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18.06 Linear Algebra, Spring 2005  
Transcript – Lecture 23

-- and lift-off on differential equations.

So, this section is about how to solve a system of first order, first derivative, constant coefficient linear equations. And if we do it right, it turns directly into linear algebra. The key idea is the solutions to constant coefficient linear equations are exponentials. So if you look for an exponential, then all you have to find is what's up there in the exponent and what multiplies the exponential and that's the linear algebra. So -- and the result -- one thing we will find -- it's completely parallel to powers of a matrix. So the last lecture was about how would you compute  $A$  to the  $K$  or  $A$  to the 100? How do you compute high powers of a matrix? Now it's not powers anymore, but it's exponentials.

That's the natural thing for differential equation.

Okay. But can I begin with an example? And I'll just go through the mechanics. How would I solve the differential -- two differential equations? So I'm going to make it -- I'll have a two by two matrix and the coefficients are minus one two, one minus two and I'd better give you some initial condition. So suppose it starts  $u$  at times zero -- this is  $u_1, u_2$  -- let it -- let it -- suppose everything is in  $u_1$  at times zero.

So -- at -- at the start, it's all in  $u_1$ .

But what happens as time goes on,  $du_2/dt$  will -- will be positive, because of that  $u_1$  term, so flow will move into the  $u_2$  component and it will go out of the  $u_1$  component. So we'll just follow that movement as time goes forward by looking at the eigenvalues and eigenvectors of that matrix. That's a first job. Before you do anything else, find the -- find the matrix and its eigenvalues and eigenvectors.

So let me do that. Okay.

So here's our matrix. Maybe you can tell me right away what -- what are the eigenvalues and -- eigenvalues anyway. And then we can check.

But can you spot any of the eigenvalues of that matrix? We're looking for two eigenvalues.

Do you see -- I mean, if I just wrote that matrix down, what -- what do you notice about it? It's singular, right.

That -- that's a singular matrix.

That tells me right away that one of the eigenvalues is  $\lambda$  equals zero. I can -- that's a singular matrix, the second column is minus two times the first column, the determinant is zero, it's -- it's singular, so zero is an eigenvalue and the other

eigenvalue will be -- from the trace. I look at the trace, the sum down the diagonal is minus three.

That has to agree with the sum of the eigenvalue, so that second eigenvalue better be minus three. I could, of course -- I could compute -- why don't I over here -- compute the determinant of  $A - \lambda I$ , the determinant of this minus one minus lambda two one minus two minus lambda matrix. But we know what's coming.

When I do that multiplication, I get a lambda squared.

I get a two lambda and a one lambda, that's a three lambda. And then -- now I'm going to get the determinant, which is two minus two which is zero. So there's my characteristic polynomial, this determinant. And of course I factor that into lambda times lambda plus three and I get the two eigenvalues that we saw coming.

What else do I need? The eigenvectors.

So before I even think about the differential equation or what -- how to solve it, let me find the eigenvectors for this matrix. Okay.

So take lambda equals zero -- so that -- that's the first eigenvalue. Lambda one equals zero and the second eigenvalue will be lambda two equals minus three.

By the way, I -- I already know something important about this.

The eigenvalues are telling me something. You'll see how it comes out, but let me point to -- these numbers are -- this eigenvalue, a negative eigenvalue, is going to disappear. There's going to be an  $e^{-3t}$  in the answer. That  $e^{-3t}$  as time goes on is going to be very, very small.

The other part of the answer will involve an  $e^{0t}$ . But  $e^{0t}$  is one and that's a constant. So I'm expecting that this solution'll have two parts, an  $e^{0t}$  part and an  $e^{-3t}$  part, and that -- and as time goes on, the second part'll disappear and the first part will be a steady state.

It won't move. It will be -- at the end of -- as  $t$  approaches infinity, this part disappears and this is the -- the  $e^{0t}$  part is what I get.

