

# Aerodynamic Design Optimization for Natural Laminar Flow Airfoils

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CFD-01: Boundary Layer Transition Modeling and Applications I

9:30AM-9:50AM PDT, Room: Academy Ballroom 410. Las Vegas, NV. July 29, 2024

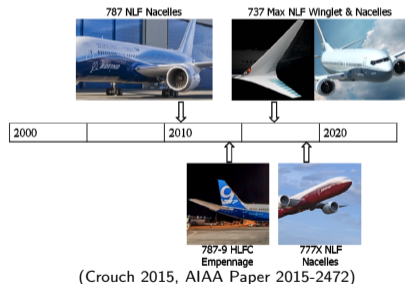


# Outline

- 1 Motivation
- 2 Theory
- 3 Results
- 4 Summary and Concluding Remarks

# Natural Laminar Flow Technology

- Natural laminar flow (NLF) technology is a passive laminar flow control (LFC) strategy that seeks to delay the onset of boundary-layer transition (BLT) through shape optimization to reduce the viscous drag of the aerodynamic vehicle
- Viscous drag accounts for about 50% of the total drag of an aircraft<sup>1</sup>
- Laminar flow on wings at high Re can provide upto  $\mathcal{O}(10\%)$  drag reduction on commercial aircrafts
- Drag reduction improves fuel efficiency that increases flight range and payload capacity, reduces operational costs, and lowers carbon emissions
- Boeing has recently included NLF technologies<sup>2,3</sup>:
  - ▶ 787-8 NLF Nacelles
  - ▶ 737Max NLF Winglet and Nacelles
  - ▶ 777X NLF Nacelles



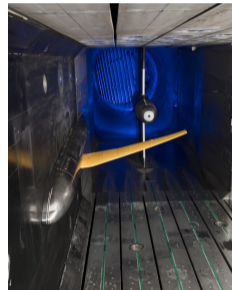
<sup>1</sup>R. Rashad and D.W. Zingg. *Viscous drag reduction on transport aircraft*. AIAA Paper 1991-0685. 1991.

<sup>2</sup>J.D. Crouch. *Boundary-layer transition prediction for laminar flow control*. AIAA Paper 2015-2472. 2015.

<sup>3</sup>M.R. Malik et al. "Application of Drag Reduction Techniques to Transport Aircraft". In: *Encyclopedia of Aerospace Engineering*. John Wiley & Sons, Ltd, 2015.

# Natural Laminar Flow Design Optimization

- Optimization is critical to maximize the benefits of NLF technology
- Knowledge-based inverse-design optimization:
  - ▶ Crossflow Attenuated NLF (CATNLF)<sup>4</sup>
    - \* Successful design of transonic wind tunnel model, the CRM-NLF<sup>5</sup>
- Genetic algorithm design optimization:
  - ▶ Coupling of Euler solver with BL code and LST N-factor calculation<sup>6</sup>
- Physics-based adjoint design optimization:
  - ▶ Coupling of Euler solver with BL code and PSE N-factor calculation<sup>7</sup>
  - ▶ Coupling of RANS solver with BL code and N-factor surrogate<sup>8,9,10</sup>



(<https://commonresearchmodel.larc.nasa.gov/crm-nlf>)

<sup>4</sup>R.L. Campbell and M.N. Lynde. *Natural laminar flow design for wings with moderate sweep*. AIAA Paper 2016-4326. 2016.

<sup>5</sup>M.N. Lynde and R.L. Campbell. *Computational design and analysis of a transonic natural laminar flow wing for a wind tunnel model*. AIAA Paper 2017-3058. 2017.

<sup>6</sup>D. Simanowitsch et al. *Comparison of Gradient-Based and Genetic Algorithms for Laminar Airfoil Shape Optimization*. AIAA Paper 2022-0008. 2022.

