

Analysis and Control of Flapping Flight: from biological to robotic insects

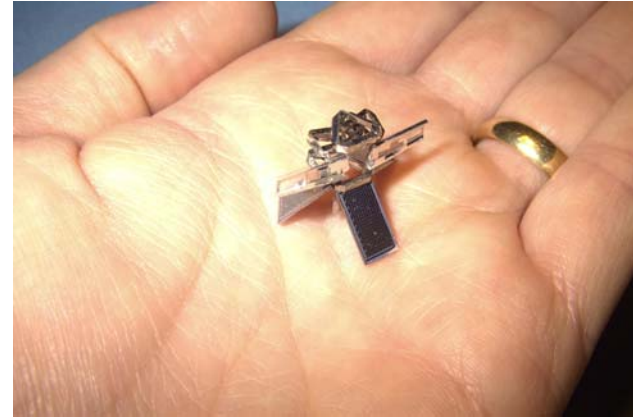
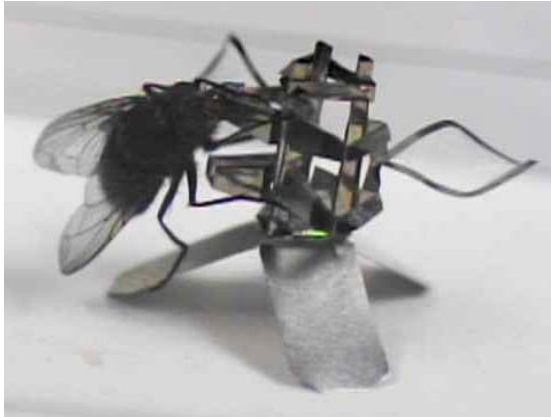


Ph.D. Dissertation Talk
EECS Department
Luca Schenato

Robotics and Intelligent Machines Laboratory
Dept of EECS
University of California at Berkeley



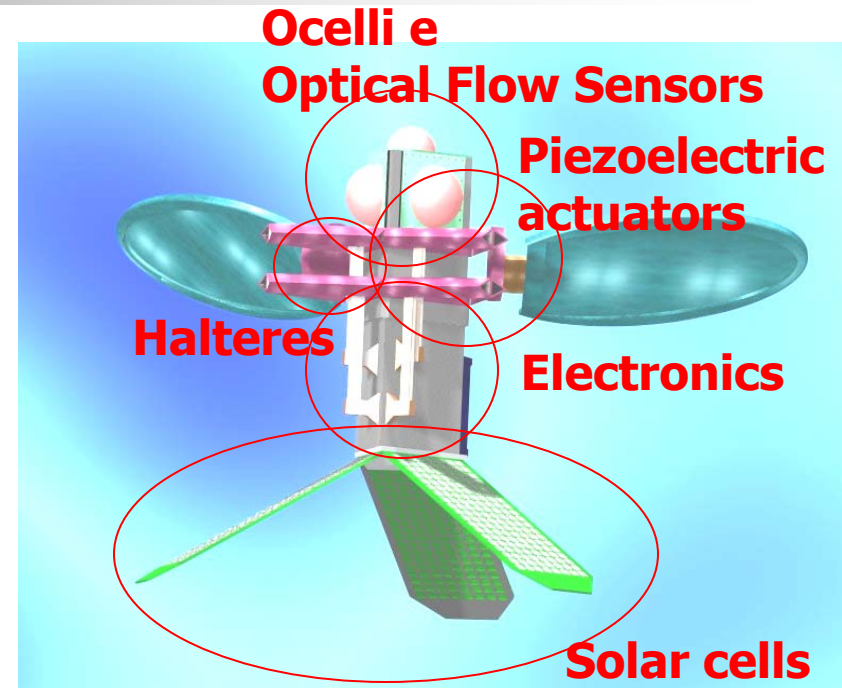
Micromechanical Flight Insect Project (MFI)



