

PROGRAM : KUHN - TUCKER
BORDERED HESSIANS
DIFFERENTIAL EQUATIONS

EARLIER EXAMS + SOLUTIONS:

IT'S LEARNING (GRA 6035)

COURSE WEBSITE

| GRA 6035 MATHEMATICS 2010/2011
(LAST YEARS WEBSITE)

THERE YOU WILL FIND:

10.12.2010 LAST YEARS EXAM

22.12.2010 MOKK EXAM
(QUITE HARD)

30.05.2011

KUHN-TUCKER

$$\max f(x_1, \dots, x_n) \quad \text{SUB. TO} \quad \begin{cases} g_1(x_1, \dots, x_n) \leq b_1 \\ \vdots \\ g_m(x_1, \dots, x_n) \leq b_m \end{cases}$$

THE VECTORS SATISFYING THESE CONSTRAINTS ARE CALLED ADMISSIBLE.

$$\textcircled{1} \quad \mathcal{L} = f(x_1, \dots, x_n) - \lambda_1 (g_1(x_1, \dots, x_n) - b_1) - \lambda_2 \dots$$

THIS GIVES THE FOLLOWING FIRST ORDER CONDITIONS

$$\textcircled{2} \quad \frac{\partial \mathcal{L}}{\partial x_i} = \frac{\partial f}{\partial x_i} - \sum_{j=1}^m \lambda_j \frac{\partial g_j}{\partial x_i} = 0$$

NEW THING:

$$\textcircled{3} \quad \lambda_j \geq 0 \quad \text{WITH} \quad \lambda_j = 0 \Rightarrow g_j(x) < b_j$$

THIS IS ~~USUALLY~~ USUALLY WRITTEN

$$\lambda_j (g_j(x) - b_j) = 0$$

(ONLY ONE ZERO AT THE TIME.)

**COMPLEMENTARY SLACKNESS
CONDITION**

EX. ~~PROB~~ EXERCISE 4 EX. 30.05.11

~~NUMBER~~ 4 b)

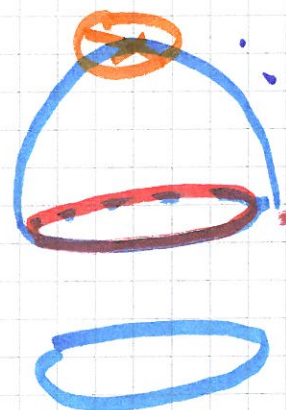
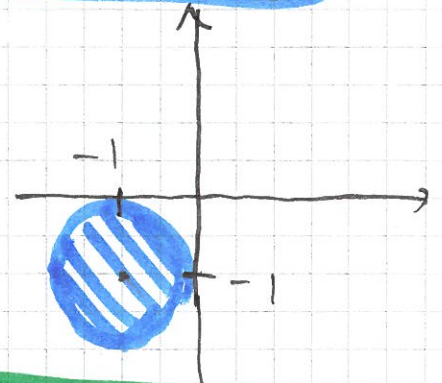
$$f(x,y) = \underline{xy} e^{x+y} \quad \text{SUB}$$

$$\mathcal{L} = xy e^{x+y} - \lambda [(x+1)^2 + (y+1)^2 - 1]$$

$$\text{I. } \mathcal{L}_x = (x+1)y e^{x+y} - 2\lambda(x+1) = 0$$

$$\text{II. } \mathcal{L}_y = (y+1)x e^{x+y} - 2\lambda(y+1) = 0$$

$$\text{III. } \lambda > 0 \quad \lambda [(x+1)^2 + (y+1)^2 - 1] = 0$$



BINDING CONSTRAINT

$$\frac{\partial f}{\partial x} = y e^{x+y} + xy e^{x+y} \cdot 1 = (x+1)y e^{x+y}$$

① $\lambda = 0 \Rightarrow$ WE ARE LOOKING FOR \otimes

② $\lambda > 0$ **CONSTRAINT TURNED ON**
 \Rightarrow WE ARE ON THE BOUNDARY.

