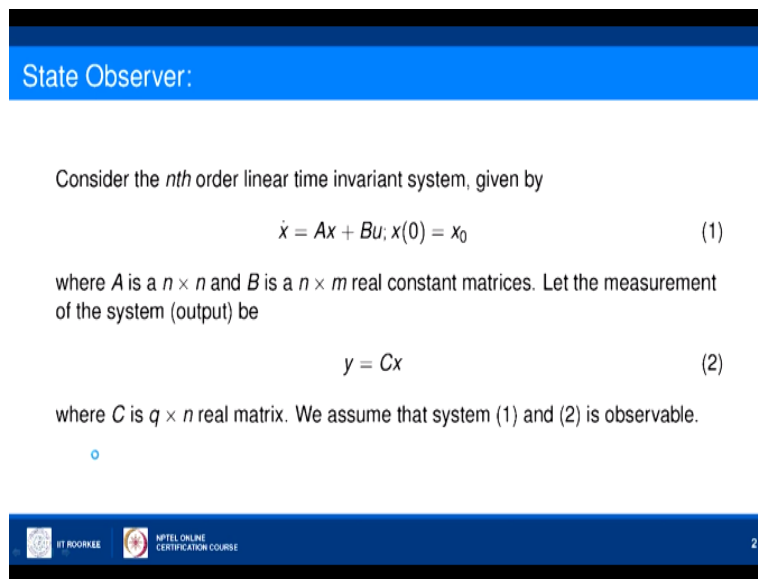


Dynamical Systems and Control
Prof. N. Sukavanam
Department of Mathematics
Indian Institute of Technology – Roorkee

Lecture - 43
State Observer

Hello viewers. Welcome to the lecture on state observer. So in this lecture, we will see how to estimate the state of a control system using the observation or the measurement of the system.

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State Observer:

Consider the n th order linear time invariant system, given by

$$\dot{x} = Ax + Bu; x(0) = x_0 \quad (1)$$

where A is a $n \times n$ and B is a $n \times m$ real constant matrices. Let the measurement of the system (output) be

$$y = Cx \quad (2)$$

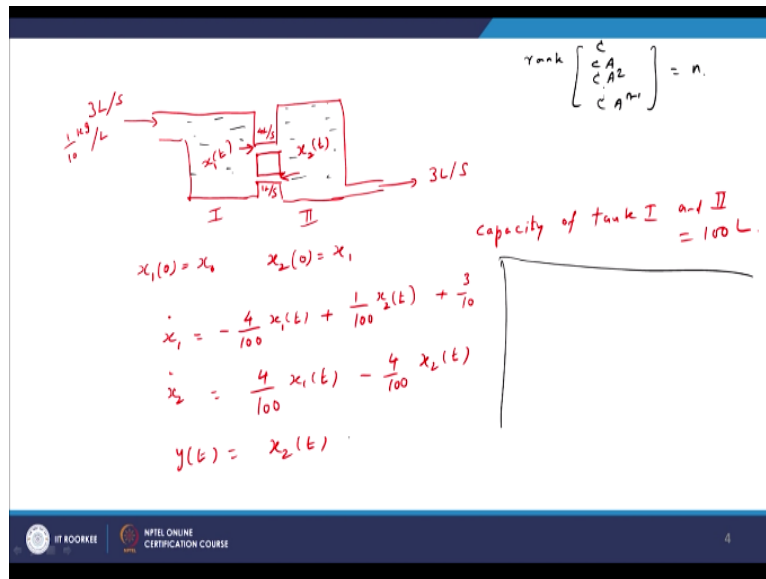
where C is $q \times n$ real matrix. We assume that system (1) and (2) is observable.

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First, let us consider the given control system $\dot{x}=Ax+Bu$ and the initial condition is x_0 . So here x is the state variable and u is the control variable, A is a $n \times n$ matrix and B is $n \times m$ constant matrices and the entries are real numbers and the measurement or the observation related to this control system is $y=Cx$ where C is a $q \times n$ real matrix. So first we assume that the system 1 and 2 is observable.

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So we have seen the observability of a system, it means estimating the initial condition uniquely that is given the measurement $y=Cx$ if you are able to estimate, if you are able to find the initial condition x_0 uniquely, then the system is called observable system. So the meaning is it should be satisfying the given condition that is the rank of the matrix C CA CA^2 square CA power $n-1$.

