

## 18.335 Problem Set 3

Due Friday, 10 October 2008.

### Problem 1: Least-squares

In class, I claimed that the solution(s)  $x$  to the “normal” equations

$$A^*Ax = A^*b$$

minimizes

$$f(x) = \|Ax - b\|_2 = x^*A^*Ax - b^*Ax - x^*A^*b + b^*b$$

over all complex vectors  $x \in \mathbb{C}^n$ .

- (a) Prove that the solution to the normal equations is indeed an extremum of  $f(x)$ , by looking at the partial derivatives of  $f(x)$  with respect to the real and imaginary parts of each component of  $x$ .
- (b) Prove that this solution achieves minimum value of  $f(x)$ .

### Problem 2: SVD and low-rank approximations

- (a) Trefethen, problem 4.5.
- (b) Trefethen, problem 5.2.
- (c) Take any grayscale photograph (either one of your own, or off the web). Scale it down to be no more than  $1500 \times 1500$  (but not necessarily square), and read it into Matlab as a matrix  $A$  with the `imread` command (type “`doc imread`” for instructions).
  - (i) Compute the SVD of  $A$  (Matlab’s `svd` command) and plot the singular values (e.g. as a histogram, possibly on a log scale) to show the distribution.
  - (ii) Compute a lower-rank approximation of  $A$  by taking only the largest  $\nu$  singular values for some  $\nu$  (as in theorem 5.8). You can save this approximation as an image using `imwrite`, or you can plot it directly using the `pcolor` command [`set colormap('gray')` to get a grayscale image]. How big does  $\nu$  have to be to get a reasonably recognizable image?

### Problem 3: QR and orthogonal bases

- (a) Prove that  $A = QR$  and  $B = RQ$  have the same eigenvalues, assuming  $A$  is a square matrix. Construct a random  $10 \times 10$  real-symmetric matrix in Matlab via `X=rand(10,10); A = X' * X`. Use `[Q,R] = qr(A)` to compute the QR factorization of  $A$ , and then compute  $B = RQ$ . Then find the QR factorization  $B = Q'R'$ , and compute  $R'Q'$ ...repeat this process until the matrix converges. From what it converges to, suggest a procedure to compute the eigenvalues and eigenvectors of a matrix (no need to prove that it converges in general).
- (b) Trefethen, problem 7.2.
- (c) Trefethen, problem 10.4.