

NLF Airfoil and Wing  
Design by Adjoint Method and Automatic  
Transition Prediction

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## Outline

- ▣ Design via Control Theory
- ▣ Automatic Transition Prediction and Coupling with RANS solver
- ▣ 2D Airfoil and 3D Wing Design
- ▣ Conclusion
- ▣ Acknowledgment

# Design via Control Theory

## Automatic Design Based on Control Theory

- The current approach used in this study is a **gradient-based** numerical optimization technique based on the control theory.
- Regard the wing as a device to generate lift (with minimum drag) by controlling the flow.
- Apply theory of optimal control of systems governed by PDEs (Lions) with boundary control (the wing shape).
- Merge control theory and CFD.
- Find the Frechet derivative (infinite dimensional gradient) of a cost function with respect to the shape by solving the adjoint equation in addition to the flow equation.
- Modify the shape in the sense defined by the smoothed gradient.
- Repeat until the performance value approaches an optimum.

## Gradient-based Optimization

Let  $\mathbf{x}$  be the current design point. We want to find a direction  $\mathbf{d}$  and step size  $\alpha > 0$  such that  $f(\mathbf{x} + \alpha \mathbf{d}) < f(\mathbf{x})$ . Expand  $f$  about  $\mathbf{x}$  using Taylor's expansion

$$f(\mathbf{x} + \alpha \mathbf{d}) = f(\mathbf{x}) + \alpha \nabla f(\mathbf{x})^T \mathbf{d} + O(\alpha^2)$$

The change in  $f$  is

$$\begin{aligned} \delta f &= f(\mathbf{x} + \alpha \mathbf{d}) - f(\mathbf{x}) \\ &= \alpha \nabla f(\mathbf{x})^T \mathbf{d} + O(\alpha^2) \end{aligned}$$

For small enough  $\alpha$ , we have

$$\delta f \approx \alpha \nabla f(\mathbf{x})^T \mathbf{d}$$

## Gradient-based Optimization

For a reduction in  $f$  for  $\delta f < 0$ , we want to choose a *descent direction* such that

$$\nabla f(\mathbf{x})^T \mathbf{d} < 0$$

and then update new design by

$$\mathbf{x}_{k+1} = \mathbf{x}_k + \alpha_k \mathbf{d}_k$$

For a steepest descent method,  $\mathbf{d}$  is chosen to be

$$\mathbf{d} = -\nabla f(\mathbf{x})$$

## Gradient Calculation: Adjoint approach

Let  $I$  be the cost (or objective) function

$$I = I(w, \mathcal{F})$$

where

$w$  = flow field variables

$\mathcal{F}$  = grid variables

The first variation of the cost function is

$$\delta I = \frac{\partial I}{\partial w} \delta w + \frac{\partial I}{\partial \mathcal{F}} \delta \mathcal{F}$$

The flow field equation and its first variation are

$$\begin{aligned} R(w, \mathcal{F}) &= 0 \\ \delta R &= 0 = \left[ \frac{\partial R}{\partial w} \right] \delta w + \left[ \frac{\partial R}{\partial \mathcal{F}} \right] \delta \mathcal{F} \end{aligned}$$

## Gradient Calculation: Adjoint approach

Introducing a Lagrange Multiplier,  $\Psi$ , and using the flow field equation as a constraint

$$\begin{aligned}\delta I &= \frac{\partial I}{\partial w} \delta w + \frac{\partial I}{\partial \mathcal{F}} \delta \mathcal{F} - \psi^T \left\{ \left[ \frac{\partial R}{\partial w} \right] \delta w + \left[ \frac{\partial R}{\partial \mathcal{F}} \right] \delta \mathcal{F} \right\} \\ &= \left\{ \frac{\partial I}{\partial w} - \psi^T \left[ \frac{\partial R}{\partial w} \right] \right\} \delta w + \left\{ \frac{\partial I}{\partial \mathcal{F}} - \psi^T \left[ \frac{\partial R}{\partial \mathcal{F}} \right] \right\} \delta \mathcal{F}\end{aligned}$$

By choosing  $\Psi$  such that it satisfies the adjoint equation

$$\left[ \frac{\partial R}{\partial w} \right]^T \psi = \frac{\partial I}{\partial w},$$

We have

$$\delta I = \left\{ \frac{\partial I}{\partial \mathcal{F}} - \psi^T \left[ \frac{\partial R}{\partial \mathcal{F}} \right] \right\} \delta \mathcal{F}$$

This reduces the gradient calculation for an arbitrarily large number of design variables to

=> **ONE FLOW SOLUTION + ONE ADJOINT SOLUTION**



## Gradient Smoothing

In general, the gradient  $G$  obtained from equation (5) is of a lower smoothness class than the shape  $S$ . Hence it is important to restore the smoothness. This can be achieved by replacing  $G$  by  $\bar{G}$

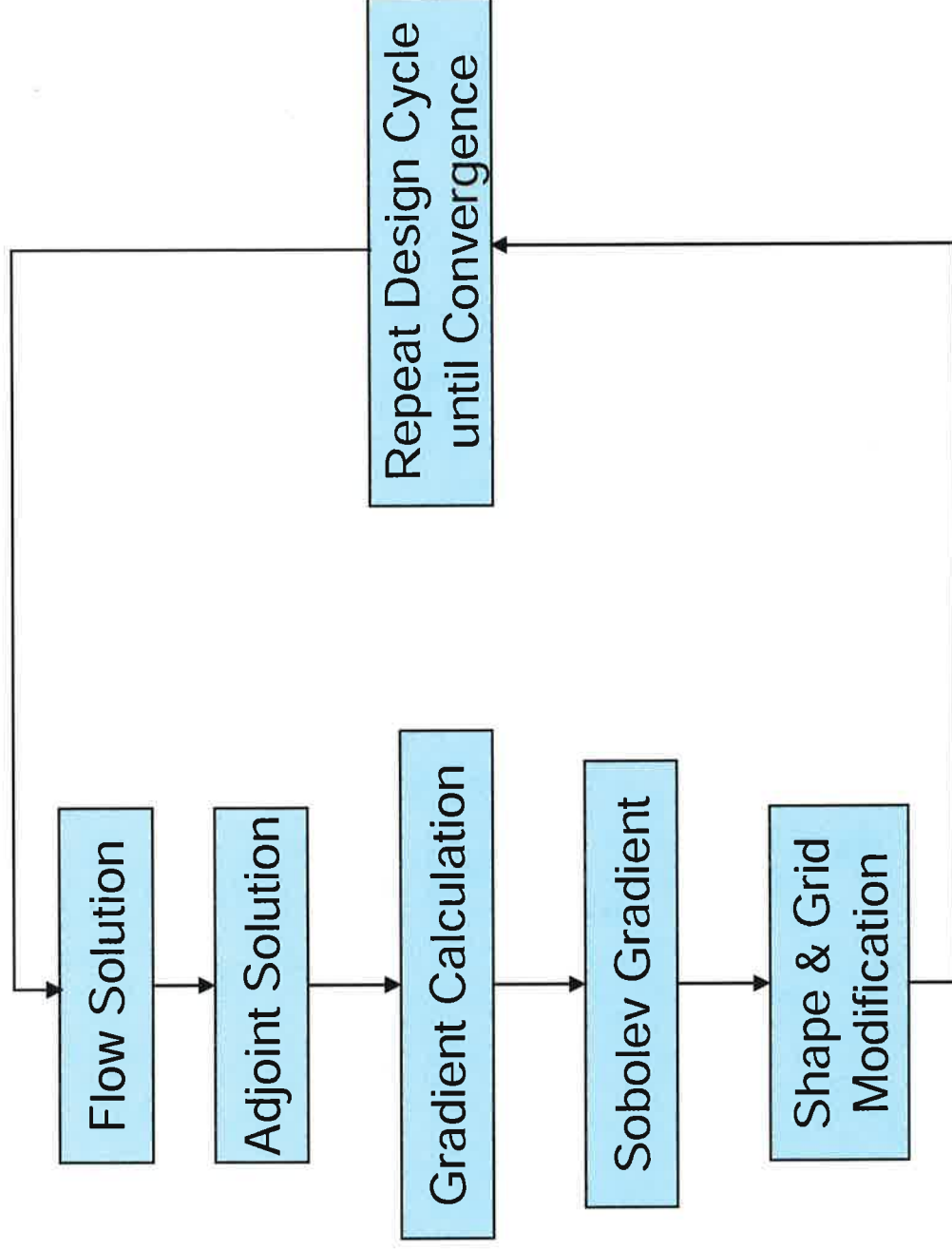
$$\bar{G} - \frac{\partial}{\partial \xi} \epsilon \frac{\partial \bar{G}}{\partial \xi} = G \quad \bar{G} = 0, \text{ at end points}$$

Now makes a shape change  $\delta S = -\bar{G}$  and for small positive  $\lambda$

$$\delta I = -\lambda \langle \bar{G}, \bar{G} \rangle \leq 0$$

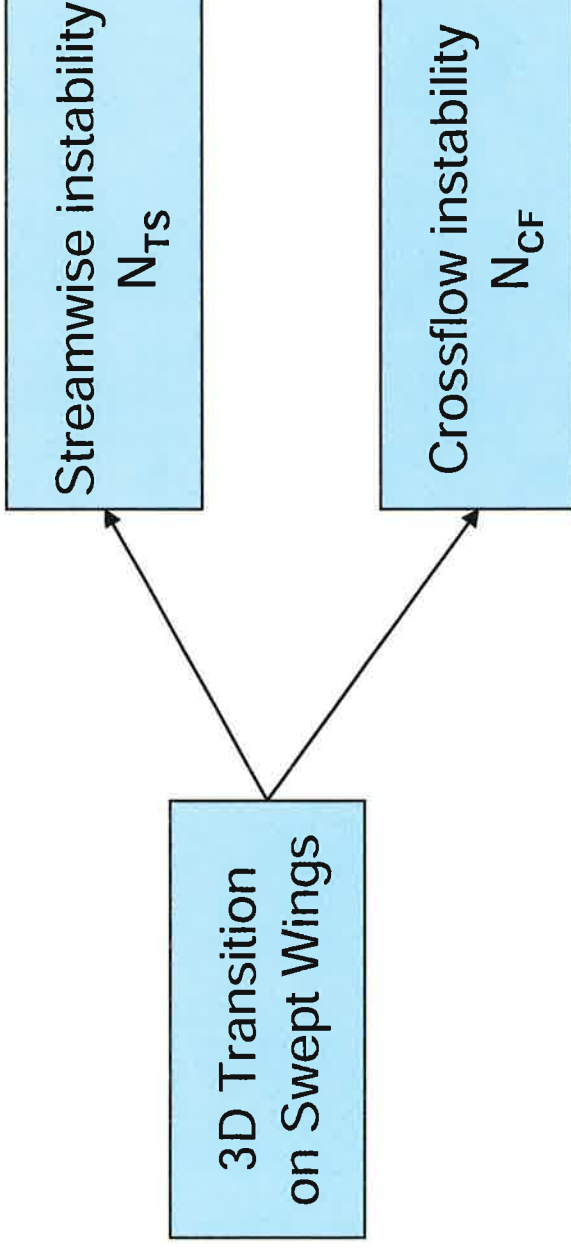
guarantees an improvement.

## Outline of the Design Process



# Transition Prediction

## Present Transition Prediction Methodology



## The $e^N$ Criterion

- ▣ In the mid 1950s, Smith and Gamberoni, and independently van Ingen, compared linear stability calculations with experimental results for which transition locations were known.
- ▣ They found that transition locations in many cases happened at the location where Linear Stability Theory predicts the amplification of Tollmien-Schlichting waves to reach about 8100.
- ▣ This value corresponds to  $e^N$ , where  $N = 9$ .