So if the rank of this matrix is n , then it implies that the system is observable or in the other way also, the system is observable then the rank of this matrix= n . So if the system is observable, then we should be able to find the value of the state x of t at each instant of time that is theoretical but in practice in many systems, the observation may be available but we may not be able to measure the system state x of t say a function of t accurately.

So it is required that we should estimate this state variable provided y of t that is the observation. So for example if you consider the mixing problem, consider two tanks, tank 1 and tank 2 with capacity let say 100 liters and the x of t denotes the amount of some substance for example salt mixed in this tank 1 and the liquid is let us say water. So the amount of salt in tank 1 is x_1 of t and amount of salt in tank 2 is x_2 of t at each instant of time.

And there is an inflow of 3 liter per second and in this inflow $1/10$ kg of salt per liter is present. So it means $3/10$ kg of salt will enter into the system continuously that is a constant rate. Similarly, 3 liters per second will be outflow from the tank 2 and there is a circulation

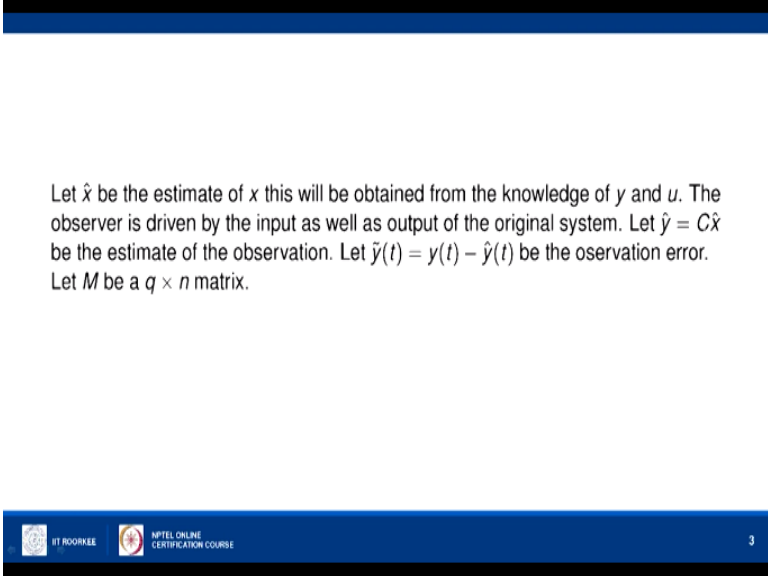
between tank 1 and 2 that is 4 liters from tank 1 enters into tank 2 and 1 liter from tank 2 enters into tank 1, so it is circulating.

Now as time changes the amount of salt changes in both the tanks. Initially, we assume that x_0 is the amount of salt in tank 1 and x_1 is the salt in tank 2 and the rate of change of the amount of salt in 1 and 2 is given by this equation. It is depending on whatever how much inflow and how much outflow from each tank, the - sign and + sign denotes that one. So it is a dynamical control system and the control is a constant one here.

This 3/10 is entering into the system and the observation we are assuming that we are measuring the amount of salt coming out of the tank 2, y of $t=x_2$ of t can be measured because it is coming out. Now we can see that there is no way of measuring x_1 of t because it is completely closed, there is no outlet here. So it is to be estimated only using the information y of t .

So similarly in many problems directly we may not be able to measure the state of this, all the states of the system but we can estimate them using the output or the measurement y of t .

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A slide with a blue header and footer. The main content is white with black text. The text describes the estimation of state variables from observations and inputs.

Let \hat{x} be the estimate of x this will be obtained from the knowledge of y and u . The observer is driven by the input as well as output of the original system. Let $\hat{y} = C\hat{x}$ be the estimate of the observation. Let $\tilde{y}(t) = y(t) - \hat{y}(t)$ be the observation error. Let M be a $q \times n$ matrix.

So let \hat{x} denote the estimate of the state variable x here and from the information of y and u . Now let us assume that $\hat{y} = C\hat{x}$ because \hat{x} is the estimate and $C\hat{x}$ is the estimate of \hat{y} but in fact we have y of t that is the actual value of the output, y of t is available with us and actual value of x of t is not available.

We are estimating x of t , so we are giving this notation \hat{y} as C times \hat{x} and the difference between these two is called the y bar of t . Now if y bar of t is $=0$, it means that $\hat{y} = y$ and the estimate is equal to the exact value. So let $\hat{y} = C * \hat{x}$ be the estimate of the observation and y bar is the difference between the actual value of y and the estimated value of y here. So we have these values with us, y of t and y bar of t the error. So using this we want to estimate the state value.

