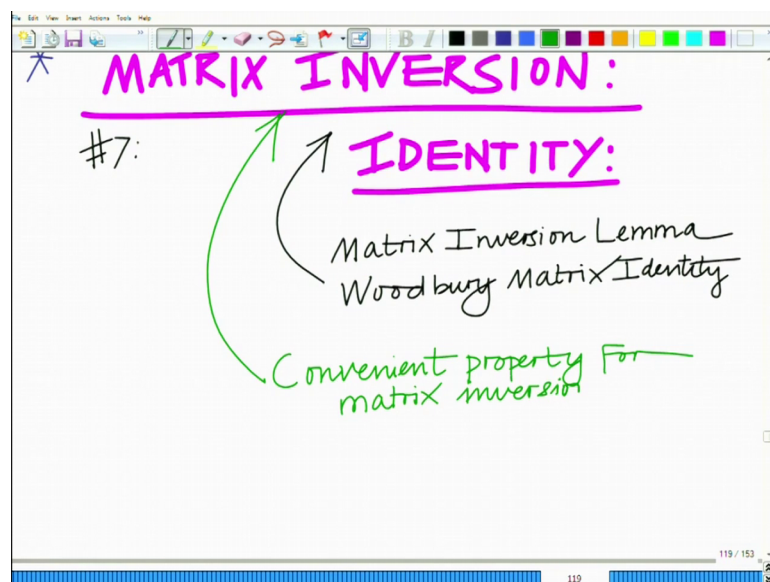


**Applied Optimization for Wireless, Machine Learning, Big Data**  
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**Lecture - 10**  
**Matrix Inversion Lemma (Woodbury identity)**

Hello welcome to another module in this massive open online course. So, we are looking at the mathematical preliminaries and the examples for the various mathematical preliminaries. Let us continue our discussion and look at another important principle that comes in handy several times this is known as the Matrix Inversion Lemma or the Matrix Inversion Identity.

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So, what we want to look at is the matrix in this module of linear algebra and matrix preliminaries for optimization. So, we want to look at the matrix inversion identity and this is also often termed as the matrix inversion. So, there are many names for this, this is also termed as the matrix inversion lemma, is also termed as the Woodbury matrix identity; also popularly known sometime as the Woodbury matrix identity. This is our example number 7 and what it is? It is a very convenient principle for the inversions a convenient property for matrix inversions or convenient you can also say trick to compute the inverse of a matrix; convenient property for matrix inversion or to compute

the inverse of a matrix. What it states is that if I have a matrix inverse of the form A plus UCV inverse.

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$$(A + UCV)^{-1} = A^{-1} - A^{-1}U(C^{-1} + VA^{-1}U)^{-1}VA^{-1}$$

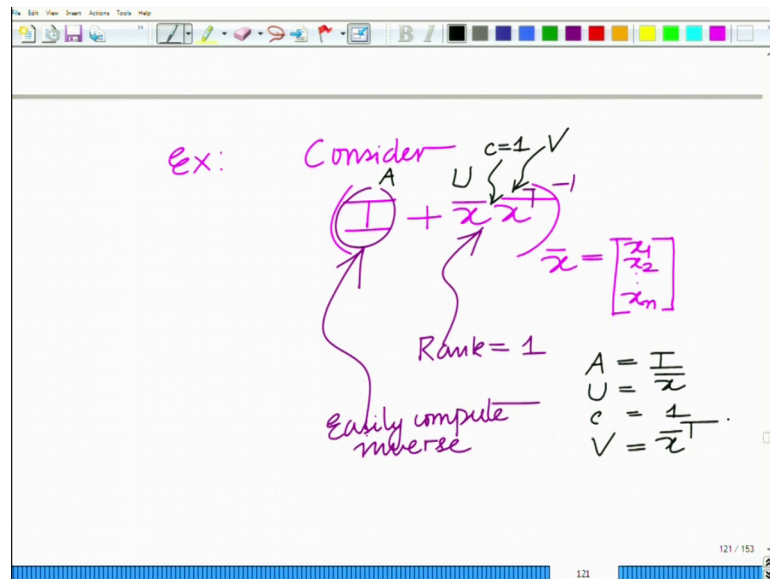
Annotations in the image:

- An arrow points from the text "To compute inverse of matrix" to the main equation.
- An arrow points from the text " $A^{-1}$  is known" to the  $A^{-1}$  term in the equation.
- An arrow points from the text " $UCV = \text{low rank Matrix}$ " to the  $UCV$  term in the equation.