<sup>7</sup>O. Amoignon et al. "Shape Optimization for Delay of Laminar-Turbulent Transition". In: *AIAA Journal* 44.6 (2006), pp. 1009–1042.

<sup>8</sup>J.-D. Lee and A. Jameson. *Natural-Laminar-Flow Airfoil and Wing Design by Adjoint Method and Automatic Transition Prediction*. AIAA Paper 2009-0897. 2009.

<sup>9</sup>R. Rashad and D.W. Zingg. *Aerodynamic shape optimization for natural laminar flow using a discrete-adjoint approach*. AIAA Paper 2015-3061. 2015.

<sup>10</sup>Y. Shi et al. "Natural Laminar-Flow Airfoil Optimization Design Using a Discrete Adjoint Approach". In: *AIAA Journal* 58.11 (2020), pp. 4702–4722.

# Objectives

- **Transition Modeling:** Integration of physics-based BLT modeling based on N-factor method into FUN3D/SFE calculations (similar to previous work with FUN3D/FV and LASTRAC<sup>11</sup>)
  - ▶ Direct coupling of RANS transitional solutions with N-factor calculation (no BL code)
  - ▶ Transition location based on N-factor envelope calculation based on linear stability analysis (LSA)
- **Design Optimization:** Fully-coupled physics-based adjoint design optimization of BLT control strategies to target improvement of aerodynamic performance of the vehicle
  - ▶ Sensitivities to transition location incorporated through fully-coupled adjoint of CFD, mesh deformation, and transition prediction solvers

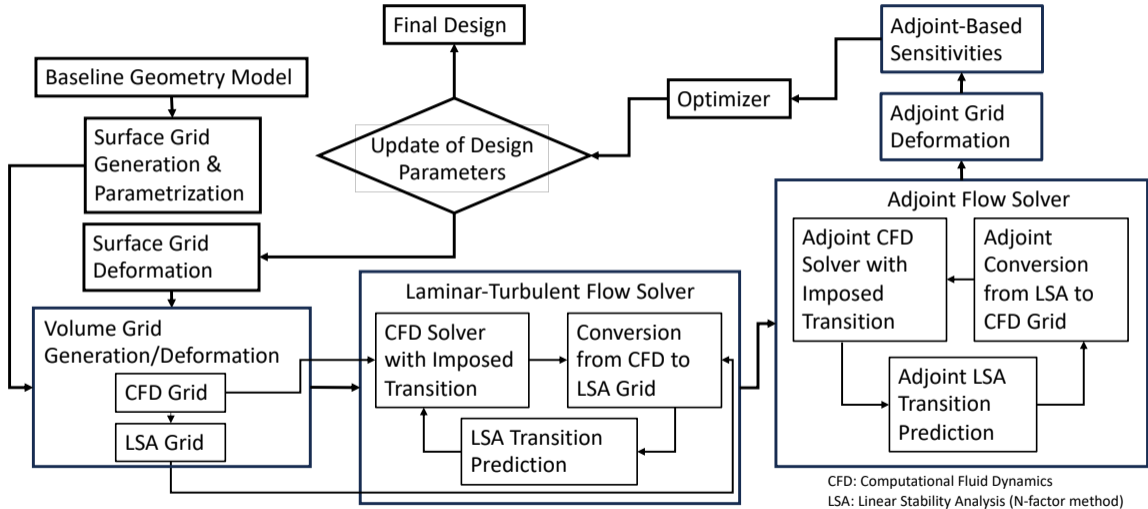
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<sup>11</sup>N. Hildebrand et al. *Coupling of the FUN3D Unstructured Flow Solver and the LASTRAC Stability Code to Model Transition*. AIAA Paper 2022-1952. 2022.