- **Objective:** Development of a micromechanical flying insect (MFI), a 10-25mm (wingtip-to-wingtip) micro air vehicle capable of sustained autonomous flight
- **Applications:** surveillance, search, rescue, map-building and monitoring in hazardous and impenetrable environments
- **Advantages:** highly manoeuvrable, small, inexpensive, swarms of MFIs promise high success rate

MFI Target Specs

- 10-30mm wingtip-to-wingtip
- 100mg weight
- 150Hz wingbeat frequency
- 10-20mWatt power budget from solar cell



Courtesy of MFI group



Micromechanical Flight Insect (MFI)

- **Kickoff:** summer 1998
- **Interdepartmental Project:**
 - 4 departments (EE,ME,Mat Sci,Bio),
 - 5 professors
 - R. Fearing (PI) (EE)
 - M. Dickinson (Bio) (now at Caltech)
 - S. Sastry (EE)
 - T. Sands (Material Sciences) (now at Purdue)
 - K. Pister (EE)
 - 5-8 students/postdocs



Motivating Questions:

- **Biological perspective:**

- How many degrees of freedom can be independently controlled in flapping flight ?
- How do insects control flight ?

- **Technological perspective:**

- How can we replicate insect flight performance on MFIs given the limited computational resources?
- Why is flapping flight different from helicopter flight ?

- **Control Theoretical perspective:**

- What's really novel in flapping flight from a control point of view ?



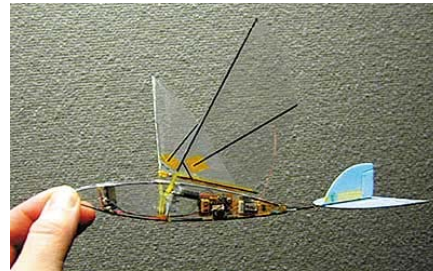
Previous work: biological perspective

- Seminal work by C. Ellington(80s) and M. Dickinson(90s)
- Aerodynamic mechanisms are now clear
- Correlation available between flight maneuvers and wing motions
- Hierarchical architecture of sensor fusions and neuromotor control
- Some evidence that insect can control 5 degrees of freedom out of the total 6

Previous work: Micro Aerial Vehicles (MAVs)

- **Flapping robots are still at infancy**

- MFI at U.C. Berkeley
- Entomopter at GeorgiaTech
- Microbat at Caltech
- Microbat by Aerovinnment Inc.



- **Microaerial Vehicles:**

- Black Widow by Aerovinnment Inc.
- Mesocopter at Stanford
-





Previous work: control theory

- **Flapping flight**

- ... ?

- **Fish locomotion:**

- Caltech group:

- Underactuated nonholonomic systems
- Averaging theory

[Mason, Morgansen, Vela, Murray, Burdick 99-03]

- **Anguilliform Locomotion:**

- [Ostrowski, Burdick 99]
 - Hyper-Redundant systems
 - Averaging theory



Personal contribution:

- **Biological perspective:**

- Flapping flight do allow independent control of 5 degrees of freedom (using mathematical models)

- **Technological perspective:**

- Simple control scheme: proportional period feedback from sensors to actuators input
- Quantifications of limits of performance
- Practical methodology (when experimental data available)

- **Control Theoretical perspective:**

- Rigorous use of averaging theory to explain flapping flight
- Flapping flight as biological example of high-frequency control of an under-actuated system



Talk overview:

- **Insect Flight Modeling**
 - Aerodynamics
 - Body Dynamics
 - Neuromotor control architecture
 - Flight Control Mechanisms in real insects
- **Averaging theory**
- **Flight control design methodology**
 - MFI toy-model
 - MFI realistic model
 - MFI realistic model + actuators and sensors
- **Conclusions**

