

Linear Algebra
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Lecture – 55
Results on Eigenvalues and Eigenvectors

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Multiplicity by S.K.S.

Thm: Let A and B be two similar matrices. Then

- (a) $\alpha \in \sigma(A)$ [α is an eigenvalue of A] $\Leftrightarrow \alpha \in \sigma(B)$
- (b) For each $\alpha \in \sigma(A)$, $\text{alg mult}_A(\alpha) = \text{alg mult}_B(\alpha)$
- (c) For each $\alpha \in \sigma(A)$, $\text{geo mult}_A(\alpha) = \text{geo mult}_B(\alpha)$

Pf: A & B similar $\Rightarrow A = S B S^{-1}$ for some $N \times N$ nonsingular S .

For eigenvalue roots of the char. poly. $\det(xI - A) = \det(xI - S B S^{-1}) = \det(x \cdot S \cdot I \cdot S^{-1} - S B S^{-1}) = \det(S \cdot (xI - B) \cdot S^{-1}) = \det(S) \cdot \det(xI - B) \cdot \det(S^{-1}) = \det(xI - B)$

Characteristic polynomial of A and B are same.

alg mult α was the multiplicity of α as a root of the characteristic poly.

So, let me write what I just did. So, let me write it as a theorem, so theorem. Let A and B be two similar matrices, fine. Then α , α belongs to $\sigma(A)$ that α as an eigen value, α is an eigen value of A , if and only if α is an eigen value of B , fine. That is one thing two or b part, for each α belonging to $\sigma(A)$ fine; algebraic multiplicity of α as an eigen value of A is same as algebraic multiplicity of α as an eigen value of B that is also same.

And c, for each α belonging to $\sigma(A)$, geometric multiplicity is also the same; multiplicity of α as an eigen value of A has a same geometric multiplicity as B , is that ok. So, all the three are true. So, whenever I am looking at symmetric transformation, everything is nice fine; because I am multiplying by invertible matrix that is more important. So, multiplication of, multiplication by S and S^{-1} , that is what is, alright. So, once let us again understand it nicely.

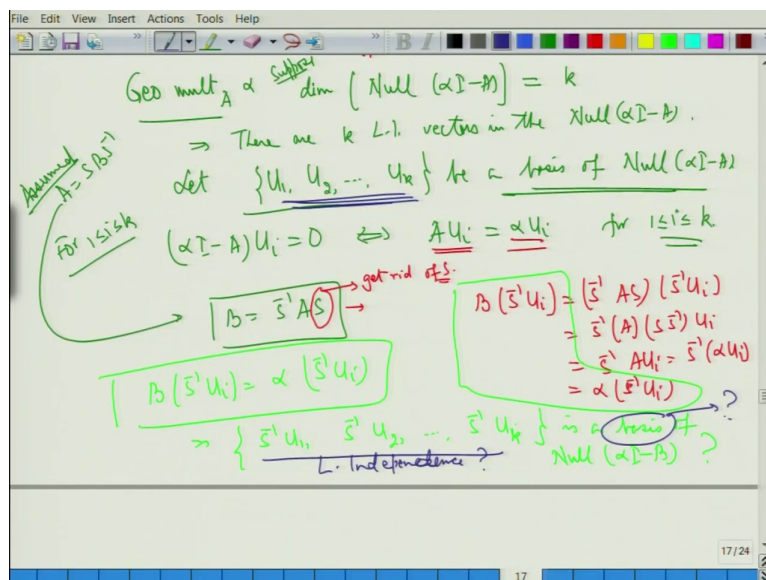
So, proof, what we did was that, we looked at determinant of. So, A and B similar, A and B similar implies, determinant of implies A is equal to $S B S^{-1}$ for some non singular matrix, non singular S or invertible matrix S whatever you want to say. So, for we need to compute, so for eigen value, for eigen value; we need to compute determinant of $X I - A$. So, eigen values, for eigen values roots of the polynomial alright, characteristic polynomial.