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# NLF Design Optimization with Adjoint-Based Sensitivities



## Coupled Adjoint Formulation

- Adjoint problem formulated by defining the Lagrangian  $\mathcal{L}$  based on the objective function  $\mathbf{J}$  to be optimized
- Lagrangian contains  $\mathbf{J}$  and set of residuals from the forward coupling
- Lagrangian multipliers  $\lambda$  are the adjoint variables

$$\begin{aligned}
 \mathcal{L}(\mathbf{d}, \mathbf{x}_s, \mathbf{x}, \boldsymbol{\xi}, \xi_T, \gamma, \mathbf{Q}, \bar{\mathbf{q}}) = & \mathbf{J}(\mathbf{x}, \mathbf{Q}, \mathbf{d}) + \lambda_D^T \overbrace{\mathbf{D}(\mathbf{d}, \mathbf{x}_s)}^{\text{shape deformation}} + \lambda_G^T \overbrace{\mathbf{G}(\mathbf{x}_s, \mathbf{x})}^{\text{grid deformation}} + \lambda_\xi^T \overbrace{\mathbf{K}_\xi(\mathbf{x}_s, \boldsymbol{\xi})}^{\text{LSA grid}} \\
 & + \lambda_\gamma^T \underbrace{\boldsymbol{\Gamma}(\boldsymbol{\xi}, \xi_T, \gamma)}_{\text{intermittency}} + \lambda_R^T \underbrace{\mathbf{R}(\mathbf{d}, \mathbf{x}, \gamma, \mathbf{Q})}_{\text{CFD flow solution}} + \lambda_q^T \underbrace{\mathbf{K}_q(\mathbf{x}, \boldsymbol{\xi}, \mathbf{Q}, \bar{\mathbf{q}})}_{\text{LSA base flow}} + \lambda_T^T \underbrace{\mathbf{T}(\boldsymbol{\xi}, \bar{\mathbf{q}}, \xi_T)}_{\text{transition location}}
 \end{aligned}$$

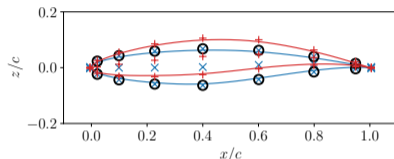
- Adjoint equations derived by differentiating  $\mathcal{L}$  wrt design variables,  $\mathbf{d}$ , and collecting and setting to zero the coefficients of the derivatives wrt state variables,  $\mathbf{x}_s, \mathbf{x}, \boldsymbol{\xi}, \xi_T, \gamma, \mathbf{Q}, \bar{\mathbf{q}}$
- Adjoint-based sensitivities:

$$\frac{d\mathcal{L}}{d\mathbf{d}} = \frac{\partial \mathbf{J}}{\partial \mathbf{d}} + \lambda_D^T \frac{\partial \mathbf{D}}{\partial \mathbf{d}} + \lambda_R^T \frac{\partial \mathbf{R}}{\partial \mathbf{d}}$$

# Surface and Volume Grid Deformation

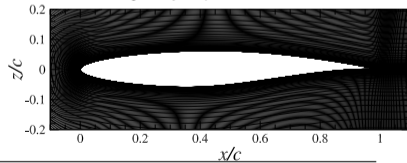
- **Surface grid deformation:** Free-form deformation (FFD) method<sup>12</sup> used for surface parametrization and deformation

- RAE 2822 airfoil with FFD box of 9x3 control points

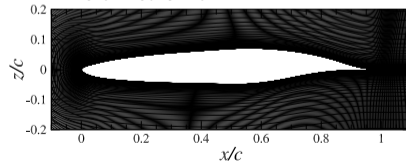


- **Volume grid deformation:** Linear elasticity model<sup>13</sup> used to displace volume nodes as a function of surface deformation

- RAE 2822 airfoil



- Deformed airfoil



<sup>12</sup>T.W. Sederberg and S.R. Parry. "Free-Form Deformation of Solid Geometric Models". In: *SIGGRAPH Computer Graphics* 20 (1986), pp. 151–160.

