

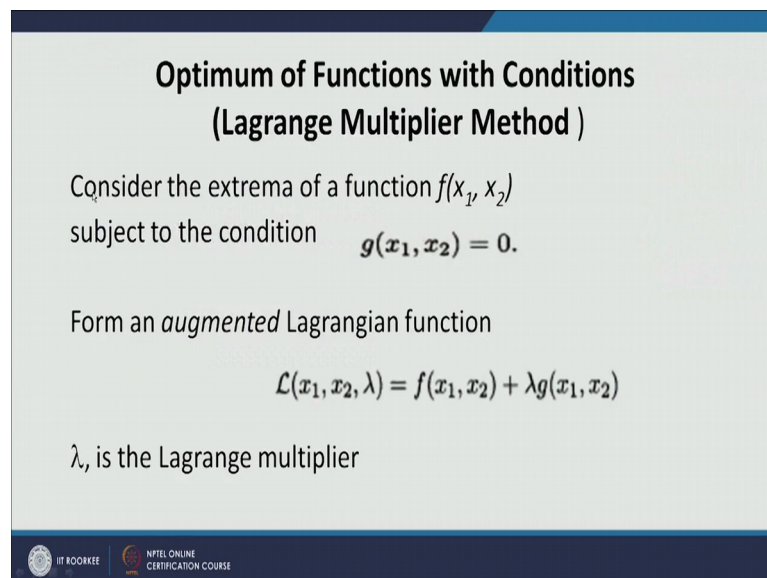
Optimal Control
Dr. Barjeev Tyagi
Department of Electrical Engineering
Indian Institute of Technology, Roorkee

Lecture - 10
Optimum of Functions with Conditions
(Lagrange Multiplier Method)

Welcome friends into the optimal control class. In the previous lecture we have discussed about the optimum of functions with condition and the approach which we have seen that was the direct approach. Say if a function is a variable of the, is a function of the 2 variable say x_1 and x_2 . So, we will eliminate the one and then simply take the df by dx equal to 0 to find out the optimum point and $d^2 f$ by dx^2 to get the sufficient condition if this is greater than 0 we get the minima if it is less than 0 we get the maxima.

Today we will continue the same topic optimum of functions with condition, but approach here we will take the Lagrangian approach.

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Optimum of Functions with Conditions
(Lagrange Multiplier Method)

Consider the extrema of a function $f(x_1, x_2)$
subject to the condition $g(x_1, x_2) = 0$.

Form an *augmented* Lagrangian function

$$\mathcal{L}(x_1, x_2, \lambda) = f(x_1, x_2) + \lambda g(x_1, x_2)$$

λ , is the Lagrange multiplier

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Let us see the problem our problem is we have a function, f which is the function of the 2 variables x_1 and x_2 , subjected to a condition given as the $g(x_1, x_2) = 0$ and objective is to get the optimum value of the function f with the given condition. In the Lagrangian approach we first define a augmented function called the Lagrangian function given as the L which is also the function of the 2 variable x_1, x_2 and the third

variable we introduce that is lambda. And this is written as the $f(x_1, x_2)$ which is my given function plus lambda times whatever be the condition $g(x_1, x_2)$ lambda we called the Lagrangian multiplier. What is the role of the Lagrangian multiplier? That you will see in this lecture. Normally lambda is the user choice we have to select the lambda depending upon the condition arises. We will see in the next part.

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**Optimum of Functions with Conditions
(Lagrange Multiplier Method)**

$$\mathcal{L}(x_1, x_2) = f(x_1, x_2)$$


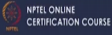
A necessary condition for extrema is

$$df = d\mathcal{L} = 0$$

The Lagrangian is optimum

$$d\mathcal{L} = df + \lambda dg = 0$$

$$\left[\frac{\partial f}{\partial x_1} + \lambda \frac{\partial g}{\partial x_1} \right] dx_1 + \left[\frac{\partial f}{\partial x_2} + \lambda \frac{\partial g}{\partial x_2} \right] dx_2 = 0$$

So, if you will see my Lagrangian is nothing but equal to $f(x_1, x_2)$ because $g(x_1, x_2)$ is nothing but I have the 0 value. So, if I am writing L as $f(x_1, x_2)$. So, the minimization of the f was say the, to determine the optimal value of the f is same as to determine the optimal value of the L because my condition is 0. So, the necessary condition for an extrema, so that is df equal to dL equal to 0. So, I have to take the df the differential of my function must be equal to 0 because the optimal value of the f is same as the optimal value of the L, so we can say f equal to the differential of the L and that all must be equal to 0. Because f we have taken as sorry, L we have taken as the f plus lambda g. So, differential of the L we can write as the df plus lambda times dg.