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Let us consider estimator equation as

$$\dot{\hat{x}} = A\hat{x} + Bu(t) - M\bar{y}(t) \quad (3)$$


Let the state error vector

$$\bar{x}(t) = x(t) - \hat{x}(t)$$

Differentiating both sides, we get

$$\dot{\bar{x}}(t) = \dot{x}(t) - \dot{\hat{x}}(t)$$

Substituting for $\dot{x}(t)$ and $\dot{\hat{x}}(t)$ from eqns. (1) and (3) respectively, we obtain

$$\begin{aligned} \dot{\bar{x}} &= Ax(t) + Bu(t) - A\hat{x}(t) - Bu(t) + MC(x - \hat{x}) \\ &= A(x - \hat{x}) + MC(x - \hat{x}) \\ &= (A + MC)\bar{x}(t) \end{aligned} \quad (4)$$


So let M be a $q \times n$ matrix a suitable matrix which will be used in the estimator equation. So let us consider this particular equation 3 that is $\dot{\hat{x}} = Ax + Bu - M$ times y bar, y bar is the error in the observation. So this M matrix we have to find suitably so that this equation 3 gives a proper estimate of the state variable. So how to find this M matrix in a suitable manner?

So the error in the original value of x and the estimated value of x is denoted by \bar{x} here. Now differentiating \bar{x} that is $\dot{\bar{x}} = \dot{x} - \dot{\hat{x}}$ and substituting $\dot{x} = Ax + Bu$ and $\dot{\bar{x}}$ we are assuming from the equation 3, so we substitute it here, $A\bar{x} - Bu$ and $+M*y$ where $y = C$ times x here. So if you substitute this expression and substituting $x - \hat{x}$ as \bar{x} , we will get the equation $\dot{\bar{x}} = A + MC * \bar{x}$ of t . So it is a very simple first-order differential equation in the error of the estimation \bar{x} .

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Thus, the error in state vector is given by

$$\tilde{x}(t) = \exp[(A + MC)t]\tilde{x}(0) \quad (5)$$

and is independent of the applied control.

The error \tilde{x} will decay to 0 if M is chosen such that (4) is asymptotically stable, i.e., all the eigenvalues of the matrix $(A + MC)$ have $-ve$ real parts. It can be easily proved that if (1) and (2) is completely observable, the matrix M may be chosen so as to place the eigenvalues of $(A + MC)$ in any desired configuration (subject to conjugate pairing).

$$\begin{array}{l}
 A' + C' M' \text{ has eigenvalues } \{\mu_1, \mu_2, \dots, \mu_n\} \\
 \text{if rank } \begin{bmatrix} C' & A' C' & (A')^2 C' & \dots & (A')^{n-1} C' \end{bmatrix} = n \\
 \text{= observability of the sys.}
 \end{array}
 \quad \left| \quad
 \begin{array}{l}
 A + B K \text{ has} \\
 \text{eigenvalues } \{\mu_1, \dots, \mu_n\} \\
 \text{if rank } \begin{bmatrix} B & AB & \dots & A^{n-1} B \end{bmatrix} \\
 = n
 \end{array}
 \right.$$

So if you solve this equation, we will get \tilde{x} = the exponential of the matrix $A+MC$ * any initial condition, let us say at the initial time $t=0$ we have made some estimate of the state variable x . So we denote it by \hat{x} at time $t=0$. So the error in the estimate is given by \tilde{x} of t given by this expression. Now we can observe that if this matrix $A+MC$ has all the eigenvalues having the real part to be negative, then the right hand side will tend to 0 as t tends to infinity.

So what we emphasize here is if you are able to select the eigenvalues of the matrix $A+MC$ to be in the left half of the complex plane, then the error will tend to 0 or in other words we will say that \hat{x} will tend to x as t tends to infinity. So theoretically, we say that t tending to infinity it will converge but in practice because it is the exponential decay, it will converge to \hat{x} of t as quickly as possible.

So it will reach the exact value of the state variable. So this \hat{x} of t the solution of the equation 3 if you are able to find a suitable matrix M is called the estimate of the state. So this is how to find the matrix M that is the question here. So for finding the suitable matrix M in such a way that $A+MC$ has eigenvalues with negative real part, we make use of the previous results on feedback control.