## Calculation of Viscous Boundary-Layer Parameters

- ▣ The first step in transition prediction using e<sup>N</sup>-database method is to calculate viscous laminar boundary-layer parameters, e.g. displacement thickness,  $\delta^*$ , and momentum thickness,  $\theta$ ,

$$\delta^* = \int_0^{\delta^e} \left(1 - \frac{U(y)}{U_e}\right) dy$$
$$\theta = \int_0^{\delta^e} \frac{U(y)}{U_e} \left(1 - \frac{U(y)}{U_e}\right) dy$$

- ▣ Use RANS solver to provide viscous data
  - Straightforward
  - Need large number of mesh points and grid adaptation may also be needed
- ▣ Use QICTP\* code to provide viscous data
  - A compressible laminar boundary-layer code for swept, tapered wings

\* Horton, H.P., Stock, H.W. "Computation of Compressible, Laminar Boundary Layers on Swept, Tapered Wings", J. Aircraft, Vol. 32, pp. 1402-14-5, 1995

## Streamwise Amplification Factor Calculation

Given the high quality boundary-layer parameters, the next step toward transition prediction is to calculate amplification factor for Tollmien-Schlichting waves,  $N_{TS}$ , by using parametric fitting results from Sturdza\*.

$$N_{TS} = \int_{Re_{\theta 0}}^{Re_{\theta}} \frac{dn_{ts}}{dRe_{\theta}} dRe_{\theta}$$

where

$Re_{\theta}$  = momentum thickness Reynolds number,

$Re_{\theta 0}$  = critical Reynolds number =  $f ( H_k , T_w/T_e )$

$dn_{ts}/dRe_{\theta}$  =  $g ( H_k , T_w/T_e )$

$H_k$  = kinematic shape factor =  $\delta^*/l_{\theta}$

\* P. Sturdza., An Aerodynamic Design Method For Supersonic Natural Laminar Flow Aircraft., PhD thesis, PhD thesis, Stanford, 2004, 3781-2004

## Crossflow Amplification Factor Calculation

The crossflow amplification factor,  $N_{CF}$ , is calculated by integrating amplification rate,  $\alpha$ , of crossflow instability

$$N_{CF} = \int_{x_0}^x \alpha dx$$

starting from  $x_0$ , where  $x_0$  is the location at which crossflow Reynolds number exceed its critical value

$$R_{cf0} = 46 \frac{T_w}{T_e}$$

and

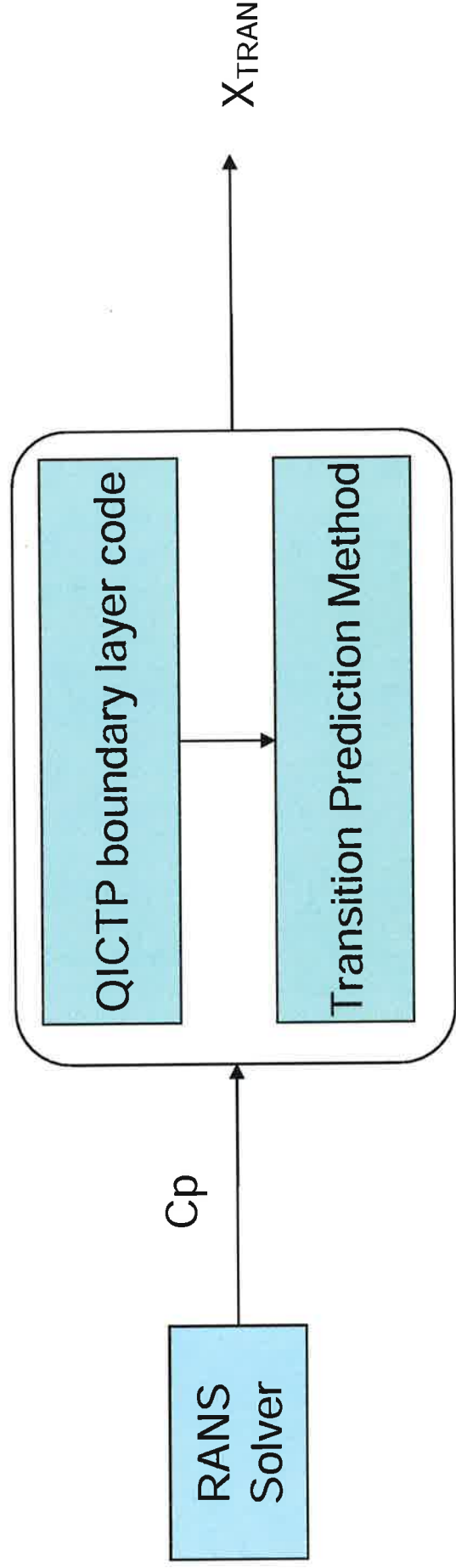
$$\alpha = \alpha \left( R_{cf}, \frac{w_{max}}{U_e}, H_{cf}, \frac{T_w}{T_e} \right)$$



## Transition Prediction Module

- ▣ Use  $C_p$  provided by RANS solver as inputs
- ▣ Split the airfoil into upper and lower surfaces from stagnation point
- ▣ Analyze each surface separately
- ▣ Outputs  $x_{\text{tran\_upper}}$  and  $x_{\text{tran\_lower}}$

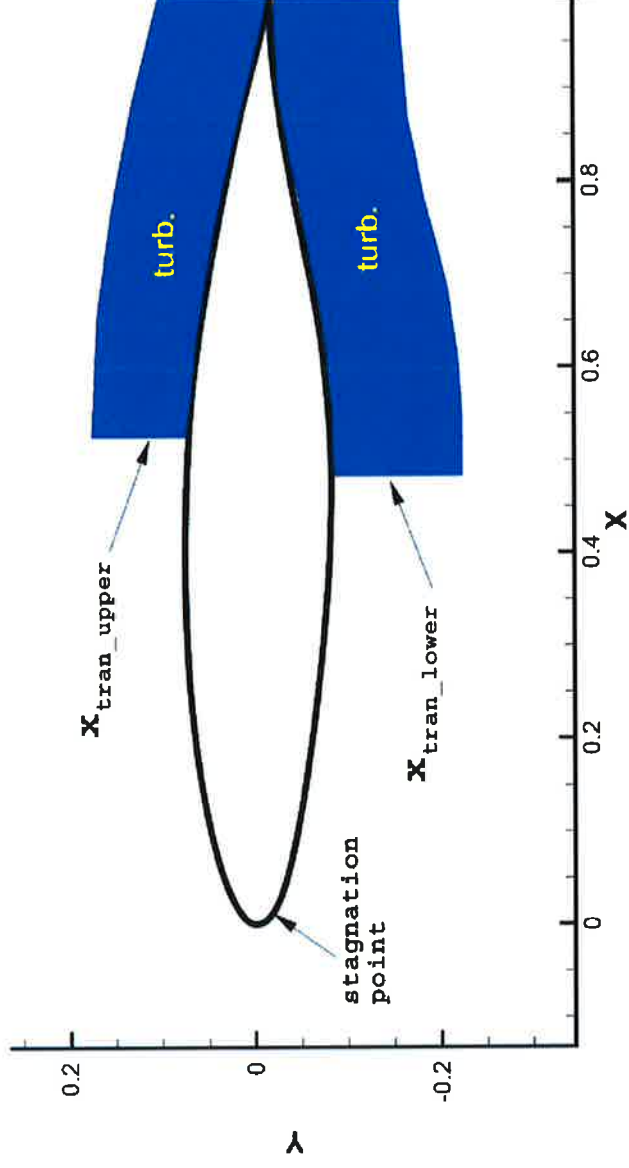
### Transition Prediction Module



# Transition Prescription

## Transition Prescription

- Transition prescription on surface
  - Transition prediction module  $\Rightarrow x_{\text{tran\_upper}}$ ,  $x_{\text{tran\_lower}}$
  - Split the airfoil surface into laminar and turbulent patches
- Transition prescription in flow domain
  - Project the turbulent patches into the flow field



## Transition Prescription

- Flow domain decomposition
  - laminar + turbulent
  - apply turbulence model to turbulent subdomains

- Baldwin-Lomax model

$$\tau_{ij} = (\mu_{lam} + \mu_{turb}) \left\{ \frac{\partial u_i}{\partial x_j} + \frac{\partial u_j}{\partial x_i} - \frac{2}{3} \left[ \frac{\partial u_k}{\partial x_k} \right] \right\} \delta_{ij}$$

- Laminar-turbulent switch:

$$\begin{aligned} lt\_switch(x) &= 0 & \mathbf{x} \in \text{laminar} \\ &= 1 & \mathbf{x} \in \text{turbulent} \end{aligned}$$

- Set:

$$\mu_{turb} = lt\_switch(x) \mu_{turb}$$

## Coupling with RANS Solver

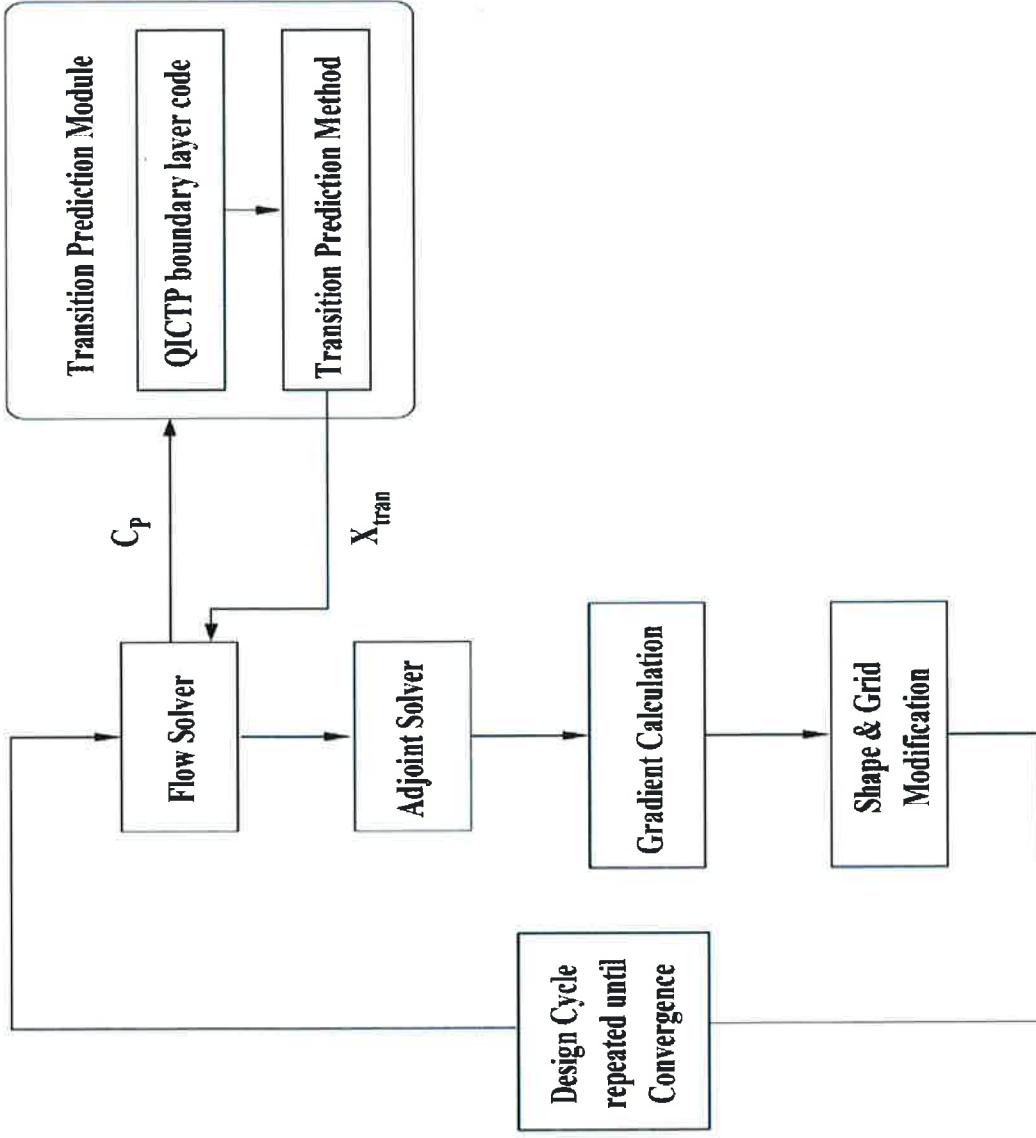
The coupling of RANS solver with transition prediction module can be summarized as follows:

- ▣ The RANS solver iterates with prescribed transition locations, e.g. 80% from the leading edge until residual drops below certain level.
- ▣ The transition prediction module is called. Surface pressure distribution from RANS solver is used as input for boundary-layer code.
- ▣ With the calculated boundary-layer parameters, two e<sup>N</sup>-database are used to calculate transition locations.
- ▣ The new transition locations are fed into RANS solver and this complete one iteration of transition prediction module.
- ▣ This process continues until convergence criteria

$$|x_{\text{tran}}(k) - x_{\text{tran}}(k-1)| \leq \delta$$

Is reached.

