IN) argument of type INTEGER that holds the leading dimension of $r$.
Restriction: $1 \mathrm{dr} \geq \mathrm{n}$.
keep is a scalar INTENT (INOUT) argument of type MP82_keep. It must be unchanged by the user between calls.
control is a scalar INTENT (IN) argument of type MP82_control. Its components control the execution of the subroutine, as explained in Section 2.5.7.
info is a scalar INTENT (INOUT) argument of type MP 82 _info. Its components provide information about the execution of the subroutine and memory allocation statistics, as explained in Section 2.5.8. To get statistics on memory allocation, info must be unchanged by the user between calls to HSL_MP 82 .
shift is an optional scalar INTENT (IN) argument of package type that holds the shift supplied by the user to be applied in the shifted-CholQR algorithm, see Section 4 for details. If not available or it has a negative value, the algorithm computes an appropriate value to be used.

### 2.5.4 Apply the $Q$ factor from TSQR

After a call to MP82_qr with job $=-2$, a call of the following form computes the product $B=Q C$, where the $N \times k$ matrix $C$ is identical on all processors.

```
call MP82_mqr(comm, m, k, n, a, lda, b, ldb, keep, control, info)
```

comm, m, n, a, lda are INTENT (IN) and must be passed as output from MP82_qr.
k is a scalar INTENT (IN) argument of type INTEGER that specifies the number of columns in $C$. It must be the same on all processors.

Restriction: $1 \leq \mathrm{k} \leq \mathrm{n}$.
$b$ is a rank-2 INTENT (INOUT) argument of package type with extents at least $m, k$. On entry, $b(1: n, 1: k)$ must hold the matrix $C$ and, if control\%annihilate_lower $b=$.false. (the default) then $b(n+1: m, 1: k)$ must be set by the user to 0 . If control \%tsqr_bcast_c=.false. (the default) then $b(1: n, 1: k)$ must be the same on all processors. Otherwise, it must be set by the user on the root processor only. On output, b holds the local rows of the matrix $Q C$. Note that if both control\%annihilate_lower_b and control\%tsqr_bcast_c are set to .false., then $\mathrm{b}(1: m, 1: k)$ must be the same on all processors.

1 db is a scalar INTENT (IN) argument of type INTEGER that holds the leading dimension of b .

## Restriction: $1 \mathrm{db} \geq \mathrm{m}$.

keep, control, info are as in Section 2.5.3.

### 2.5.5 SVD decomposition

Given $A$ as described in Section 2.1, the economic SVD decomposition of $A$ can be computed by a call of the form

```
call MP82_svd(comm, m, n, a, lda, r, ldr, s, keep, control, info)
```

comm, m, n, lda, ldr, keep, control, info are as in Section 2.5.3.
a is a rank-2 array INTENT (INOUT) argument of package type with extents at least $m, n$ that on entry holds the local matrix $A\left(\Omega_{i},:\right)$, see Section 2.1. On exit, a holds the following:
if info\%flag $=0$, then a holds the local rows of the left singular vectors, $U\left(\Omega_{i},:\right)$.
if info\%flag $=1$, then a holds the local rows of a matrix $U$ such that $\left\|A-U \Sigma V^{\top}\right\|_{2}=O\left(\mathbf{u}^{1 / 2}\right)\|A\|_{2}$, where
$V$ is the matrix stored in $r$ and $\Sigma$ is the diagonal matrix stored in s.
otherwise, a is unchanged.
$r$ is a rank-2 array INTENT (OUT) argument of package type with extents at least $n, n$. On exit, $r$ holds the following:
if info\%flag $=0$, then $r$ holds the right singular vectors, see Sections 1 and 2.1).
if info\%flag $=1$, then $r$ holds the matrix $V$ such that $\left\|A-U \Sigma V^{\top}\right\|_{2}=O\left(\mathbf{u}^{1 / 2}\right)\|A\|_{2}$ (see above).
$s$ is an array INTENT (OUT) argument of package type with extent at least $n$ that holds on output the following:
if info\%flag $=0$, then $s$ holds the singular values of $A$, see Sections 1 and 2.1).
if info\%flag $=1$, then $s$ holds the diagonal entries of the matrix $\Sigma$ such that $\left\|A-U \Sigma V^{\top}\right\|_{2}=O\left(u^{1 / 2}\right)\|A\|_{2}$ (see above).