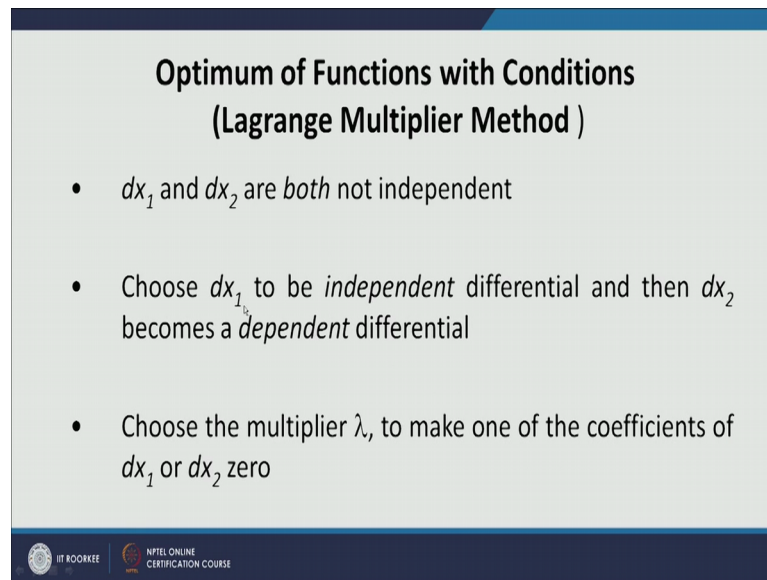
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$$\begin{aligned} & f(x_1, x_2) \\ df &= \frac{\partial f}{\partial x_1} dx_1 + \frac{\partial f}{\partial x_2} dx_2 \\ g(x_1, x_2) &= 0 ; \quad dg = \frac{\partial g}{\partial x_1} dx_1 + \frac{\partial g}{\partial x_2} dx_2 \\ \mathcal{L} &= f(\cdot) + \lambda g(\cdot) \\ d\mathcal{L} &= df + \lambda dg = 0 \\ &= \frac{\partial f}{\partial x_1} dx_1 + \frac{\partial f}{\partial x_2} dx_2 + \lambda \left[\frac{\partial g}{\partial x_1} dx_1 + \frac{\partial g}{\partial x_2} dx_2 \right] = 0 \\ df + d\mathcal{L} &= \left(\frac{\partial f}{\partial x_1} + \lambda \frac{\partial g}{\partial x_1} \right) dx_1 + \left(\frac{\partial f}{\partial x_2} + \lambda \frac{\partial g}{\partial x_2} \right) dx_2 = 0 \end{aligned}$$

Now, if we will determine the value of the df and dg what actually we will get, that we can see because f is a function of x_1 and x_2 . So, I can write my df is nothing but $\frac{\partial f}{\partial x_1} dx_1 + \frac{\partial f}{\partial x_2} dx_2$. Similarly my dg what I can write and what actually I have $g(x_1, x_2)$ which is equal to 0. So, I can write dg as $\frac{\partial g}{\partial x_1} dx_1 + \frac{\partial g}{\partial x_2} dx_2$ and what we are defining for L ? That is nothing but f plus λ times of g and dL we are writing as $df + \lambda dg$. So, if I will place the value of df and dg what actually we will get $\frac{\partial f}{\partial x_1} dx_1 + \frac{\partial f}{\partial x_2} dx_2 + \lambda \left[\frac{\partial g}{\partial x_1} dx_1 + \frac{\partial g}{\partial x_2} dx_2 \right]$.