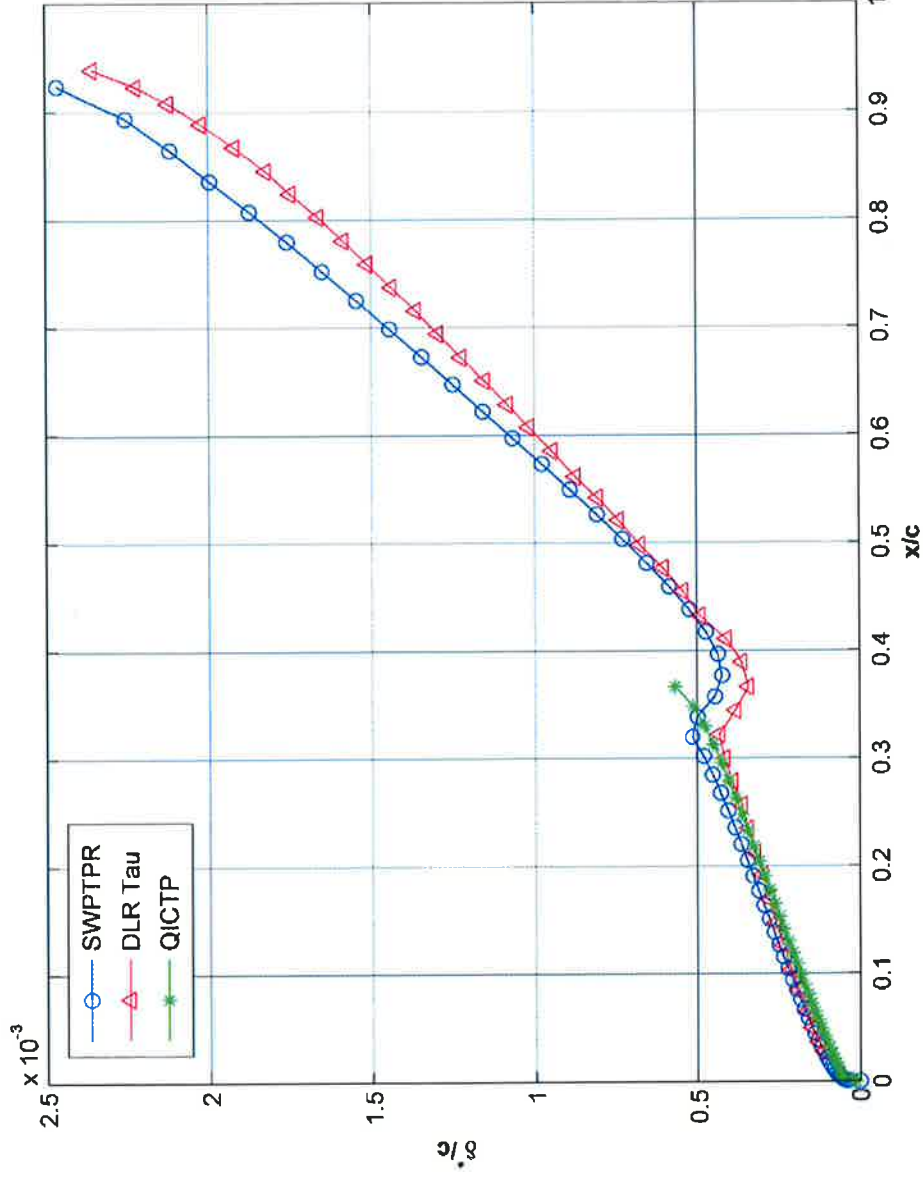
# Coupling with RANS Solver



# Numerical Results

## Verification of Boundary-Layer Parameters

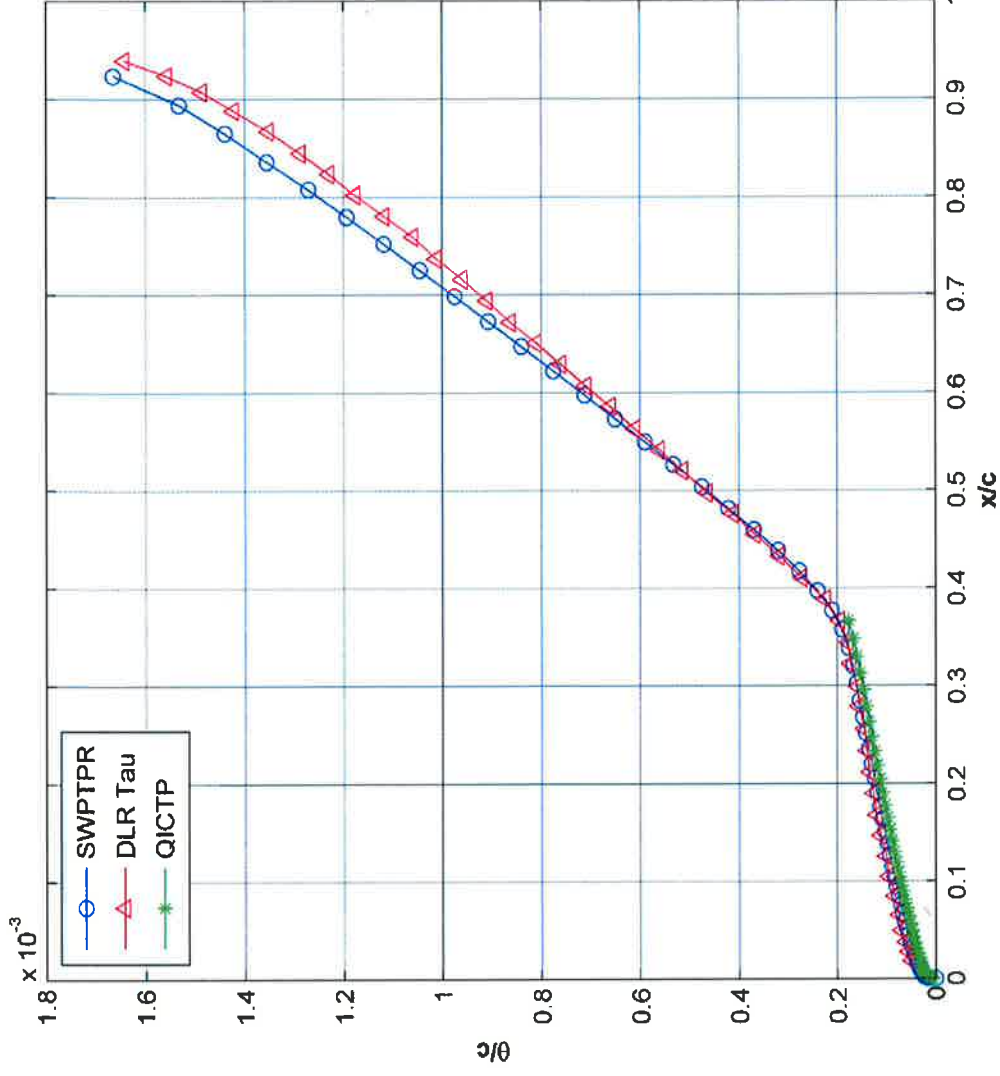
- Comparison of incompressible displacement thickness  $\delta^*$
- NLF-0416 at  $M_\infty = 0.3$ ,  $Re = 4 \times 10^6$ , and  $\alpha = 2.03^\circ$





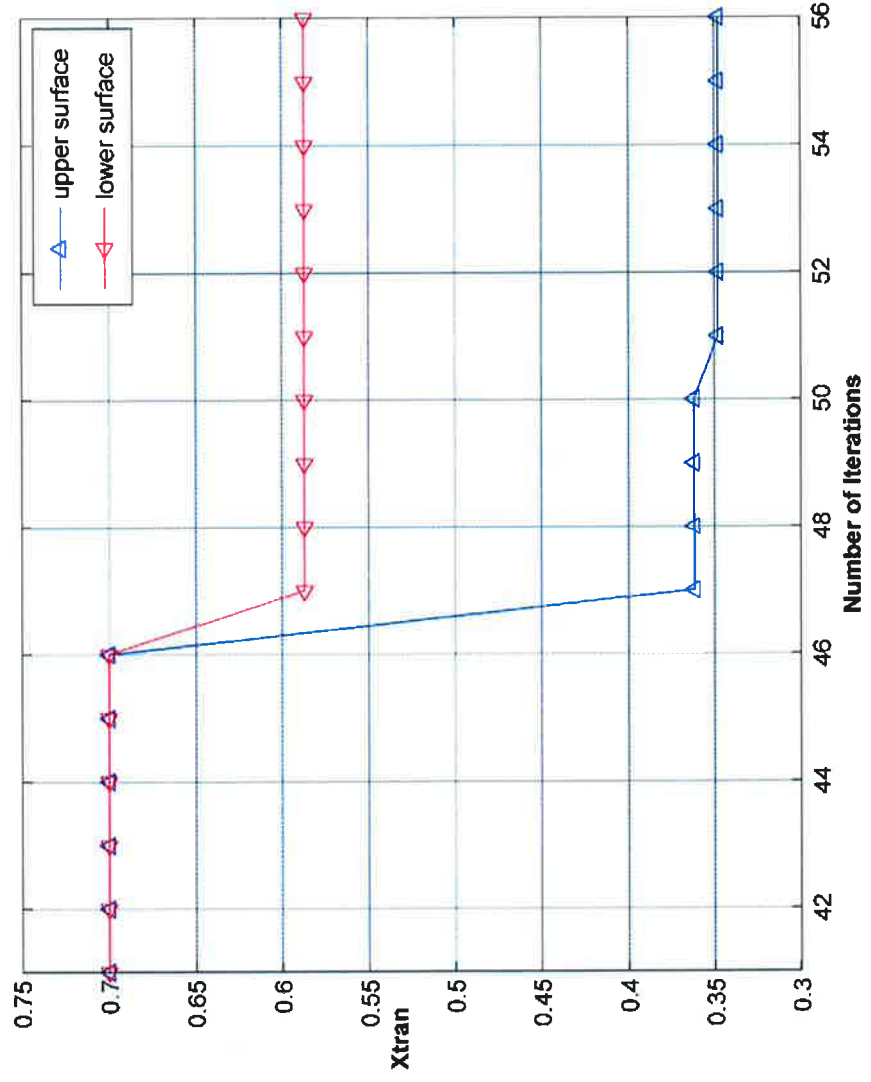
## Verification of Boundary-Layer Parameters

- Comparison of momentum thickness  $\theta$
- NLF-0416 at  $M_\infty = 0.3$ ,  $Re = 4 \times 10^6$ , and  $\alpha = 2.03^\circ$



# Verification of NLF-0416 Transition Locations

	Xtran_upper	Xtran_lower
Current Method	0.348	0.587
Experiment	0.35	0.6



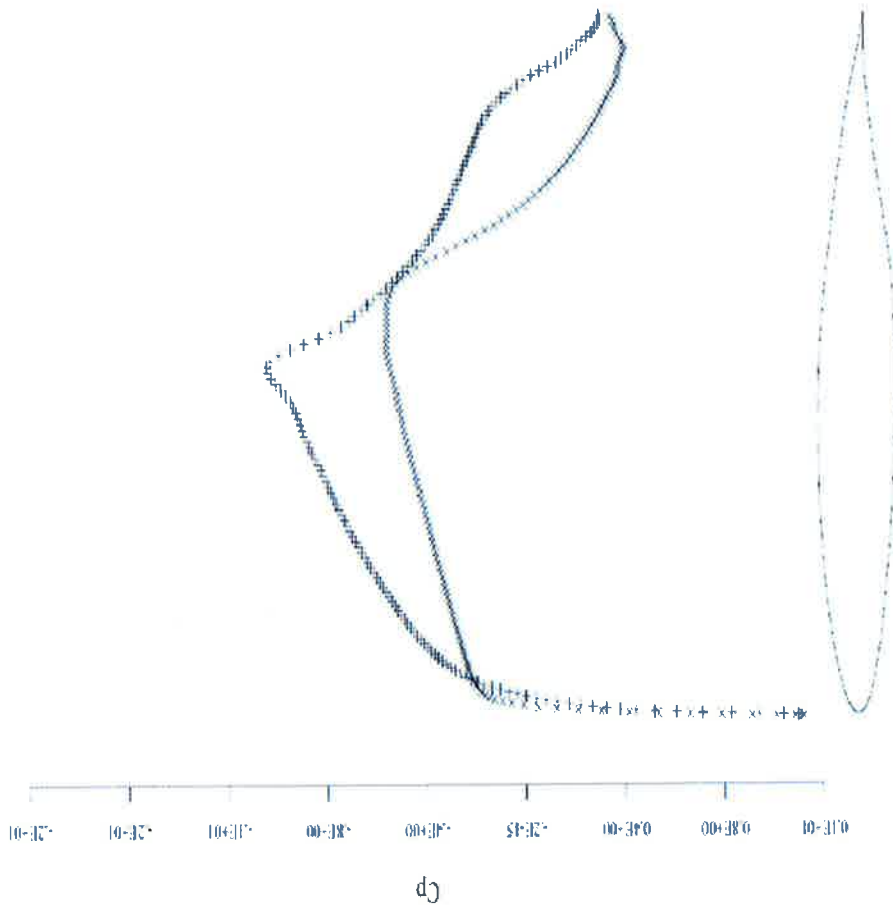
# 2D NLF Airfoil Design

## Design targets:

- $M_\infty = 0.69$
- $Re_\infty = 11.7 \times 10^6$
- $C_{l_{target}} = 0.26$

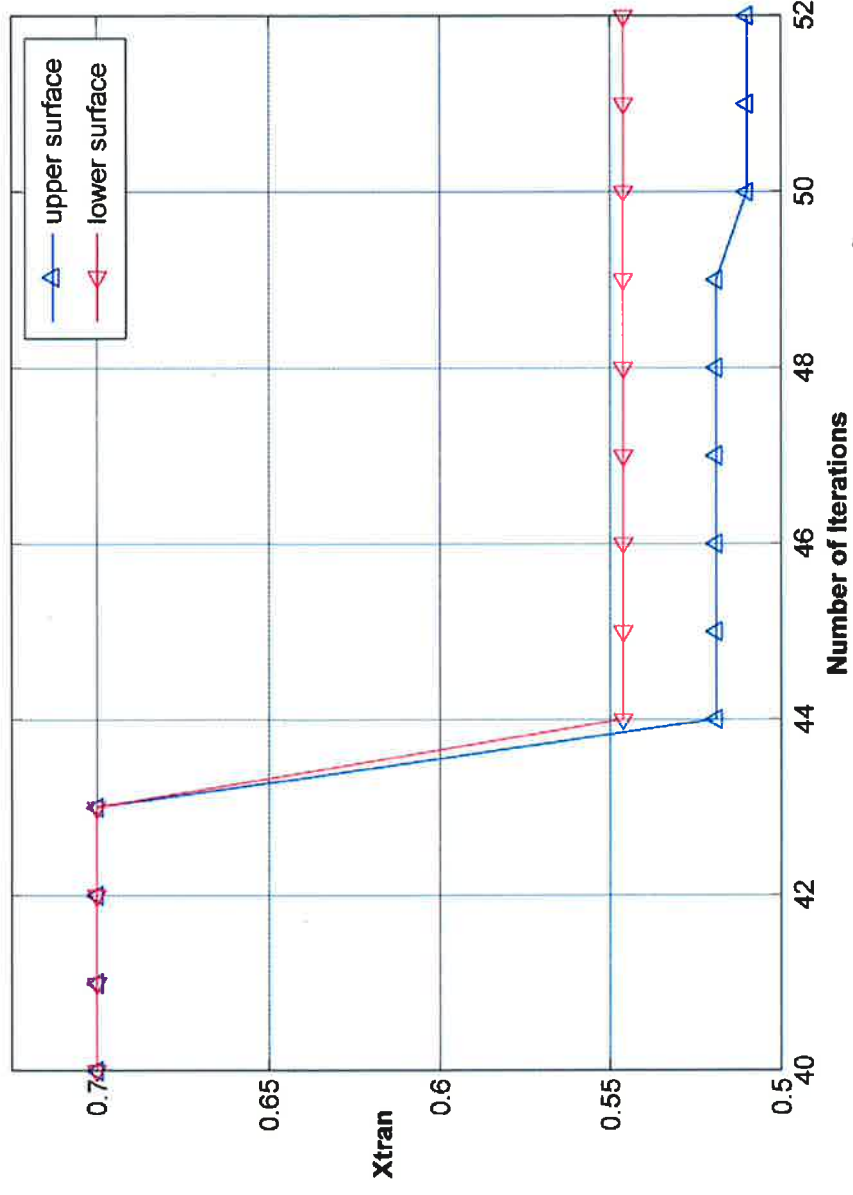
## Cost function:

$$I = \frac{1}{2} \oint_B (p - p_d)^2 dS$$



NLF AIRFOIL  
MACH 0.690 ALPHA -1.214 RE 0.117E+08  
C1 0.3600 C2 0.0023 CNI -0.0765 C1N 0.0000 C1DN 0.0034  
GRID 512X64 NDES 0 RES0.527E-03 GMAX 0.000E+00