So, this which is same as determinant of we had done it, $X I - A$ is nothing, but $S B S^{-1}$ inverse, which is same as determinant of; I can write X as it is, replace I by $S I S^{-1}$ inverse minus $S B S^{-1}$ inverse which is same as determinant of. I can take common here S this side, S^{-1} this side; I get here $X I - B$ here, which is same as determinant of S into determinant of $X I - B$ into determinant of S^{-1} which is same as determinant of $X I - B$.

So, what we are saying here is something more that characteristic, characteristic polynomial of A and B are same. Since, their characteristic polynomial is the same and therefore, we get A as well as B both together at a time because algebraic multiplicity was only related with the characteristic polynomial; the roots of the characteristic polynomial, alright.

So, this gave us algebraic multiplicity of α as an eigen value of A was the multiplicity of α as a root of the characteristic polynomial, alright fine. Now, let us look at the geometric multiplicity; how do I prove the geometric multiplicity?

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So, for geometric multiplicity, geometric multiplicity of alpha as an eigen value of A; we need to look at dimension of null space of alpha I minus A, I need to compute this. So, suppose the dimension is k, suppose dimension of this is k; this implies I can choose a basis. So, this implies there are k linearly independent vectors in the null space of alpha I minus A. So, let u_1, u_2, \dots, u_k this be a basis of null space of alpha I minus A, fine.

So, this is basis means; basis means that alpha I minus A multiplied to u_i is 0, which is same thing as saying that. So, this is for $1 \leq i \leq k$ I get this, which is same thing as saying that A of u_i is equal to; just look at this A of u_i is equal to alpha u_i for $1 \leq i \leq k$, fine.

From here I want to go to B, I want to go to B and we have assumed that, A is equal to this. So, we have assumed; what we have assumed? A is equal to $S B S^{-1}$, alright. So, let us

use this idea; I know about A , I want to go to B now, fine. So, I can rewrite this. So, I can rewrite this as, just have a look at it nicely; I can write B as $S^{-1}AS$, I can write like this, fine.

B is S^{-1} will go on the left and S will come on the right, fine. What I know is, I know about A of u_i ; then how do I multiply by u_i ? If I multiply by u_i , there will be a problem here. So, what I can do is that, I can get rid of this S . So, get rid of S , if I want to get rid of S ; I have to multiply this by S^{-1} , alright. So, let us look at B times S^{-1} of u_i .

So, this will be equal to B is $S^{-1}AS$; you are multiplying by S^{-1} of u_i and therefore, what you get is S^{-1} of, S and S^{-1} cancels out, A here S S^{-1} of u_i which is S^{-1} of Au_i , which is S^{-1} of Au_i is αu_i , which is same as α times S^{-1} of u_i , fine. So, you can see here that, I have got here this that, B times S^{-1} of u_i is equal to α times S^{-1} of u_i , fine.

So, this implies S^{-1} of u_1 , S^{-1} of u_2 , S^{-1} of u_k ; this is a basis of null space of $A - B$ with a question mark. Why a question mark? Because we do not know; till now we have not shown that this is linearly independent, linear independence. So, there is a question of linear independence, alright.

So, recall that, if I have a linearly independence at u_1 and u_2 , u_k ; if I multiply by any invertible matrix, the linear independence is maintained, alright. So, here S is an invertible matrix and I multiplying by S^{-1} which is an invertible matrix to a linearly independent set.

So, again emphasising, if you have a linearly independent set, multiply by an invertible matrix whether on the left or right whatever it is; if you are able to multiply, if your multiplication makes sense, then you again get a linearly independent set, alright. So, therefore, this will be a linearly independent set, I cannot say now. So, I have got that this is linearly independent set; how do I say it is a basis, alright? So, what?

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Our argument $\rightarrow L.S.(\underbrace{\{S^{-1}u_1, \dots, S^{-1}u_k\}}_{L.I.}) \subseteq \text{Null}(\alpha I - A)$

does it span $\text{Null}(\alpha I - A)$?

Given: $\{u_1, u_2, \dots, u_k\}$ was a basis of $\text{Null}(\alpha I - A)$

Ques: Can we have more elements in the basis of $\text{Null}(\alpha I - A)$?