<sup>13</sup>E.J. Nielsen and W.K. Anderson. "Recent improvements in aerodynamic design optimization on unstructured meshes". In: *AIAA Journal* 40.6 (2002), pp. 1155–1163.

# Transition Prediction Coupled with FUN3D

- **CFD solver:** FUN3D/SFE solver<sup>14</sup> based on second-order finite-element discretization with negative version of Spalart-Allmaras RANS model
- **Transition prediction:** Dual N-factor based on LST of planar TS and stationary CF instabilities
- **Laminar-turbulence model:** Intermittency function  $\gamma$  is a multiplier of the turbulence production term<sup>15,16</sup>

$$\gamma(\xi, \xi_T) = \begin{cases} 1 - \exp \left[ -0.413 \left( \frac{3.36(\xi - \xi_T)}{l_T(\xi_T)} \right)^2 \right], & Re_{l_T} = 5.2 Re_{\xi_T}^{3/4} & \text{if } \xi \geq \xi_T \\ 0 & & \text{if } \xi < \xi_T, \end{cases}$$

## Iterative method to model transitional flow

- 1 Calculate mean flow solution with defined  $\gamma(\xi_{T,i})$
- 2 Convert near wall laminar-flow solution from CFD to LSA grid
- 3 Perform LSA and define a new  $\gamma(\xi_{T,i+1})$
- 4 Check convergence, i.e.,  $|\xi_{T,i+1} - \xi_{T,i}| < \epsilon_T$ , and go to step 1 if not satisfied

<sup>14</sup>W.K. Anderson, J.C. Newman, and S.L. Karman. *Stabilized finite elements in FUN3D*. AIAA Paper 2017-0077. 2017.

<sup>15</sup>S. Dhawan and R. Narasimha. "Some Properties of Boundary Layer Flow During the Transition from Laminar to Turbulent Motion". In: *Journal of Fluid Mechanics* 3.4 (1958), pp. 418–436.

<sup>16</sup>G.J. Walker. "Transition Flow on Axial Turbomachine Blading". In: *AIAA Journal* 27.5 (1989), pp. 595–602.

# The Dual $N$ -factor Criterion<sup>20</sup>

- The logarithmic amplification ratio or  $N$ -factor is defined as

$$N(\xi, \omega, \beta) = - \int_{\xi_I}^{\xi} \sigma(\xi', \omega, \beta) d\xi'$$

- $\sigma(\xi', \omega, \beta)$ : Disturbance growth rate calculated with spatial LST eigenvalue analysis
- Transition onset predicted where the dual  $N$ -factor indicator function reaches 1,  $I_N = N_d(N_{TS}, N_{CF}) = 1$

$$I_N = N_d(N_{TS}, N_{CF}) = \left( \frac{N_{TS}}{N_{TS,c}} \right)^{a_{TS}} + \left( \frac{N_{CF}}{N_{CF,c}} \right)^{a_{CF}}$$

- $N_{CF}$ :  $N$ -factor envelope of stationary CF waves ( $\omega = 0$ )
- $N_{TS}$ :  $N$ -factor envelope of TS waves approximated by the envelope of planar waves ( $\beta = 0$ ) in a rotated orthogonal coordinate system aligned with  $\mathbf{u}_\infty$
- Demonstrated and validated for a subsonic aircraft model<sup>17</sup> and the transonic CRM-NLF model<sup>18</sup>
- Discrete adjoint implementation of spatial LST eigenvalue analysis similar to previous work<sup>19</sup>

<sup>17</sup>A. Leidy et al. *Measurements and Computations of Natural Transition on the NASA Juncture-Flow Model with a Symmetric Wing*. AIAA Paper 2023-0441. 2023.

<sup>18</sup>P. Paredes et al. *Transition Modeling based on the Dual  $N$ -factor Method for the CRM-NLF Wind Tunnel Configuration*. AIAA Paper 2023-3532. 2023.

