

### Advanced Control Research Laboratory

University of Illinois at Urbana-Champaign



# L<sub>1</sub> Adaptive Control and its Transition to Aerospace Applications

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IEEE Conference on Decision and Control :: Maui, Hawaii 2012

# Outline

- Overview of Various Control Design Methods
- Adaptive Control Methods
- Internal Model Control and L<sub>1</sub> Adaptive Control
- AirSTAR Project

✓ L<sub>1</sub> Adaptive Control for Multi-Input Multi-Output System

- ✓ AirSTAR Flight Tests
- Ongoing Transition Efforts in Europe
- Conclusions

# **Controller Design Methods**

#### Non-model Based Approach

- PID Control
- Unfalsified Control (Safonov 1996)
- Fuzzy Logic Control (Zadeh 1965)
- Black Box Adaptive Control
- …

#### Model Based Approach

- LQR Control
- Nonlinear Dynamic Inversion
- Internal Model Principle (IMP) (Francis 1976)
- Internal Model Control (IMC) (Morari 1982)
- $H_{\infty}$  methods (Zames, Helton, Tannenbaum 1970's) >
- Gray Box Adaptive Control
- …

- Tuning of 3 gains to achieve desired specifications
- Data driven online selection of a controller among a predefined set of candidates
- Smooth switching of control strategy based on predefined events or rules (based on fuzzy logic)
- Relies mostly on aposteriori information. Attempts to identify the behavior of the system online.
  - For a given system model generate control which minimizes a quadratic cost function
  - A method to cancel a known system nonlinearity.
  - Controller must incorporate known model of disturbance in order to compensate for it
  - Controller incorporates nominal model of the system
    - Robust control design for an uncertain system is represented as an optimization problem
  - Structure of the system and apriori parameter knowledge is available, adaptation is used to address uncertainty in system parameters

Design procedure of model based approach relies on the apriori available model of the system

# **Adaptive Control Solutions**

Control Law with Uncertain System Uncertain System State Predictor State Predictor State Predictor East Adaptation KRAC

#### << Departure in Philosophy >>

 The <u>current estimated</u> values are used to compensate for the uncertainty

Indirect MRAC

- Estimation and control run in the same frequency range
- Resulting <u>coupling may lead to poor</u> <u>performance</u> and instability
- <u>Performance</u> of the estimation loop <u>depends on</u> <u>the adaptation rate</u>
  - Higher rates affect robustness and transient
  - Tradeoff is resolved by adaptation rate
- MRAC aims for complete compensation of the uncertainty
  - Ambitious (not achievable) control objective

- The control signal is generated using a lowpass filter
- Large adaptation rates shift estimation dynamics to high frequency range
  - Estimation and control are decoupled
  - Robustness is not affected by adaptation rates

✤ L<sub>1</sub> Adaptive Control

- <u>Performance</u> of the estimation loop <u>can be</u> <u>arbitrarily improved</u> by increasing the adaptation rates
- L<sub>1</sub> adaptive control system aims for partial compensation of the system uncertainty within the bandwidth of the lowpass filter
  - Achievable control objective

# **L<sub>1</sub> Adaptive Control and IMC Architectures**

- L<sub>1</sub> adaptive controller shares the philosophy with IMC controller
  - Both architectures aim for compensation of the system uncertainty within the bandwidth of the lowpass filter



- L<sub>1</sub> adaptive controller uses <u>fast estimation loop</u> to obtain the estimate of the system uncertainty
- IMC controller inverts the ideal system dynamics to measure the uncertainty at the system input



- L<sub>1</sub> adaptive controller achieves the input-output behavior of IMC controller in the presence of fast adaptation rates
  - We refer to IMC controller as "limiting controller"
  - From input-output behavior perspective we can talk about equivalence of these control methods
  - Are there any differences between L<sub>1</sub> and IMC from other points of view?

### **Comparison of the Architectures**

L<sub>1</sub> Adaptive Control

#### **Internal Model Control**



- ✤ L<sub>1</sub> adaptive controller offers <u>significantly richer control architecture</u>
  - Straight forward modification of the estimation loop to address real world requirements without affecting the control law performance (Z. Li CDC 2012, Vanness ACC 2012, Kharisov ACC 2012)
- IMC requires explicit inversion of the ideal model
  - Computation of the system inverse may become a limitation
- The estimation loop of L<sub>1</sub> adaptive controller does not require the knowledge of the system inverse; it computes the approximate system inverse with fast estimation (Kharisov GNC 2011)
  - Beneficial from <u>implementation perspective</u>
  - Possible use of the architecture in other fields of engineering