And I'm very interested in these steady states, so that's -- I get a steady state when I have a zero eigenvalue. Okay.

What about those eigenvectors? So what's the eigenvector that goes with eigenvalue zero? Okay. The matrix is singular as it is, the eigenvector is -- is the guy in the null space, so what vector is in the null space of that matrix? Let's see. I guess I probably give the free variable the value one and I realize that if I want to get zero I need a two up here. Okay? So  $Ax = 0$ .  $x_1 = 0$ .

Fine. Okay.

What about the other eigenvalue? Lambda two is minus three. Okay.

How do I get the other eigenvalue, then? For the moment -- can I mentally do it? I subtract minus three along the diagonal, which means I add three -- can I -- I'll just

do it with an erase -- erase for the moment. So I'm going to add three to the diagonal. So this minus one will become a two and -- I'll make it in big loopy letters - - and when I add three to this guy, the minus two becomes -- well, I can't make one very loopy, but how's that? Okay. Now that's A minus three I -- A plus three I, sorry.

That's A plus three I. It's supposed to be singular, right? I-- if things -- if I did it right, this matrix should be singular and the  $x_2$ , the eigenvector should be in its null space.

Okay. What do I get for the null space of this? Maybe minus one one, or one minus one. Doesn't matter. Those are both perfectly good. Right? Because that's in the null space of this.

Now I'll -- because A times that vector is three times that vector.  $Ax_2$  is minus three  $x_2$ . Good.

Okay. Can I get A again so we see that correctly? That was a minus one and that was a minus two. Good.

Okay. That -- that's the first job.

eigenvalues and eigenvectors. And already the eigenvalues are telling me the most important information about the answer.

But now, what is the answer? The answer is -- the solution will be U of T -- okay. Now, wh- now I use those eigenvalues and eigenvectors. The solution is some -- there are two eigenvalues. So I -- it -- so there're going to be two special solutions here.

Two pure exponential solutions. The first one is going to be either the  $\lambda_1$  one  $x_1$  and the -- so that solves the equation, and so does this one. They both are solutions to the differential equation. That's the general solution.

The general solution is a combination of that pure exponential solution and that pure exponential solution.

Can I just see that those guys do solve the equation? So let me just check -- check on this one, for example. Check. I -- I want to check that the -- my equation -- let's remember, the equation --  $du/dt$  is Au. I plug in  $e^{\lambda_1 t} x_1$  and let's just see that the equation's okay.

I believe this is a solution to that equation.

So just plug it in. On the left-hand side, I take the time derivative -- so the left-hand side will be  $\lambda_1 e^{\lambda_1 t} x_1$ , right? The time derivative -- this is the term that depends on time, it's just ordinary exponential, its derivative brings down a  $\lambda_1$ .

On the other side of the equation it's A times this thing. A times either the  $\lambda_1$  one  $x_1$ , and does that check out? Do we have equality there? Yes, because either the  $\lambda_1$  one  $t$  appears on both sides and the other one is  $Ax_1$  equal  $\lambda_1 x_1$  -- check. Do you -- so, the -- we've come to the first point to remember.

These pure solutions. Those pure solutions are the -- those pure exponentials are the differential equations analogue of -- last time we had pure powers.

Last time -- so -- so last time, the analog was  $\lambda$  --  $\lambda$  one to the  $K$ -th power  $x_1$ , some amount of that, plus some amount of  $\lambda$  two to the  $K$ -th power  $x_2$ . That was our formula from last time. I put it up just to -- so your eye compares those two formulas. Powers of  $\lambda$  in the -- in the difference equation -- that -- this was in the -- this was for the equation  $u_k + 1 = A u_k$ .

That was for the finite step -- stepping by one.

And we got powers, now this is the one we're interested in, the exponentials.

So -- so that's -- that's the solution -- what are  $c_1$  and  $c_2$ ? Then we're through. What are  $c_1$  and  $c_2$ ? Well, of course we know these actual things. Let me just -- let me come back to this.