### 2.5.6 Finalization:

After all calls are complete, the user should make a call of the following form to deallocate memory used by the package.
call MP82_finalize(keep, info)
keep is an INTENT (INOUT) scalar of type MP82_keep that must be passed unchanged from the earlier calls. On exit, allocatable components will be deallocated.
info is an INTENT (IN) scalar of type MP82_info. Only the components flag and stat are accessed (see Section 2.5.8).
Note that, given a sequence of matrices $A_{1}, \ldots, A_{f}$ having the same number of rows and columns that are distributed in the same way across the processors, it is not nevessary to call MP82_finalize until after the factorization of the final matrix $A_{f}$. This avoids repeated memory allocations and deallocations and can be useful, for example, within a block Arnoldi iteration.

### 2.5.7 The derived data type for controlling the execution

The derived data type MP82_control is used to control the execution. The components are automatically given default values in the definition of the type.

## Components that control printing

unit_error is a scalar of type INTEGER with default value 6 that is used as the output stream for error messages. If it is negative, these messages will be suppressed.
unit_warning is a scalar of type INTEGER with default value 6 that is used as the output stream for warning messages. If it is negative, these messages will be suppressed.

## Components that control the checking of the input data.

check_input is scalar of type LOGICAL that controls whether the user-supplied data is checked for errors. The default value is .true..
tsqr_bcast_c is a scalar of type LOGICAL that controls whether the leading $n \times k$ matrix stored in $b$ on the root processor is broadcast by the subroutine MP82_mqr. The default value is .false., that is, the user needs to make sure that the leading $\mathrm{n} \times \mathrm{k}$ matrix stored in b is the same on all processors.
annihilate_lower_b is a scalar of type LOGICAL that controls whether the lower $m-n \times k$ matrix stored in $b$ is annihilated by the subroutine MP 82 mqr. The default value is .false., that is, the user needs to make sure that the lower $m-n \times k$ matrix stored in b is 0 on all processors. Note that if both tsqr_bcast_c and annihilate_lower_b are set to .false. then $b(1: m, 1: k)$ must be the same on all processors.

### 2.5.8 The derived data type for holding information

The components of the derived data type MP82_info are used to hold information.
flag is a scalar of type INTEGER that gives the exit status of the algorithm (details in Section 2.6).
stat is a scalar of type INTEGER that, in the event of an allocation error, holds the Fortran stat parameter (and is set to 0 otherwise).
proc is a scalar of type INTEGER that, in the case of an error, holds the rank of one of the processors on which the error occurred.
amem is a scalar of type INTEGER that holds the current amount of memory used by the package.
pmem is a scalar of type INTEGER that holds the maximum amount of memory used by the package.
shift is scalar of package type that holds the shift used in shifted-CholQR.

### 2.6 Warning and error messages

A successful return is indicated by info\%flag having the value zero. A negative value is associated with error as follows:
-1 Error in memory allocation.
-2 Error in the number of columns of the local matrix $A\left(\Omega_{i},:\right), i=$ info\%proc.
-3 Error in the number of rows of the local matrix $A\left(\Omega_{i},:\right), i=$ info\%proc.
-4 Error in the number of rows of the rank-2 array a.
-5 Error in the number of columns of the rank-2 array a.
-6 Error in the leading dimension of the rank-2 array a.
-7 Error in the number of rows of the rank-2 array $r$.
-8 Error in the number of columns of the rank-2 array r.
-9 Error in the leading dimension of the rank-2 array r.

- 10 Unknown value of the parameter job.
-11 job is not the same on all processors.
- 12 The number of columns of the matrix $A$ is not the same on all processors.
-13 Error in the number of rows in the rank-2 array b
-14 Error in the number of columns of the rank-2 array b.
-15 Error in the leading dimension of the rank-2 array b
-16 The number of columns of the matrix $B$ is not the same on all processors.
-17 For $|j \circ b|=2$, the number of local rows in $A\left(\Omega_{i},:\right), i=$ info\%proc, must be larger than the number of columns.
- 18 The size of $s$ must be larger than $n$.
-19 job $=-1$ (CholQR2) failed. The condition number of $A$ is larger than $\mathbf{u}^{-1 / 2}$.
-20 job $=1$ (shifted-CholQR2) failed. The condition number of $A$ is larger than $\mathbf{u}^{-1}$.
-21 LAPACK routine _syev did not converge.
A positive value is associated with a warning as follows:
1 The condition number of $A$ is larger than $\mathbf{u}^{-1 / 2}$. The SVD decomposition obtained is only $\mathbf{u}^{1 / 2}$ accurate.
2 The shift supplied by the user was not used. Instead the method computed an appropriate shift, see info\%shift in section 2.5.8.