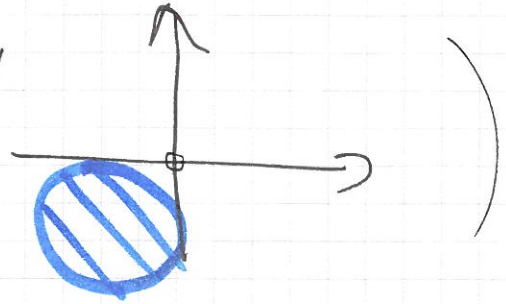
THE CANDIDATES: I. $(x+1)[y e^{x+y} - 2\lambda] = 0$
 II. $(y+1)[x e^{x+y} - 2\lambda] = 0$

$$x = -1 \quad y = -1 \quad \lambda = 0$$

THIS IS THE ONLY ONE. WHY? NOTE x OR y ~~NOT~~
 WE GET $2\lambda = y e^{x+y}$ AND SINCE $x+1 \neq 0$
 $y < 0$

WHY? NOTE THAT x OR $y \neq 0$.

$$\left((x+1)^2 + (y+1)^2 \leq 1 \right)$$



ASSUME $y \neq 0$ ($x+1 \neq 0$)

WE GET $2\lambda = y e^{x+y}$

AND [I. $(x+1)(y e^{x+y} - 2\lambda) = 0$]

SINCE $y < 0$ WE GET A CONTRADICTION
TO [II] $\lambda \geq 0$.

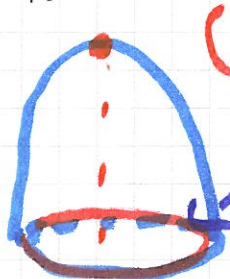
IN SHORT: ONLY ~~ONE~~ ONE CANDIDATE

$(-1, -1, \lambda = 0)$

(YESTERDAY WE PROVED THAT f WAS
~~CONVEX~~ CONCAVE. HENCE

$(-1, -1)$ SOLVES THE PROBLEM.

[$(-1, -1)$ GIVES THE MAX!]]



$(-1, -1, \text{SOMETHING})$

THE $\lambda \geq 0$ CONDITION
IS SMART ENOUGH
TO SEE THAT BORDER
POINTS HERE CAN
NOT BE MAX !!

b. FIND MAX/MIN VALUES OF f

$$\mathcal{L} = xy e^{x+y} - \lambda ((x+1)^2 + (y+1)^2 - 1)$$

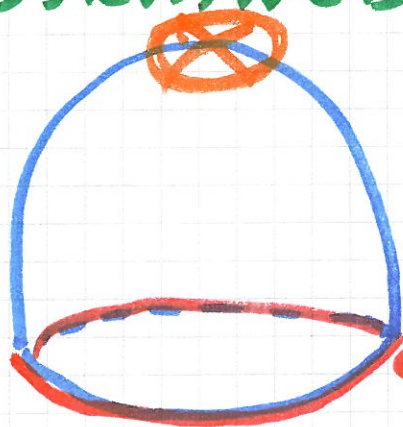
$$\text{I. } \mathcal{L}'_x = (x+1)y e^{x+y} - 2\lambda(x+1) = 0$$

$$\text{II. } \mathcal{L}'_y = (y+1)x e^{x+y} - 2\lambda(y+1) = 0$$

$$\text{III. } \lambda \geq 0 \quad \lambda ((x+1)^2 + (y+1)^2 - 1) = 0$$

SLACKNESS CONDITION
NOT BOTH ~~IS~~ ZERO.

NOTE: THAT $\lambda = 0$ THEN
CORRESPONDS TO THE UN-
CONSTRAINED PROBLEM.



① $\lambda = 0 \Rightarrow$ WE ARE LOOKING
FOR ~~IS~~

② $\lambda > 0$ CONSTRAINT ON
 \Rightarrow WE ARE
ON THE BOUNDARY

A BIRDS VIEW TO THE SOLUTION OF THE PROBLEM:

$$\max xy e^{x+y} \quad \text{SUB} \quad (x+1)^2 + (y+1)^2 \leq 1$$

$$\text{I. } (x+1)y e^{x+y} - 2\lambda(x+1) = 0$$

$$\text{II. } (y+1)x e^{x+y} - 2\lambda(y+1) = 0$$

$$\text{III. } \lambda \geq 0 \quad \lambda ((x+1)^2 + (y+1)^2 - 1) = 0$$

$$\lambda = 0$$

BACK TO NORMAL

NO CONSTRAINTS

$$\lambda \neq 0$$

CONSTRAINT
TURNED ON:

$$(x+1)^2 + (y+1)^2 = 1$$

SO IT IS IN SOME SENSE ORDINARY LAGRANGE. + AN ADDED

BONUS: $\lambda > 0$, WHICH

ALLOWS US TO GET

RID OF IN THIS CASE ALL CANDIDATES.