### **Explicit vs. Approximate System Inversion**



- In the presence of fast adaptation L<sub>1</sub> adaptive controller achieves its <u>limiting</u> <u>controller</u>, which is <u>not implementable</u>
- ✤ L<sub>1</sub> adaptive controller does not require the system inversion
- IMC controller <u>uses lowpass filter to compute the output derivatives</u> needed for the ideal model inversion
  - for nonlinear ideal model the blocks do not commute
  - may lead to significant transient errors



### L<sub>1</sub> Adaptive Architecture: Decoupling Estimation from Control



 $\succ$  L<sub>1</sub> adaptive controller achieves decoupling of estimation from control, which

#### eliminates uncertainties from the estimation loop

- > Decoupling of estimation from control allows for various modifications of the
  - estimation scheme without violating robustness of the system
- MRAC does not have decoupling between control and estimation
- Non-adaptive controller does not have an estimation loop

### **Adaptive Control in Transition**



# **Integrated Resilient Aircraft Control (IRAC)**

Develop validated, multidisciplinary integrated aircraft control design tools and techniques for enabling safe flight in the presence of adverse conditions (faults, damage, and/or upsets).

• Advance the state-of-the-art in adaptive control as a design option that will provide enhanced stability and maneuverability margins for safe landing in adverse conditions



# **Robust Fast Adaptation: the key to** *safe flight*



#### Control law objectives:

- Keep aircraft in the <u>wind tunnel data</u> <u>envelope</u> (accurate models)
- Eventually, return to <u>normal flight</u> <u>envelope</u>

Control actions within 2-4 seconds of failure onset are **critical**:

- ✓ Need for transient performance guarantees
- ✓ Predictable response
- ✓ Need for fast adaptation



# **Main Features of L<sub>1</sub> Adaptive Control**

- Separation between adaptation and robustness
- Speed of adaptation subject only to hardware limitations
- Guaranteed robustness with fast adaptation
- Guaranteed transient response for input and output



- NOT achieved via high-gain feedback or persistence of excitation or gain-scheduling or control reconfiguration
- Guaranteed (bounded away from zero) time-delay margin
- Uniform <u>scaled transient response</u> dependent on changes in initial conditions, uncertainties, and reference inputs
- Verifiable software with <u>computationally predictable</u> numerical characteristics
- <u>Systematic</u> design guidelines suitable for flight verification

Suitable for development of **theoretically justified Verification & Validation tools** for feedback systems

# **NASA Langley AirSTAR :: Generic Transport Model**

*High-risk flight conditions*, some unable to be tested in target application environment.



- **5.5 % geometrically and dynamically scaled model** 
  - 82in wingspan, 96in length, 49.6 lbs (54 lbs full), 53 mph stall speed
  - Model angular response is 4.26 <u>faster</u> than full scale
  - Model velocity is 4.26 times <u>slower</u> than regular scale

# **AirSTAR :: Challenges**

Inner-loop state-feedback controller for tracking angle of attack, roll rate, and sideslip angle commands.

#### <u>Challenges:</u>

- Single <u>all-adaptive</u> CAS design for the entire flight envelope (including stall and post stall high α conditions), without gain scheduling
- Compensation for structural damage/actuator failures without FDI methods
- Compensation for **unmatched uncertainties** variations is  $\alpha$ ,  $\beta$ , V dynamics with flight condition
- Strict performance requirements:
  - High precision tracking
  - Reduced workload
  - Predictable response!!!
- Hardware requirements:
  - Euler integration at 600Hz



### **L1 AFCS :: Problem Formulation**

#### System dynamics:

$$\dot{x}(t) = A_m x(t) + B_m \omega u(t) + f(x(t), z(t), t), \quad x(0) = x_0 \qquad ||x_0|| \le \rho_0 < \infty$$

$$z(t) = g_o(x_z(t), t), \quad \dot{x}_z(t) = g(x_z(t), x(t), t), \quad x_z(0) = x_{z0}$$

$$y(t) \quad = \quad Cx(t)$$

General unmatched uncertainties that cannot be addressed by <u>recursive design methods</u>

#### System dynamics (reformulation):

$$\begin{aligned} \dot{x}(t) &= A_m x(t) + B_m \left( \omega u(t) + f_1(x(t), z(t), t) \right) + B_{um} f_2(x(t), z(t), t), \quad x(0) = x_0 \\ z(t) &= g_o \left( x_z(t), t \right), \quad \dot{x}_z(t) = g \left( x_z(t), x(t), t \right), \quad x_z(0) = x_{z0} \end{aligned}$$

$$y(t) = Cx(t)$$
•  $B_m^{\top} B_{um} = 0$ 
• rank( $[B_m \ B_{um}]$ ) = n
$$\left[ \begin{array}{c} f_1(x(t), z(t), t) \\ f_2(x(t), z(t), t) \end{array} \right] = \left[ \begin{array}{c} B_m \quad B_{um} \end{array} \right]^{-1} f(x(t), z(t), t)$$