So what we have seen earlier is if A is a matrix, the state matrix and B is the control matrix, we have seen that we can find a matrix K such that $A+BK$ has say eigenvalues with negative real parts, eigenvalues u_1, u_2, \dots, u_n . Any eigenvalue can be assigned, in particular we are

By the assumption of observability of system, the pair $\{A, C\}$ is observable i.e.

$$\text{rank} \begin{bmatrix} C \\ CA \\ \vdots \\ CA^{n-1} \end{bmatrix} = n$$

or

$$\text{rank} [C^T \quad A^T C^T \quad \dots \quad (A^T)^{n-1} C^T] = n$$

Then by duality, the pair $\{A^T, C^T\}$ is controllable. Using the results on feedback control we can get a matrix M^T such that $(A^T + C^T M^T)$ has eigenvalues which can be assigned arbitrarily.

$\therefore (A + MC)$ can be assigned eigenvalues arbitrarily.

So this is what we have seen if the rank=n, we will be able to find this expression.

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Thus, if the system is observable, its state can be estimated with an n -dimensional observer of the form

$$\dot{\hat{x}} = (A + MC)\hat{x} + Bu - My; \hat{x}(0) = \hat{x}_0 \quad (6)$$

The matrix M may be chosen so as to place the eigenvalues of (6) in any desired configuration. It may be noted that if the eigenvalues of $(A + MC)$ have negative real parts, then no matter what \hat{x}_0 is, \hat{x} will approach x asymptotically. For an asymptotic estimator (6), there is no need of setting an initial state, because no matter what the initial state is, the estimator output will tend to real state.

So now we will see, so we have in equation 6 the error system $\dot{\hat{x}} = A + MC * \hat{x}$. So in this equation 6, the observer or the estimation of the state is given by $\dot{\hat{x}} = A \hat{x} + Bu - My$, so this thing there is MC has come extra okay this can be removed. So using this system whatever be the initial condition \hat{x}_0 , this will converge to the exact value of the state x of t because of the equation 5 here.

Because we are selecting the matrix M so that all the eigenvalues of $A + MC$ are having negative real part. The estimator will work properly for any initial condition \hat{x}_0 okay.

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$\dot{x}_1 = x_2$
 $\dot{x}_2 = u$

$y(t) = x_1(t) = \begin{bmatrix} 1 & 0 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix}$

$A = \begin{bmatrix} 0 & 1 \\ 0 & 0 \end{bmatrix}$, $B = \begin{bmatrix} 0 \\ 1 \end{bmatrix}$, $C = \begin{bmatrix} 1 & 0 \end{bmatrix}$.

$\text{rank} \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} = 2 \Rightarrow$ observable system.

To find M : such that $A+MC$ has e.v. $\{-1, -2\}$

i.e. $A+C^T M^T$ has eigenvalues $\{-1, -2\}$

Let $M^T = \begin{bmatrix} k_1 & k_2 \end{bmatrix}$ then we set $T = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}$, $TAT^{-1} = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}$

Then we set $k_1 = 0$, $k_2 = 0$, $B_1 = 3$, $B_2 = 2$, $T^{-1} = \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}$

$\gamma_1 = k_1 - B_1 = -3$, $\gamma_2 = -2$. Then $(k_1 \ k_2) = [x_2 \ x_1] T^{-1} = [-3 \ -2]$

$\Rightarrow M = \begin{bmatrix} -3 \\ -2 \end{bmatrix}$ then estimator eq. is given by

$\frac{d^2 x}{dt^2} = u$

$x = x_1$
 $\dot{x} = x_2$

$\dot{\hat{x}}_1 = -3\hat{x}_1 + \hat{x}_2 + 3x_1$
 $\dot{\hat{x}}_2 = -2\hat{x}_2 + u + 2x_2$

$\hat{x}_1 = x_1$
 $\hat{x}_2 = x_2$

$\begin{bmatrix} \dot{\hat{x}}_1 \\ \dot{\hat{x}}_2 \end{bmatrix} = \begin{bmatrix} -3 & 1 \\ 0 & -2 \end{bmatrix} \begin{bmatrix} \hat{x}_1 \\ \hat{x}_2 \end{bmatrix} + \begin{bmatrix} 3 \\ 1 \end{bmatrix} u$

So now we will see for example a simple system which is familiar to us the usual Newton's equation mass*acceleration=force where mass is 1 here and the u is the force acting on the system. So this system if you convert it into a system of equation, if x is=x1 and x dot=x2, we will get the system as x1 dot=x2 and x2 dot=the force u and this will imply we will get to the system as x1 dot x2 dot as 0 1 0 0 x1 x2+0 1*u.