$c_1$  is -- we haven't figured out yet, but  $e$  to the  $\lambda$  one  $t$ , the  $\lambda$  one is zero so that's just a one times  $x_1$  which is two one. So it's  $c_1$  times this one that's not moving times the vector, the eigenvector two one and  $c_2$  times -- what's  $e$  to the  $\lambda$  two  $t$ ?  $\lambda$  two is minus three. So this is the term that has the minus three  $t$  and its eigenvector is this one minus one. So this vector solves the equation and any multiple of it. This vector solves the equation if it's got that factor  $e$  to the minus three  $t$ . We've got the answer except for  $c_1$  and  $c_2$ . So -- so everything I've done is immediate as soon as you know the eigenvalues and eigenvectors. So how do we get  $c_1$  and  $c_2$ ? That has to come from the initial condition.

So now I -- now I use --  $u$  of zero is given as one zero.

So this is the initial condition that will find  $c_1$  and  $c_2$ . So let me do that on the board underneath. At  $t$  equals zero, then -- I get  $c_1$  times this guy plus  $c_2$  and now I'm at times zero. So that's a one and this is a one minus one and that's supposed to agree with  $u$  of zero one zero. Okay. That should be two equations. That should give me  $c_1$  and  $c_2$  and then I'm through. So what are  $c_1$  and  $c_2$ ? Let's see.

I guess we could actually spot them by eye or we could solve two equations in two unknowns. Let's see.

If these were both ones -- so I'm just adding -- then I would get three zero. So what's the -- what's the solution, then? If -- if  $c_1$  and  $c_2$  are both ones, I get three zero, so I want, like, one third of that, because I want to get one zero.

So I think it's  $c_1$  equals a third,  $c_2$  equals a third.

So finally I have the answer. Let me keep it in the -- in this board here. Finally the answer is one third of this plus one third of this.

Do you see what -- what's actually happening with this flow? This flow started out at -- the solution started out at one zero.

Started at one zero. Then as time went on, people moved, essentially.

Some fraction of this one moved here.

And -- and in the limit, there's -- there's the limit, as -- right? As  $t$  goes to infinity, as  $t$  gets very large, this disappears and this is the steady state. So the steady state is -- so the steady state --  $u$  -- we could call it  $u$  at infinity is one third of two and one. It's -- it's two thirds of one third. So that's the -- we really -- I mean, you're getting, like, total, insight into the behavior of the solution, what the differential equation does.

Of course, we don't -- wouldn't always have a steady state.

Sometimes we would approach zero.

Sometimes we would blow up. Can we straighten out those cases? The eigenvalue should tell us. So when do we get -- so -- so let me ask first, when do we get stability? That's  $u$  of  $t$  going to zero.

When would the solution go to zero no matter what the initial condition is? Negative eigenvalues, right. Negative eigenvalues.

But now I have to -- I have to ask you for one more step.

Suppose the eigenvalues are complex numbers? Because we know they could be. Then we want stability -- this -- this -- we want -- we need all these  $e$  to the  $\lambda t$  all going to zero and somehow that asks us to have  $\lambda$  negative. But suppose  $\lambda$  is a complex number? Then what's the test? What -- if  $\lambda$ 's a complex number like, oh, suppose  $\lambda$  is negative plus an imaginary part? Say  $\lambda$  is minus three plus six  $i$ ? What -- what happens then? Can we just, like, do a -- a case here? If -- if this  $\lambda$  is minus three plus six  $i$ , how big is that number? Does this -- does this imaginary part play a -- play a -- play a role here or not? Or how big is -- what's the absolute value of that -- of that quantity? It's just  $e$  to the minus three  $t$ , right? Because this other part, this -- the -- the magnitude -- the -- this --  $e$  to the six  $i t$  -- what -- that has absolute value one. Right? That's just this cosine of six  $t$  plus  $i$ , sine of six  $t$ .

