

# Numerical Linear Algebra

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## Object Oriented Representation

- Matrix: uniform type for matrices and vectors.
  - transparency - hidden implementation details
  - encapsulation - linear algebra functions
- View: lightweight “matrix”
- Expression: special type of views, syntactic sugar
- Iterator: efficient element access to contiguous memory

# Matrix, View and Iterator

```
1 Matrix A(5,5);  
  
3 // View: shared pointer to ‘‘physical’’ matrix A,  
4 // but access only to the first row.  
5 Matrix::View A1 = A.row(0);  
  
7 // Matrix expressions: special type of views  
8 // A*B: multiplication expression  
9 // A*B + C: addition expression  
10 Matrix D = A * B + C;  
  
12 // A has contiguous memory and iterator support.  
13 Matrix::iterator_support its = A.it_support();  
  
15 // Iterators have efficient element access.  
16 Matrix::iterator_traits::row_iterator it =  
17     its->row_begin(0);
```

# Permutation

## Row/column Interchanges

Let  $\mathbf{P}$  be a permutation matrix,  $\mathbf{M}$  be a regular matrix.

$\mathbf{P} * \mathbf{M} \rightarrow$  row interchanged view of  $\mathbf{M}$

$\mathbf{M} * \mathbf{P} \rightarrow$  column interchanged view of  $\mathbf{M}$

$\mathbf{P}_n \cdots \mathbf{P}_1 * \mathbf{P}_0 * \mathbf{M} \rightarrow$  a sequence of row permutation on  $\mathbf{M}$

$\mathbf{M} * \mathbf{P}_0 * \mathbf{P}_1 \cdots \mathbf{P}_n \rightarrow$  a sequence of column permutation on  $\mathbf{M}$

## Example

```
1 Matrix M(5,5);
2 // permutation of 2nd and 5th row/column interchange
3 Matrix::Permutation P(5, 1, 4);
4 Matrix::View PM=P * M;// row interchanged view of M
5 Matrix::View MP=M * P;// column interchanged view of M
```

# Rotation

## Givens

Let  $\mathbf{G}$  be a Givens rotation matrix,  $\mathbf{M}$  be a regular matrix.

$\mathbf{G} * \mathbf{M}$  → orthonormal transformation on 2 rows of  $\mathbf{M}$

$\mathbf{M} * \mathbf{G}$  → orthonormal transformation on 2 columns of  $\mathbf{M}$

$\mathbf{G}_n \cdots \mathbf{G}_1 * \mathbf{G}_0 * \mathbf{M}$  → a sequence of transformation on rows of  $\mathbf{M}$

$\mathbf{M} * \mathbf{G}_0 * \mathbf{G}_1 \cdots \mathbf{G}_n$  → a sequence of transformation on columns of  $\mathbf{M}$

## Example

```
1 Matrix M(5,5);
2 // rotation: r = sqrt(0.5^2 + 0.6^2),
3 // c = 0.6 / r, s = -0.6 / r.
4 Matrix::Givens G(1, 2, 0.5, 0.6);
5 G * M; // 2nd and 3rd rows of M are changed
6 M * G; // 2nd and 3rd columns of M are changed
```

# Matrix Arithmetics and Factorization

## Optimized BLAS/LAPACK (3rd party)

Multiplication, inverse, eigen, SVD, LU, QR

## In-house Implementation

Full QR, Cholesky, reduced/modified/parital Cholesky

# Matrix Arithmetics and Factorization

```
1 // LU decomposition of matrix A
2 Matrix L, U;
3 // P records the pivoting
4 Matrix::Permutation P;
5 A.lu(L, U, P);

7 Matrix B = P * L * U;
8 ftl::Assert(A.equals_to(B, 1.e-12));
```

# Linear System

Different solvers based on various matrix forms, i.e. symmetric, positive definite, etc.

## Optimized LAPACK (3rd party)

QR, SVD,  $LDL^T$ , LU, Cholesky

## In-house Implementation

triangular based eliminations, tridiagonal, range space solver, conjugate gradient update, LU update



# Linear System

```
1 // solve  $A x = b$ ,  $A$  is a general matrix.  
2 LinearSystem::solve(A, b, x, Matrix::GENERAL);  
  
4 // solve  $A x = b$ ,  $A$  is possibly a singular matrix.  
5 LinearSystem::solve(A, b, x, Matrix::SINGULAR);  
  
7 // solve  $A x = b$ ,  $A$  is positive definite.  
8 LinearSystem::solve(A, b, x, Matrix::POS_DEFINITE);
```

```
1 // Solve  $A x = b$  in conjugate gradient steps.  
2 Matrix r = -b; // residual  
3 Matrix p = b; // step update  
  
5 LinearSystem::cg_step_update(A, x, p, r);  
6 LinearSystem::cg_step_update(A, x, p, r);
```