AE4233 Advanced design methods

MDO Practical session 5

- Fmincon and sensitivity analysis
- Surrogate handling in IDF
- Q3DAerosolver-EMWET load mapping

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What you need to know to start an optimization with MATLAB

- FMINCON settings: options = optimset (...)
- Some options you HAVE TO define for your optimization:
 - Algorithm: SQP is recommended
 - DiffMinChange: not less than 0.01
 - DiffMaxChange: not higher than 0.1
 - TolFun
 - TolCon
 - TolX

Finding good values for them is a part of

your assignment

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What you need to know to start an optimization with MATLAB

- Some options are optional but recommended:
 - Display: Iter is recommended
 - PlotFun:

plotfunctions={@optimplotx @optimplotfval @optimplotconstrviolation};

See MATLAB help for "optimset" to find the available optimization options for fmincon



Sensitivity Analysis

- Gradient based algorithms need sensitivity of objective functions and constraints with respect to the design variables.
- Fmincon uses "finite difference" method for sensitivity analysis:

$$\frac{\partial f}{\partial x} = \frac{f(x + \Delta x) - f(x)}{\Delta x}$$
The value of deltaX should be defined



Sensitivity Analysis

- Theoretically $\Delta x \rightarrow 0$
- Practical values in numerical analysis ~10^-6
- DiffminChange is the minimum value of Δx
- DiffMaxChange is the maximum value of Δx
- Matlab default value for DiffMinChange is 10^-6



Sensitivity Analysis - Example

 Example: Sensitivity analysis of wing induced drag with respect to wing span using Q3D:

$$\left. \frac{\partial C_{Di}}{\partial b} \right|_{b=b_0} = \frac{C_{Di}(b_0 + \Delta b) - C_{Di}(b_0)}{\Delta b}$$

• b0 = 29m



Sensitivity Analysis - Example

- For AOA = $2 \text{ deg } \rightarrow \text{CDi} = 0.0094$
- Using Matlab default value for Δx :

$$f(x + \Delta x) = C_{Di}(b_0 + \Delta b) = C_{Di}(29.000001)$$

- Running Q3D for new wing span of 29.000001m
 - For AOA = $2 \text{deg} \rightarrow \text{CDi} = 0.0094$

$$\frac{\partial C_{Di}}{\partial b} = 0$$

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Sensitivity Analysis - Example

• $\frac{\partial C_{Di}}{\partial b} = 0$ means b=29m is the optimum wing span for minimum induced drag (other variables are fixed)

WRONG

- Use $\Delta x = 0.1$:
 - CDi(b=29.1) = 0.0093! Induced drag is reduced!

Q3D cannot see the effect of one micron difference in span on the induced drag, you need to change the span at least a few centimetres to have a change in Cdi

use diffminchange & diffmaxchange to definde deltaX

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Effect of Scaling

- If you scale all the design variables: $x_{is} = \frac{x_i}{x_{i0}} \implies b_s = \frac{b}{b_0} = \frac{b}{29}$
- Sensitivity @ b=29m: $b_s + \Delta b = 29/29 + 0.01*29 = 1.01*29 = 1.01b_0$
- Δx is now percentage of the reference value... so $\Delta x = 0.01$ means 1% of the initial value of span: 29cm instead of 1cm for a 29m span
- If you do not scale your design variables for $\Delta x = 0.01$:
- $t/c + \Delta t/c = 0.14 + 0.01 = 0.15$ huge effect on objfun
- $W_{to} + \Delta W_{to} = 40000 + 0.01 = 40000.01$ No measurable effect on objfun
- For scaled design vector:

$$t/c + \Delta t/c = 0.14 + 0.01*0.14 = 0.1414$$

 $W_{to} + \Delta W_{to} = 40000 + 0.01*40000 = 40400$

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IDF Strategy

From the second tutorial:

$$\min_{\mathbf{x}} J = x_2^2 + x_3 + y_1 + e^{-y_2}$$

$$y_1 = x_1^2 + x_2 + x_3 - 0.2 y_2$$

$$y_2 = \sqrt{y_1} + x_1 + x_3$$

s.t.

