**Due:** 09/19

Exercise 1 Consider the matrix

$$A = \begin{bmatrix} 16 & 4 & 4 & -4 \\ 4 & 10 & 4 & 2 \\ 4 & 4 & 6 & -2 \\ -4 & 2 & -2 & 4 \end{bmatrix}$$

Compute its Cholesky decomposition by hand.

**Exercise 2** Let  $x \in \mathbb{K}^m$ . Prove that there exists a Householder transformation P such that

$$Px = \begin{bmatrix} \alpha \\ 0 \\ \vdots \\ 0 \end{bmatrix}$$

where  $\alpha = ||\mathbf{x}||$ .

Exercise 3 Consider the Cauchy/Laplace kernel, i.e.,

$$D_{pq} = \frac{1}{\omega_p + \omega_q}, \qquad \omega_p > 0, \tag{1}$$

Prove that this is symmetric and positive definite.

**HINT**: Use Laplace transform

## Programming Assignment

To receive full credit for the following programming exercises, please ensure that your code correctly handles any relevant input.

Exercise 4 (Pivoted Cholesky Algorithm) Write a function pivoted\_cholesky. Follow the pseudo-code given in class. The function takes A and a tolerance  $\epsilon$  as input and returns L such that  $L^*L = A$ .

Exercise 5 (Matrix-free Pivoted Cholesky) In special cases, we are able to improve on the algorithms by making problem-specific adjustments.

Consider the matrix D in Eq. (1), which is defined via a provided vector  $\omega = [\omega_p]_{p=1}^K$ . We seek to compute a low-rank approximation of D without ever holding D in memory, i.e., "matrix-free"! To that end, write a function  $MFPC(\omega, max\_rank=None, tol=None)$  where  $\omega$  is the input vector defining D,  $max\_rank$  and tol are parameters that can be chosen by the user, terminating the pivoted Cholesky algorithm either after  $max\_rank$  or tol is reached.

**HINT**: Write two helper functions e.g. diag\_fn and col\_fn that return diagonal of the Cauchy kernel, and the k<sup>th</sup> column of the Cauchy kernel, respectively.

**Exercise 6** In the following exercises, you will implement a memory-improved version of Householder QR and use it to solve a linear system Ax = b.

1. Write a function backward\_substitution that takes a matrix U (upper triangular) and a vector b as input that returns the solution obtained via backward substitution.

- 2. Write a function householder\_qr\_opt that is storage improved, i.e., you are supposed to perform all computations in place. You may only define additional variables of the types integer and one additional vector.
- 3. Write a function apply\_Q\_opt that computes

$$y = Q'b$$
,

- provided the output from householder\_qr\_opt. Again, perform all computations in place, no additional variables are to be defined.
- 4. Write a linear solver (named solve\_LS) that only uses the above routines householder\_qr\_opt, apply\_Q\_opt, and backward\_substitution. The function takes a matrix A and vector b as input, and returns the solution to the system Ax = b.