Diagram illustrating the mapping:

- $\text{Null}(\alpha I - A)$ (dimension k) is mapped to $\text{Null}(\alpha I - A)$ (dimension $\geq k$).
- The set $\{u_1, u_2, \dots, u_k\}$ is mapped to $\{v_1, v_2, \dots, v_k\}$.
- The dimension of $\text{Null}(\alpha I - A)$ is shown to be $\geq k$.

So, our argument, our argument implies $S^{-1}u_1$ till $S^{-1}u_k$ is a subset linear L.S. of this is a subset of null space of $\alpha I - B$. Can it have more elements question? So, this; does it span null space, that is the question, alright? So, what we know, we have been given.

So, let me just write it again. So, I started with. So, given what we had given that, this set u_1, u_2, \dots, u_k was a basis of null space of $\alpha I - B$. From there we got that this will imply that, that this is linearly independent; these are linearly independent and the linear span is a subset of this, fine.

Question is, can I have more elements in the basis, fine? So, question, can we have more elements in the basis of null space of $\alpha I - B$, alright? So, what we have done? I wrote it wrongly here, it is A here, $\alpha I - A$ here, fine. So, from null space of $\alpha I - B$

A, I went to null space of $\alpha I - B$, this is what I did. So, from k I got something. So, here what we are saying is that, what we have shown is that, dimension of null space of $\alpha I - B$ is greater than equal to k , fine.

So, from k , I went to say that this is greater than equal to k ; if I start with a t here, the same argument, alright. So, if I start with a basis here say v_1, v_2, \dots, v_l ; if I start with this here fine, I can go here and then look at sv_1, sv_2, \dots, sv_l . I can go to this; again S is invertible.

So, this will be linearly independent set and this will imply that dimension of null space of $\alpha I - A$ will be greater than equal to l , fine. So, from k I have got, this is greater than equal to k from this part, alright. So, this is t I wrote. So, t here, t here, t here, alright fine. So, from one I can go and say that dimension is greater than equal to k ; I can go the other way around to say that its dimension is more.

So, the dimension of the two is the same, alright. So, you have to be careful, you have to understand this; this is very important fine. So, what we have shown is that, if two matrices are similar; then they have the same eigen values, their algebraic multiplicity is the same, their geometric multiplicity is the same, alright fine. What more?

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$\text{Null}(\alpha I - A) \rightarrow \text{Null}(\alpha I - B)$
 $k \rightarrow \dim(\text{Null}(\alpha I - A)) \rightarrow \geq k$
 $\dim(\text{Null}(\alpha I - A)) \geq k$
 $\{s_1, s_2, \dots, s_k\}$
 $\{v_1, v_2, \dots, v_k\}$

Similarity $T(A, B)$
 $A = \begin{bmatrix} 0 & 0 \\ 0 & 0 \end{bmatrix}$ $B = \begin{bmatrix} 0 & 1 \\ 0 & 0 \end{bmatrix}$
 Both of them have 0 as eigenvalues of alg mult 2
 But they have different geo mults
 e_1, e_2 $Ae_1 = 0 \cdot e_1$
 $Ae_2 = 0 \cdot e_2$ $Be_1 = 0 \cdot e_1$
 And we didn't have any other vector X l.i. with e_1 s.t. $BX = 0X$.

So, let us look at example which you have already done; I am just trying to recollect for you. Look at this matrix A which is 0, 0, 0, 0; the matrix B which is 0, 1, 0, 0, both of them have the same eigen values, both of them have 0 as eigen values of algebraic multiplicity 2 fine, both of them 0, 0, 0, 0, fine. But they have different geometric multiplicity, alright.