<sup>19</sup>C. Klauss et al. *Eigenvalue sensitivity computations for linear stability theory*. AIAA Paper 2023-3271. 2023.

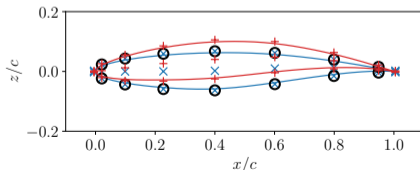
<sup>20</sup>D. Arnal. "Boundary layer transition: Prediction based on linear theory". In: *Special course on Progress in Transition Modeling*. AGARD. R-793. 1994, pp. 1–62.

# Outline

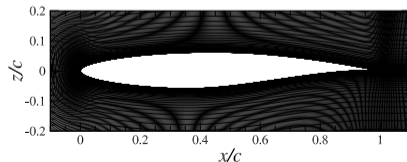
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## Flow Conditions and Optimization Parameters

- RAE 2822 airfoil used to evaluate coupled adjoint formulation for design optimization
  - ▶ Unswept, 2D BL case:  $\Lambda = 0^\circ$ ,  $C_{L,d} = 0.3$ , symmetric spanwise BCs
  - ▶ Swept, 3D BL case:  $\Lambda = 30^\circ$ ,  $C_{L,d} = 0.225$ , zero-order extrapolation spanwise BCs
- Optimizer: SNOPT, gradient-based optimizer with sequential quadratic programming method
- Objective function:  $\mathbf{J} = C_D$
- Constraints:  $C_L = C_{L,d}$ ,  $A \leq A_0$  (area),  $t_{cp} > 0.5t_{cp,0}$  (thickness)
- Design variables:  $AoA$ , vertical displacement of 14 FFD control points (black circles)
- NASA FUN3D/SFE solver: NS solver for unstructured grids with finite-element discretization
- CGT<sup>21</sup>: c-type structured grid with  $1,521 \times 2 \times 151$  points (721 in airfoil surface, 75 in BL at midchord)
- RAE 2822 airfoil with FFD box



- Near-wall grid view



<sup>21</sup>W. Chan et al. *Best practices in overset grid generation*. AIAA Paper 2002-3191. 2002.

# Computational Details and Verification of Adjoint-Based Sensitivities

- Dual N-factor parameters for transition modeling:
  - ▶  $N_{TS,c} = 9$ ,  $N_{CF,c} = 7$ ,  $a_{TS} = 1$ ,  $a_{CF} = 2.5$
- Convergence thresholds:
  - ▶ RANS residual:  $\epsilon_R = 10^{-13}$
  - ▶ Linear grid deformation:  $\epsilon_G = 10^{-13}$
  - ▶ LST eigenvalue problem with Newton-Raphson iterations:  $\epsilon_{LST} = 10^{-9}$
  - ▶ Transition location:  $\epsilon_T = 10^{-8}$
- Adjoint implementation verified by comparing adjoint-based and real-step central FD sensitivities

	Adjoint	Central FD ( $h = 10^{-6}$ )
$d(C_D)/d(AoA)$	$1.208 \times 10^{-3}$	$1.207 \times 10^{-3}$
$d(C_L)/d(AoA)$	$7.856 \times 10^{-2}$	$7.862 \times 10^{-2}$
$d(C_D)/d(FFD_z)$	$1.875 \times 10^{-1}$	$1.887 \times 10^{-1}$
$d(C_L)/d(FFD_z)$	-1.391	-1.402

- Relative errors are  $\mathcal{O}(10^{-3})$  with selected FD step size and convergence thresholds
- Similar relative errors found for a linearized frequency-domain gust analysis with FUN3D/SFE<sup>22</sup>

<sup>22</sup>K.E. Jacobson, A.S. Thelen, and B.K. Stanford. *Linearized Frequency-Domain Gust Analysis and Adjoint-Based Sensitivities*. AIAA Paper 2024-2591. 2024.