## 2D NLF Airfoil Design



- $X_{tran\_upper} = 0.510$

- $X_{tran\_lower} = 0.546$

## Breguet Range Equation

A good first estimate of performance is provided by the Breguet range equation:

$$R = \frac{VL}{D} \frac{1}{SFC} \log \frac{W_1}{W_2}$$

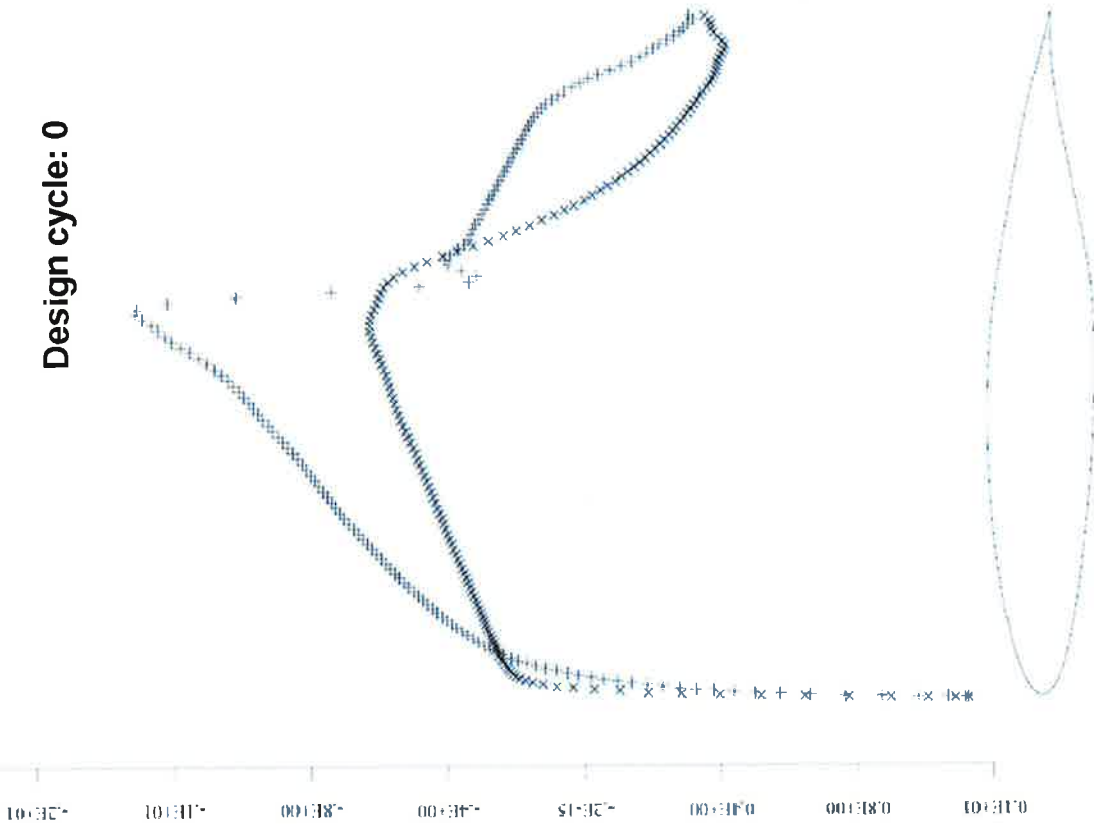
From aerodynamic point of view, the designer should try to maximize  $VL/D$ . This means the cruising speed  $V$  should be increased until the onset of drag rise.

## Redesign of NLF Airfoil

- ▣ Improve the range parameter  $M_\infty L/D$ 
  - $M_\infty = 0.69 \implies 0.72$ ,  $C_{l_{\text{target}}} = 0.26$
- ▣ Still maintain a reasonable amount of laminar flow
- ▣ Use the ajoint method to minimize wave drag

# Redesign of NLF Airfoil

Design cycle: 0

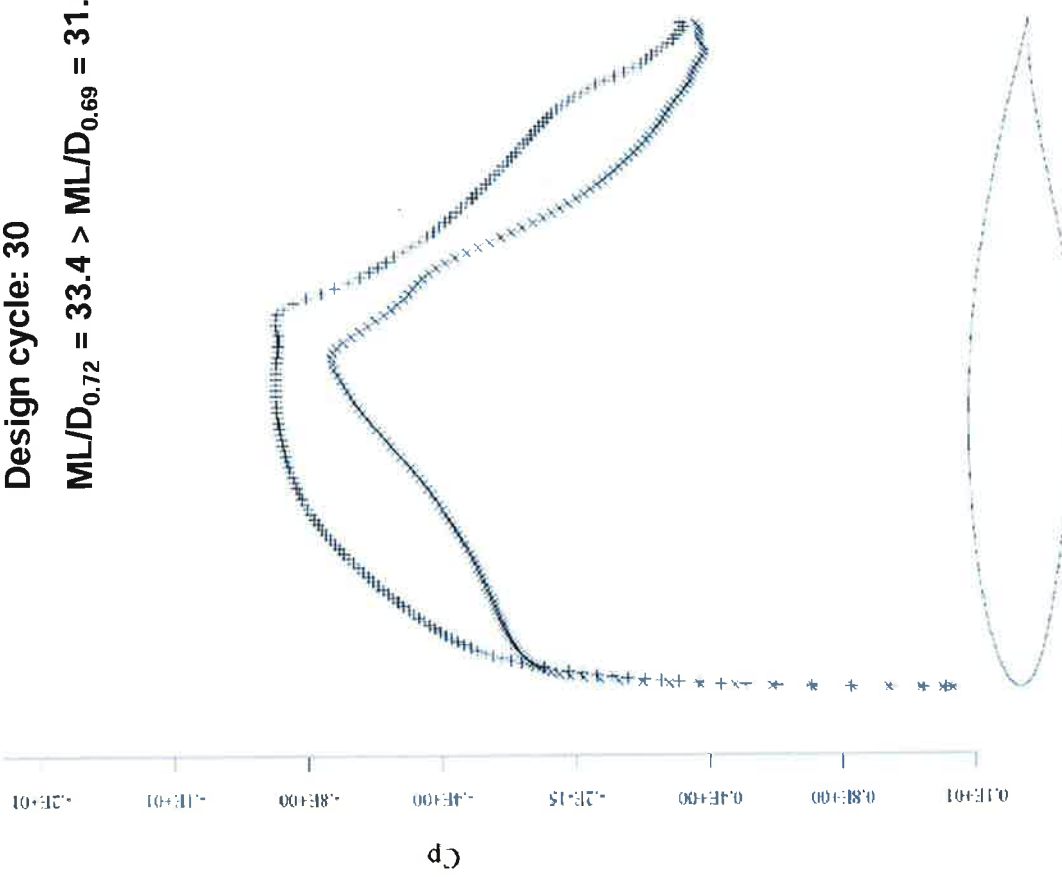


NLF AIRFOIL

MACH 0.720 ALPHA -1.302 RE 0.120E+08  
CL 0.2600 CD 0.0046 CM -0.0820 CTY 0.0000 CDV 0.0031  
GRID 512X64 NDES 0 RESO 167E-02 GMAX 0.000E+00

Design cycle: 30

$$ML/D_{0.72} = 33.4 > ML/D_{0.69} = 31.4$$

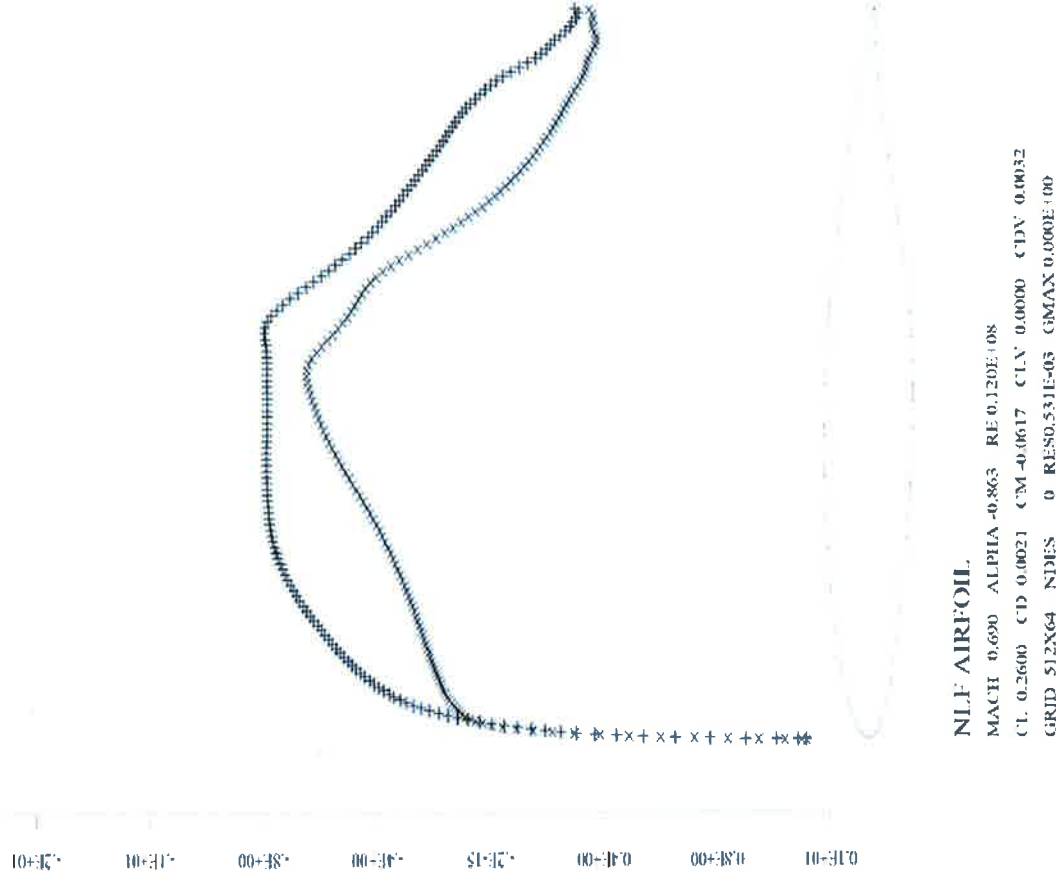


NLF AIRFOIL

MACH 0.720 ALPHA -0.980 RE 0.120E+08  
CL 0.2600 CD 0.0024 CM -0.0649 CTY 0.0000 CDV 0.0032  
GRID 512X64 NDES 0 RESO 492E-03 GMAX 0.000E+00

## Off-design Condition I: $M = 0.69$ , $C_l = 0.26$

- Natural-laminar-flow airfoils may have undesirable characteristics, such as formation of shock waves, when flying at off-design conditions.
- Test three off-design flight conditions
  - $M = 0.69$ ,  $C_{l_{\text{target}}} = 0.26$
  - $M = 0.70$ ,  $C_{l_{\text{target}}} = 0.26$
  - $M = 0.71$ ,  $C_{l_{\text{target}}} = 0.26$





# Off-design Condition II: $M = 0.70$ , $Cl = 0.26$



## NFI AIRFOIL

MACH 0.700 ALPHA -0.895 RE 0.120E+08  
CL 0.2600 CD 0.0022 CM -0.0625 CLV 0.0000 CDV 0.0032  
GRID 512X64 NDES 0 RES0.513E-03 GMAX 0.000E+00

# Off-design Condition III: $M = 0.71$ , $Cl = 0.26$



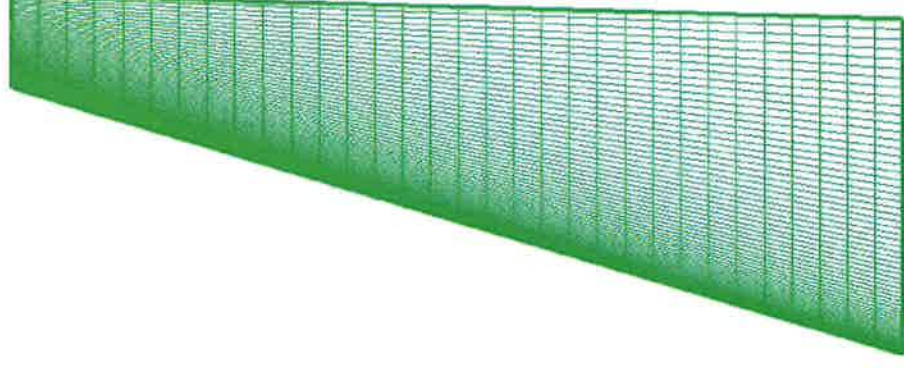
NI F AIRFOIL.