## **L1 AFCS :: Assumptions**

**Assumption 1** [Partial knowledge of the system input gain] The system input gain matrix  $\omega$  is assumed to be an unknown (non-singular) strictly row-diagonally dominant matrix with  $\operatorname{sgn}(\omega_{ii})$  known. Also, we assume that there exists a known compact convex set  $\Omega$ , such that  $\omega \in \Omega \subset \mathbb{R}^{m \times m}$ , and that a nominal system input gain  $\omega_0 \in \Omega$  is known.

**Assumption 2** [Stability of internal dynamics] The  $x_z$ -dynamics are BIBO stable both with respect to initial conditions  $x_{z0}$  and input x(t), i.e. there exist  $L_z$ ,  $B_z > 0$  such that for all  $t \ge 0$ 

 $||z_t||_{\mathcal{L}_{\infty}} \leq L_z ||x_t||_{\mathcal{L}_{\infty}} + B_z.$ 

**Assumption 3** [Semiglobal Lipschitz condition] For any  $\nu > 0$ ,  $\exists K_{1\nu}, K_{2\nu}, B_{10}, B_{20} > 0$  such that

=1,2,

$$f_i(X_1, t) - f_i(X_2, t) \|_{\infty} \leq K_{i_{\nu}} \|X_1 - X_2\|_{\infty}, |f_i(0, t)| \leq B_{i0}, \qquad i$$

for all  $||X_j||_{\infty} \leq \nu$ , j = 1, 2, uniformly in t.

1

**Assumption 4** [Stability of matched transmission zeros] The transmission zeros of the transfer matrix  $H_m(s) = C(s\mathbb{I} - A_m)^{-1}B_m$  lie in the open left-half plane.

### L1 AFCS :: Control Objective

Design an adaptive state feedback controller to ensure that y(t) tracks the output response of a *desired system* 

$$M(s) \triangleq C \left( s\mathbb{I} - A_m \right)^{-1} B_m K_g(s)$$

to a given bounded reference signal r(t) both in transient and steady-state, while all other signals remain bounded.



- Aircraft characteristics
- Pilot compensation

### Handling Qualities :: Cooper Harper Rating Scale



# **L<sub>1</sub> Control Architecture**

State predictor:

$$\dot{\hat{x}}(t) = A_m \hat{x}(t) + B_m (\omega_0 u(t) + \hat{\sigma}_1(t)) + B_{um} \hat{\sigma}_2(t), \quad \hat{x}(0) = x_0$$

Adaptive laws:  

$$\begin{bmatrix} \hat{\sigma}_{1}(t) \\ \hat{\sigma}_{2}(t) \end{bmatrix} = \begin{bmatrix} \hat{\sigma}_{1}(iT_{s}) \\ \hat{\sigma}_{2}(iT_{s}) \end{bmatrix}, \quad t \in [iT_{s}, (i+1)T_{s})$$

$$\begin{bmatrix} \hat{\sigma}_{1}(iT_{s}) \\ \hat{\sigma}_{2}(iT_{s}) \end{bmatrix} = -\begin{bmatrix} \mathbb{I}_{m} & 0 \\ 0 & \mathbb{I}_{n-m} \end{bmatrix} B^{-1} \Phi^{-1}(T_{s}) e^{A_{m}T_{s}} \tilde{x}(iT_{s})$$

$$\begin{bmatrix} \Phi(T_{s}) = A_{m}^{-1} \left(e^{A_{m}T_{s}} - \mathbb{I}_{n}\right) \\ B = \begin{bmatrix} B_{m} & B_{um} \end{bmatrix}$$

$$u(s) = -KD(s) \left(\omega_{0}u(s) + \hat{\sigma}_{1}(s) + H_{m}^{-1}(s)H_{um}(s)\hat{\sigma}_{2}(s) - K_{g}(s)r(s)\right)$$

$$H_{m}(s) = C(s\mathbb{I} - A_{m})^{-1}B_{m}$$

$$H_{um}(s) = C(s\mathbb{I} - A_{m})^{-1}B_{um}$$

### **Sufficient Condition for Stability and Performance**

The design of 
$$D(s)$$
 and K needs to ensure that,  $\forall \ \omega \in \Omega$ :

