

Matrix Theory
Professor Chandra R. Murthy
Department of Electrical Communication Engineering
Indian Institute of Science, Bangalore
The Characteristic Polynomial

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Ex. $\begin{bmatrix} 4 & -5 \\ 2 & -3 \end{bmatrix} = A$

Characteristic eqn.
Poly. of degree 2

$$\det(A - \lambda I) = \det \begin{bmatrix} 4-\lambda & -5 \\ 2 & -3-\lambda \end{bmatrix} = (4-\lambda)(-3-\lambda) + 10$$

$$\Rightarrow \lambda^2 - \lambda - 2 = 0 \Rightarrow \lambda = -1 \text{ or } +2$$

$(A - \lambda_1 I) \underline{x}_1 = \begin{bmatrix} 5 & -5 \\ 2 & -2 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} = 0 \Rightarrow \underline{x}_1 = \begin{pmatrix} 1 \\ 1 \end{pmatrix}$

$(A - \lambda_2 I) \underline{x}_2 = \begin{bmatrix} 2 & -5 \\ 2 & -5 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} = 0 \Rightarrow \underline{x}_2 = \begin{pmatrix} 1 \\ 2 \end{pmatrix}$

Spectrum $\sigma(A)$ = Set of EVals of A .
Spectral radius $\rho(A) = \max \{ |\lambda| : \lambda \in \sigma(A) \}$

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If $Ax = \lambda x$, $A(cx) = \lambda(cx)$ for any $0 \neq c \in \mathbb{C}$
 \Rightarrow If x is an EVec, so is cx for any $c \neq 0$.

Given any polynomial $p(t) = a_k t^k + a_{k-1} t^{k-1} + \dots + a_0$
and $A \in \mathbb{C}^{n \times n}$, can define $p(A) = a_k A^k + a_{k-1} A^{k-1} + \dots + a_0 I$

Thm. Let $p(\cdot)$ be a poly. If λ is an EVal of $A \in \mathbb{C}^{n \times n}$
and x is a corresp. EVec, then $p(\lambda)$ is an EVal of $p(A)$
and x is an EVec of $p(A)$ assoc. w/ EVal $p(\lambda)$.

So, the spectrum of a matrix sigma of A, here is the set of Eigenvalues of A. And again the spectral radius rho of A is the largest magnitude Eigenvalue, which is equal to max of mod lambda, where lambda belongs to sigma of A. So, this is just writing the spectral radius in terms of sigma of A. Another small point to note is that, if Ax equals lambda x, then A times cx is equal to lambda times cx for any 0 not equal to c belonging to some complex space.

And so, basically if x is an Eigenvector, so is cx for any c not equal to 0. So, now, the other thing is, which will sort of lead us to the characteristic polynomial and studying it and, is that given any polynomial. So, let us say $p(t) = a_k t^k + a_{k-1} t^{k-1} + \dots + a_0$, this is a polynomial in T . And A in C to the n cross n . So, we can define p of A , this is the polynomial evaluated at a matrix valued point A .

So, we will define it as a_k times A power k plus a_{k-1} times A power $k-1$ plus a_0 identity matrix otherwise you cannot add it to these terms. So, this is how we define the polynomial evaluated at a matrix. Now, this p of A it will always have the same Eigenvectors as the matrix A itself.

And the polynomials the Eigenvalues of p of A , p of A is an n cross n matrix. Because this is n cross n , this is n cross n , this is n cross n , when you add up all these terms you will get an n cross n matrix. And its Eigenvalues are closely related to the Eigenvalues of A itself. And so, that is the following theorem.

Student: Sir?

Professor: Yes?

Student: Sir, the screen is not updated sir.

Professor: Can somebody else confirm?

Student: It is getting updated for me sir, (())(04:06).

Professor: So, yeah maybe, if it just wait for a second if it does not update, then just drop off and join again, you should see the new screen, be a polynomial. And if λ is an Eigenvalue A and x is a corresponding Eigenvector, then p of λ is an Eigenvalue of p of A and x is an Eigenvector of p of A associated with the Eigenvalue p of λ . So, how do we show this? This is very simple.

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and x is a corresp. Evec, then $p(A)x = p(\lambda)x$
 and x is an Evec of $p(A)$ assoc. of Eval $p(\lambda)$.