So, I want to compute the inverse of this matrix to compute the inverse of this matrix of the matrix A plus UCV, this inverse is given as follows, this inverse is given as follows that will be equal to A inverse minus A inverse U times C inverse plus VA inverse U inverse into VA inverse and this is the matrix inverse and this is especially convenient if the inverse of A is already known; let us say A is a large matrix, for which the inverse is already known or can be computed rather easily and this quantity UCV is a low rank matrix ok.

So, this is very handy if A inverse is known for instance this requires A inverse you can see this and UCV equals a low rank that is it is not a full rank matrix, although it can be used even when it is a full rank matrix its handy when it is a low rank matrix.

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For instance to understand this better let us look at a simple example or let us call this an illustration. Consider, computing the inverse of  $I$  plus  $\bar{x} \bar{x}^T$  where  $\bar{x}$  is a vector; this is the vector  $x_1 \times 2$  up to  $x_n$  and this  $\bar{x} \bar{x}^T$  is a rank 1 matrix. So, we want to compute the inverse of this and you can see this  $\bar{x} \bar{x}^T$  has rank equal to 1; this is a rank 1 matrix that is we compute  $\bar{x} \bar{x}^T$  you will realize that  $\bar{x} \bar{x}^T$  is the rank 1 matrix or basically a rank deficient matrix and if you look at this  $I$ , this is a matrix for which you can easily compute the inverse;  $I$  inverse is nothing but  $I$ .

So, this is what we mean this is its sort of a very illustrative case where this matrix inversion identity can be used and in fact, if you look at or compare or this thing this is our  $A$  or  $\bar{x}$  is  $U$ . Now there is no  $c$ , so  $c$  is basically the constant its simply 1 and  $V$  is this is  $V$  equals  $\bar{x}^T$ . So, in our matrix inversion lemma we have  $A$  equals  $I$ ,  $U$  equals  $\bar{x}$ ,  $c$  equals 1 and  $V$  equals  $\bar{x}^T$  and  $v$  equals  $\bar{x}^T$  ok. So, that is what that is a property that we can use and now with this settings we can use this property of the matrix inversion lemma and this can be done as follows.

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$$\begin{aligned}
 A^{-1} &= I \\
 (I + \bar{x} \bar{x}^T)^{-1} &\stackrel{c^{-1}=1}{=} I - I \bar{x} (1 + \bar{x}^T I \bar{x})^{-1} \bar{x}^T I \\
 &= I - I \bar{x} \underbrace{(1 + \|\bar{x}\|^2)^{-1}}_{\text{Scalar}} \bar{x}^T I \\
 &= I - \frac{\bar{x} \bar{x}^T}{1 + \|\bar{x}\|^2}
 \end{aligned}$$

Now, note that A inverse equals identity A is identity, so inverse is identity. So, I plus x bar x bar transpose inverse equals well this equals A inverse, which is I minus, this is A inverse once again I into U that is x bar times c inverse c equals 1. So, c inverse is c inverse equals 1, so c inverse plus V x bar transpose A inverse, which is again identity times U, which is x bar inverse c inverse plus V inverse U inverse into VA inverse; V is again x bar transpose and A inverse is identity, which is equal to now you can see this is I minus I times x bar; this is 1 plus you can see x bar transpose x bar into identity into x bar is simply x bar transpose into x bar this is norm x bar square inverse into x bar transpose into identity.

And what you can see here is that this quantity 1 plus x bar square this is a scalar quantity, this is simply a number because remember norm x bar is a number norm of vector that is length of the vector x bar norm x bar square is also a number, all right.

So, 1 plus norm x bar square is a number. So, inverse of a number is simply the reciprocal that is 1 over that number ok. So, I can simply write this now once you realize that I can simply write this and of course, these are simply identity matrix. So, I can simply write this as x bar x bar transpose divided by 1 plus norm x bar square and this is basically the expression for the inverse of you can readily compute this. So, this is basically your expression for the inverse of I plus x bar x bar transpose.