1. 
$$C(s) \triangleq \omega KD(s) (\mathbb{I}_m + \omega KD(s))^{-1} \in \mathcal{RH}_{\infty}$$
, with DC gain  $C(0) = \mathbb{I}_m$ 

2. 
$$C(s)H_m^{-1}(s) \in \mathcal{RH}_\infty$$

Moreover, the design of D(s) and a K needs to ensure that, for given  $\rho_0$ ,  $\exists \rho_{x_r} > 0$  such that

$$\|G_m(s)\|_{\mathcal{L}_1} + \|G_{um}(s)\|_{\mathcal{L}_1} \,\ell_0 \quad < \quad \frac{\rho_{x_r} - \|H_{xm}(s)C(s)K_g(s)\|_{\mathcal{L}_1} \,\|r\|_{\mathcal{L}_\infty} - \|s(s\mathbb{I} - A_m)^{-1}\|_{\mathcal{L}_1} \,\rho_0}{L_{1\rho_{x_r}}\rho_{x_r} + B_0} \,,$$

where  $\ell_0 \triangleq L_{2\rho_{x_r}}/L_{1\rho_{x_r}}$ , and  $B_0 \triangleq \max\{B_{10}, \frac{B_{20}}{\ell_0}\}$ 

$$H_{xm}(s) \triangleq (s\mathbb{I}_n - A_m)^{-1} B_m$$
  

$$H_{xum}(s) \triangleq (s\mathbb{I}_n - A_m)^{-1} B_{um}$$
  

$$H_m(s) \triangleq CH_{xm}(s) = C (s\mathbb{I}_n - A_m)^{-1} B_m$$
  

$$H_{um}(s) \triangleq CH_{xum}(s) = C (s\mathbb{I}_n - A_m)^{-1} B_{um}$$
  

$$G_m(s) \triangleq H_{xm}(s) (\mathbb{I}_m - C(s))$$
  

$$G_{um}(s) \triangleq (\mathbb{I}_n - H_{xm}(s)C(s)H_m^{-1}(s)C) H_{xum}(s)$$

#### Remark:

 $f_2(\cdot) = 0$  and  $f_1(\cdot)$  globally Lipschitz with constant L

$$\|G_m(s)\|_{\mathcal{L}_1} L < 1$$

#### Closed-Loop Reference System (non-adaptive version):

$$\begin{aligned} \dot{x}_{\rm ref}(t) &= A_m x_{\rm ref}(t) + B_m \left( \omega u_{\rm ref}(t) + f_1(x_{\rm ref}(t), z(t), t) \right) + B_{um} f_2(x_{\rm ref}(t), z(t), t), \quad x_{\rm ref}(0) = x_0 \\ u_{\rm ref}(s) &= -\omega^{-1} C(s) \left\{ f_1(x_{\rm ref}(t), z(t), t) \right\} + H_m^{-1}(s) H_{um}(s) \left\{ f_2(x_{\rm ref}(t), z(t), t) \right\} - K_g(s) r(s) \right\} \\ y_{\rm ref}(t) &= C x_{\rm ref}(t) \,, \end{aligned}$$

If the stability (sufficient) conditions hold, and

$$||z_t||_{\mathcal{L}_{\infty}} \leq L_z(||x_{\operatorname{ref} t}||_{\mathcal{L}_{\infty}} + \gamma_x) + B_z,$$

then the closed-loop reference system is BIBO stable:

$$\|x_{\mathrm{ref}\,t}\|_{\mathcal{L}_{\infty}} < \rho_{x_r}, \qquad \|u_{\mathrm{ref}\,t}\|_{\mathcal{L}_{\infty}} < \rho_{u_r}.$$

where

$$\rho_{u_r} \triangleq \|\omega^{-1}C(s)\|_{\mathcal{L}_1} (L_{1\rho_{x_r}}\rho_{x_r} + B_{10}) + \|\omega^{-1}C(s)H_m^{-1}(s)H_{um}(s)\|_{\mathcal{L}_1} (L_{2\rho_{x_r}}\rho_{x_r} + B_{20}) + \|\omega^{-1}C(s)K_g(s)\|_{\mathcal{L}_1} \|r\|_{\mathcal{L}_\infty}.$$