MACH 0.710 ALPHA -0.935 RE 0.120E+08  
CL 0.2600 CD 0.0023 CM -0.0636 CLV 0.0000 CDV 0.0032  
GRID 512X64 NIDES 0 RES0.497E-03 GMAX 0.000E+00

# 3D NLF Wing Calculation

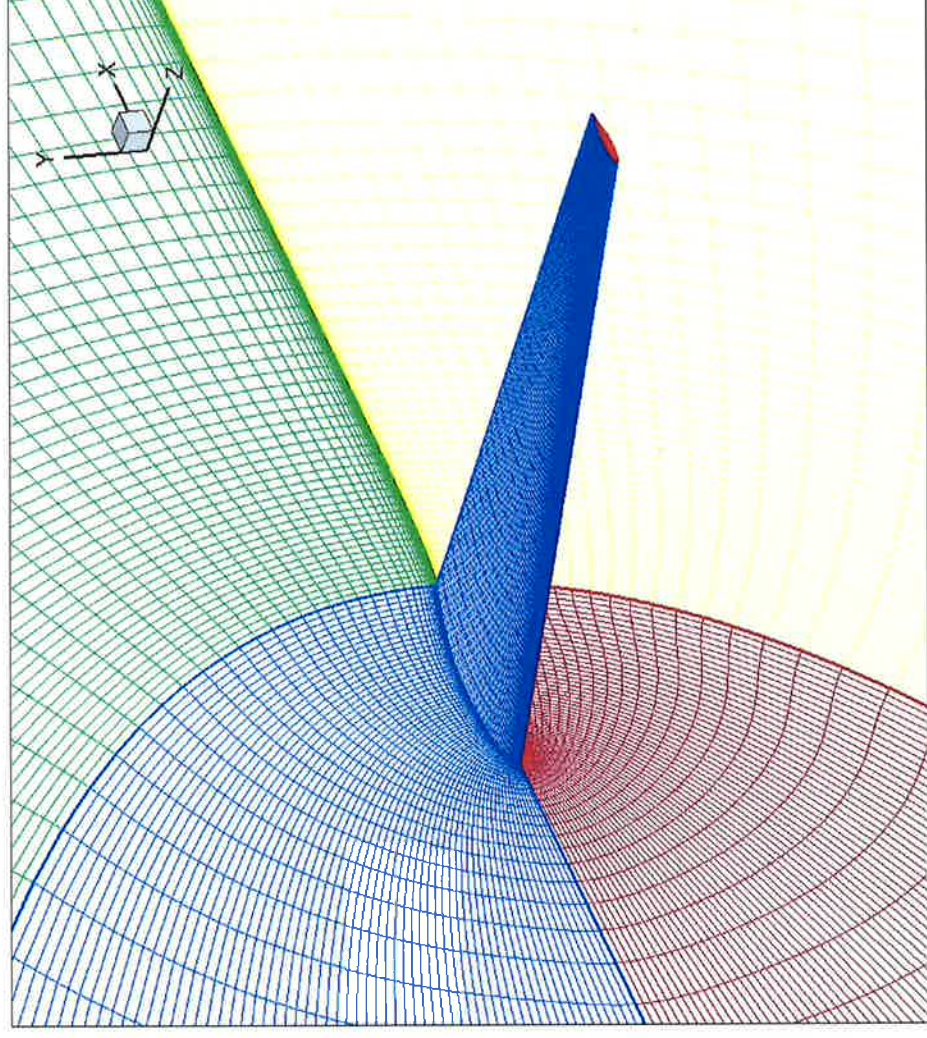
## 3D NLF Wing Definition

- Semi-span
- Tapered,  $\lambda = 0.278$
- Swept,  $\Delta_{LE} = 16.69^\circ$ ,  $\Delta_{TE} = 1.67^\circ$
- Cross sections: NLF airfoil designed at  $M_\infty = 0.69$

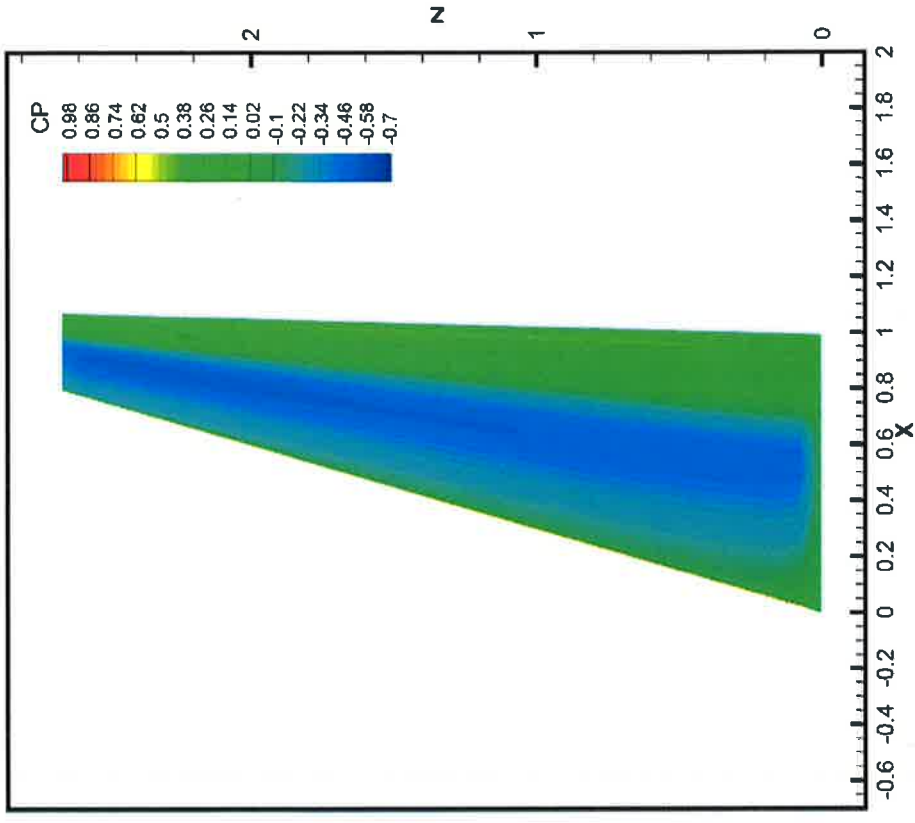
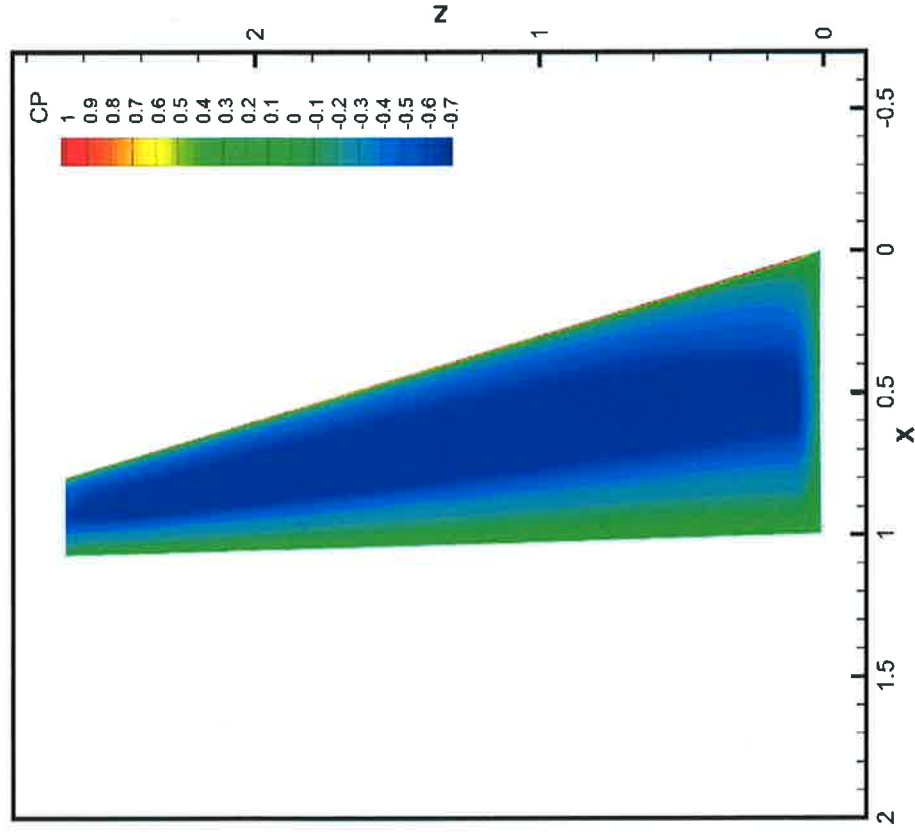


## 3D NLF Wing Definition

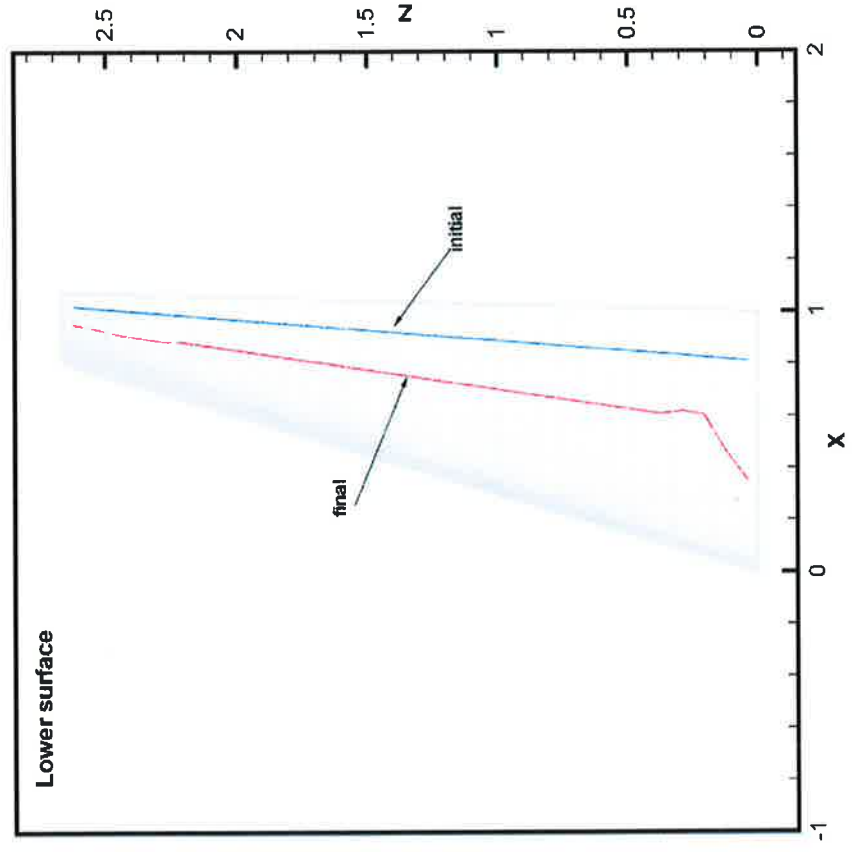
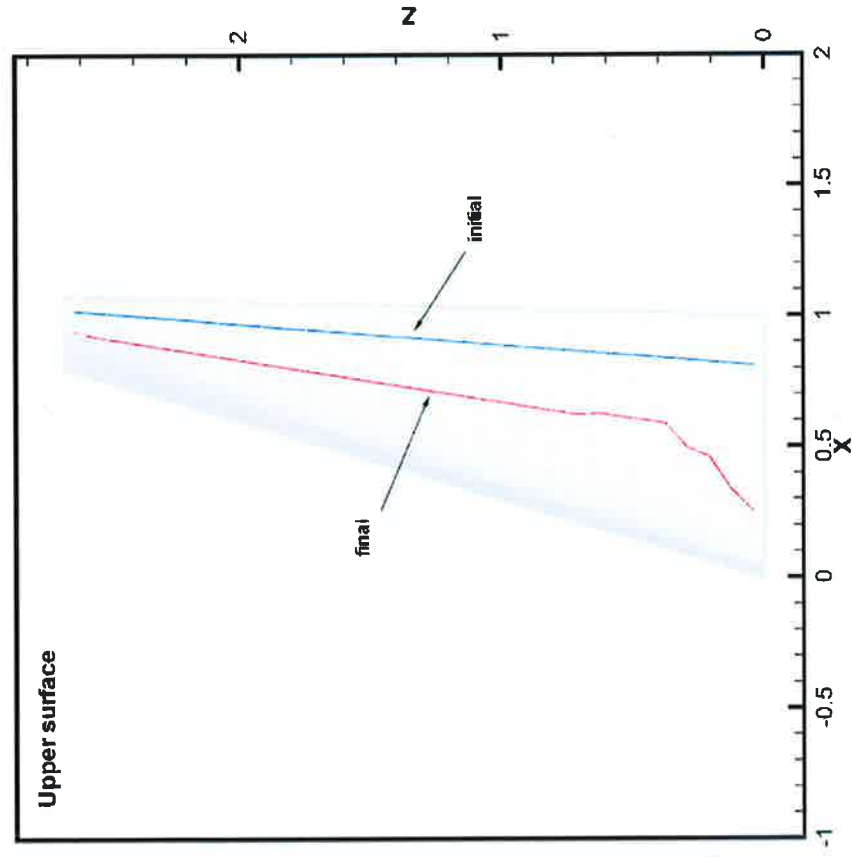
- ▣ C-type structured mesh,  
total = 256 x 64 x 48 mesh  
cells
- ▣ Wing definition: 128 x 33
- ▣ Parallel computation with  
MPI