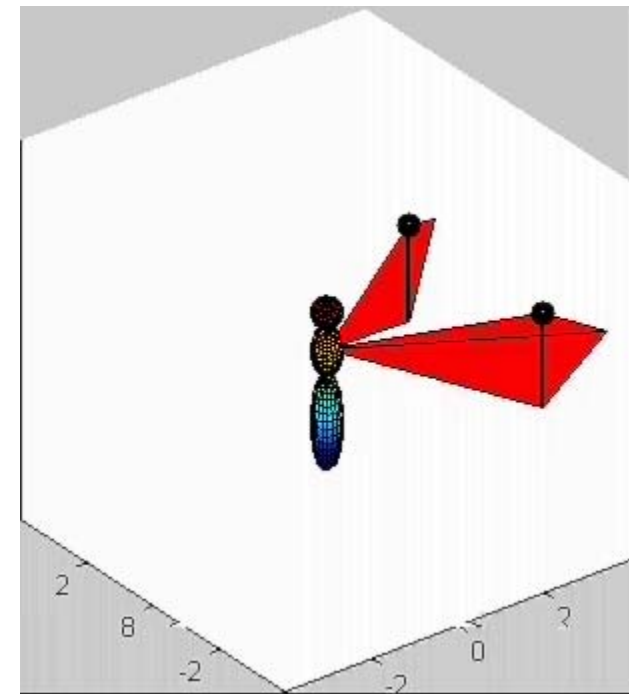
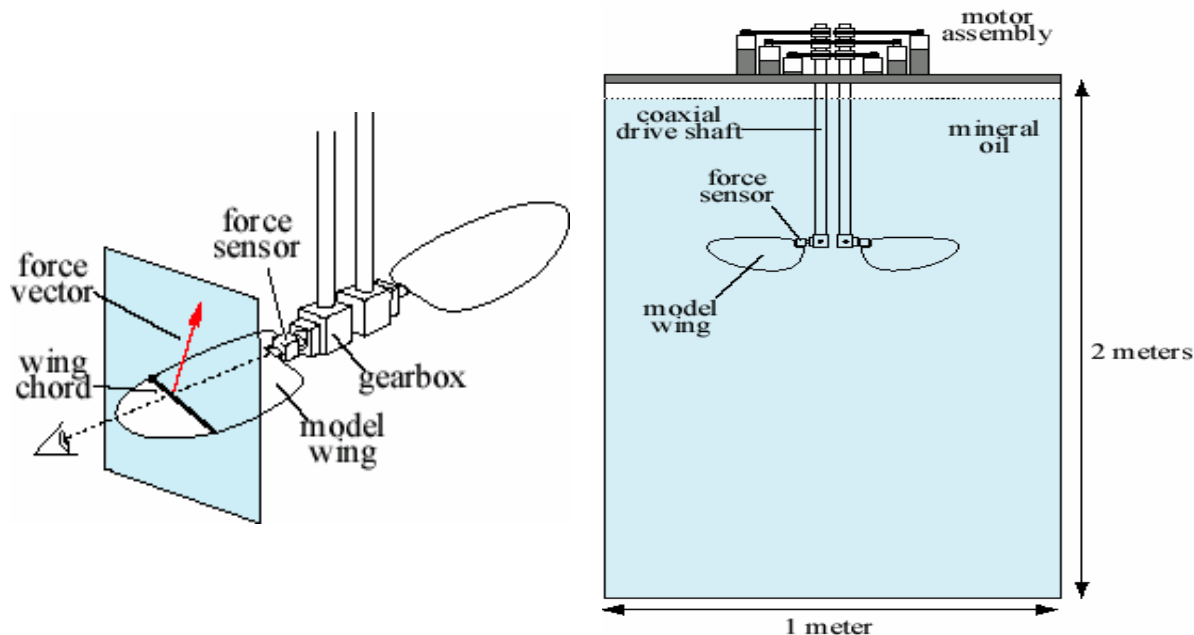


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....The Bumblebee Flies Anyway