### **Guaranteed Performance Bounds**



# **All-Adaptive FCS**



# **Flight Test Evaluations**



Credit: NASA LaRC / Sean Smith / Irene M. Gregory

### **Mobile Operations Station**









# Flight Control Law Evaluation Matrix (I)

Evaluation Task	1 <sup>st</sup> straight leg	2 <sup>nd</sup> straight leg	Turns	Scope
Latency injection (5msec / 5sec)	Fault Engaged Roll Doublet	Fault Engaged Pitch Doublet	Fault Engaged	Nominal Stability
Δ(Cmα & Clp ) ≈ 0%	Fault Engaged Roll Doublet	Fault Engaged Pitch Doublet	Disengage Fault	Nominal Stability
Δ(Cmα & Clp ) ≈ -50%	Fault Engaged Roll Doublet	Fault Engaged Pitch Doublet	Disengage Fault	Robust Stability
Δ(Cmα & Clp ) ≈ -75%	Fault Engaged Roll Doublet	Fault Engaged Pitch Doublet	Disengage Fault	Robust Stability
Δ(Cmα & Clp ) ≈ -100% (neutrally stable)	Fault Engaged Roll Doublet	Fault Engaged Pitch Doublet	Disengage Fault	Robust Stability
Δ(Cmα & Clp ) ≈ -125% <i>(unstable)</i>	Fault Engaged Roll Doublet	Fault Engaged Pitch Doublet	Disengage Fault	Robust Stability
Post-stall $\alpha$ tracking	No Fault No Doublet	No Fault No Doublet	N/A	Robust Performance

• Cm $\alpha$  – degraded by 2 inboard elevator segments  $\rightarrow$  50% reduction in pitch control effectiveness

Clp – degraded by spoilers

Evaluation Task	Downwind straight leg	Upwind straight leg	Turns	Scope
Offset-to-landing (nominal)	Achieve good trim	No fault 1 <sup>st</sup> : Practice landing 2 <sup>nd</sup> : Evaluation landing	N/A	Nominal Performance
Offset-to-landing Δ(Cmα & Clp ) ≈ -100% (neutrally stable)	Achieve good trim	Fault Engaged Evaluation landing	Disengage Fault	Robust Performance
Offset-to-landing Δ(Cmα & Clp ) ≈ -125% <i>(unstable)</i>	Achieve good trim	Fault Engaged Evaluation landing	Disengage Fault	Robust Performance

- Cm $\alpha$  degraded by 2 inboard elevator segments  $\rightarrow$  50% reduction in pitch control effectiveness
- Clp degraded by spoilers

# March 2010 Flight Test Evaluation

L1 all-adaptive CAS: provides performance/stability for nominal and impaired aircraft

 Not an augmentation to a baseline controller that provides nominal aircraft performance, like other adaptive controllers implemented

#### Flight Control Law related tasks during March 2010 deployment:

- Flight Control Law Block :
  - Injected longitudinal and lateral stick doublets for each fault, continuous stick doublets on straight legs during latency fault
  - Latency fault: starting at 20msec, continuously increase in latency (5msec every 5sec) through the turns, etc until aircraft is neutrally stable or unstable want graceful performance degradation
    - ✓ Robust to 105msec of additional time delay
  - Simultaneous longitudinal and lateral stability degradation (Cmα/Clp):
    - ✓ 50%: nominal performance
    - ✓ 75%: small degradation of performance in roll
    - ✓ 100%: small degradation of performance in pitch, larger degradation in roll
    - ✓ 125%: large amplitude roll with pitch doublet
  - Left elevator inboard and outboard segments locked-in-place failure (<2deg): nonevent for the adaptive controller

# Flight Test Evaluation (March 2010)

FLT14: Mode 3.2 (L1 all-adaptive) FCL under moderate (+) turbulence

- Reduction in turbulence response with all-adaptive flight controller engaged
- Immediate return to nominal controller performance as soon as fault disengaged



### Flight Test Evaluation (March 2010)

> FLT14: Mode 3.2 (L1 all-adaptive) FCL under moderate (+) turbulence

• Consistency in bank angle throughout the flight



# Flight Test Evaluation (March 2010)

- FLT14: Mode 3.2 (L<sub>1</sub> all-adaptive) FCL under moderate (+) turbulence
  - $\alpha$ - $\beta$  data:



"...this is the first successful flight of an **all-adaptive** control law that deals with aircraft stability degradation as well as actuator failures..."

"...it is the first flight of a direct **all-adaptive** controller with a pilot in the loop..."