# Pressure Distribution: $M = 0.69$ , $C_L = 0.26$

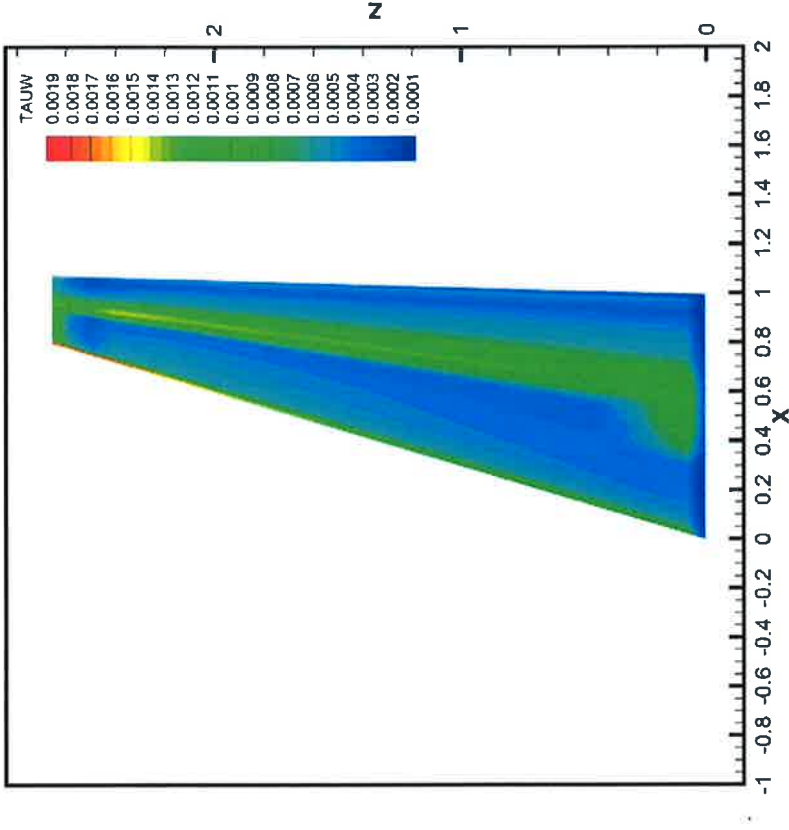
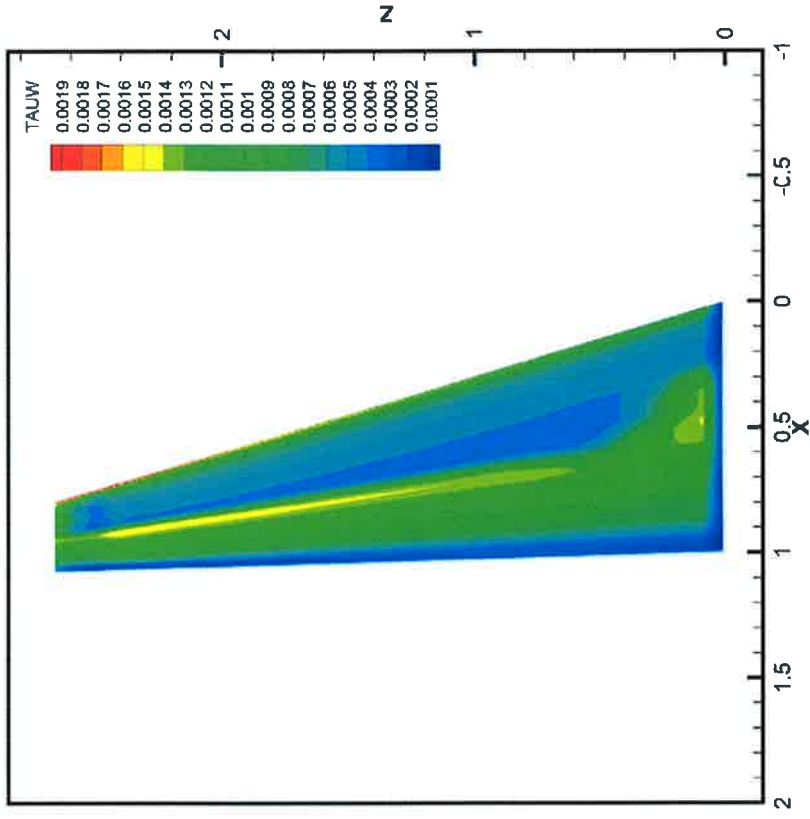


# Initial and Final Transition Locations: $M = 0.69$ , $C_L = 0.26$



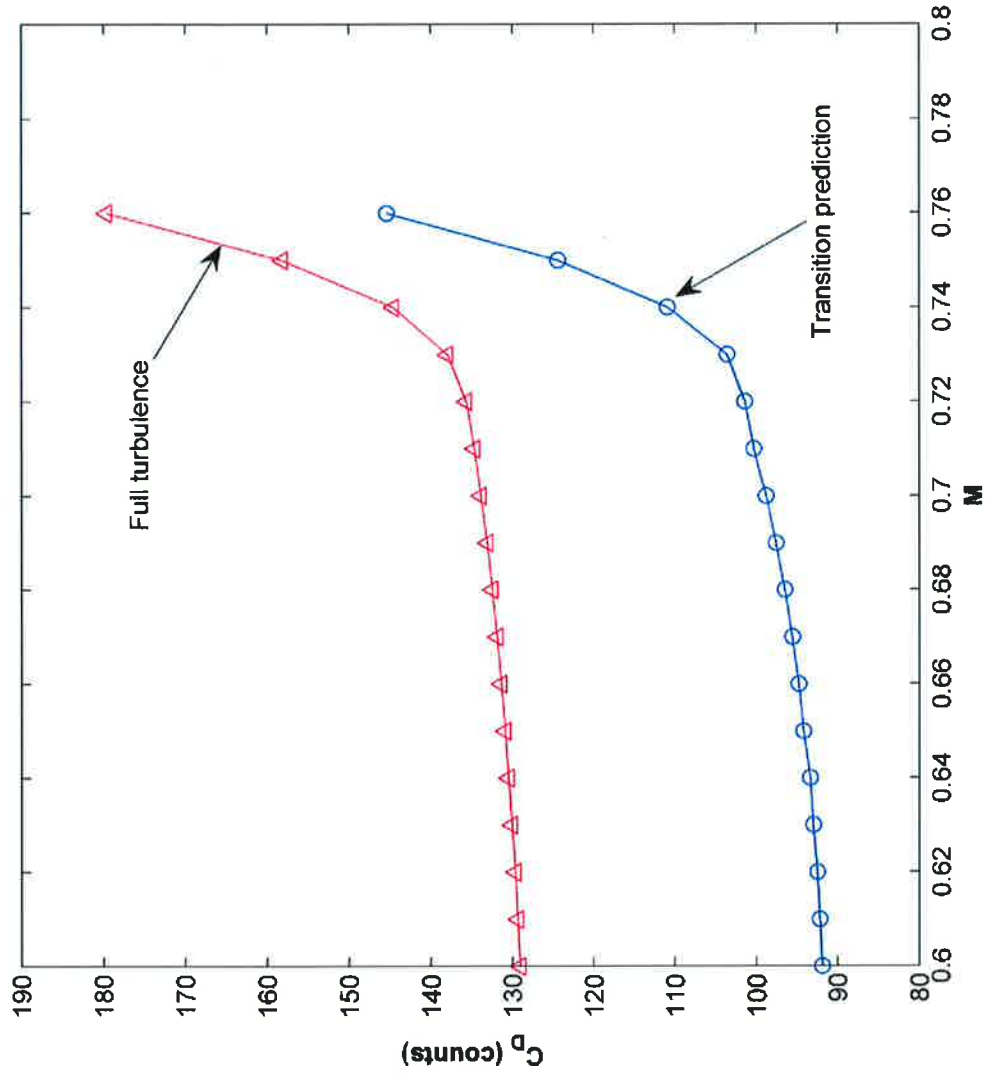


# Shear Stress Distribution: $M = 0.69$ , $C_L = 0.26$

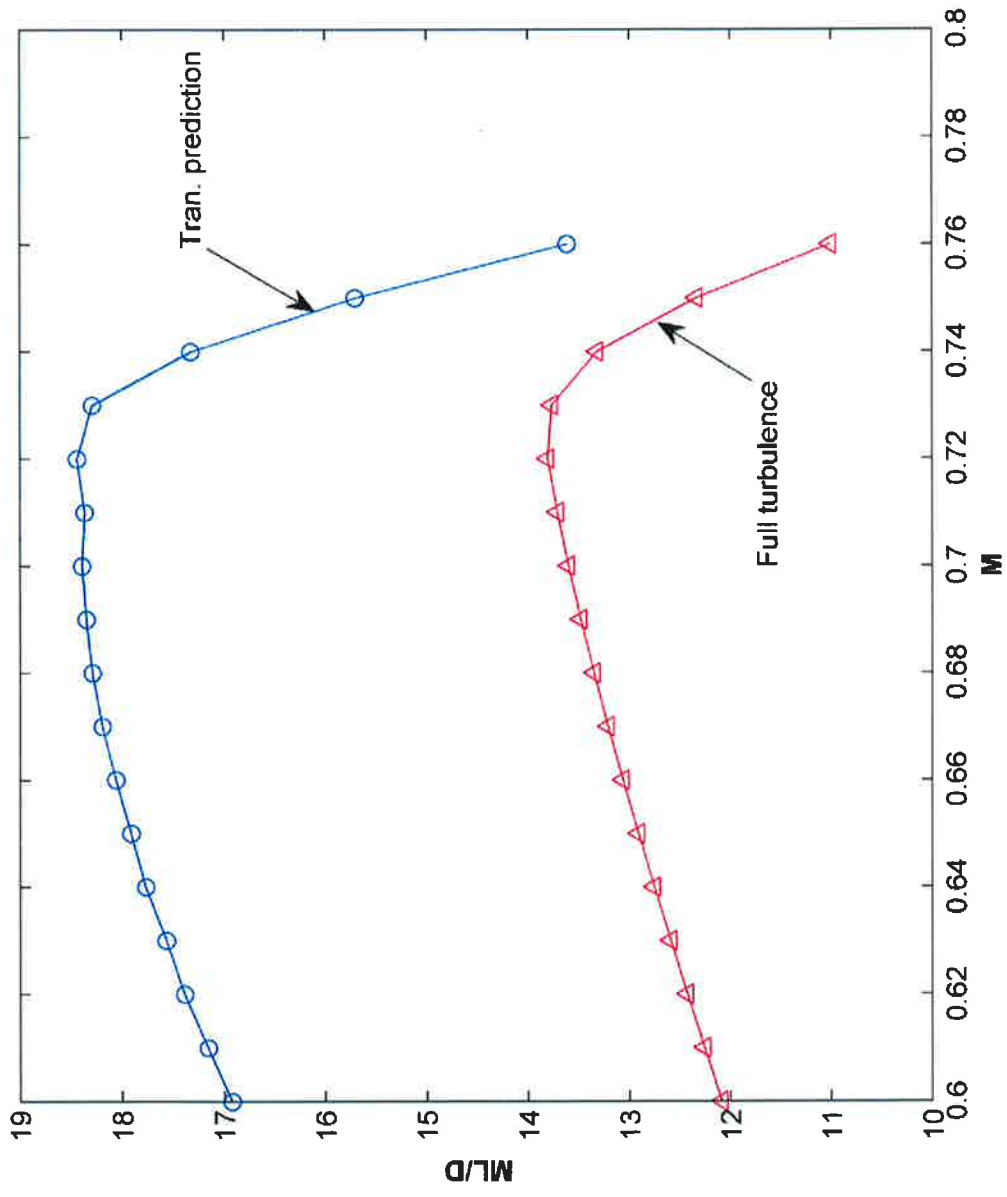




# Comparison of Aerodynamic Coefficients



# Comparison of Aerodynamic Coefficients

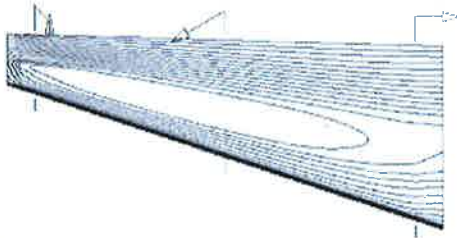


# NLF Wing Design

# Natural-Laminar-Flow Wing Design

IAI-NLF5

Mach: 0.740 Alpha: 0.015  
 CL: 0.258 CD: 0.01352 CM: -0.1669  
 Design: 20 Residual: 0.1833E-02  
 Grid: 2.57X 65X 49