Proof: $p(A)x = a_k A^k x + a_{k-1} A^{k-1} x + \dots + a_0 x$
 $A^j x = A^{j-1} A x = \lambda A^{j-1} x = \dots = \lambda^j x$
 $\Rightarrow p(A)x = a_k \lambda^k x + a_{k-1} \lambda^{k-1} x + \dots + a_0 x$
 $= (a_k \lambda^k + a_{k-1} \lambda^{k-1} + \dots + a_0) x = p(\lambda) x \quad \square$

Ex. $\sigma(A) = \{-1, 2\} \Rightarrow \sigma(A^2) = \{1, 4\}$.

Note: $A \in \mathbb{C}^{n \times n}$ is singular iff $0 \in \sigma(A)$.

So, if I take p of A times x , this is going to be equal to $a_k A^k x$ plus $a_{k-1} A^{k-1} x$ plus etc plus a_0 times the identity times x which is equal to x . Now, of course, $A^j x$ is equal to $A^{j-1} Ax$ which is equal to $\lambda A^{j-1} x$. And so, we can keep going like this, go to $j-2$ and so on. And so, this is going to be equal to $\lambda^j x$.

So, that means that p of A times x is equal to. So, it becomes $\lambda^k x$ here and $\lambda^{k-1} x$ here and so on. So, it becomes $a_k \lambda^k x$ plus $a_{k-1} \lambda^{k-1} x$ plus etc, plus $a_0 x$, and x is multiplying all these terms so, I can pull it out, and write this as $(a_k \lambda^k + a_{k-1} \lambda^{k-1} + \dots + a_0) x$ and this is nothing but p of λ .

This polynomial evaluated at the number λ times x . So, we see that p of A times x equals p of λ times x , this is an $n \times n$ matrix, this times x equals, this is a scalar. So, p of λ times x which means that, p of λ is an Eigenvalue of A and the corresponding Eigenvector is x , p of λ is an Eigenvalue of p of A . And the corresponding Eigenvector is x . So, based on this for example, if $\sigma(A)$ were the two values say -1 and 2 , then what is $\sigma(A^2)$?

A is a two cross two matrix, it has two Eigenvalues, -1 and 2 . So, $\sigma(A^2)$ will be λ^2 and 2^2 , which is equal to 1 and 4 . And as I already mentioned to you earlier, A is singular if and only if 0 is part of $\sigma(A)$. Because if A is

singular if and only if ax equals 0 for some nonzero x , which means, which is true if and only if λ equal to 0 is an Eigenvalue.

Student: Sir?

Professor: yes?

Student: Sir, in the above example, the polynomials bx equals x square, right?

Professor: Correct.

Student: Okay, thank you.

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Note: $A \in \mathbb{C}^{n,n}$ is singular iff $0 \in \sigma(A)$.

The Characteristic Polynomial

$p_A(t) = \det(tI - A)$ degree n ; roots are EVals

$\det \begin{bmatrix} t-a_{11} & -a_{12} \\ -a_{21} & t-a_{22} \end{bmatrix} = (t-a_{11})(t-a_{22}) - a_{21}a_{12}$

Fundamental thm. of algebra: Any poly. of degree n with complex coeff. has exactly n zeros, counting multiplicities

Let $\lambda_1, \dots, \lambda_n$ be the EVals of A , counting multiplicities

Then $p_A(t) = (t-\lambda_1)(t-\lambda_2) \dots (t-\lambda_n)$.

Professor: Okay, so, now let us discuss this characteristic polynomial in some more detail. So, this basically we answer questions about the Eigenvalues of A and for example, how many Eigenvalues does an n cross n matrix have, and when will it have an linearly independent Eigenvectors. So, those are the type of questions we want to answer. So, the characteristic polynomial will define it in a slightly different way from what I said earlier, it is just a change of sign.

We will define it to be p_A of t which is equal to determinant of tI minus A . This is a polynomial of degree n and its roots are the Eigenvectors, are Eigenvalues. So, why is this a polynomial of degree n ? It is, because if I think of it, I mean, I will just write it for the 2 cross 2 case, so, that

you see what happens. This matrix will look like $t - a_{11}$ $t - a_{22}$ $-a_{21}$ $-a_{12}$ and $t - a_{22}$.

And if I take this determinant, it will be equal to $t - a_{11}$, $t - a_{22}$ minus $-a_{21}$ $-a_{12}$. And so, you can see that this is a quadratic polynomial. So, in the n cross n case by similarly, writing it out you will see that it has to be a polynomial of degree n and the coefficient of t is always 1. So, when I take the determinant of this I cannot suddenly get a polynomial whose degree is $n - 1$.

It will always be of degree n . So, there is a, what is known as the fundamental theorem of algebra. We will not prove this here, we will take it on faith, but it says that any polynomial of degree n and complex coefficients, or with complex coefficients has exactly n zeros counting multiplicities.