And the absolute value squared will be cos squared plus sine squared will be one. This is -- this complex number is running around the unit circle.

This com- this -- the -- it's the real part that matters.

This is what I'm trying to do. Real part of  $\lambda$  has to be negative. If  $\lambda$ 's a complex number, it's the real part, the minus three, that either makes us go to zero or doesn't, or let -- or blows up. The imaginary part won't -- will just, like, oscillate between the two components. Okay.

So that's stability. And what about -- what about a steady state? When would we have, a steady state, always in the same direction? So let me -- I'll take this part away -- when -- so that was, like, checking that it's -- that it's the real part that we care about. Now, we have a steady state when -- when  $\lambda$  one is zero and the other eigenvalues have what? So I'm looking -- like, that example was, like, perfect for a steady state.

We have a zero eigenvalue and the other eigenvalues, we want those to disappear. So the other eigenvalues have real part negative. And we blow up, for sure -- we blow up if any real part of  $\lambda$  is positive.

So if I -- if I reverse the sign of  $A$  -- of the matrix  $A$  -- suppose instead of the matrix  $A$  I had, the  $-A$  that I had, I changed it -- I changed all its signs.

What would that do to the eigenvalues and eigenvectors? If I -- if -- if I know the eigenvalues and eigenvectors of  $A$ , tell me about  $-A$ .

What happens to the eigenvalues? For  $-A$ , they'll all change sign.

So I'll have blow up. This -- instead of the  $e^{-3t}$ , if I change that to  $e^{+3t}$  -- if I change the signs in that matrix, I would change the trace to  $+3$ , I would have an  $e^{+3t}$  and I would have blow up. Of course the zero eigenvalue would stay at zero, but the other guy is taking off in -- if I reversed all the signs. Okay.

So this is -- this is the stability picture.

And for a two by two matrix, we can actually pin down even more closely what that means. Can I -- let -- can I do that? Let me do that -- I want to -- for a two by two matrix, I can tell whether the real part of the eigenvalues is negative, I -- well, let me -- let me tell you what I have in mind for that.

So two by two stability -- let me -- this is just a little comment. Two by two stability. So my matrix, now, is just  $\begin{bmatrix} a & b \\ c & d \end{bmatrix}$  and I'm looking for the real parts of both eigenvalues to be negative.

Okay. What -- how can I tell from looking at the matrix, without computing its eigenvalues, whether the two eigenvalues are negative, or at least their real parts are negative? What would that tell me about the trace? So -- so the trace -- that's  $a + d$  -- what can you tell me about the trace in the case of a two by two stable matrix? That means the eigenvalues have -- are negative, or at least the real parts of those eigenvalues are negative -- then, when I take the -- when I look at the matrix and find its trace, what -- what do I know about that? It's negative, right.

This is the sum of the -- this equals -- this equals  $\lambda_1 + \lambda_2$ , so it's negative. The two eigenvalues, by the way, will have -- if they're complex -- will have  $\pm 6i$  and  $\mp 6i$ . The complex parts will -- will be conjugates of each other and disappear when we add and the trace will be negative.

Okay, the trace has to be negative.

Is that enough -- is a negative trace enough to make the matrix stable? Shouldn't be enough, right? Can I -- can you make -- what's a matrix that has a negative trace but still it's not stable? So it -- it has a blow -- it still has a blow-up factor and a -- and a -- and a decaying one. So what would be a -- so just -- just to see -- maybe I just put that here.

This -- now I'm looking for an example where the trace could be negative but still blow up. Of course -- yeah, let's just take one. Oh, look, let me -- let me make it  $\begin{bmatrix} -2 & 0 \\ 0 & 1 \end{bmatrix}$ . Okay.

There's a case where that matrix has negative trace -- I know its eigenvalues of course.

They're minus two and one and it blows up.

It's got -- it's got a plus one eigenvalue here, so there would be an  $e$  to the plus  $t$  in the solution and it'll blow up if it has any second component at all.