# Computational Details and Verification of Adjoint-Based Sensitivities

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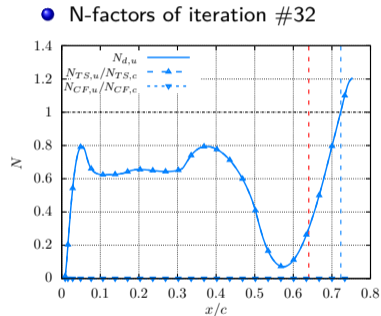
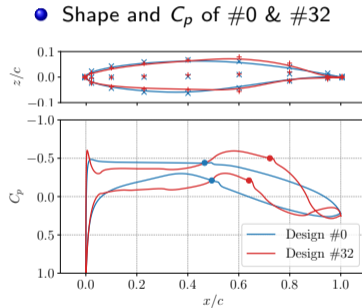
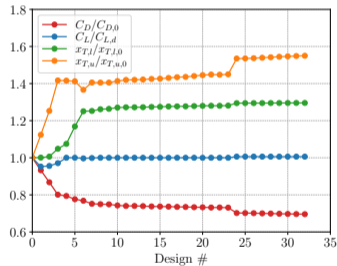
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- Relative errors are  $\mathcal{O}(10^{-3})$  with selected FD step size and convergence thresholds
- Similar relative errors found for a linearized frequency-domain gust analysis with FUN3D/SFE<sup>22</sup>
- For a fixed  $\xi_T$ , sensitivities become  $d(C_D)/d(AoA) = 9.840 \times 10^{-5}$  and  $d(C_D)/d(FFD_z) = -2.760 \times 10^{-4}$ 
  - ▶ Highlights importance of accounting for the effects of  $\xi_T$  variations

<sup>22</sup>K.E. Jacobson, A.S. Thelen, and B.K. Stanford. *Linearized Frequency-Domain Gust Analysis and Adjoint-Based Sensitivities*. AIAA Paper 2024-2591. 2024.

# Unswept RAE 2822 Airfoil

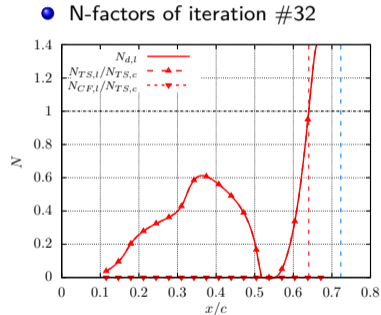
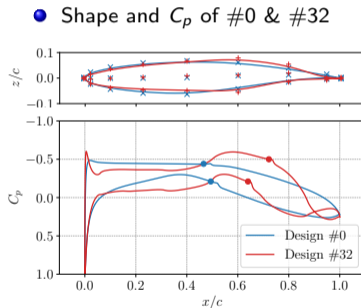
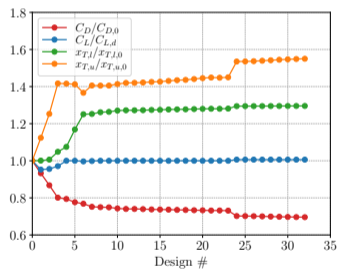
- Flow conditions:  $M_\infty = 0.19$ ,  $Re_c = 5.6 \times 10^6$ ,  $T_\infty^* = 300$  K,  $\Lambda = 0^\circ$ ,  $AoA_0 = 0.72^\circ$ ,  $C_{L,d} = 0.3$
- 2D boundary layer:  $N_{CF} = 0$ ,  $N_d = N_{TS}/9$
- $C_D/C_{D,0}$ ,  $C_L/C_{L,d}$ ,  $x_T/x_{T,0}$
- Shape and  $C_p$  of #0 & #32
- N-factors of iteration #32



- Optimized airfoil #32:  $AoA_{32} = 1.057^\circ$ ,  $C_{D,32}/C_{D,0} = 0.7$  (30% drag reduction)
- Additional design iterations required to reach optimum shape for NLF