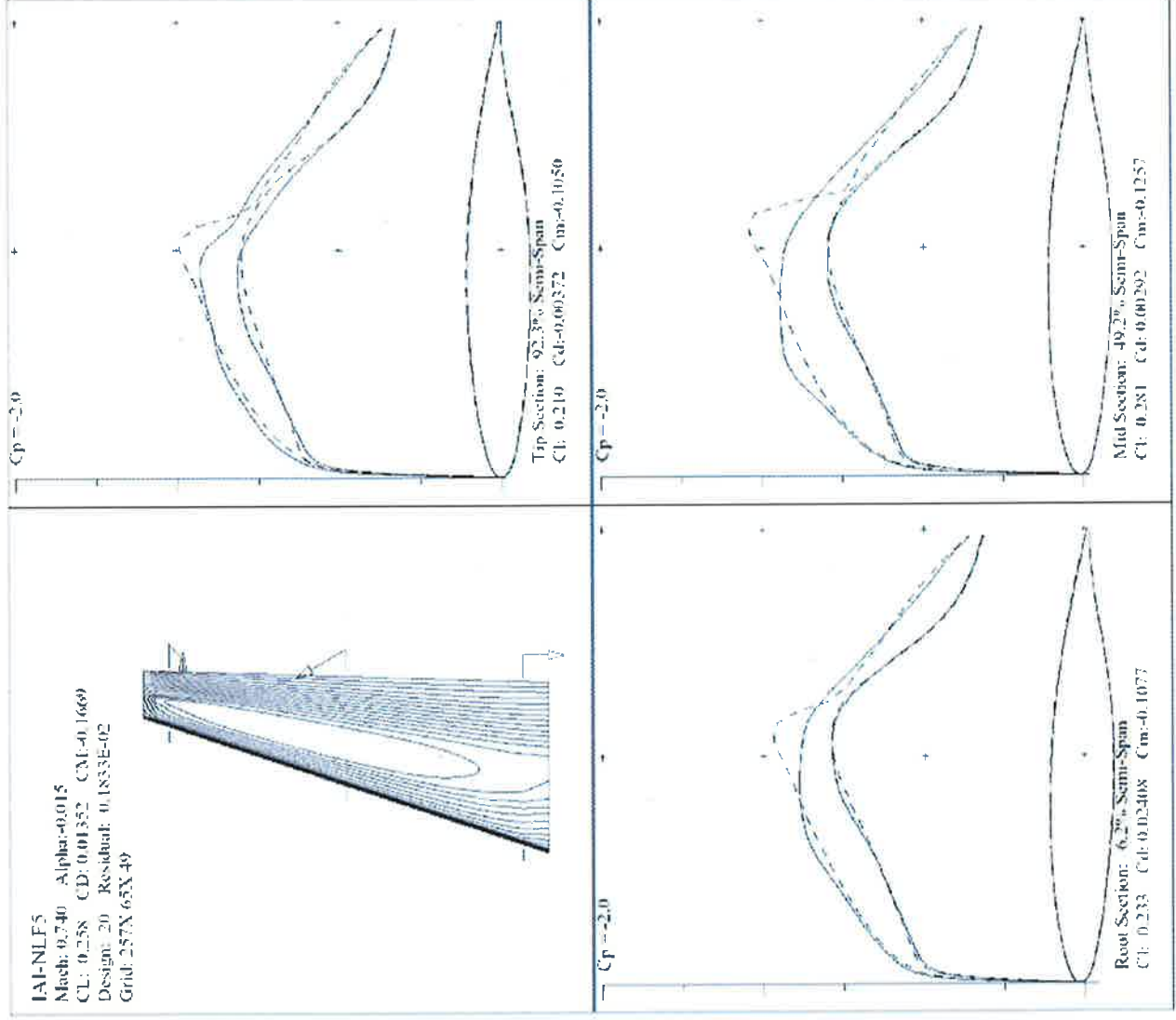
Baseline



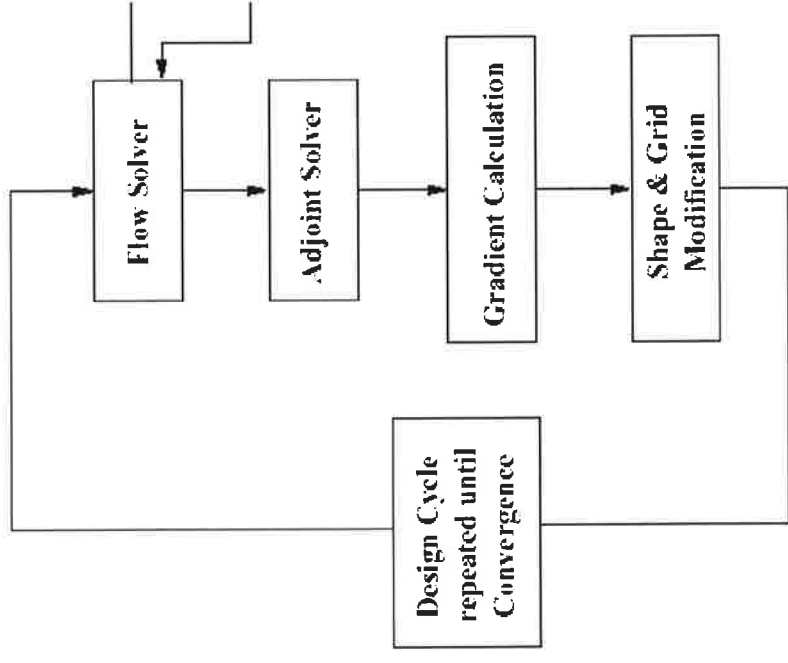
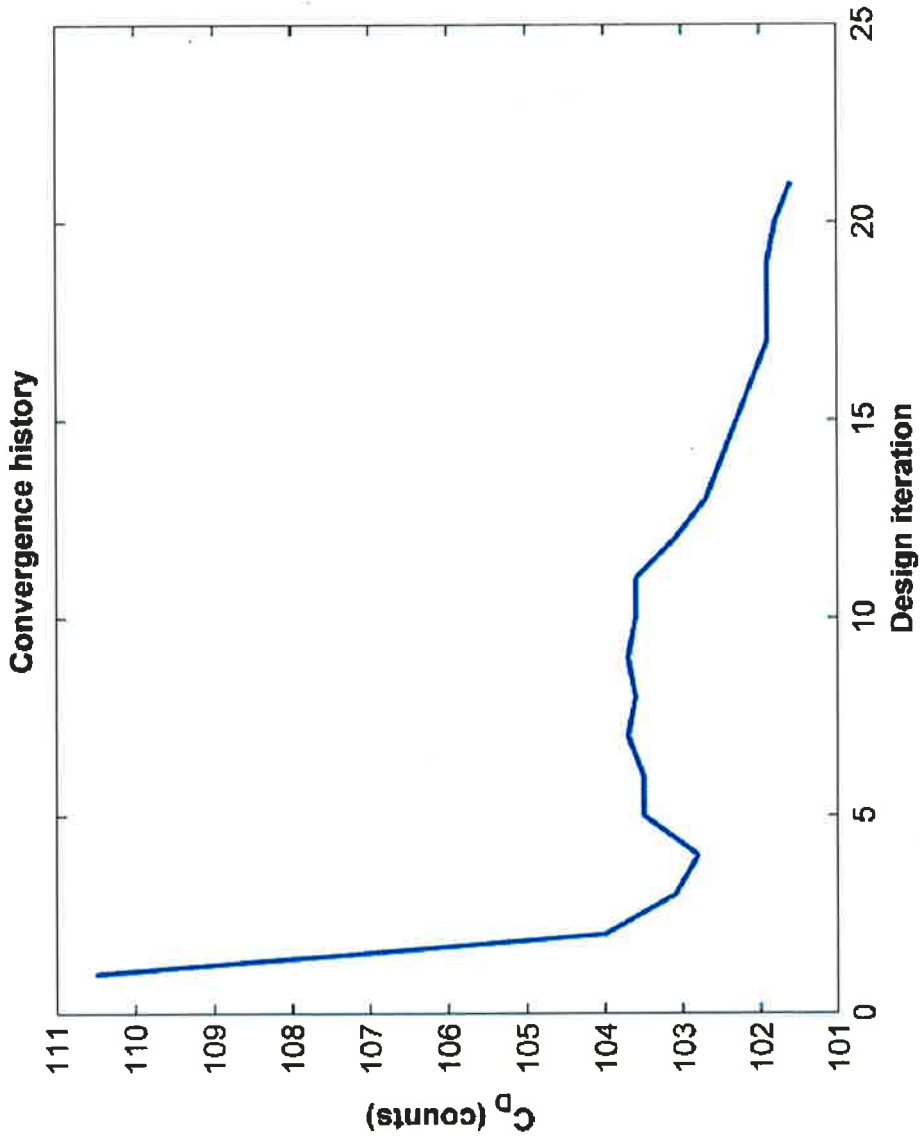
Re-designed