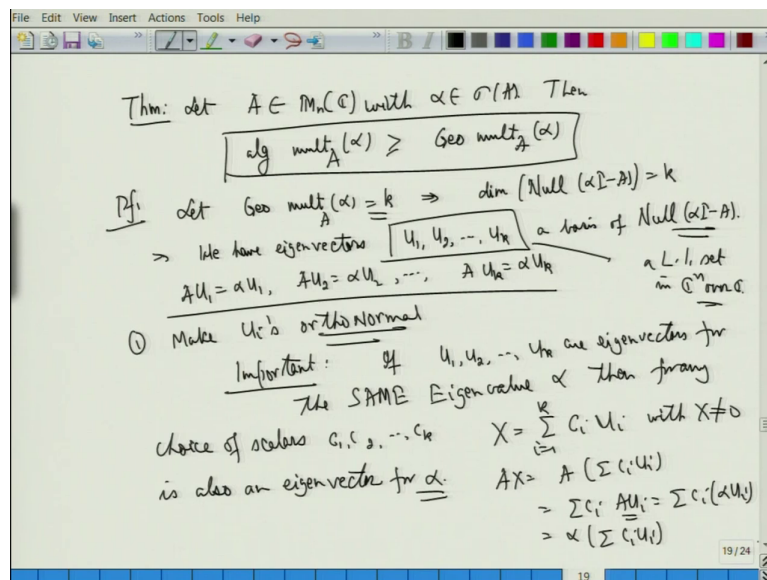
So, recall e_1, e_2 as my eigen vectors; because A of e_1 is 0 times e_1 , A of e_2 is 0 times e_2 . But in this case we will look at B times e_1 was 0 times e_1 and we did not have any other eigen, any other vector X linearly independent with e_1 , such that B X is equal to 0 times x, alright.

So, understand them that, if you have similarity, everything is nice; if there is no similarity, there is a problem. And again recall, I am telling you again and again that, similarity means

changing the basis; this is what we had done at the time of defining itself when we looked at linear transformations.

I think the last slide or last lecture in that part that, whenever we look at matrix of a linear transform from T of A, A to T of B, B alright; then the notion of similarity comes into play. So, we are just changing the basis and trying to get things. So, whenever I change the basis, properties do not change; everything is nice, fine. So, I would like you to keep track of this part, fine. As the last thing in this lecture, I would like you to understand this theorem.

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And I want you to understand the argument here, because a similar argument will be used at different place also, fine. So, let A belong to M n of C and this with alpha belonging to a spectrum of A; then algebraic multiplicity of alpha as an eigen value of A is greater than equal to geometric multiplicity of alpha, is that ok.

Proof, very important idea, it gives you idea of how do we play around with matrices eigen vectors, eigen values, linear independence, dependence and so on; how are we playing things that is very important. So, understand it nicely, alright. So, let geometric multiplicity of α as an eigen value of A be k , suppose it is k .

What does it mean? It means that, dimension of null space of $\alpha I - A$ is k ; implies we have eigen vectors. So, whenever we say eigen vectors, they are linearly independent; eigen vectors u_1 and u_2 to u_k a basis of null space of $\alpha I - A$ fine, is that ok. So, what we have is $A u_1$ is equal to αu_1 , $A u_2$ is equal to αu_2 , so on till $A u_k$ is equal to αu_k , fine. I have this, fine.

Now, u_1 to u_k is a linearly independent set, a linearly independent set in C^n over C , alright. So, we can extend it to form a basis. So, extend it. So, extend it, alright. So, before extending it, let me first make this. So, first thing first, make u_i 's orthonormal; I do not need it alright, I need the other part to be orthonormal or orthogonal at least.

So, make u as orthonormal, important; I did not say it directly, but indirectly I said in the very beginning because of linear independence that important that, if u_1 and u_2 are eigen vectors, then their linear combination is also eigen vector. So, if u_1, u_2, u_k are eigen vectors for the same eigen value α ; then for any choice of scalars c_1, c_2, c_k , this vector X which is summation $c_i u_i$ is equal to 1 to k alright with X not equal to 0 is also an eigen vector for α , is that ok.

That you can check $A X$ is equal to A of $c_i u_i$, which will be equal to $c_i A u_i$, which will be equal to $c_i \alpha u_i$, which is same as α times summation $c_i u_i$, alright. So, I can get I can make u_i 's to be orthonormal alright, that is the first thing source. So, what we have shown is that I can make u_i 's orthonormal.