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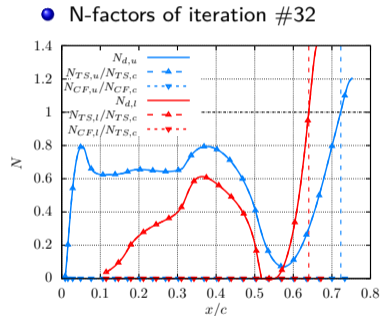
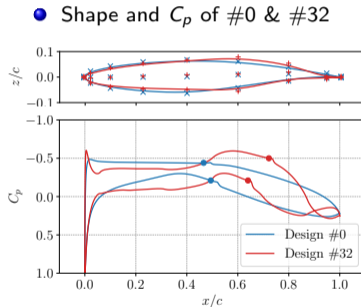
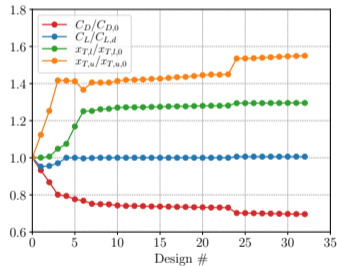
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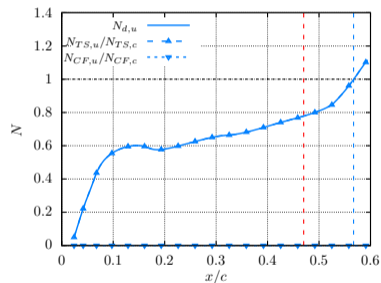
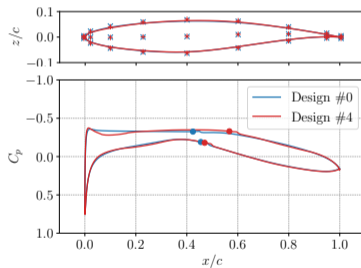
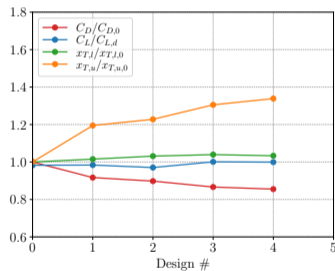
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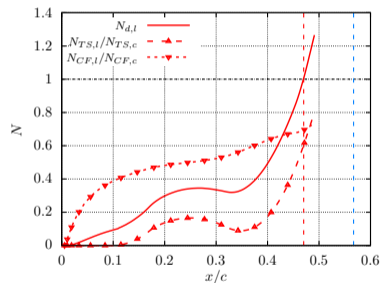
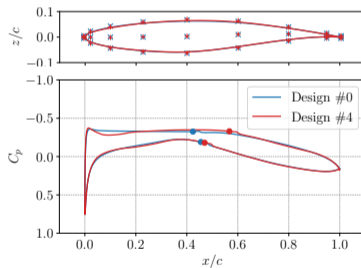
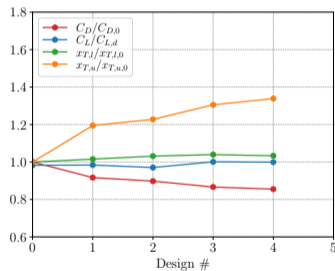
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- 3D boundary layer:  $N_d = (N_{TS}/9) + (N_{CF}/7)^{2.5}$  ( $N_{CF} > 0$  only in lower side)
- $C_D/C_{D,0}$ ,  $C_D/C_{D,d}$ ,  $x_T/x_{T,0}$
- Shape and  $C_p$  of #0 & #4
- N-factors of iteration #4



- Optimized airfoil (iteration #4):  $AoA_4 = 0.658^\circ$ ,  $C_{D,4}/C_{D,0} = 0.855$  (14.5% drag reduction)
- Additional design iterations expected to further reduce drag