NASA RTD weekly key activities report Dr. Irene M. Gregory

# June 2010 Flight Test Evaluation

L1 all-adaptive CAS: provides performance/stability for nominal and impaired aircraft

 Not an augmentation to a baseline controller that provides nominal aircraft performance, like other adaptive controllers implemented

#### Flight Control Law related tasks during June 2010 deployment:

- Flight Control Law Block :
  - Injected longitudinal and lateral stick doublets for each fault, continuous stick doublets on straight legs during latency fault
  - Latency fault: starting at 20msec, continuously increase in latency (5msec every 5sec), carried through the turns, until aircraft is neutrally stable or unstable want graceful performance degradation
    - ✓ Robust to 125msec of additional time delay [147ms total time delay]
  - Simultaneous longitudinal and lateral stability degradation (Cmα/Clp):
    - ✓ 50%: nominal performance
    - ✓ 75%: small degradation of performance in roll
    - ✓ 100%: small degradation of performance in pitch, larger degradation in roll
    - ✓ 125%: large amplitude roll with pitch doublet
  - Left elevator inboard and outboard segments locked-in-place failure (<2deg): nonevent for the adaptive controller
- Modeling Tasks:
  - L1 used for β-sweep in flat turn maneuver

# High AOA Flight :: Aggressive Roll-Off (June 2010)

• **Open-loop aircraft** tends to aggressively **roll off** between 13deg and 15deg AOA and exhibits significant degradation in pitch stability



### Flight Test Evaluation (June 2010)

#### > FLT23: Mode 3.6 (L1 all-adaptive) FCL under light turbulence



# Nominal A/C Wave Train Response (June 2010)

- $\triangleright$   $\alpha$ -cmd and p-cmd wave trains (WT) enter as pilot stick commands
- Pilot asked for hands off during WT WT characterized by straight lines



- α-cmd response designed for pilot, not to the maximum potential of the control law [tracking doublet faster – too sensitive for the pilot ]
- Roll rate is a very fast and challenging response [with no turbulence smooth, fast response tracking the p\_cmd doublet]

# Latency Response (June 2010)

- Latency fault
  - Carried through the turns
  - Engaged around 286 seconds
  - The maneuver was abandoned at 394 seconds due to persistent roll rate oscillations of ± 20 deg/sec



### Latency Fault Doublet Response (June 2010)



# High AOA Flight :: L1 Adaptive FCL (June 2010)

- L1 provides departure resilient control for aircraft in post-stall flight
  - L1 adaptive controller significantly improved pilot's ability to fly the aircraft at high angles of attack and decreased his workload



# **High AOA Flight :: α-β Excursion (June 2010)**

#### Post-stall, high angle of attack flight

• L1 provides departure resilient control for aircraft in post-stall flight



### **Cmα/Clp Degradation WT Response (June 2010)**



# **125% Cmα/Clp Degradation WT Response (June 2010)**



- Pilot called "knock it off" but <u>did not</u> abandon the control law
- Test engineer simply flipped the switch to turn off the stability degradation fault and the controller <u>recovered its nominal performance immediately</u>.
- The pilot proceeded to fly into a typical aggressive turn less than 10 seconds after the fault was terminated (~770 seconds)

# **September 2010 Flight Test Evaluation**

L1 all-adaptive CAS: provides performance/stability for nominal and impaired aircraft

 Not an augmentation to a baseline controller that provides nominal aircraft performance, like other adaptive controllers implemented

#### Flight Control Law related tasks during September 2010 deployment:

- Flight Control Law Block :
  - Offset-to-landing with simultaneous longitudinal and lateral stability degradation (Cmα/Clp):
    - ✓ Nominal: CHR 3
    - ✓ 100%: CHR 5
    - ✓ 125%: CHR 7
- L1 support on Modeling Tasks:
  - β-vane calibration (flat turn maneuvers)
  - α-vane calibration (variable and constant AOA strategies)
  - Unsteady Aerodynamics Modeling (Stall and post-stall high AOA tracking)

# High Workload Task :: Offset-to-Landings (September 2010)

- Initial offset:
  - > 90 ft. lateral, 1800 ft. downrange, 100 ft. above the runway
- Performance boundaries:
  - **Desired:**  $|\phi| < 10 \text{ deg}; |\gamma| < 1 \text{ deg}; \text{ landing box} = 164' \times 12'$
  - Adequate:  $|\phi| < 20 \text{ deg}$ ;  $|\gamma| < 3 \text{ deg}$ ; landing box = 363' x 24'
- Flying qualities ratings taken for nominal, neutrally stable, unstable airplane

	S2S	L1 AFCS
Nominal	<i>CHR</i> 4 (HQ L2)	CHR3 (HQ L1)
Neutral Stability	CHR10 (uncontrollable)	<i>CHR</i> 5 (HQ L2)
Unstable		<i>CHR</i> 7 (HQ L3)



### **Offset-to-Landings (September 2010)**

• Nominal airplane – CHR 3





### **Offset-to-Landings (September 2010)**

- Aircraft response during offset landing task for nominal and stability degraded dynamics.
- Performance boundaries:
  - > <u>Desired</u>:  $|\phi| < 10 \text{ deg}; |\gamma| < 1 \text{ deg}; \text{ landing box} = 164' \times 12'$
  - > <u>Adequate:</u>  $|\phi| < 20 \text{ deg}; |\gamma| < 3 \text{ deg};$  landing box = 363' x 24'