3 Shifted CholQR2 was requested as a method job $=1$, however, CholQR2 was sufficient to provide an accurate QR decomposition, thus no shift was employed.

## 3 GENERAL INFORMATION

Other routines called directly: BLAS subroutines _gemm, _syrk, _trsm, _trsm, and the LAPACK subroutines _potrf, _syev, _geqrt, _gemqrt, _tpqrt, _tpmqrt,_lacpy.

Restrictions: $m \geq 1 ; n \geq 1 ; k \geq 1$. If $|j o b|=2, m \geq n$.

## 4 METHOD

When one of the subroutines MP82_qr MP82_mqr MP82_svd is called and the control option control\%check_input is set to .true., the package performs the checks on the user-supplied data. If the check fails, an error is returned by the package in info\%flag. info\%proc holds the rank of one of the processors on which the error occured. If the check passes and memory was not allocated in a previous call to the package, memory is allocated.

### 4.1 QR Algorithms

Algorithm 1 computes the QR factorization of a matrix $A \in \mathbb{R}^{M \times N}$, with $M \geq N$. The QR decomposition of $A$ is $A=Q R$ with $Q \in \mathbb{R}^{M \times N}$ is an orthonormal matrix, i.e., $Q^{\top} Q=I_{N}$, and $R \in \mathbb{R}^{N \times N}$ is an upper triangular matrix. The algorithm is based on the fact that $C=A^{\top} A=R^{\top} R$. If $A$ has full column rank, applying a Cholesky decomposition of $C$ results in computing the R factor. To retrieve the Q factor, backward substitution can be applied. If $\kappa_{2}(A)$, the spectral condition number of $A$, is smaller but close to $\mathbf{u}^{-1 / 2}$, then $C$ can become badly conditioned. Indeed, $\kappa_{2}(C)=\kappa_{2}(A)^{2}$. Hence, repeating the procedure, see Algorithm 1, results in an accurate QR factorization. However, the algorithm will fail if the Cholesky decomposition in the first step fails. This occurs if the condition number of $A$ is of the order of $\mathbf{u}^{-1 / 2}$ or higher.

If $\kappa_{2}(A)$ is of the order of $\mathbf{u}^{-1}$, a preliminary step can be performed to obtain a numerically full rank auxiliary triangular matrix $\widetilde{R}$ such that $A \widetilde{R}^{-1}$ has condition number of the order of $\mathbf{u}^{-1 / 2}$. Then, Algorithm 1 can be applied to compute the QR factorization of $A \widetilde{R}^{-1}$. The QR factorization of $A$ can be obtained easily. This is summarized in Algorithm 2.

The unconditionally stable QR factorization TSQR is based on a sequence of orthogonal transformations. The basic idea of TSQR can be illustrated on the matrix $A$ that has the form

$$
A=\binom{A_{1}}{A_{2}}
$$

By performing a QR decomposition of $A_{1}=Q_{11} R_{11}$ and $A_{2}=Q_{21} R_{21}$, where $Q_{i 1}$ is an orthogonal matrix and $R_{i 1}$ is an upper triangular matrix, we have

$$
\begin{gathered}
A=\binom{Q_{11} R_{11}}{Q_{21} R_{21}} \\
=\left(\begin{array}{cc}
Q_{11} & \\
& Q_{21}
\end{array}\right)\binom{R_{11}}{R_{21}} .
\end{gathered}
$$

Now we compute the QR decomposition of $\binom{R_{11}}{R_{21}}=Q_{12} R_{12}$ and we have

$$
A=\left(\begin{array}{cc}
Q_{11} & \\
& Q_{21}
\end{array}\right) Q_{21} R_{21}
$$

Since $R_{21}$ is upper triangular and $\left(\begin{array}{cc}Q_{11} & \\ & Q_{21}\end{array}\right) Q_{21}$ is an orthogonal matrix - a product of orthogonal matrices - we have the QR decomposition of $A$. Note that the Q factor can be assembled by successively applying the orthogonal matrices to the identity matrix $I_{N}$. Further details are given in [2,3].