# Swept RAE 2822 Airfoil

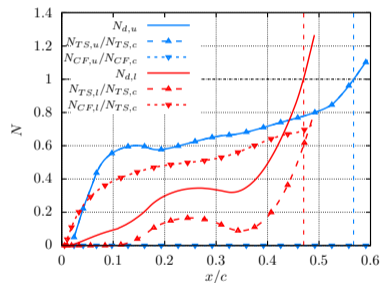
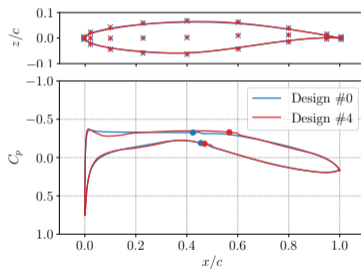
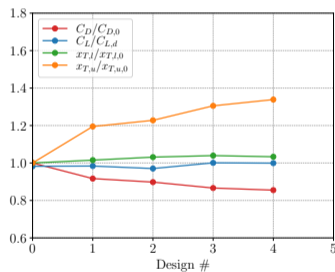
- Flow conditions:  $M_\infty = 0.19$ ,  $Re_c = 5.6 \times 10^6$ ,  $T_\infty^* = 300$  K,  $\Lambda = 30^\circ$ ,  $AoA_0 = 0.72^\circ$ ,  $C_{L,d} = 0.225$
- 3D boundary layer:  $N_d = (N_{TS}/9) + (N_{CF}/7)^{2.5}$  ( $N_{CF} > 0$  only in lower side)
- $C_D/C_{D,0}$ ,  $C_D/C_{D,d}$ ,  $x_T/x_{T,0}$
- Shape and  $C_p$  of #0 & #4
- N-factors of iteration #4



- Optimized airfoil (iteration #4):  $AoA_4 = 0.658^\circ$ ,  $C_{D,4}/C_{D,0} = 0.855$  (14.5% drag reduction)
- Additional design iterations expected to further reduce drag

# Swept RAE 2822 Airfoil

- Flow conditions:  $M_\infty = 0.19$ ,  $Re_c = 5.6 \times 10^6$ ,  $T_\infty^* = 300$  K,  $\Lambda = 30^\circ$ ,  $AoA_0 = 0.72^\circ$ ,  $C_{L,d} = 0.225$
- 3D boundary layer:  $N_d = (N_{TS}/9) + (N_{CF}/7)^{2.5}$  ( $N_{CF} > 0$  only in lower side)
- $C_D/C_{D,0}$ ,  $C_D/C_{D,d}$ ,  $x_T/x_{T,0}$
- Shape and  $C_p$  of #0 & #4
- N-factors of iteration #4



- Optimized airfoil (iteration #4):  $AoA_4 = 0.658^\circ$ ,  $C_{D,4}/C_{D,0} = 0.855$  (14.5% drag reduction)
- Additional design iterations expected to further reduce drag

# Outline

- 1 Motivation
- 2 Theory
- 3 Results
- 4 Summary and Concluding Remarks**

# Summary and Concluding Remarks

- Implementation of physics-based aerodynamic design optimization of unswept and swept airfoils for natural laminar flow
  - ▶ Adjoint-based design optimization formulation with NASA FUN3D/SFE, linear grid deformation, and physics-based transition modeling based on linear stability analysis
  - ▶ Iterative transition modeling method with NASA FUN3D/SFE based on dual N-factor criterion with LST spatial eigenvalue problem that accounts for linear amplification of planar TS and stationary CF waves
- Preliminary optimization results with unswept and swept airfoils at subsonic conditions achieve significant drag reductions by shifting transition locations downstream over both airfoil sides
- Future work:
  - ▶ Perform additional design iterations to reach optimal airfoil shapes
  - ▶ Extend the analysis to transonic and supersonic conditions
  - ▶ Apply the optimization to 3D NLF wing design

# Thank you for your attention

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