# L1 Support Tasks on Modeling

Research Task	Subtask	1 <sup>st</sup> straight leg	2 <sup>nd</sup> straight leg	Deployment	Flights
Air-data vane calibration	$\alpha$ -vane calibration	Variable $\alpha$	Repeat	Sep 2010 May 2011	28, 56
		Constant $\alpha$			
	β-vane calibration	Flat turn	Repeat	Sep 2010 May 2011	29, 31, 56
Unsteady aerodynamic modeling work	Post-stall $\alpha$ tracking	Multi-step	Regain altitude	Sep 2010	31, 35, 52
		Schroeder sweep			
		Multi-sine			
	Roll forced oscillations	Roll wavetrain	Regain altitude	May 2011	49, 50, 53, 56, 57
Exploration of departure-prone edges	α-sweep from low angles, through stall, to departure	Control-surface wavetrains	Regain altitude	May 2011	54, 55, 58

# **β** – Vane Calibration (September 2010)

- Flat turn:
  - 2deg/s (or 1deg/s) ramp up to desired  $\beta$  value
  - hold target sideslip (0, ±2, ±4, ±6, ±8 deg)
  - Minimize lateral axis excursions







# **Unsteady Aero :: High AOA Tracking (September 2010)**

- Modeling unsteady aerodynamics by emulating the dynamic motion in the wind tunnel – determining efficacy of GTM to be a <u>"flying wind tunnel"</u>
- Target AOA = 18 deg post-stall
- Injected inputs for L1 FCL to track Step, Schroeder, Sinusoids



# May 2011 Flight Test

L1 all-adaptive CAS: provides performance/stability for nominal and impaired aircraft

 Not an augmentation to a baseline controller that provides nominal aircraft performance, like other adaptive controllers implemented

#### Flight Control Law related tasks during September 2010 deployment:

- L1 support on Modeling Tasks:
  - Continuation of Unsteady Aerodynamics Modeling
  - Real-time System Identification in approach to stall and departure

Applied L1 adaptive control to **lengthen time on condition** with stabilization that allowed slow transition through stall boundary and **improved stall/departure recovery** 

### **Unsteady Aero :: Roll Forced Oscillations (May 2011)**

#### • Roll forced oscillations at α=12 deg:

- Precise tracking of  $\alpha$ =12 deg (*L1 longitudinal*)
- Allow *free*  $\beta$  response to roll wavetrain
  - ✓ Step doublet, Schroeder sweep, variable frequency Sinusoid



#### Schroeder Input



### L1 Supports Large Flight Envelope Modeling (May 2011)



# AoA Pull Through Stall and Departure (May 2011)

- Flight 58 active wavetrain through stall, departure, and recovery, L1 adaptive control law in the feedback loop
- Reached departure conditions; aircraft not fully controllable





# **GTM T2 :: Flight Test Evaluation Summary**

- All-adaptive FCS that provides nominal aircraft performance and takes care of large changes in aircraft dynamics
  - ✓ No baseline to assist
- A **single controller design** at a nominal flight condition (4deg AOA) to provide satisfactory FQ and robustness
  - ✓ No gain scheduling of control parameters (adaptation rate, filter)
- **Predictable response** to the pilot under stability degradation and *graceful performance degradation* once nominal response was unachievable
- **Departure resistant in post-stall flight:** L1 provides a **controllable aircraft** to the pilot and facilitates **safe** return to normal flight
- The classical trade-off between robustness (to system latency) vs. performance was found to be consistent with the theory
- **Protected against input control saturation** (persistent control surface saturation occurred during high AOA flight and vane calibration)

# **GTM T2 :: Modeling Support Summary**

- Aerodynamic modeling in highly nonlinear regimes and real-time dynamic modeling of the **departure-prone edges of the flight envelope**.
- L1 control law used to support modeling of **unsteady aerodynamics at stall conditions**.
- Post-stall aerodynamic test **envelope expanded** to 28 degrees angle of attack (in closed-loop).
- The L1 flight control law:
  - enabled operation near stall and departure for longer periods of time, allowing for data collection for a wide range of flight conditions
  - ✓ provided safe recovery

#### L1 adaptive control law provides:

- tighter acquisition of target flight conditions
- precision tracking capability across the flight envelope
- graceful performance degradation
  - target flight conditions are beyond achievable values
  - control surfaces are persistently saturated

# **TU Delft :: Cessna Citation II**



#### **Objective:**

• Improve handling qualities and maneuverability margins for **safe landing** in the presence of failures.