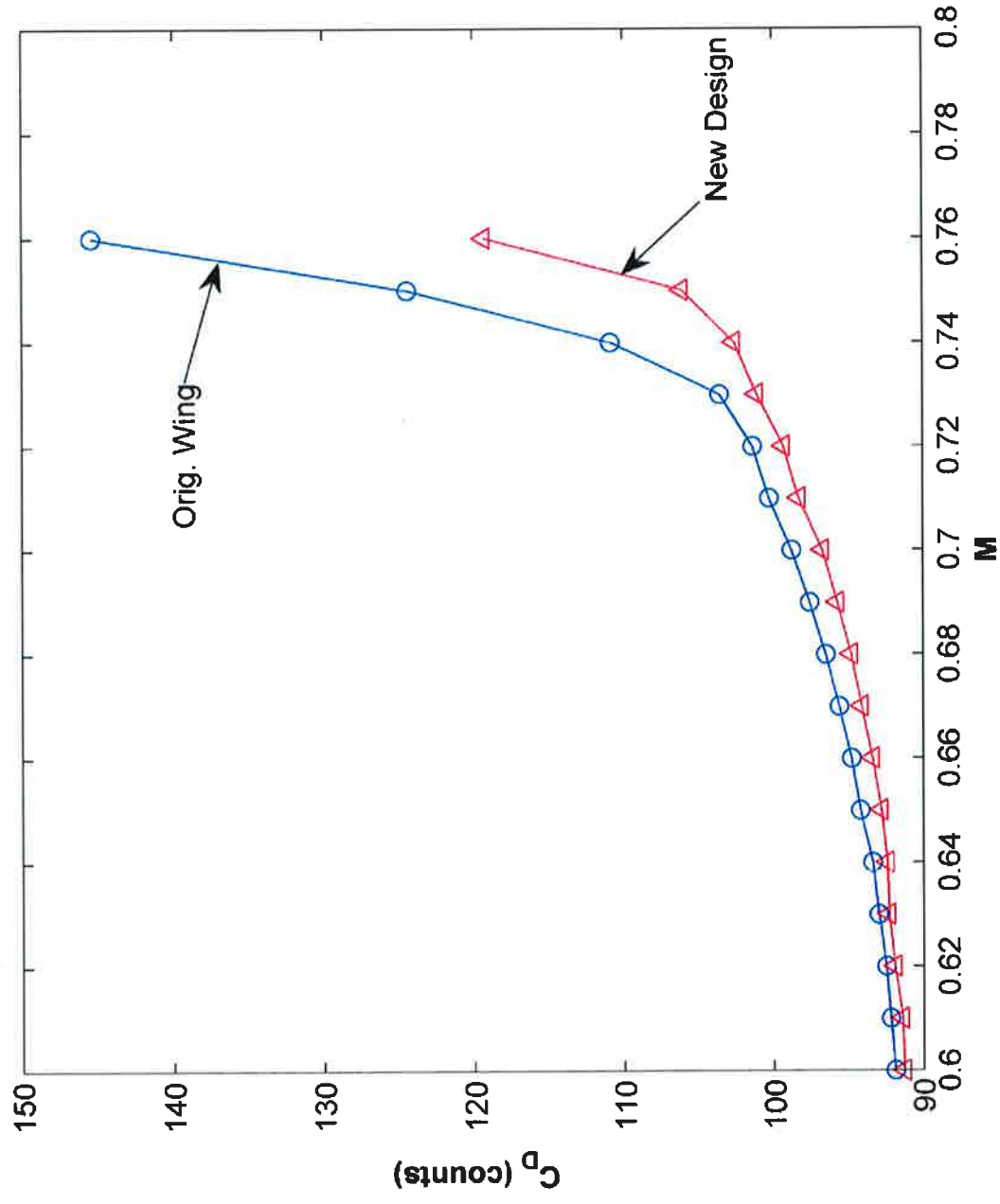
Mach = 0.74



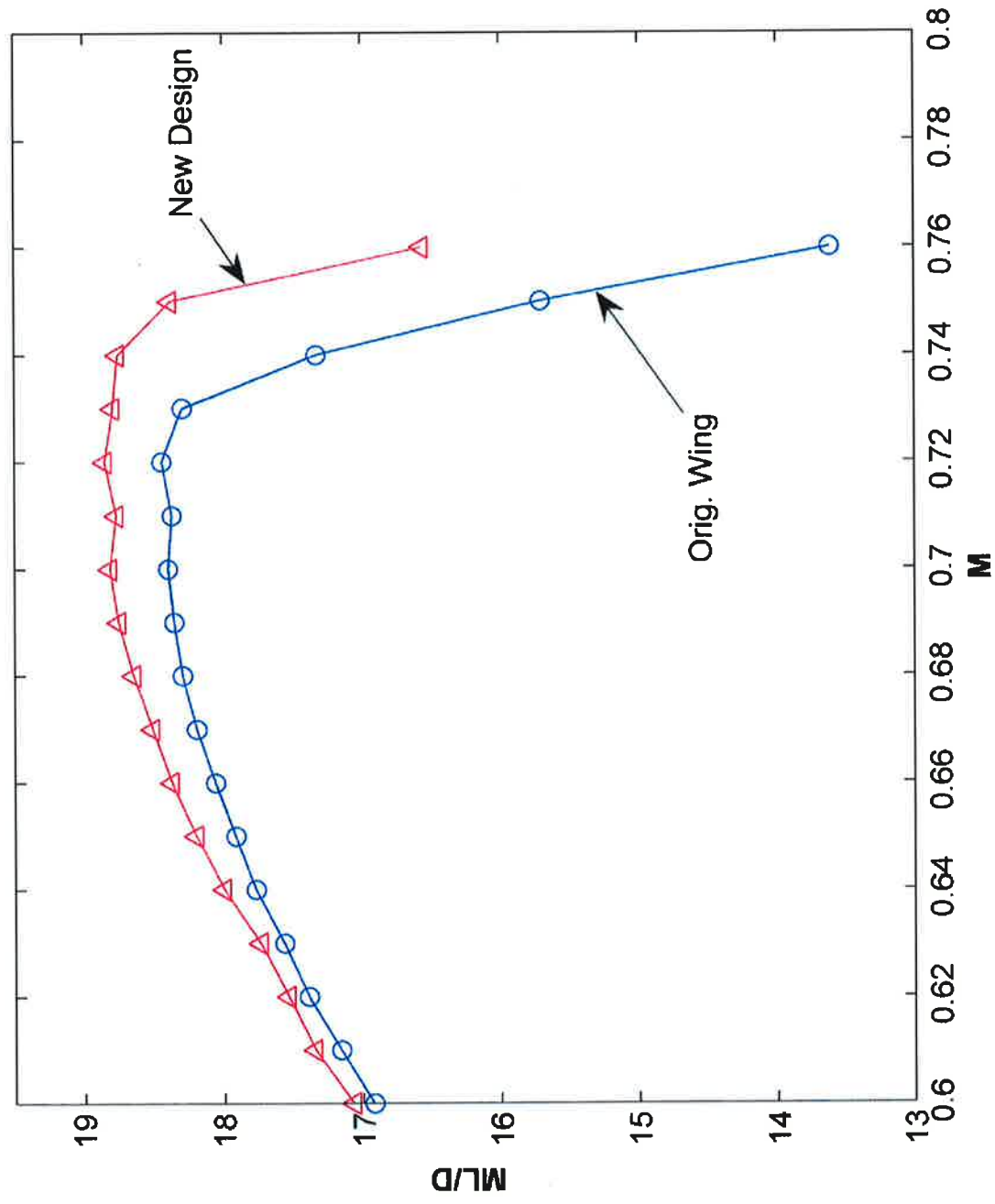
# Natural-Laminar-Flow Wing Design



# Natural-Laminar-Flow Wing Design



# Natural-Laminar-Flow Wing Design

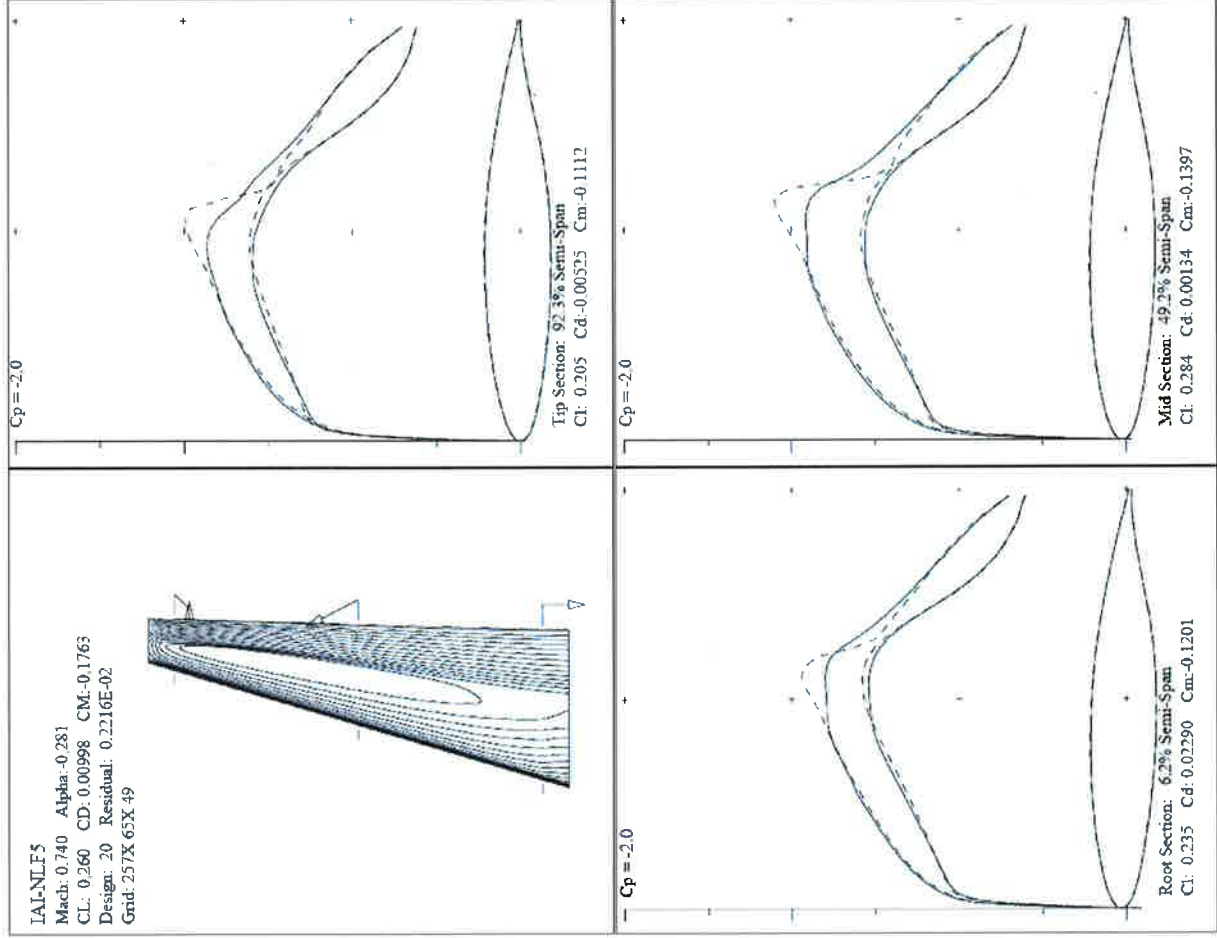


# Redesign of Natural-Laminar-Flow Wing Design

Baseline

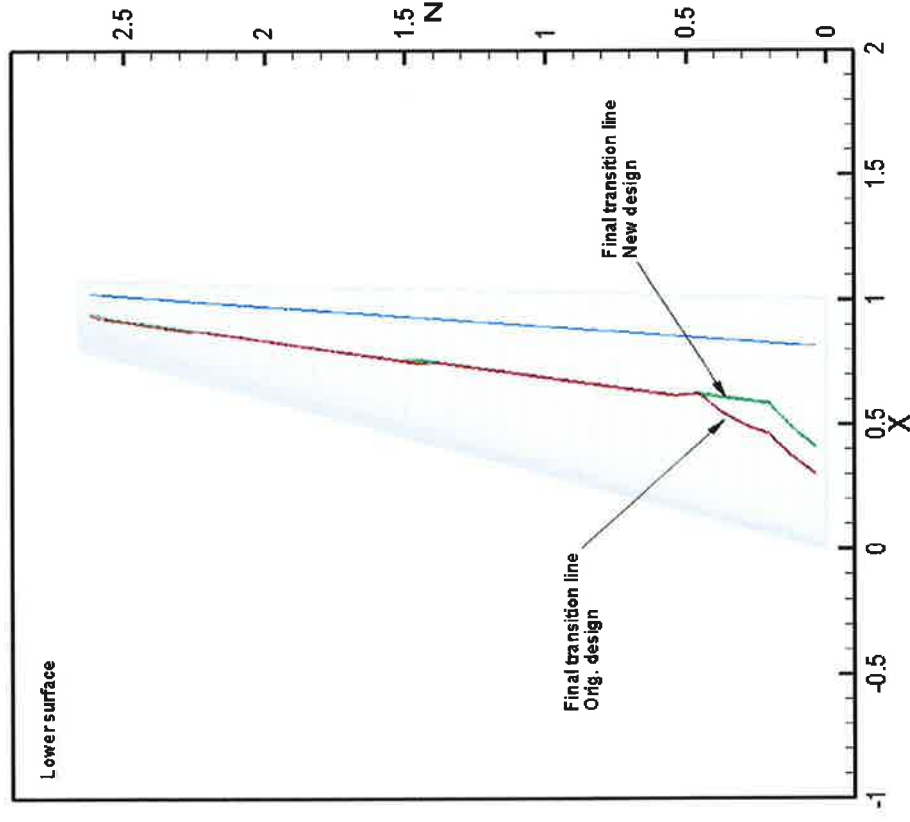
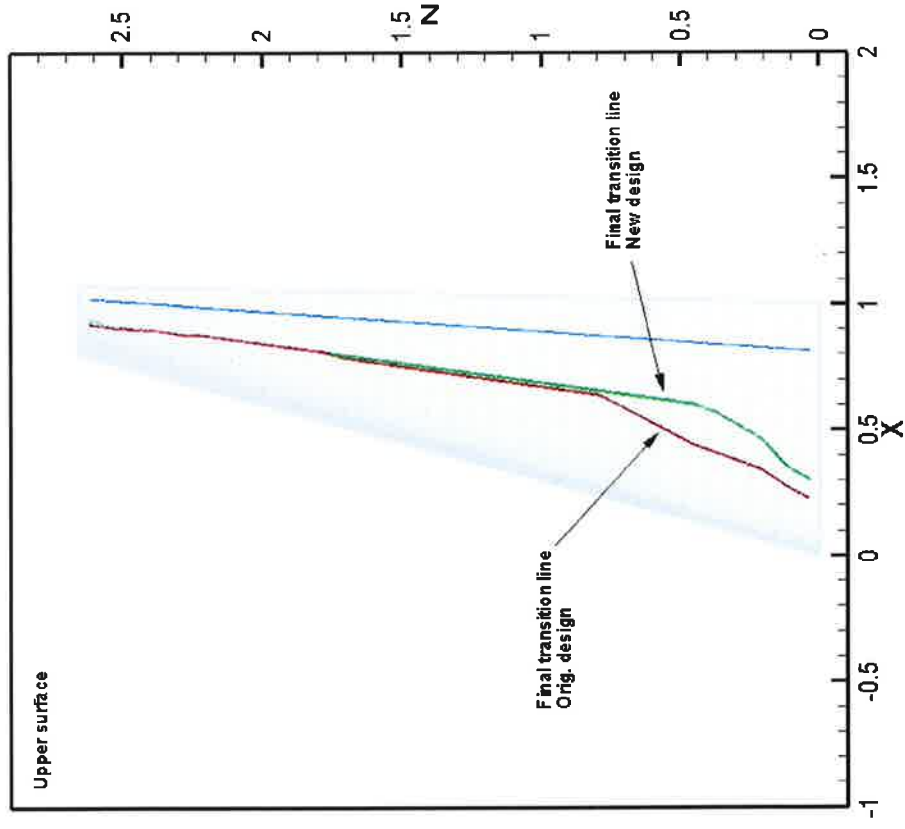
Re-designed

Mach = 0.74





# Redesign of Natural-Laminar-Flow Wing Design



# Summary and Conclusion

## Summary and Conclusion

- This paper focuses on the application of adjoint method for natural-laminar-flow airfoil and wing design.
- A transition prediction module consisting of a boundary-layer code and two  $e^N$ -database methods for streamwise and crossflow instabilities are coupled with the flow solver to predict and prescribe transition locations automatically.
- The coupling of a 2D RANS solver with a transition prediction module provides reasonable accurate transition locations.
- For 3D wing configurations, the results are still reasonable and can be used for the estimation of aerodynamic performance at the initial design stage.
- The differences in aerodynamic coefficients are evident between 100% turbulence and laminar-turbulent transition model, and this indicates the necessary of incorporating transition prediction mechanism with flow solver for more realistic results.
- The new designed wing has an improvement over wide range of Mach numbers and the airfoil has thickness-to-chord ratio about 15% which gives the airplane sufficient fuel volume for the required range.

## Acknowledgement

This work has benefited greatly from the support of

- ▣ Krumbain, A. and Sturdza, P., who share their expertise on transition prediction.
- ▣ Prof. Horton, H. P., who kindly enough provide us the laminar boundary-layer code to make this research possible.