I need another condition. And it's a condition on the determinant. And what's that condition? If I know that the two eigenvalues -- suppose I know they're negative, both negative.

What does that tell me about the determinant? Let me ask again. If I know both the eigenvalues are negative, then I know the trace is negative but the determinant is positive, because it's the product of the two eigenvalues. So this determinant is  $\lambda_1 \lambda_2$ . This is -- this is  $\lambda_1 \lambda_2$  and if they're both negative, the product is positive. So positive determinant, negative trace. I can easily track down the -- this condition also for the -- if -- if there's an imaginary part hanging around. Okay.

So that's a -- like a small but quite useful, because two by two is always important -- comment on stability. Okay.

So let's just look at the picture again.

Okay. The main part of my lecture, the one thing you want to be able to, like, just do automatically is this step of solving the system.

Find the eigenvalues, find the eigenvectors, find the coefficients. And notice -- what's the matrix -- in this linear system here, I can't help -- if I -- if I have equations like that -- that's my equations column at a time -- what's the matrix form of that equation? So -- so this -- this system of equations is -- is some matrix multiplying  $c_1, c_2$  to give  $u$  of zero. One zero.

What's the matrix? Well, it's obviously two one, one minus one, but we have a name, or at least a letter -- actually a name for that matrix. Wh- what matrix are we s- are we -- are we dealing with here in this step of finding the c-s? Its letter is  $S$  -- it's the eigenvector matrix.

Of course. These are the eigenvectors, there in the columns of our matrix.

So this is  $S c = u$  of zero -- is the -- that step where you find the actual coefficients, you find out how much of each pure exponential is in the solution.

By getting it right at the start, then it stays right forever. I -- you're seeing this picture that each -- each pure exponential goes on its own way once you start it from  $u$  of zero.

So you start it by figuring out how much each one is present in  $u$  of zero and then off they go.

Okay. So -- so that's a system of two equations in two unknowns coupled -- the matrix sort of couples  $u_1$  and  $u_2$  and the eigenvalues and eigenvectors uncouple it, diagonalize it. Actually -- okay, now can I -- can I think in terms of  $S$  and  $\lambda$ ? So I want to write the solution down, again in terms of  $S$  and  $\lambda$ . Okay.

I'll do that on this far board. Okay.

So I'm coming back to -- I'm coming back to our equation  $du/dt$  equals  $Au$ . Now this matrix  $A$  couples them.

The whole point of eigenvectors is to uncouple.

So one way to see that is introduce set  $u$  equal  $A$  -- not  $A$ . It's  $S$ , the eigenvector matrix that uncouples it. So I'm -- I'm taking this equation as I'm given, coupled with -- with  $A$  has -- is probably full of non-zeroes, but I'm -- by uncoupling it, I mean I'm diagonalizing it.

If I can get a diagonal matrix, I'm -- I'm in.

Okay. So I plug that in.

This is  $A S v$ . And this is  $S dv/dt$ .

$S$  is a constant. It's -- this is the eigenvector matrix. This is the eigenvector matrix.

Okay. Now I'm going to bring  $S$  inverse over here. And what have I got? That combination  $S$  inverse  $A S$  is  $\lambda$ , the diagonal matrix.

That's -- that's the point, that in -- if I'm using the eigenvectors as my basis, then my system of equations is just diagonal. I -- each -- there's no coupling anymore --  $dv_1/dt$  is  $\lambda_1 v_1$ .

So let's just write that down.  $dv_1/dt$  is  $\lambda_1 v_1$  and so on for all  $n$  of the equations. It's a system of equations but they're not connected, so they're easy to solve and why don't I just write down the solution?  $v$  -- well,  $v$  is now some  $e$  to the  $\lambda_1 t$  -- well, okay -- I guess my idea here now is to use, the natural notation --  $v$  of  $T$  is  $e$  to the  $\lambda t$   $v$  of zero. And  $u$  of  $t$  will be  $S e$  to the  $\lambda t$   $S$  inverse,  $u$  of zero.