RECALL: THIS CORRESPONDS TO WHAT

WE DID IN THE FIRST YEAR COURSE:

1. SEARCH FOR INTERIOR POINTS: $\frac{\partial f}{\partial x} = \frac{\partial f}{\partial y} = 0$

2. ON THE BOUNDARY: USE THE BOUNDARY CONDITION AND FIND POINTS THERE.

IS THE KUHN-TUCKER CONDITIONS
REALLY WHAT WE WANT?

$$\left[\text{KUHN-TUCKER: } \frac{\partial f}{\partial x_i} = \sum_{j=1}^m \lambda_j \frac{\partial g_j}{\partial x_i} \right.$$

$$\lambda_j \geq 0$$

$$\lambda_j (g_j(x_1, \dots, x_n) - b_j) = 0$$

L

DOES IT SOLVE THE MAX f
PROBLEM?

~~YES~~... OR BETTER ALMOST...

FIRST RESULT: KUHN ~~AND~~ TUCKER
NECESSARY CONDITIONS



SUPPOSE $x^* \in S$ (x_1^*, \dots, x_n^*)

SOLVES:

$$\max f(x) \text{ SUB. TO } \begin{cases} g_1(x) \leq b_1 \\ \vdots \\ g_m(x) \leq b_m \end{cases}$$

(AND f DIFFERENTIABLE ON S
 x^* AN INTERIOR POINT OF S)

ASSUME FURTHERMORE THAT

THE FOLLOWING **CONSTRAINT**

QUALIFICATION IS SATISFIED:

$$\text{CQ: } \nabla g_j(x^*) \quad 1 \leq j \leq m$$

CORRESPONDING TO ACTIVE
CONSTRAINTS AT x^* ARE
LINEARLY INDEPENDENT,

THEN THERE EXISTS $\lambda_1 \dots \lambda_m$
SUCH THAT THE KKT/TUCKER
CONDITIONS HOLD AT $x = x^*$.

THE IMPORTANT THING IN COMPUTATIONS,
IS THE FOLLOWING:

THE KUHN-TUCKER CONDITIONS ARE
SUFFICIENT IF THE LAGRANGIAN
IS CONCAVE.

SO IN PRACTICE, THE WORKING HORSE
IS :

KUHN TUCKER
+ CONCAVE

BORDERED HESSIANS

COMMENT ON ; REVISITING

$$\text{LOCAL max (min)} f(x, y, z) = x^2 + y^2 + z^2$$

$$g_1(x, y, z) = x + y + z = 30$$

$$g_2(x, y, z) = 2x - y - 3z = 10$$

GIVEN $P(10, 10, 0)$ WHAT CAN WE SAY?

CRITICAL POINT:

RECALL: $(-1)^m B_r(x^*) > 0 \quad r = m+1 \dots n \quad \text{LOC MIN}$

$(-1)^r B_r(x^*) > 0 \quad r = m+1 \dots n \quad \text{LOC MAX}$

NOTE THAT r IS NOT THE DIMENSION OF THE DETERMINANT.

IN THIS CASE: $m=2$ AND $n=3$

SO $r=3$ IS THE ONLY ONE WE NEED TO CHECK.

$$B_3(P) = \begin{pmatrix} 0 & 0 & \frac{\partial g_1}{\partial x} & \frac{\partial g_1}{\partial y} & \frac{\partial g_1}{\partial z} \\ 0 & 0 & \frac{\partial g_2}{\partial x} & \frac{\partial g_2}{\partial y} & \frac{\partial g_2}{\partial z} \\ L''_{xx} & L''_{xy} & L''_{xz} \\ L''_{yx} & L''_{yy} & L''_{yz} \\ L''_{zx} & L''_{zy} & L''_{zz} \end{pmatrix} = \begin{pmatrix} 0 & 0 & 1 & 2 & 1 \\ 0 & 0 & 2 & -1 & -3 \\ 1 & 2 & 2 & 0 & 0 \\ 2 & -1 & 0 & 2 & 0 \\ 1 & -3 & 0 & 0 & 2 \end{pmatrix}$$

$$(-1)^2 B_3(P) = 150 > 0 \quad \text{LOC. MIN.}$$

DIFFERENTIAL EQUATIONS.