So let us assume that the observation, we will observe the position of the particle at each instant of time x1 of t we are observing, so it is possible to observe the, get the velocity from this expression. So if the measurement is only x1 of t can be observed both the states that is what here, so to estimate this state the entire state x1 and x2 but x1 is already measured, only x2 has to be estimated in this case.

So how to proceed with the equations here, so here the matrix A is 0 1 0 0 and the matrix B is 0 1 and the matrix C, so this can be written as 1 0 x1 x2, so the matrix C is 1 0 and it can be easily seen that the system is observable because the rank of the C matrix is 1 0 and C*A if you multiply it will be 0 1, so the rank is 2. So this implies the system is observable. So now the estimator equation we can easily calculate.

Now we want to find the matrix M such that A+M*C has any arbitrary eigenvalues. For example, eigenvalues if you select let say -1 and -2 any two negative eigenvalues we will select. Then, we will be able to find the matrix in the following way. Instead of finding directly A+MC as we have seen earlier, we will try to find this in the form of A dashed+C dashed M dashed okay has eigenvalues -1, -2.

So we are interested in finding M such that this has the eigenvalues -1 and -2 , so that can be calculated in the following way. If you assume that $M = K_2 K_1$ a row matrix. Then, we can get the T matrix all this can be calculated using the feedback control procedure which we have seen earlier. So we will get the T matrix to be like this and TAT^{-1} will be in the companion form $\begin{bmatrix} 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix}$ and $T^{-1}B$ matrix or in other words the C matrix is $\begin{bmatrix} 0 & 1 \end{bmatrix}$ here.

So this is the procedure for finding the companion form of this pair A and C and using this T matrix we will get then we get this companion form will give α_1 and α_2 in the last row. We get α_1 is 0 , α_2 is 0 and from these eigenvalues if you find the characteristic equation for -1 and -2 that is $\lambda^2 + \lambda + 2 = 0$. So that will give the characteristic equations coefficient as β_1 and β_2 value as 3 and 2 .

So that will give the γ values, γ_1 is $\alpha_1 - \beta_1$. So these values are -3 and similarly γ_2 is $\alpha_2 - \beta_2$ is -2 and then the $K_2 K_1$ that is what we require M matrix that is $\gamma_2 \gamma_1 T^{-1}$. Using this procedure, we get the value to be M is $-3, -2$. So M matrix is so this implies the required matrix M is the column matrix $-3, -2$ and the estimator equation $\dot{\hat{x}} = A\hat{x} + Bu - My$.

So if we substitute all the values here, the M matrix value, etc here, so then the estimator equation is given by this equation. Let us write here $\dot{x}_1 = -3x_1 + x_2 + 3x_1$ and $\dot{x}_2 = -2x_1 + u + 2x_1$. So from the equation 3, estimator equation 3 using the matrix M , we will be getting this estimator equation. So if you solve this equation, we will obtain because x_1 is the observation.

As given here, the observation is given by x_1 , so using x_1 how to estimate x_2 ? Here it is estimating x_1 also but it is already measured here as the measurement. So \hat{x}_2 can be obtained. So if we can verify whether this equation is proper or not, so if you substitute the exact value for the \hat{x}_1 and \hat{x}_2 as x_1 and x_2 itself, so that will imply that we will get so if $\hat{x}_1 = x_1$ and $\hat{x}_2 = x_2$ in this equation what we get is the original equation $\dot{x}_1 = x_2$ and $\dot{x}_2 = u$ is the original equation from this itself.

So it verifies that the system given in equation 3 can estimate the state variable in a proper manner. So this is about the estimator of the state variable.

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Consider $\dot{x} = Ax + Bu$ and $y = Cx$. Let $u = Kx$ be feedback control. Instead of $u = Kx$ let $u = K\tilde{x}$ then

$$\begin{aligned}\dot{x} &= Ax + BK\tilde{x} \\ \dot{\tilde{x}} &= (A + MC)\tilde{x} + Bu - My \\ &= (A + MC)\tilde{x} + BK\tilde{x} - MCx\end{aligned}$$

$$\Rightarrow \begin{bmatrix} \dot{x} \\ \dot{\tilde{x}} \end{bmatrix} = \begin{bmatrix} A & BK \\ -MC & BK + A + MC \end{bmatrix} \begin{bmatrix} x \\ \tilde{x} \end{bmatrix}$$

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Now we will consider the system $\dot{x}=Ax+Bu$ and the observation $y=Cx$. So the previous problem is to estimate the state variable x and so in this section what we will see is how to find the feedback for the given control system $\dot{x}=Ax+Bu$. So usually when we consider the feedback $u=Cx$ where K is suitably chosen matrix so that $A+BK$ will behave in a desirable manner.