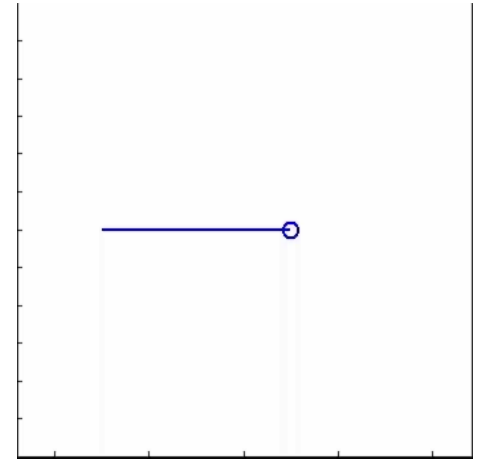
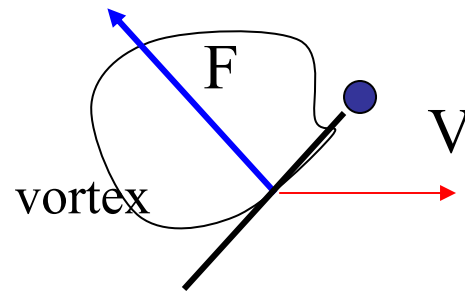
- **Apparatus:** scaled model of insect wing immersed in a mineral oil tank to replicate the same aerodynamic mechanisms $Re \approx 100-1000$



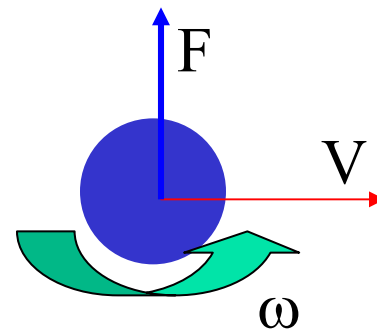
Courtesy of M.H. Dickinson and S. Sane

Unsteady-state Aerodynamic Mechanisms

- **Delayed stall:**

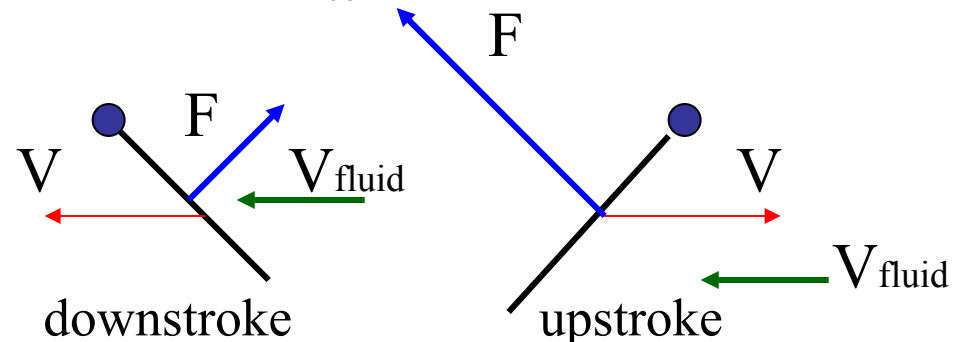


- **Magnus effect**



- **Wake capture**

$$V_{rel} = V_{wing} + V_{fluid}$$



Aerodynamic Mechanisms:

- **Delayed stall:**

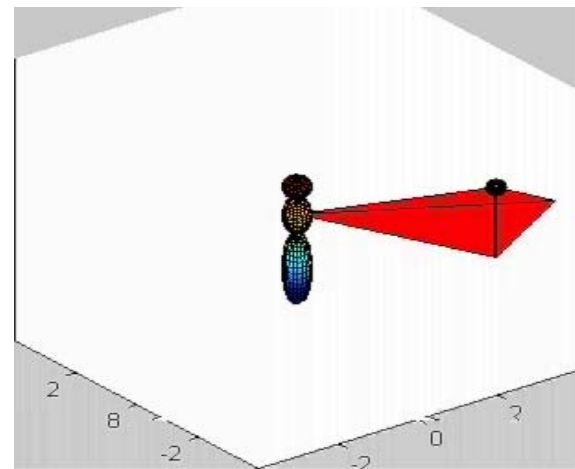
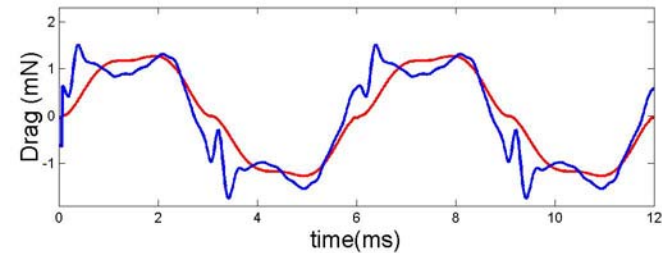
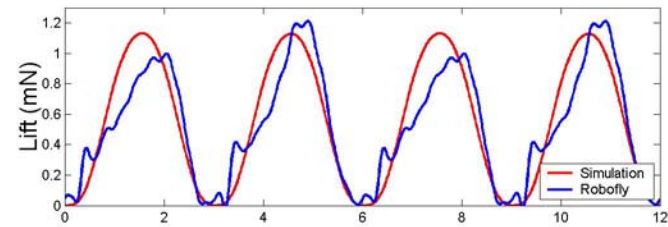
$$F_N = a V^2 \sin \alpha$$