#### $L_1$ AFCS:

- Augmentation of a nonadaptive (dynamic) baseline controller.
- Baseline controller is gain-scheduled.
- No gain-scheduling of the adaptation sampling rate or the law-pass filters.
- Adaptation working at 200Hz.



Noticeable improvement of L<sub>1</sub> over S2S and BL configurations.



Stroosma, Damveld, Mulder, Choe, Xargay, & Hovakimyan, "A Handling Qualities Assessment of a business Jet Augmented with an  $L_1$  Adaptive Controller," in AIAA GNC 2011

### **DA-42 & Gripen-like Fighter**



**DA-42** Twin seat, propeller-driven aircraft *TUM, Germany* 

### Generic Missile Model (industry contract)



Baseline controller vs. L<sub>1</sub> Augmentation:



Uniform tracking response for all tested (admissible) uncertainty combinations

Variable	UC 1	UC 2	UC 3
$I_{xx}$ , $I_{yy}$ , $I_{zz}$	+5%	-5%	+5%
m	-1%	-1%	-1%
x <sub>cg</sub>	-50mm	+50 <i>mm</i>	+50 <i>mm</i>
$ \begin{pmatrix} C_{x,0} \end{pmatrix}_{B}, \begin{pmatrix} C_{y,0} \end{pmatrix}_{B}, \\ \begin{pmatrix} C_{z,0} \end{pmatrix}_{B} \end{pmatrix} $	-10%	-10%	-10%
$(C_{L,0})_{B}, (C_{M,0})_{B}, (C_{N,0})_{B}$	-20%	-20%	-20%
$ \begin{pmatrix} C_{x,\xi} \end{pmatrix}_{B}, \begin{pmatrix} C_{y,\zeta} \end{pmatrix}_{B}, \\ \begin{pmatrix} C_{z,\eta} \end{pmatrix}_{B}, \begin{pmatrix} C_{L,\xi} \end{pmatrix}_{B}, \\ \begin{pmatrix} C_{M,\eta} \end{pmatrix}_{B}, \begin{pmatrix} C_{N,\zeta} \end{pmatrix}_{B} $	-20%	+20%	-20%
$ \begin{pmatrix} C_{L,p} \end{pmatrix}_{B}, \begin{pmatrix} C_{M,q} \end{pmatrix}_{B}, \\ \begin{pmatrix} C_{N,r} \end{pmatrix}_{B} \end{pmatrix} $	-20%	+20%	+20%
$\alpha_K, \beta_K$	–2.5deg	–2.5 <i>deg</i>	–2.5deg, + 2.5deg
$\overline{q}$	-5%	-5%	-5%
Ма	-10%	-10%	+10%

26% improvement wrt other tested adaptive approaches

### L<sub>1</sub> Augmentation Loops on Multirotors



# **Generic Helicopter Model** (industry contract)



Light-utility helicopter TUM, Germany



#### **Remarks:**

- Rate inner-loop augmentation;
- Augmented state predictor with controller states;
- Known nonlinearities, nominal actuator dynamics, saturations, & input delays included in the state predictor;
- Fictitious uncertainty added to derive estimation laws;
- PWC estimation laws with integral modification term;
- Notch filter added to the L<sub>1</sub> low-pass filter so as not to excite the blade lead-lag mode;
- Multi-rate controller (baseline 50Hz L<sub>1</sub> 200Hz)



# **Conclusions**

#### L<sub>1</sub> adaptive control architectures:

- ✓ Performance and robustness guarantees
- ✓ Systematic design guidelines
- ✓ Computationally predictable characteristics
- Design of robust adaptive flight control systems:
  - Single design for the entire flight envelope (including stall and post-stall conditions) without...
    - Gain-scheduling/Persistency of excitation/Control reconfiguration/High-gain feedback
  - ✓ Compensation for structural damage and actuator failures without FDI methods
  - Consistent results from platform to platform, <u>as predicted by theory</u>
  - Implementation as an all-adaptive controller or as an augmentation loop for baseline controllers
  - ✓ 10+ successful flights with NASA's GTM T2 and 100+ successful flights with NPS

Suitable for development of theoretically justified Verification & Validation tools for feedback systems

# Acknowledgements

- This research was supported by:
  - NASA under grants NNX08BA64A and NNX08BA65A
  - AFOSR under Contract FA9550-09-1-0265
  - AFRL under Contract F33615-00-D-3052

- Collaborators:
  - Chengyu Cao (UConn)
  - Irene M. Gregory (NASA Langley)
- Special thanks to the staff of the AirSTAR Flight Test Facility for their support with control law implementation.









# Questions?