This is the -- this is the, formula I'm headed for.

This -- this matrix,  $S e$  to the  $\lambda t$   $S$  inverse, that's my exponential. That's my  $e$  to the  $A t$ , is this  $S e$  to the  $\lambda t$   $S$  inverse. So my -- my job really now is to explain what's going on with this matrix up in the exponential.

What does that mean? What does it mean to say  $e$  to a matrix? This ought to be easier because this is  $e$  to a diagonal matrix, but still it's a matrix. What do we mean by  $e$  to the  $A t$ ? Because really  $e$  to the  $A t$  is my answer here. My -- my answer to this equation is -- this  $u$  of  $t$ , this is my -- this is my  $e$  to the  $A t$   $u$  of zero. So it's -- my job is really now to say what's -- what does that mean? What's the exponential of a matrix and why is that formula correct? Okay. So I'll put that on the board underneath. What's the exponential of a matrix? Let me come back here.

So I'm talking about matrix exponentials.

$e$  to the  $At$ . Okay.

How are we going to define the exponential of a -- of something? The trick -- the idea is -- the thing to go back to is exponential -- there's a power series for exponentials. That's how you -- you -- the good way to define  $e$  to the  $x$  is the power series one plus  $x$  plus one half  $x$  squared, one sixth  $x$  cubed and we'll do it now when the -- when we have a matrix. So the one becomes the identity, the  $x$  is  $At$ , the  $x$  squared is  $At$  squared and I divide by two. The cube, the  $x$  cube is  $At$  cubed over six, and what's the general term in here?  $At$  to the  $n$ -th power divided by -- and it goes on.

But what do I divide by? So, you see the pattern -- here I divided by one, here I divided by one by two by six, those are the factorials. It's  $n$  factorial.

That was, like, the one beautiful Taylor series. The one beautiful Taylor series -- well, there are two -- there are two beautiful Taylor series in this world. The Taylor series for  $e$  to the  $x$  is the  $s$  with  $x$  to the  $n$ -th over  $n$  factorial.

And all I'm doing is doing the same thing for matrixes.

The other beautiful Taylor series is just the sum of  $x$  to the  $n$ -th not divided by  $n$  factorial.

Can you -- do you know what function that one is? So if I take -- this is the series, all these sums are going from zero to infinity. What's -- what function have I got -- this is like a side comment -- this is one plus  $x$  plus  $x$  squared plus  $x$  cubed plus  $x$  to the fourth not divided by anything, what's -- what's that function? One plus  $x$  plus  $x$  squared plus  $x$  cubed plus  $x$  fourth forever is one over one minus  $x$ .

It's the geometric series, the nicest power series of all.

So, actually, of course, there would be a similar thing here. If -- if I wanted,  $I$  minus  $A$   $t$  inverse would be -- now I've got matrixes.

I've got matrixes everywhere, but it's just like that series with -- and just like this one without the divisions.

It's  $I$  plus  $At$  plus  $At$  squared plus  $At$  cubed and forever.

So that's actually a -- a reasonable way to find the inverse of a matrix. If I chop it off -- well, it's reasonable if  $t$  is small. If  $t$  is a small number, then -- then  $t$  squared is extremely small,  $t$  cubed is even smaller, so approximately that inverse is  $I$  plus  $At$ . I can keep more terms if I like. Do you see what I'm doing? I'm just saying we can do the same thing for matrixes that we do for ordinary functions and the good thing about the exponential series -- so in a way, this series is better than this one. Why? Because this one always converges.

I'm dividing by these bigger and bigger numbers, so whatever matrix  $A$  and however large  $t$  is, that series -- these terms go to zero.

The series adds up to a finite sum,  $e$  to the  $At$  is a -- is -- is completely defined.