That means we will assign a fixed set of eigenvalues and we are interested in finding K so that $A+BK$ has that set of eigenvalue. So for that it is required that we should substitute the exact value of x for the feedback control but in practical problems as we have already seen, it may not be possible to get x but we will be able to get an estimate value \hat{x} . So let us try to substitute the control u in the form of $K*\hat{x}$ where \hat{x} is the estimated value of x .

So now the control which we are applying is not the one which we desired that is $u=Cx$ but it is slightly different, $u=C\hat{x}$. So when we substitute that control, the system is $\dot{x}=Ax+BK\hat{x}$ and the second equation is it should be $\dot{\tilde{x}}$, that is the equation 3 which is the estimator equation $\dot{\tilde{x}}=A+MC$. So now if you substitute the control $u=C\hat{x}$ or Cx , we get the equation as $\dot{x}=Ax+BK\hat{x}$ and $\dot{\tilde{x}}=A+MC$ which is the equation 3 that was the estimator equation.

Now from these two equations, if you combine these two equations as a single control system, we can see that the first equation, the first row*this column will give $Ax+BK x$ cap and the second equation x cap dot will give the equation. So in the matrix form we can write like this where these are the block matrices A, BK, etc.

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Then

$$\begin{bmatrix} I & 0 \\ I & -I \end{bmatrix} \begin{bmatrix} A & BK \\ -MC & BK+A+MC \end{bmatrix} = \begin{bmatrix} A & BK \\ A+MC & -A-MC \end{bmatrix}$$

$$\begin{bmatrix} I & 0 \\ I & -I \end{bmatrix} = \begin{bmatrix} A+BK & -BK \\ 0 & A+MC \end{bmatrix}$$

∴ eigenvalues are that of $(A+BK)$ of $(A+MC)$.

$$\begin{bmatrix} \dot{x} \\ x \end{bmatrix} = \begin{bmatrix} A+BK & -BK \\ 0 & A+MC \end{bmatrix} \begin{bmatrix} x \\ \bar{x} \end{bmatrix}$$

$\dot{x} = (A+BK)x - BK\bar{x}$
 $\dot{\bar{x}} = (A+MC)\bar{x}$

Now pre-multiplying the block matrix $I \ 0 \ I \ -I$, the sizes are compatible, then we will get this expression $A \ BK$ in the first block and $A+MC \ -A-MC$ after multiplication. Now again multiplying this matrix by $I \ 0 \ I \ -I$, this multiplied by so let us call this matrix as some D matrix and if you put D here that is it is missing here.

So $D \cdot I \ 0 \ I \ -I$ we will get this expression and if you multiply the left hand side also in the same manner with these two matrices $I \ 0 \ I \ -I$ in the left side, again $I \ 0 \ I \ -I$ in the right hand side for this one we will get the expression to be like this. So we get the equation to be x dot and x cap dot okay, instead of this left hand side we will get this expression and the right hand side will be as given here $A+BK$ and $-BK$ block 0 and $A+MC \cdot x$ and x cap.

So we will get a system of equation in this manner. Now we can see that this is making it into two compartments, so they are even though this system looks as if they are combined system. Now after multiplying left and right using these matrices, we will get the system to be like this. So the first equation will give x dot= $Ax+BK \cdot x$ and $-BK \cdot x$ bar, the error in the estimation.

The second equation gives $\dot{\bar{x}}$ is simply so the second equation $\dot{\bar{x}} = A + MC \bar{x}$. So if you are selecting the eigenvalues of $A + MC$ properly that is all negative eigenvalues, then it is obvious that \bar{x} will tend to 0 as t tends to infinity. So when \bar{x} tend to 0, it automatically implies that \hat{x} will tend to x as t tends to infinity.

So whether we use in the feedback control $K \bar{x}$ or we use $K \hat{x}$, both will give the same effect as t becomes larger and larger because \hat{x} is going to tend to the value x here. So the effect of control will be the same as t increases. So that is advantage of the estimator here. We estimate x and then use it in the feedback control for driving the system. So in this lecture, we have seen how to estimate the state variables using the observation and how to make use of the estimate in the feedback control of the system.

So in the next lecture, we will see observable and unobservable systems and how to find the unobservable subspace and then estimate the observable states of the system. Thank you.