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We have eigenvectors u_1, u_2, \dots, u_k
 $Au_1 = \alpha u_1, Au_2 = \alpha u_2, \dots, Au_k = \alpha u_k$

a L.I. set in \mathbb{C}^n over \mathbb{C}

① Make u_i 's orthonormal

Without loss of generality let u_i 's be orthonormal

Important: If u_1, u_2, \dots, u_k are eigenvectors for the SAME Eigenvalue α then for any choice of scalars c_1, c_2, \dots, c_k

$X = \sum_{i=1}^k c_i u_i$ with $X \neq 0$

is also an eigenvector for α .

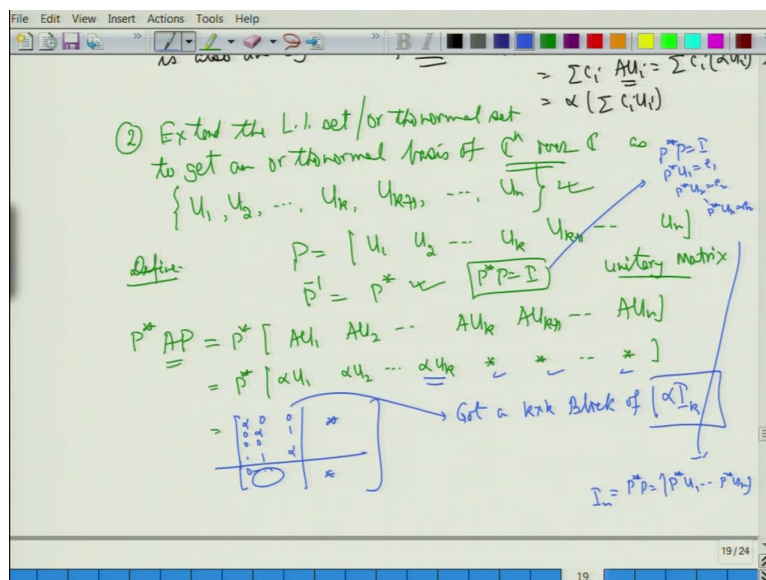
$AX = A(\sum c_i u_i)$
 $= \sum c_i A u_i = \sum c_i (\alpha u_i)$
 $= \alpha (\sum c_i u_i)$

② Extend the L.I. set / orthonormal set to get an orthonormal basis of \mathbb{C}^n over \mathbb{C} as

$\{u_1, u_2, \dots, u_k, u_{k+1}, \dots, u_n\}$

Now 2, so without loss of generality, without loss of generality; let u_i 's be orthonormal, alright. 2, extend the linearly independent set orthonormal set to get an orthonormal basis of \mathbb{C}^n over \mathbb{C} as u_1, u_2, u_k, u_{k+1} till u_n , is that ok? So, I have got this basis now. And now I want to multiply things and see what is happening.

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So, define the matrix P as $u_1, u_2, \dots, u_k, u_{k+1}, \dots, u_n$. Let me write this, now this is an orthonormal basis. So, P^{-1} is same as P^* fine; because I do not know whether the u_i 's are real numbers or complex numbers, I do not have anything, but I know there are over \mathbb{C}^n . So, I can talk of unitary matrix.

So, P is a unitary matrix, because we have taken this as orthonormal, fine. So, let us compute $P^* A P$, fine. So, what is $P^* A P$? P^* is P^{-1} itself. So, let me write P^* here. And what is $A P$? So, $A P$ will be equal to $A u_1, A u_2, A u_k, A u_{k+1}, \dots, A u_n$, fine. So, this is equal to P^* , look at $A u_1$; $A u_1$ is nothing, but αu_1 , $A u_2$ has αu_2 , αu_k , fine.

I do not know what they are these parts; I do not have any handle on those parts, fine. But I knew that u_1, u_2, u_k they were eigen vectors corresponding to α . So, therefore, I will

get alpha here, is that? Now when you multiply P^* with u_1 ; what do I get? P^* if you look at this, we are saying that, since it is a unitary matrix; P^*P is identity fine, it means that u_1 multiplied to P^* is nothing, but $1, 0, 0, 0$, fine.

So, look at the matrix multiplication again here recall. So, P^*P is identity means that, where we multiplied P^* with u_1 will give me e_1 , P^* with u_2 will give me e_2 and so on P^* of u_n will give me e_n alright, that is the way you multiply, fine. Because P^* will go inside; so recall here P^*P will give me P^*u_1 till P^*u_n and this is my identity, alright. So, this is the way it is.