So, in this expression if I will collect the terms of the dx_1 and dx_2 , so I can write this nothing but as $\left(\frac{\partial f}{\partial x_1} + \lambda \frac{\partial g}{\partial x_1} \right) dx_1 + \left(\frac{\partial f}{\partial x_2} + \lambda \frac{\partial g}{\partial x_2} \right) dx_2$. So, this dL or we can say dL that I can represented as in terms of the dx_1 and dx_2 which we can see here. So, we are representing by this and this whole is equal to 0 because dL is equal to 0, so this equal to 0 and this equal to 0. So, anyway we can say my $\left(\frac{\partial f}{\partial x_1} + \lambda \frac{\partial g}{\partial x_1} \right) dx_1 + \left(\frac{\partial f}{\partial x_2} + \lambda \frac{\partial g}{\partial x_2} \right) dx_2 = 0$. So, this we are trying to get the necessary condition.

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**Optimum of Functions with Conditions
(Lagrange Multiplier Method)**

- dx_1 and dx_2 are *both* not independent
- Choose dx_1 to be *independent* differential and then dx_2 becomes a *dependent* differential
- Choose the multiplier λ , to make one of the coefficients of dx_1 or dx_2 zero

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Now if we will see what actually x_1 , x_2 x_1 and x_2 are not independent because this is the 2 variables related to each other. So, this means dx_1 and the dx_2 are also not independent, if we will choose one of the variable say x_1 is the independent variable then x_2 will be the dependent variable on x_1 . So, I can choose dx_1 as my independent variable then dx_2 will be the dependent on x_2 . Now here comes the role of the lambda what actually lambda we will take. So, this lambda we can choose the value of the lambda such that say in this case if I will choose lambda such that my coefficient of the dependent variable if this will become 0. So, that will be the, that will be my choice for the lambda.


At one take if having this if I will choose a lambda which will make the coefficient of the dx_2 as 0. So, my initial conditions simply will be which is dependent on the dx_1 . So, that is why we say we have to choose lambda to make one of the coefficient of dx_1 or dx_2 to 0.

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**Optimum of Functions with Conditions
(Lagrange Multiplier Method)**

let λ take on the value λ^* that makes the coefficient of the *dependent* differential dx_2 equal zero
that is

$$\frac{\partial f}{\partial x_2} + \lambda^* \frac{\partial g}{\partial x_2} = 0$$



In this case we are selecting the lambda say the value lambda is star which will make the coefficient of the dx_2 , 0. So, in that case what was my coefficient of the dx_2 ? This we are making 0, so this means $\frac{\partial f}{\partial x_2} + \lambda^* \frac{\partial g}{\partial x_2}$ that will be equal to 0 if this term is 0.

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**Optimum of Functions with Conditions
(Lagrange Multiplier Method)**

Therefore

$$\left[\frac{\partial f}{\partial x_1} + \lambda \frac{\partial g}{\partial x_1} \right] dx_1 = 0$$
$$\frac{\partial f}{\partial x_1} + \lambda^* \frac{\partial g}{\partial x_1} = 0$$

and

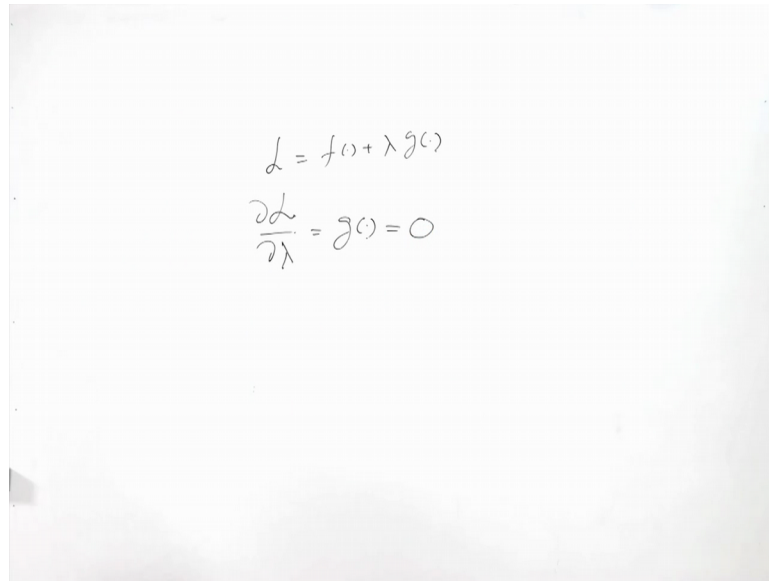
$$\frac{\partial \mathcal{L}}{\partial \lambda} = 0$$



So, I will left only with the $\frac{\partial f}{\partial x_1} + \lambda^* \frac{\partial g}{\partial x_1}$ dx_1 which will be equal to 0.