Whereas this second guy could fail, right? If  $A t$  is big -- somehow if  $A t$  has an eigenvalue larger than one, then when I square it it'll have that eigenvalue squared, when I cube it the eigenvalue will be cubed -- that series will blow up unless the eigenvalues of  $A t$  are smaller than one. So when the eigenvalues of  $A t$  are smaller than one -- so I'd better put that in. The -- all eigenvalues of  $A t$  below one -- then that series converges and gives me the inverse.

Okay. So this is the guy I'm chiefly interested in, and I wanted to connect it to -- oh, okay. What's -- how do I -- how do I get -- this is my, like, main thing now to do -- how do I get  $e$  to the  $A t$  -- how do I see that  $e$  to the  $A t$  is the same as this? In other words, I can find  $e$  to the  $A t$  by finding  $S$  and  $\lambda$ , because now  $e$  to the  $\lambda t$  is easy.

$\lambda$ 's a diagonal matrix and we can write down either the  $\lambda t$  -- and will right -- in a minute.

But how -- do you see what -- do you see that we're hoping for a -- we're hoping that we can compute either the  $A t$  from  $S$  and  $\lambda$  -- and I have to look at that definition and say, okay, how do -- how do I get an  $S$  and the  $\lambda$  to come out of that? Okay, can -- do you see how I -- I want to connect that to that, from that definition. So let me erase this -- the geometric series, which isn't part of the differential equations case and get the  $S$  and the  $\lambda$  into this picture. Oh, okay.

Here we go. So identity is fine.

Now -- all right, you -- you -- you'll see how I'm -- how I'm -- how I going to get  $A$  replaced by  $S$  and  $S$  is in  $\lambda$ 's? Well I use the fundamental formula of this whole chapter.  $A$  is  $S \lambda S^{-1}$  and then times  $t$ . That's  $A t$ .

Okay. What's  $A^2 t$ ? I can -- I've got the divide by two, I've got the  $t^2$  and I've got an  $A^2$ . All right, I -- so I've got a -- there's  $A$  -- there's  $A$ . Now square it.

So what happens when I square it? We've seen that before. When I square it, I get  $S \lambda^2 S^{-1}$ , right? When I square that thing, the -- there's an  $S$  and a -- an  $S$  cancels out an  $S^{-1}$ . I'm left with the  $S$  on the left, the  $S^{-1}$  on the right and  $\lambda^2$  in the middle. And so on.

The next one'll be  $S \lambda^3 S^{-1}$  -- times  $t^3$  over three factorial. And now -- what do I do now? I want to pull an  $S$  out from everything.

I want an  $S$  out of the whole thing.

Well, look, I'd better write the identity how? I -- I want to be able to pull an  $S$  out and an  $S^{-1}$  out from the other side, so I just write the identity as  $S$  times  $S^{-1}$ .

So I have an  $S$  there and an  $S^{-1}$  from this side and what have I got in the middle? If I pull out an  $S$  and an  $S^{-1}$ , what have I got in the middle? I've got the identity, a  $\lambda t$ , a  $\lambda^2 t^2$  over two -- I've got  $e$  to the  $\lambda t$ .

That's what's in the middle. That's my formula for  $e^{At}$ . Oh, now I have to ask you.

Does this formula always work? This formula always works -- well, except it's an infinite series.

But what do I mean by always work? And this one doesn't always work and I just have to remind you of what assumption is built into this formula that's not built into the original. The assumption that  $A$  can be diagonalized. You'll remember that there are some small -- some subset of matrixes that don't have  $n$  independent eigenvectors, so we don't have an  $S$  inverse for those matrixes and the whole diagonalization breaks down.

We could still make it triangular.

I'll tell you about that. But diagonal we can't do for those particular degenerate matrixes that don't have enough independent eigenvectors. But otherwise, this is golden. Okay. So that's the formula -- that's the matrix exponential.