$$y_1/3.16-1 \ge 0$$

 $1-y_2/24 \ge 0$

$$-10 \le x_1 \le 10, 0 \le x_2 \le 10, 0 \le x_3 \le 10$$

In an IDF strategy both the objective function and the constraints are functions of surrogate variables y1* and y2*





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Example DSM (IDF)

| SO | $\mathbf{x}, \mathbf{y}_2^*$ | $\mathbf{x}, \mathbf{y}_1^*$ | \mathbf{x}, y_1^*, y_2^* |
|--------------------------|--------------------------------------|----------------------------------|--|
| $y_1, r_1 = y_1^* - y_1$ | $y_1 = x_1^2 + x_2 + x_3 - 0.2y_2^*$ | | 1 |
| $y_2, r_2 = y_2^* - y_2$ | | $y_2 = \sqrt{y_1^*} + x_1 + x_3$ | |
| J | | | $J = x_2^2 + x_3 + y_1^* + e^{-y_2^*}$ |





$$X = [x_1, x_2, x_3, y_1^*, y_2^*]$$

 \boldsymbol{J}

Objfun

$$J = x_2^2 + x_3 + y_1^* + e^{-y_2^*}$$

X

 C_1, C_2, Ceq_1, Ceq_2

Consistency constraints on surrogate variables (equality constraints)

X

Constraints of the original problem (inequality constraints)

Constr.

$$C_1 = 1 - y_1^* / 3.16$$
 $C_2 = y_2^* / 24 - 1$

$$y_1 = x_1^2 + x_2 + x_3 - 0.2y_2^*$$

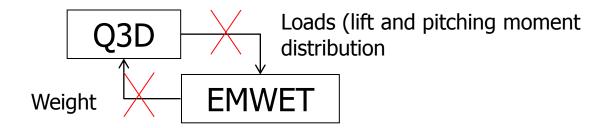
$$y_2 = \sqrt{y_1^*} + x_1 + x_3$$

$$Ceq_1 = y_1 - y_1^*$$
 $Ceq_2 = y_2 - y_2^*$



IDF approach for wing optimization

- Defining surrogate values for the coupling variables
- Loads are coupling variables:

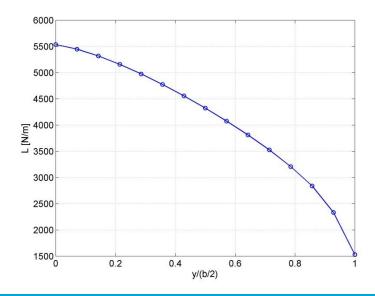


In contrast to the weight, which is only one variable, for loads you need to define the spanwise distributions as surrogate variables



Load distribution using surrogate variables

- Approach one:
 - Define loads at different points:
 - L = [L1 L2 ... Li ...Ln], Li is the load at yi
 - You need at least 15-20 points to have a nice load distribution

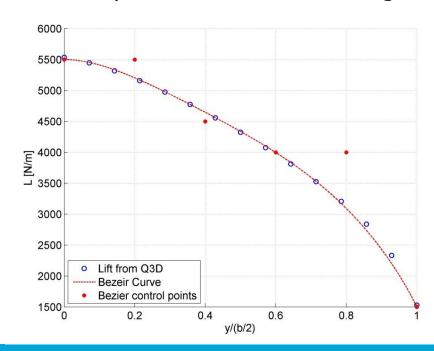




Load distribution using surrogate variables

- Approach two (optional):
 - Approximate the load distribution using a curve (Bezeir, B-Spline, etc.) with 5-6 control points
 - Define the control point of the curve as design variables

A good approximation of the lift distribution is achieved using a Bezier curve with 6 control points



You can fix the spanwise position of the control points and define their weights (y positions) as design variables:

6 vs 15 design variables!



Making an automatic link between Q3D and EMWET

- Download the Matlab codes EMWET-Q3D.zip for connecting Q3D to EMWET from Blackboard
- Try to run the code and understand it
- Remove all the hard coded numbers in the code and use your design variables. Make an automatic link between the Q3D solver and EMWET.