Now, in this equation my dx_1 is an arbitrary function which can take any value. So, the coefficient of the dx_1 this will also be equal to 0. So, what was my condition? My first condition was the $\frac{\partial f}{\partial x_2} + \lambda \frac{\partial g}{\partial x_2} = 0$, x_1 is the independent variable dx_1 is the arbitrary, so the coefficient of the dx_1 that will also be equal to 0.

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The image shows a whiteboard with two handwritten equations. The first equation is $L = f(x) + \lambda g(x)$. The second equation is $\frac{\partial L}{\partial \lambda} = g(x) = 0$.



And if you will see what is my L , as my L is nothing but f plus λg . So, if I will take $\frac{\partial L}{\partial \lambda}$ this is nothing but my g which is 0. So, even I can write my last equation as $\frac{\partial L}{\partial \lambda} = 0$.

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**Optimum of Functions with Conditions
(Lagrange Multiplier Method)**

Therefore for extrema of a function $f(x_1, x_2)$ with condition $g(x_1, x_2) \neq 0$, the following conditions must satisfy

$$\frac{\partial f}{\partial x_1} + \lambda^* \frac{\partial g}{\partial x_1} = 0.$$
$$\frac{\partial f}{\partial x_2} + \lambda^* \frac{\partial g}{\partial x_2} = 0$$
$$\frac{\partial \mathcal{L}}{\partial \lambda} = 0$$

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So, I have the three conditions now, if f is a function of x_1 and x_2 . So, my to get the minimum my equation will be $\frac{\partial f}{\partial x_1} + \lambda^* \frac{\partial g}{\partial x_1} = 0$, $\frac{\partial f}{\partial x_2} + \lambda^* \frac{\partial g}{\partial x_2} = 0$ and the third equation is $\frac{\partial \mathcal{L}}{\partial \lambda} = 0$.

So, to get the necessary condition we can apply this. So, these three equation will give me the x_1 , x_2 and λ these are the three variables which we have to determine. So, simply by writing this I will have the number of equation equal to number of variables and these can be solved to determine the value of the x_1 , x_2 and λ , and these will be my optimal values.

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**Optimum of Functions with Conditions
(Lagrange Multiplier Method)**



Consider the extrema of a continuous, real-valued function
 $f(\mathbf{x}) = f(x_1, x_2, \dots, x_n)$
subject to the conditions

$$g_1(\mathbf{x}) = g_1(x_1, x_2, \dots, x_n) = 0$$
$$g_2(\mathbf{x}) = g_2(x_1, x_2, \dots, x_n) = 0$$

...

$$g_m(\mathbf{x}) = g_m(x_1, x_2, \dots, x_n) = 0$$

where, f and g have continuous partial derivatives, $m < n$.

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So, this was the case in which we are considering only the 2 variables x_1, x_2 , but if we will generalize this case then suppose we consider a function which is a function of a vector \mathbf{x} means $f(\mathbf{x})$ is equal to $f(x_1, x_2, \dots, x_n)$. So, it is a function of these n states. So, this n optimal value we have to determine and this is subjected to the condition g_1, g_2, \dots, g_m all are the function of x_1 to x_n all equation. Where $g_1 = 0, g_2 = 0, \dots, g_m = 0$ and for a feasible solution the value of the m means the number of the condition must be less than the number of the variables which we have considered at the most they may be equal to each other, but m cannot be greater than n in that case my number of variables will be more than the number of equations and we are not able to find out the solution in that case. So, we put the condition that m should be less than n .

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**Optimum of Functions with Conditions
(Lagrange Multiplier Method)**

Let $\lambda_1, \lambda_2, \dots, \lambda_m$ be the Lagrange multipliers corresponding to m conditions

$$\mathcal{L}(\mathbf{x}, \boldsymbol{\lambda}) = f(\mathbf{x}) + \boldsymbol{\lambda}'\mathbf{g}(\mathbf{x})$$

where, $\boldsymbol{\lambda}'$ is the transpose of $\boldsymbol{\lambda}$.