### 4.1.1 Which method to use

The accuracy of the thin QR factorization depends on the method and the conditioning of the matrix $A$. The TSQR method is unconditionaly stable (and thus the safest option), shifted-CholQR2 is less stable, and CholQR2 is the least
stable but most efficient approach. If $A$ is known to be only slightly ill-conditioned ( $\kappa_{2}(A)<\mathbf{u}^{-1}$ ), shifted-CholQR2 ( $\mathrm{j} \circ \mathrm{b}=1$ ) is generally a good choice, and if $\kappa_{2}(A)<\mathbf{u}^{-1 / 2}$, CholQR2 ( $\mathrm{job}=-1$ ) is appropriate. If job $=1$ is selected, the package checks whether CholQR2 is sufficient to form an accurate factorization and, if so, proceeds without a shift; a warning flag is set in that case.

```
Algorithm 1 CholQR2
Input: \(M \times N\) matrix \(A\).
Output: \(A=Q R\), where \(Q^{T} Q=I\), and \(R\) is upper triangular.
    \(C=A^{T} A\)
    \(R=\operatorname{chol}(C)\)
    \(Q=A R^{-1}\)
    \(\widetilde{R}=\operatorname{chol}\left(Q^{T} Q\right), Q=Q \widetilde{R}^{-1} ; R=\widetilde{R} R\)
```

```
Algorithm 2 shifted-CholQR2
Input: \(M \times N\) matrix \(A\).
Output: \(A=Q R\), where \(Q^{T} Q=I\), and \(R\) is upper triangular.
    \(C=A^{T} A\)
    \(s=11(M N+N(N+1)) \mathbf{u}\|A\|_{2}^{2}\)
    \(R=\operatorname{chol}(C+s I)\)
    \(Q=A R^{-1}\)
    \(\widetilde{R}=\operatorname{chol}\left(Q^{T} Q\right), Q=Q \widetilde{R}^{-1} ; R=\widetilde{R} R\)
    \(\widetilde{R}=\operatorname{chol}\left(Q^{T} Q\right), Q=\widetilde{Q} \widetilde{R}^{-1} ; R=\widetilde{R} R\)
```


### 4.2 Gram-SVD Algorithm

```
Algorithm 3 Gram-SVD
Input: \(M \times N\) matrix \(A\).
Output: \(A=U \Sigma V^{T}\), where \(U^{T} U=V^{T} V=I\), and \(\Sigma\) is diagonal with non negative entries.
    \(C=A^{T} A\)
    \(C=V^{T} \Sigma^{2} V\)
    \(U=A V \Sigma^{-1}\)
```

The Gram-SVD algorithm is based on the fact that if $A=U \Sigma V^{\top}$, then $C=V \Sigma^{2} V^{\top}$ is an eigen decomposition of $C=A^{\top} A$. Once $V$ and $\Sigma$ are available, we have $U=A V \Sigma^{-1}$. Again, numerical issues would appear with computations based on $C$ if $A$ is not well conditioned. However, failure can only occur if the eigen decomposition does not succeed. As a result, the Gram-SVD algorithm computes an accurate ecnonomic SVD factorization if $\kappa_{2}(A)<\mathbf{u}^{-1 / 2}$. Otherwise, the computed factorization satisfies $\left\|A-U \Sigma V^{\top}\right\|_{2}=O(\mathbf{u})\|A\|_{2}$.

## References:

[1] T. Fukaya, R. Kannan, Y. Nakatsukasa, Y. Yamamoto, and Y. Yanagisawa (2020). Shifted Cholesky QR for Computing the QR Factorization of Ill-Conditioned Matrices. SIAM J. Sci. Comput., 42(1), A477-A503.
[2] J. Demmel, L. Grigori, M. Hoemmen, and J. Langou. Communication-optimal parallel and sequential QR and LU factorizations: theory and practice. arXiv:0806.2159; 2008.
[3] H. Al Daas, G. Ballard, and P. Benner. Parallel Algorithms for Tensor Train Arithmetic. arxiv:2011.06532; 2021.