Now it just remains for me to say what is  $e^{\lambda t}$ ? Can I just do that? Let me just put that in the corner here. What is the exponential of a diagonal matrix? Remember  $\lambda$  is diagonal,  $\lambda_1$  down to  $\lambda_n$ . What's the exponential of that diagonal matrix? Because our whole point is that this ought to be simple. Our whole point is that to take the exponential of a diagonal matrix ought to be completely decoupled -- it ought to be diagonal, in other words, and it is. It's just  $e^{\lambda_1 t}$ ,  $e^{\lambda_2 t}$ ,  $e^{\lambda_n t}$ , all zeroes.

So -- so if we have a diagonal matrix and I plug it into this exponential formula, everything's diagonal and the diagonal terms are just the ordinary scalar exponentials  $e^{\lambda_i t}$ . Okay, so that's -- that's -- in a sense, I'm doing here, on this board, with -- with, like, formulas what I did on the -- in the first half of the lecture with specific matrix  $A$  and specific eigenvalues and eigenvectors. The -- so let me show you the formulas again. But the -- so you -- I guess -- what should you know from this lecture? You should know what this matrix exponential is and, like, when does it go to zero? Tell me again, now, the answer to that.

When does  $e^{At}$  approach -- get smaller and smaller as  $t$  increases? Well, the  $S$  and the  $S$  inverse aren't moving. It's this one that has to get smaller and smaller and that one has this simple diagonal form.

And it goes to zero provided every one of these  $\lambda$ s -- I -- I need to have each one of these guys go to zero, so I need every real part of every eigenvalue negative. Right? If the real part is negative, that's -- that takes the exponential -- that forces -- the exponential goes to zero.

Okay, so that -- that's really the difference.

If I can just draw the -- here's a picture of the -- of the -- this is the complex plain.

Here's the real axis and here's the imaginary axis. And where do the eigenvalues have to be for stability in differential equations? They have to be over here, in the left half plain. So the left half plain is this plain, real part of  $\lambda$ , less than zero.

Where do the ma- where do the eigenvalues have to be for powers of the matrix to go to zero? Powers of the matrix go to zero if the eigenvalues are in here.

So this is the stability region for powers -- this is the region -- absolute value of  $\lambda$ , less than one. That's the stability for -- that tells us that the powers of  $A$  go to zero, this tells us that the exponential of  $A$  goes to zero.

Okay. One final example.

Let me just write down how to deal with a final example.

Let's see. So my final example will be a single equation,  $u'' + bu' + Ku = 0$ .

One equation, second order.

How do I -- and maybe I should have used -- I'll use -- I prefer to use  $y$  here, because that's what you see in differential equations. And I want  $u$  to be a vector. So how do I change one second order equation into a two by two first order system? Just the way I did for Fibonacci. I'll let  $u$  be  $y$  prime and  $y$ .

What I'm going to do is I'm going to add an extra equation,  $y$  prime equals  $y$  prime. So I take this -- so by -- so using this as the vector unknown, now my equation is  $u$  prime. My first order system is  $u$  prime, that'll be  $y$  double prime  $y$  prime, the derivative of  $u$ , okay, now the differential equation is telling me that  $y$  double prime is  $m$ - so I'm just looking for -- what's this matrix?  $y$  prime  $y$ . I'm looking for the matrix  $A$ . What's the matrix in case I have a single first order equation and I want to make it into a two by two system? Okay, simple.

The first row of the matrix is given by the equation.

So  $y'' - by' - ky$  -- no problem.

And what's the second row on the matrix? Then we're done. The second row of the matrix I want just to be the trivial equation  $y$  prime equals  $y$  prime, so I need a one and a zero there.

So matrixes like these, the gen- the general case, if I had a five by five -- if I had a fifth order equation and I wanted a five by five matrix, I would see the coefficients of the equation up there and then my four trivial equations would put ones here. This is the kind of matrix that goes from a fifth order to a five by five first order.

So the -- and the eigenvalues will come out in a natural way connected to the differential equation. Okay, that's differential equations. The -- a parallel lecture compared to powers of a matrix we can now do exponentials.

Thanks.