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So, in this case also we can write our augmented function Lagrangian function, L as f plus λ prime g where f is a function of x_1 to x_m and λ prime is a vector.

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Handwritten mathematical derivation on a whiteboard:

$$f(x) = f(x_1, x_2, \dots, x_n) \quad x = \begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_n \end{bmatrix}$$
$$\begin{matrix} g_1(x) = 0 \\ \vdots \\ g_m(x) = 0 \end{matrix} \quad \lambda = \begin{bmatrix} \lambda_1 \\ \lambda_2 \\ \vdots \\ \lambda_m \end{bmatrix}$$
$$L = f(x_1, x_2, \dots, x_n) + [\lambda_1 \lambda_2 \dots \lambda_m] \begin{bmatrix} g_1(x) \\ g_2(x) \\ \vdots \\ g_m(x) \end{bmatrix}$$
$$= f + \lambda' g$$

So, let us write this as my f is a function of x_1, x_2 and x_n or we are saying my x is a vector of x_1, x_2 and x_n . So, f will be the function of this. We have the conditions g_1 equal to 0 to g_m equals to 0. I have the m number of the condition. So, the Lagrangian multiplier λ which we have to select this will be nothing but a vector of λ_1, λ_2 each multiplier for each condition to λ_m . So, once we have to write my

Lagrangian this will be nothing but my f the function which is given x_1, x_2 sorry, this is equal to n, x_n plus λ prime; λ prime we are writing is $\lambda_1 \lambda_2$ up to λ_m multiplied with the condition $g_1 g_2$ and up to g_m . This means $\lambda_1 g_1 + \lambda_2 g_2 + \dots + \lambda_m g_m$. So, that will be my augmented function L .

And this we are writing as f plus λ prime g , where λ prime is nothing but representing the vector λ which we have selected here. So, prime represent here the transpose of λ . So, transpose of the λ will be λ_1 to λ_m . So, we can write my augmented function as L equal to f plus λ prime g . The optimal value x and λ are the solution of my equations $\frac{\partial L}{\partial x} = \frac{\partial f}{\partial x} + \lambda$ prime $\frac{\partial g}{\partial x}$ as we have seen in the first case $\frac{\partial L}{\partial \lambda}$ which is nothing but equal to g that must be equal to 0.

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**Optimum of Functions with Conditions
(Lagrange Multiplier Method)**

The optimal values x^ and λ^* are the solutions of the following $n + m$ equations*

$$\frac{\partial \mathcal{L}}{\partial \mathbf{x}} = \frac{\partial f}{\partial \mathbf{x}} + \lambda' \frac{\partial \mathbf{g}}{\partial \mathbf{x}} = 0$$

$$\frac{\partial \mathcal{L}}{\partial \lambda} = \mathbf{g}(\mathbf{x}) = 0.$$

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So, this the first $\frac{\partial L}{\partial x}$ this is represent the n number of the equation because this is $\frac{\partial L}{\partial x_1}, \frac{\partial L}{\partial x_2}, \dots, \frac{\partial L}{\partial x_n}$.

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The image shows handwritten mathematical equations on a whiteboard. At the top, it says 'n eqns' followed by the equation $\frac{\partial L}{\partial x} = \frac{\partial f}{\partial x} + \lambda' \frac{\partial g}{\partial x} = 0$ and $\frac{\partial L}{\partial \lambda} = 0$. Below this, a large curly brace groups 'n eqns' and contains three equations: $\frac{\partial L}{\partial x_1} = \frac{\partial f}{\partial x_1} + \lambda_1 \frac{\partial g}{\partial x_1} = 0$, $\frac{\partial L}{\partial x_2} = \frac{\partial f}{\partial x_2} + \lambda_2 \frac{\partial g}{\partial x_2} = 0$, and $\frac{\partial L}{\partial x_n} = \frac{\partial f}{\partial x_n} + \lambda_m \frac{\partial g}{\partial x_n} = 0$. At the bottom, another curly brace groups 'm eqns' and contains three equations: $\frac{\partial L}{\partial \lambda_1} = 0$, $\frac{\partial L}{\partial \lambda_2} = 0$, and $\frac{\partial L}{\partial \lambda_m} = 0$.