## All use is subject to licence.

## 5 EXAMPLE OF USE

Suppose we want to compute the thin QR factorization $A=Q R$ using two processors, where

$$
A=\left(\begin{array}{rr}
0.5377 & -0.4336 \\
1.8339 & 0.3426 \\
-2.2588 & 3.5784 \\
1.4090 & 0.4889 \\
1.4172 & 1.0347 \\
0.6715 & 0.7269
\end{array}\right)
$$

the first 3 rows of $A, A(1: 3,:)$, are stored on the processor with rank 0 and the remaining rows, $A(4: 6,:)$, are stored on the processor with rank 1 .
We may use the following code:

```
program MP82_spec_single
    use mpi
    use HSL_MP82_single
    implicit none
    integer, parameter :: wp = kind(0.0)
    type(MP82_control) :: control
    type(MP82_info) :: info
    type(MP82_keep) : : keep
    real(wp), allocatable :: a(:,:) ! local matrix
    real(wp), allocatable :: r(:,:) ! r factor (QR) / V factor (SVD)
    integer :: m, n ! size of local matrix
    integer :: job ! qr method
    integer :: mpiierr ! info variables
    integer :: comm,comm_rank,comm_size ! communicator,rank,and size
    integer :: i,j,k ! indeces
    integer :: stat ! stat for allocation
    call MPI_INIT(mpiierr)
    comm = MPI_COMM_WORLD
    call MPI_COMM_RANK(comm, comm_rank, mpiierr)
    call MPI_COMM_SIZE(comm, comm_size, mpiierr)
    ! local problem size
    m = 3
    n = 2
    ! allocate memory for arrays
    allocate(a(m,n), stat=stat)
    allocate(r(n,n), stat=stat)
    if(comm_rank.eq.0) then
        a(1,1) = 0.5377
        a(2,1) = 1.8339
        a(3,1) = -2.2588
        a(1,2) = -0.4336
        a(2,2)=0.3426
        a(3,2)=3.5784
    else
        a(1,1)=1.4090
```

```
    a(2,1) = 1.4172
    a(3,1) = 0.6715
    a(1,2) = 0.4889
    a(2,2) = 1.0347
    a(3,2) = 0.7269
    end if
    job = -1
    call MP82_QR(comm, job,m,n,a,m,r,n,keep, control,info)
    if(comm_rank.eq.0) then
    write(*,"(a)") "---------------------------
    write(*,"(a)") "The tirangular factor R: "
    write(*,"(a)") "----------------------------
    do j=1,n
            do k=1,n
                write(*,"(es16.5)",advance="no") r(j,k)
            end do
            write(*,"(a)") " "
    end do
    write(*,"(a)") "-----------------------------
    write(*,"(a)") "The orthonormal factor Q:"
    write(*,"(a)") "-----------------------------
    end if
    do i =0,comm_size-1
    if(comm_rank.eq.i) then
            write(*,"(a)") "------------------------------
            write(*,"(a,i1)") "On processor ", i
            write(*,"(a)") "-----------------------------
            do j=1,m
                do k=1,n
                    write(*,"(es16.5)",advance="no") a(j,k)
                    end do
                    write(*,"(a)") " "
            end do
            write(*,"(a)") "----------------------------
    end if
    call mpi_barrier(comm,mpiierr)
    end do
    call MP82_finalise(keep, info)
    deallocate(a,stat=stat)
    deallocate(r,stat=stat)
    call mpi_finalize(mpiierr)
end program MP82_spec_single
```

this produces the output:

The triangular factor R :

```
    3.63306E+00
    -1.38847E+00
    0.00000E+00 3.60839E+00
```

```
The orthonormal factor Q:
```

------------------------------
On processor 0

| $1.48002 \mathrm{E}-01$ | $-6.32149 \mathrm{E}-02$ |
| ---: | ---: |
| $5.04781 \mathrm{E}-01$ | $2.89179 \mathrm{E}-01$ |
| $-6.21735 \mathrm{E}-01$ | $7.52452 \mathrm{E}-01$ |

On processor 1
3.87827E-01 $\quad 2.84721 \mathrm{E}-01$
$3.90084 \mathrm{E}-01 \quad 4.36848 \mathrm{E}-01$
$1.84830 \mathrm{E}-01 \quad 2.72568 \mathrm{E}-01$