So, multiplicity just simply means, how many times a particular λ occurs as a 0 of p_A , p_A of λ . So, if you count multiplicities then there are exactly n Eigenvalues. So, for example, the n cross n identity matrix has exactly n Eigenvalues, all are equal to 1. Now, because.

Student: Sir.

Professor: Yes?

Student: Sir complex coefficients means real (())(14:00), no?

Professor: Yes.

Student: Okay.

Professor: Now, suppose we let λ_1 through λ_n be the Eigenvalues of A , where repeated Eigenvalues are okay, they are just counted as λ_1 λ_2 to n . So, so, let λ_1 λ_n be the Eigenvalues of A counting multiplicities, the n Eigenvalues of A counting multiplicities. Then, these are the zeros of the characteristic polynomial, so we can write $p_A(t)$ equals $t - \lambda_1$, $t - \lambda_2$, $t - \lambda_n$.

So, this is a factorized form of the characteristic polynomial, and this polynomial is identical to this determinant of $tI - A$. So, in particular, if I look at the coefficient of t to the $n - 1$ in

this polynomial, that is just the sum of the Eigenvalues. And similarly, if I look at the coefficient of t power 1 here, you can see that it is just going to be t power 1 will be minus a 1×1 minus a 2×2 . And the coefficient of t power n minus 1 here will be minus of λ_1 plus λ_2 plus etc up to λ_n .

So, those two coefficients must match if the polynomials are, if we say two polynomials are equal, it means that the coefficients of t power n , t power n minus 1 all the way down to t power 0 must match, t power n obviously matches because the coefficient of t squared is 1. And here also when I take the coefficient of t squared in the 2×2 case, that will also be equal to 1.

But basically, if I look at what happens to the coefficient of t to the n minus 1 here, it is going to be equal to a 1×1 plus a 2×2 , which is a coefficient, which is equal to, which must equal λ_1 plus λ_2 , which is the coefficient of t to the n minus 1 here. So, basically, we and similarly, if I take the constant term here, that is the product of these Eigenvalues and the constant here, here is going to be, all I have to do is that the constant term will be obtained by setting t equal to 0 in this p_A of t .

And so the constant term is just nothing but the determinant of the matrix A . So, the product of the Eigenvalues equals $(\det A)$. And the sum of the Eigenvalues equals the trace of the matrix.

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Fundamental thm. of algebra: Any poly. of degree n with complex coeffs. has exactly n zeros, counting multiplicities.

Let $\lambda_1, \dots, \lambda_n$ be the EVals of A , counting multiplicities.

Then $p_A(t) = (t - \lambda_1)(t - \lambda_2) \dots (t - \lambda_n)$.

Thm. If $\lambda_1, \dots, \lambda_n$ are the EVals of $A \in \mathbb{C}^{n \times n}$,

$\text{tr}(A) = \sum_{i=1}^n \lambda_i$ and $\det A = \prod_{i=1}^n \lambda_i$

(Coeff. of t^{n-1}) (Coeff. of t^0)
 (Set $t=0$ in $p_A(t)$)

So, that is the following theorem. If λ_1 through λ_n are the Eigenvalues of A . So, the determinant of A is the product of the Eigenvalues, and the trace of A is the sum of the Eigenvalues.

So, just to maybe make it clear, if you look at the if I set t equals 0 here, what I get is λ_1 into λ_2 up to λ_n , which is $\lambda_1 \lambda_2 \dots \lambda_n$ times the product of the Eigenvalues. If I set t equals 0 here, I will get determinant of $-A$, which is again going to be equal to $(-1)^n$ times determinant of A . Those two must be equal, and therefore, $(-1)^n$ cancels with $(-1)^n$.

And what you are left with is determinant of A is the product of the Eigenvalues. And similarly, if I look at the coefficient of t^{n-1} here, it is going to be $-\lambda_1 - \lambda_2 - \dots - \lambda_n$. And here if I look at the coefficient of t^{n-1} , I have $a_{11} + a_{22} + \dots + a_{nn}$, which is nothing but the negative trace of the matrix. So, negative trace of the matrix is the same as the negative sum of the Eigenvalues.

And so, we have this part here. So, for the sake of completeness, I will just say here coefficient of t^{n-1} and this is obtained by looking at the coefficient of t^0 or the constant term, or the other way is set t equal 0 in. So, there couple of others results. Before that, maybe I will just write this one thing out, which is what is the procedure to find Eigenvalues and Eigenvectors?