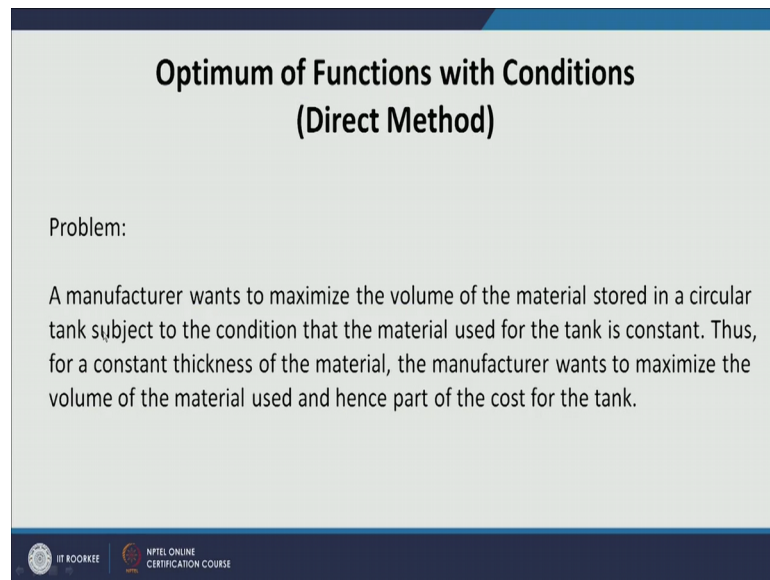
So, here if we are saying del L by del x equal to del f by del x plus lambda prime del g by del x and this we are saying equal to 0. So, this will contain n equation.

So, if we are taking del L by del x as del f by del x plus lambda prime del g by del x equal to 0. So, this means this is representing my n number of the equation which is equivalent to del L by del x 1, del f by del x 1 plus lambda 1, del g by del x 1 equal to 0 del L by del x 2, as del f by del x 2 plus lambda 2 del g by del x 2 equal to 0 and last equation del L by del x n as del f by del x n lambda m del g by del x m equal to 0. So, sorry, del g by del x n equal to 0 because g is a function of x 1 to x m f is a function of x 1 2 x n.

Number of Lagrangian multiplier is equal to number of condition which is given. So, these are the n number of the equation these are my n equations, n equations will come from my second condition which will say del L by del lambda equal to 0 this means del L by del lambda 1 equal to 0 del L by del lambda 2 equal to 0 and del L by del lambda m equal to 0 and this will give me m equations. So, I have total n plus m equations which is to be solved to find out the value of x 1 to x n and lambda 1 to lambda n.

So, what the values we are finding there, that all will be my optimal value. To understand clearly let us take one example which we have taken in the, for the direct method also.

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**Optimum of Functions with Conditions
(Direct Method)**

Problem:

A manufacturer wants to maximize the volume of the material stored in a circular tank subject to the condition that the material used for the tank is constant. Thus, for a constant thickness of the material, the manufacturer wants to maximize the volume of the material used and hence part of the cost for the tank.

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The same example we are taking here which is a manufacture want to maximize the volume of the material is stored in a circular tank which is subjected to the condition that material used in the tank is constant. Thus, for a constant thickness of the material, manufacture want to maximize the volume of the material used has he wants to simply reduce the cost, so in a minimum sorry; in the lower cost he can is store the maximum volume.

So, this is the same problem which we have discussed for the direct method approach. So, our objective here is to maximize the volume if we will consider d is the diameter, h is the height.

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The image shows a handwritten derivation on a whiteboard. It starts with the definition of variables: 'd is the diameter, h is the height'. Then, it defines the volume function to be maximized: $V(d, h) = \frac{\pi d^2 h}{4} \rightarrow f(\cdot)$. Next, it defines the surface area constraint: $A(d, h) = \frac{\pi d^2}{2} + \pi dh = A_0$. This constraint is then rearranged to $\frac{\pi d^2}{2} + \pi dh - A_0 = 0 \rightarrow g(\cdot) = 0$. Finally, the Lagrangian function is defined as $\mathcal{L}(d, h, \lambda) = V(d, h) + \lambda g(d, h)$, which is expanded to $\mathcal{L}(d, h, \lambda) = \frac{\pi d^2 h}{4} + \lambda \left[\frac{\pi d^2}{2} + \pi dh - A_0 \right]$.