So, therefore, what I will get here is, this will give me $\alpha, 0, 0, 0$; this will give me $0, \alpha, 0$ like this, for α_k again I will get $0, 0, 0$ and α here. So, this part will be $0, \alpha, 0$ fine. I do not know. So, let us look at these parts; I do not know what they are. So, there will be some things here, is that ok? So, at this stage I only know that, I have got a, got a k cross k block of α times identity I_k , is that I have got this, fine.

And therefore, from there I want to make statements about the whole thing. So, what I have seen here is that, P^* and P they are invertible matrix and P^* .

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$P = [u_1 \ u_2 \ \dots \ u_k]$
 $P^*P = I$ (unitary matrix)
 $P^*AP = P^* [AU_1 \ AU_2 \ \dots \ AU_k \ AU_{k+1} \ \dots \ AU_{k+1}]$
 $= P^* [\alpha_1 \ \alpha_2 \ \dots \ \alpha_k \ * \ * \ \dots \ *]$
 Get a $k \times k$ block of $[\alpha_k]$
 $I_k = P^*P = (P^*u_1 \ \dots \ P^*u_k)$

The matrices A and P^*AP are similar
 \Rightarrow Characteristic polynomials are same.
 \Rightarrow Look at the characteristic poly of P^*AP

So, this is same as $P^{-1}AP$, fine. Since they are the same; so I am saying that, the matrix A and this they are similar. So, the matrices A and P^*AP are similar, fine. Since they are similar; it means that, they have the characteristic polynomial; algebraic multiplicity is the same, geometric multiplicity is the same and so on, fine.

So, what we know is that, they are similar. So, this implies algebraic multiplicity; this implies characteristic polynomials are same. So, this will imply that look at it. So, now, look at the characteristic polynomial of P^*AP .

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→ Characteristic polynomials are same.
 → Look at the characteristic poly of P^*AP

$$\det(xI - P^*AP) = \det \left(\begin{array}{c|c} xI_k - P^*AP & \\ \hline & xI_{n-k} - A \end{array} \right)$$

Geo mult $\alpha \geq k$

$$= \det \left(\begin{array}{c|c} (x-\alpha)I_k & \\ \hline & B \end{array} \right)$$

$$= (x-\alpha)^k \det(A)$$

→ alg mult α = alg mult P^*AP $\geq k$

as det B is also a poly in X of deg n-k and may have α as a root.

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So, the characteristic polynomial of P^*AP will be determinant of $X I$ minus P^*AP , which will be equal to determinant of X times 1, 0, 0; 0, 1. So, this is 1 here on the main diagonal minus P^*AP ; P^*AP and αI here, something here 0 here and something here, this is what I had, fine. So, this will give me a determinant of just look at this part also, I can just break up like this.

So, I will get here X minus α times I_k ; I will have something here, 0 here and something here, fine. So, this determinant of this part now, I can look at is as X minus α I_k is there, there is a 0 matrix here. So, determinant of this should be determinant of this part into determinant of this part. So, if I write this as B , then I will get it as X minus α to the power k into determinant of B , is that fine.

So, therefore, from here we see that, this implies algebraic multiplicity of α as A which will be same as algebraic multiplicity of α for $P^* A P$, which is greater than equal to k ; because as determinant of B is also a polynomial in X of degree $n - k$ and may have α as a root, alright.

I am not sure whether what is B ; I do not understand, I cannot understand what the B is, what are the entries of the B . But at least I know that, that since geometric multiplicity. So, since geometric multiplicity of α of A was, this was this number was k ; I could get u_1, u_2, \dots, u_k which were orthonormal, fine.

And then extend it to the get the whole basis, I could do that. And therefore, I could get this matrix. And because of this matrix I could say that, I have $A - \alpha I$ to the power k coming into play and therefore, I could show that algebraic multiplicity is greater than equal to k . But what was k ? k was nothing, but the geometric multiplicity of α this, alright.

So, we have shown that algebraic multiplicity is greater than equal to geometric multiplicity, alright. So, that is all for now.

Thank you.