

Ma221 Homework #7, Fall 2024, Due Wednesday, Oct 23, by 11:59pm

In this assignment we will empirically explore part of the design space of randomized low rank factorizations, and compare how well they can approximate the SVD of a matrix.

Using your favorite programming language (Matlab, Python with numpy, etc) you should

1) Implement a routine to produce a $k \times m$ sketching matrix F , with $k < m$, where F is a random orthogonal matrix, **multiplied by $\sqrt{m/k}$** .

2) Implement a routine to generate a random $m \times n$ matrix $A = U \cdot \text{Sigma} \cdot V^T$, with $m \geq n$, and singular values depending on parameters t and r :

U is a random $m \times n$ orthogonal matrix

Sigma is an $n \times n$ diagonal matrix with specified singular values on the diagonal:

There are t singular values equal to r^j , for $j = 0, 1, \dots, \text{ceiling}(n/t)-1$,

for $t=10$ and $r = (1e-10)^{1/(n/10 - 1)}$. This means the largest singular value is 1 and the smallest is $1e-10$. These singular values are called true_sigma_i below.

V is a random $n \times n$ orthogonal matrix

3) Perform the following tests:

For $n = [50, 500]$

For $m = [2, 10] \cdot n$

Generate an $m \times n$ test matrix A as described above, with $t=10$ and $r = (1e-10)^{1/(n/10 - 1)}$. This means the largest singular value is 1 and the smallest is $1e-10$

For $k = [.1, .5] \cdot n$

Repeat 20 times:

Generate a random $k \times m$ F as described above

Compute and save the singular values of $F \cdot A$ (called sketched_sigma_i below)

Make a whisker plot (boxplot in Matlab, or Python matplotlib) of the values of $\text{sketched_sigma}_i / \text{true_sigma}_i$ versus true_sigma_i (with a horizontal log axis). Since each true_sigma_i takes the same value **up to $t=10$ times (one group may be smaller)**, there should be one whisker per distinct value of true_sigma_i

4) Make observations about the data you see, eg how accurately the sketched_sigma_i approximate the true_sigma_i , and how the quality of the approximation depends on n , m and k .

5) Extra credit: Try other singular value distributions, values of m , n and k , and sketching matrices.