So, we have to maximize the volume which we are taking V which is a function of d and h and can be written as $\pi d^2 h$ by four let me change this and. So, I have to maximize this volume which will and surface area is a again a $d h$ which is equal to πd^2 square by 2 plus $\pi d h$. So, what is our problem? We have to maximize the volume if my diameter is d and height is h . So, this volume will be $\pi d^2 h$ by 4 my surface area is πd^2 square by 2 plus $\pi d h$, what is my problem, my surface area is constant let say A naught.

So, I have to maximize my volume subjected to the condition for a constant surface area. So, what should be my d and h , so that my volume will be maximized? So, first we are solve this problem by the direct approach in which we are one of the variable, we are finding in terms of the A naught and substituting this value into the V taking $d V$ by that particular variable equal to 0, so this give us the condition. In this case this is my f and condition I can write it as πd^2 square by 2 plus $\pi d h$ minus A naught equal to 0 and this is nothing but like my g equal to 0. So, as my first step I have to define my Lagrangian. So, my Lagrangian will be in this case f plus λg . So, I will have plus λg which again is a function of d and h , V I can write as $\pi d^2 h$ by 4 plus λ times and g is πd^2 square by 2 plus $\pi d h$ minus A naught. So, this will be my Lagrangian.

So, this Lagrangian if I will say, this L is a function of d h and lambda. So, in my Lagrangian approach I have to take del L by del d equal to 0, del L by del h equal to 0, del L by del lambda equal to 0.

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$$\begin{cases} \frac{\partial L}{\partial h} = 0 \Rightarrow \frac{\pi d^2}{4} + \lambda(\pi d) = 0 \\ \frac{\partial L}{\partial d} = 0 \Rightarrow \frac{\pi d h}{2} + \lambda(\pi d + \pi h) = 0 \\ \frac{\partial L}{\partial \lambda} = 0 \Rightarrow \frac{\pi d^2}{2} + \pi d h - A_0 = 0 \end{cases}$$

Solving these Equations find d^* , h^* , λ^*

$$\lambda^* = -\sqrt{\frac{A_0}{24\pi}} \quad ; \quad h^* = d^* = \sqrt{\frac{2A_0}{3\pi}}$$

So, if L is this what I have? Del L by del h equal to 0 and this gives me with respect to a h I am differentiating del L by del h pi d square by 4 plus with respect to h I have to differentiate. So, pi lambda times pi d because this is independent of h this is independent of h, so I will left only the pi d that is equal to 0. My next condition is del L by del d equals to 0, I have to differentiate this with respect to d. So, this is giving me pi d h by 2, 2 d to 2 this will give me pi dg by 2 plus lambda times pi d and this will give me the pi h and this equal to 0 and my third condition is del L by del lambda equal to 0 and this will give me nothing but whatever we my condition which is pi d square by 2 plus pi d h minus A naught equal to 0.

So, these three equations n is 2 here I have the 2 variable, m I have the one condition. So, as the total three equations; I have the three variables d h and lambda, these three I can find out by solving this equation. So, solving these equations find t star h star and lambda star. So, the solution of the equation gives me lambda star is A naught by 24 pi and as we have find in the previous case my h height is equal to diameter and this is equal to 2 A naught by 3 pi. So, in this way we can find out the optimum of a function which is subjected to a given condition.

So, simply we have to write first the augmented Lagrangian function which is nothing but my function which I have to minimize f plus λ times what is my condition g then I have to differentiate L with respect to all my variables. Like in this case d and h versus the x_1, x_2, \dots, x_n $\frac{\partial L}{\partial x_1} = 0$, $\frac{\partial L}{\partial x_2} = 0$ and similarly for all the λ s.

So, today's lecture we stop here and in the next class we will start our discussion on the optimum of the functional. So, till now we have discussed only the functions and in the next class we will start our optimum of the functional with the given conditions.

Thank you very much.