

## Lab Session 8

MA-423 : Matrix Computations Lab

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1. The roots of a quadratic polynomial  $p(x) := ax^2 + bx + c$  is given by  $(-b \pm \sqrt{b^2 - 4ac})/2a$ . Write a MATLAB function that implements the above formula to compute the roots. Your function will look like this:

```
function [x1, x2] = quadroot1( a, b, c)
d = sqrt( b^2 - 4 * a* c );
x1 = (-b + d) / (2*a);
x2 = (-b - d) / (2*a);
```

The largest (in magnitude) root of  $p$  can be computed as  $x_1 = (-b - \text{sign}(b)\sqrt{b^2 - 4ac})/2a$  and the second root  $x_2$  can be computed from the identity  $x_1x_2 = c/a$ . Write a MATLAB function that implements the modified method to compute the roots. Your function will look like this:

```
function [x1, x2] = quadroot2(a, b, c)
d = sqrt( b^2 - 4 * a* c );
x1 = (-b - sign(b) * d) / (2*a);
x2 = c/( a * x1 );
```

Find the roots of  $x^2 - (10^7 + 10^{-7})x + 1$  using `quadroot1` and `quadroot2`. Do you observe any difference? Which method is better and why?

2. Consider the matrix  $A := \begin{bmatrix} 1 & f \\ f & 1 \end{bmatrix}$ , where  $f = \sqrt{\text{eps}}$  and `eps` is matlab's machine epsilon.

Let  $T$  be the result of 10 basic QR steps (without shift) performed on  $A$ . Determine  $T$ . Now compute eigenvalues of  $A$  using MATLAB command `eig`. Can the diagonals of  $T$  be considered as eigenvalues of  $A$ ? Justify your answer. Now use the functions `quadroot1` and `quadroot2` in Question 1 and compute the eigenvalues of  $A$  from its characteristic polynomial. Which method is better?

3. Consider the matrix given by the MATLAB command `A = gallery(5)`. Compute  $A^5$ . What are the eigenvalues of  $A$ ? Now compute eigenvalues of  $A$  using MATLAB command `eig`. What are the eigenvalues? Now plot the eigenvalues with the following commands:

```
A = gallery(5)
e = eig(A)
plot(real(e), imag(e), 'r*', 0, 0, 'ko')
axis(.1*[-1 1 -1 1])
axis square
```

What do you observe? Next, repeat the experiment with a matrix where each element is perturbed by a single roundoff error. The elements of `gallery(5)` vary over four orders of magnitude, so the correct scaling of the perturbation is obtained with

```
e = eig(A + eps*randn(5,5).*A)
```

Put this statement, along with the plot and axis commands, on a single line and use the up arrow to repeat the computation several times. You will see that the pentagon flips orientation and that its radius varies between 0.03 and 0.07, but that the computed eigenvalues of the perturbed problems behave pretty much like the computed eigenvalues of the original matrix.

This experiment provides evidence for the fact that the computed eigenvalues are the exact eigenvalues of a matrix  $A + E$  where the elements of  $E$  are on the order of roundoff error compared to the elements of  $A$ . This is the best we can expect to achieve with floating-point computation.

4. The matlab command `[V, D] = eig(A)` computes eigenvalues and eigenvectors of  $A$ . Type `help eig` for more information. You can compute condition numbers of the eigenvalues by using the command `[V, D, s] = condeig(A)`. Here  $V$  and  $D$  contain eigenvectors and eigenvalues of  $A$ , respectively, and the vector  $s$  contains the condition numbers of the eigenvalues, that is,  $s(j)$  is the condition number of the eigenvalue  $D(j,j)$ . Type `help condeig` for more information. The condition number of  $\lambda$  is defined by  $\text{cond}(\lambda) := \frac{\|x\| \|y\|}{|y^*x|}$ , where  $Ax = \lambda x$  and  $y^*A = \lambda y^*$ .

(a) Consider the Wilkinson's matrix  $W$ . It is a 20-by-20 matrix whose diagonal entries are  $20, 19, \dots, 1$ , supper diagonal (just above diagonals) entries are 20 (fixed for all) and rest of the entries are zero. This matrix can be generated as follows: `W = zeros(20); W = diag([20:-1:1])+ diag( 20 * ones(1,19), 1)`.

What are the eigenvalues of  $W$ ? Compute condition number of each of the eigenvalues of  $W$ . Now perturb  $W$  slightly as follows. Set  $W1 := W$  and  $W1(20,1) := \epsilon$ . For  $\epsilon := 7.8 \times 10^{-10}, 7.5 \times 10^{-12}, 7.8 \times 10^{-14}$ , compute eigenvalues of  $W1$ . Do these eigenvalues satisfy the perturbation bounds  $|\lambda(W) - \lambda(W1)| \leq \text{cond}(\lambda)\epsilon + \mathcal{O}(\epsilon^2)$ ?

(b) Now compute `[V, D] = eig(W)` and `cond(V)`. Do you observe some sort of relationship between `cond(V)` and the condition numbers of the eigenvalues of  $W$ ? Which eigenvalues are most sensitive to perturbations? (look at the results you have computed above)

(c) Next, for 500 random perturbations  $E_i$  with  $\|E_i\| \leq 10^{-12}$ , plot (real and imaginary parts) of the eigenvalues of  $W + E_i$  and  $W$  (in a single plot). The distribution of eigenvalues illustrate geometrically the sensitivity of the eigenvalues of  $W$ .

(d) The matlab command `jordan(A)`, computes jordan canonical form of a small matrix  $A$  with integers entries. Type `help jordan` for more information. Try to compute jordan canonical forms of  $W$  and  $W1$  considered above. What do you observe?

From all the results above, can you conclude that the distance of  $W$  from the set of defective matrices is  $\mathcal{O}(10^{-14})$ ? [Exact distance is  $6.13 \times 10^{-14}$ .] As an illustration, compute eigenvalues of  $W1$  for  $\epsilon := 10^{-15}$ . Then  $W1$  is away from defective matrices and so  $W$  should have real and simple eigenvalues as  $W$  does. Does your experiment confirm this? Do the eigenvalues of  $W1$  now satisfy the perturbation bounds given above?

\*\*\*\*\*End\*\*\*\*\*