THE UNKNOWN, THE OBJECT OF INTEREST,
IS A FUNCTION, NOT A NUMBER.

$$f(x) = ax^2 + bx + c = 0$$

WHAT DOES THAT MEAN:

$$x = \frac{-b \pm \sqrt{b^2 - 4ac}}{2a}$$

OR

$$a = b = c = 0$$

EQUAL
AS
WHAT?

SO

$$a = b = c = 0$$

IS EQUALITY AS FUNCTIONS

$f(x) = \text{ZERO FUNCTION}$

MEANS THAT $f(x) = 0$ FOR ALL x

WHICH GIVES US THE CONCLUSION

$$a = b = c = 0$$

IN THIS CHAPTER OUR
EQUATIONS, ARE EQUATIONS
DEFINING FUNCTIONS, NOT
GIVING NUMBERS....

EXAMPLE

$$x = x(t)$$

$$x'(t) = a x(t) \quad a \text{ NUMBER.}$$

THIS IS AN EXAMPLE OF A DIFFERENTIAL EQUATION.

WHAT DOES A SOLUTION LOOK LIKE?

CANDIDATE: $x(t) = e^{at}$

TEST: $x'(t) = a$ e^{at}

GOOD! $x'(t) = a$ $x(t)$

SO $x(t) = e^{at}$ IS A SOLUTION OF THE DIFFERENTIAL EQUATION

$$x'(t) = a x(t)$$

TO MUCH NOTATION, WE WANT SOMETHING SHORTER:

$$\dot{x} = ax$$

(SHORT FOR $x'(t) = a x(t)$)

SOME INITIAL INSIGHTS ABOUT DIFFERENTIAL EQUATIONS.

$$\textcircled{1} \quad \underline{\dot{x} = x + t} \quad \left(\begin{array}{l} x = x(t) \\ \dot{x} = x'(t) \end{array} \right)$$

$$\text{IS } x(t) = Ce^t - t - 1 \quad (C \text{ CONSTANT})$$

A SOLUTION OF $\textcircled{1}$?

WE ANSWER THAT BY PLUGGING IN?

$$x(t) = Ce^t - t - 1$$

$$x'(t) = Ce^t - 1$$

TEST: LEFT HAND SIDE: $Ce^t - 1$

RIGHT HAND SIDE: $Ce^t - t - 1 + t$

LS = RS  IT'S OK.

SOME NOTATION AND NOTIONS:

IT IS ~~ESTD~~ COSTUMARY TO WRITE

A. $\textcircled{1}$ IN THIS WAY:

$$\dot{x} - x = t$$

[THE \dot{x} , x ON THE LEFT SIDE]

B. ONE SOLUTION OF $\textcircled{1}$, SAY $e^t - t - 1$ ($C=1$)
IS CALLED A PARTICULAR SOLUTION.

[ANOTHER PARTICULAR SOLUTION IS $-t - 1$ ($C=0$)]

C. IMPORTANT FACT:

THE DIFFERENCE OF TWO PARTICULAR SOLUTIONS:

$$x_1(t) = e^t - t - 1 \quad (C=1)$$

$$x_2(t) = -t - 1 \quad (C=0)$$

$$x_h(t) = x_1(t) - x_2(t) = e^t - t - 1 - (-t - 1) \\ = e^t$$

IS A SOLUTION OF

$$\dot{x} - x = 0$$

WHY IS THIS TRUE?

CHECK IN THE EXAMPLE WE ARE CONSIDERING.

~~$x_h(t) = e^t$~~ $x_h(t) = e^t$ $x_h'(t) = e^t$

$$\dot{x} - x \stackrel{?}{=} 0$$

CHECK: $e^t - e^t = 0$

😊 OK!

A A

$$\dot{x} - x = t$$
$$\dot{x} - x = 0$$

FORGETTING ABOUT THE t ON THE RIGHT HAND SIDE

WHY IS THIS INTERESTING:

CONSIDER THE MORE GENERAL PROBLEM

$$\dot{x} + \cancel{g(t)} \cdot g(t)x = f(t)$$

THEN THIS PROBLEM CAN BE
BROKEN DOWN TO TWO SEPERATE
PROBLEMS:

1. FINDING ONE SOLUTION,
ONE PARTICULAR SOLUTION
TO $\dot{x} + g(t)x = f(t)$

2. FINDING **ALL** SOLUTIONS
TO $\dot{x} + g(t)x = 0$.