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$$= I - \frac{\text{Scalar } \bar{x} \bar{x}^T}{1 + \|\bar{x}\|^2}$$

$$\frac{1}{(I + \bar{x} \bar{x}^T)^{-1}}$$

Quick check:

$$(I + \bar{x} \bar{x}^T) \left( I - \frac{\bar{x} \bar{x}^T}{1 + \|\bar{x}\|^2} \right)$$

$$= I + \bar{x} \bar{x}^T$$

So, the simple trick can be readily used to compute the inverse of such matrices and you can just do a quick check for instance, you can do a quick check to verify that this is indeed the inverse. You can check  $I$  plus  $\bar{x} \bar{x}^T$  into its purported or claimed inverse that is  $\bar{x} \bar{x}^T$  divided by  $1 + \|\bar{x}\|^2$  well this gives  $I$  times  $I$  plus  $\bar{x} \bar{x}^T$  into identity that is simply  $\bar{x} \bar{x}^T$  minus  $I$  into  $\bar{x} \bar{x}^T$  by norm  $1 + \|\bar{x}\|^2$ , so minus  $\bar{x} \bar{x}^T$  divided by  $1 + \|\bar{x}\|^2$  minus  $\bar{x} \bar{x}^T$  into  $\bar{x} \bar{x}^T$  divided by  $1 + \|\bar{x}\|^2$ .

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$$= I - \frac{\bar{x} \bar{x}^T}{1 + \|\bar{x}\|^2} + \frac{\bar{x} (\bar{x}^T \bar{x}) \bar{x}^T}{1 + \|\bar{x}\|^2}$$

$$= I - \frac{\bar{x} \bar{x}^T}{1 + \|\bar{x}\|^2} + \frac{\|\bar{x}\|^2 \bar{x} \bar{x}^T}{1 + \|\bar{x}\|^2}$$

Now, if you look at this quantity  $\bar{x} \bar{x}^T$  that is equal to norm of  $\bar{x}$  square. So, this is therefore, equal to  $I + \bar{x} \bar{x}^T$  minus  $\bar{x} \bar{x}^T$  by  $1 + \|\bar{x}\|^2$  minus  $\bar{x} \bar{x}^T$  by  $1 + \|\bar{x}\|^2$  is norm  $\bar{x}$  square it is a scalar which comes out norm  $\bar{x}$  square times  $\bar{x} \bar{x}^T$  by  $1 + \|\bar{x}\|^2$  now if you look at these 2 terms you have  $\bar{x} \bar{x}^T$  by  $1 + \|\bar{x}\|^2$  and norm  $\bar{x}$  square into  $\bar{x} \bar{x}^T$  by  $1 + \|\bar{x}\|^2$ .

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The image shows a whiteboard with the following handwritten derivation:

$$\begin{aligned}
 &= I + \bar{x} \bar{x}^T - \frac{\bar{x} \bar{x}^T}{1 + \|\bar{x}\|^2} \\
 &= I + \bar{x} \bar{x}^T - \frac{\|\bar{x}\|^2 \bar{x} \bar{x}^T}{1 + \|\bar{x}\|^2} \\
 &= I + \bar{x} \bar{x}^T - \bar{x} \bar{x}^T \\
 &= I
 \end{aligned}$$

So, this is simply  $I + \bar{x} \bar{x}^T$  minus  $\bar{x} \bar{x}^T$  times  $1 + \|\bar{x}\|^2$  correct  $1 + \|\bar{x}\|^2$  divided by  $1 + \|\bar{x}\|^2$ , which is equal to  $I + \bar{x} \bar{x}^T$  minus  $\bar{x} \bar{x}^T$  which is indeed equal to identity and therefore what we have checked is that  $I + \bar{x} \bar{x}^T$  inverse is indeed  $I - \bar{x} \bar{x}^T$  by  $1 + \|\bar{x}\|^2$ .

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The image shows a handwritten derivation of the matrix inversion identity for a rank-1 update. The equation is enclosed in a blue rectangular box and reads:

$$(I + \bar{x} \cdot \bar{x}^T)^{-1} = I - \frac{\bar{x} \cdot \bar{x}^T}{1 + \|\bar{x}\|^2}$$

Below the box, an arrow points from the text "Matrix Inversion Identity." to the boxed equation.

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So, we have used this handy property that is the matrix we have demonstrated this using the matrix inversion identity or the Woodberry matrix inversion or the Woodberry matrix inversion lemma all right. So, basically that completes the example.

Thank you very much.