- **Magnus effect**

$$F_N = c V \dot{\alpha}$$

- **Wake capture**

?





Talk overview:

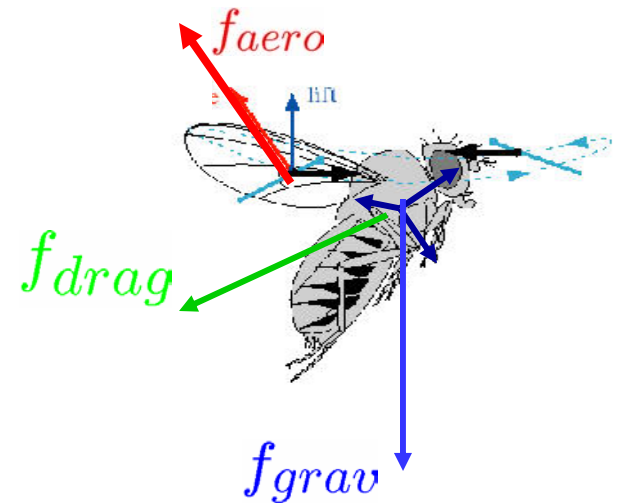
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Insect Body Dynamics

- **Hypothesis:** inertial forces from wings can be neglected

Same dynamics as helicopters

$$\begin{aligned}\dot{\mathbf{p}} &= \mathbf{v}^f \\ \dot{\mathbf{v}}^f &= \frac{1}{m} \mathbf{R} \mathbf{f}_{aero}^b - \mathbf{g} - \frac{c}{m} \mathbf{v}^f \\ \dot{\mathbf{R}} &= \mathbf{R} \hat{\boldsymbol{\omega}}^b \\ \dot{\boldsymbol{\omega}}^b &= \mathbf{I}_b^{-1} (\boldsymbol{\tau}_{aero}^b - \boldsymbol{\omega}^b \times \mathbf{I}_b \boldsymbol{\omega}^b)\end{aligned}$$



$\mathbf{R}(t)$ – Rotation matrix

\mathbf{p} – position of insect center of mass

Are wings inertial forces important ?



Courtesy of G.C. Walsh
Univ. Maryland, 1991

■ Unlikely:

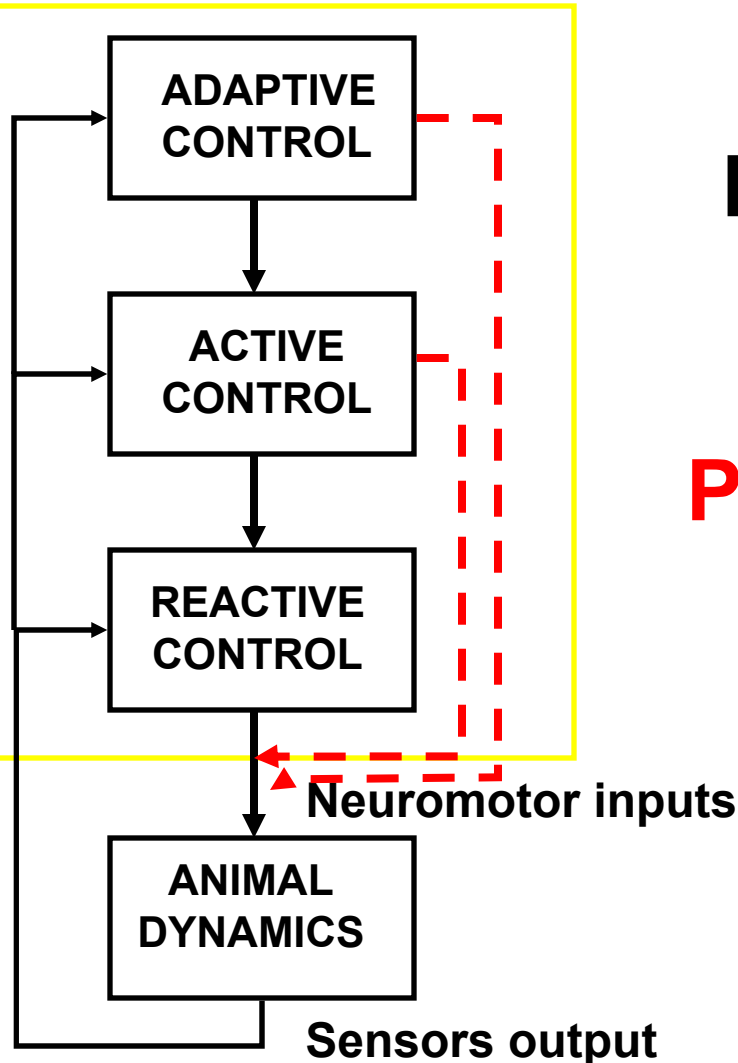
- Wings need to be shifted forward
- Wings need to oscillate 90° phased off
- Given wings-to-body mass ratio, the body oscillation angle is 5-10X larger than the net rotation per wingbeat



Talk overview:

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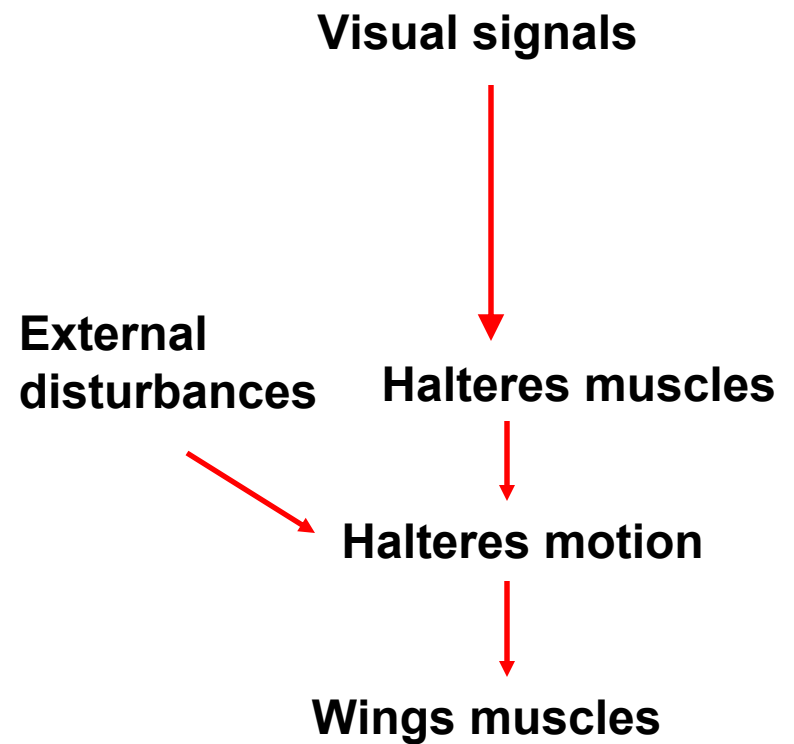
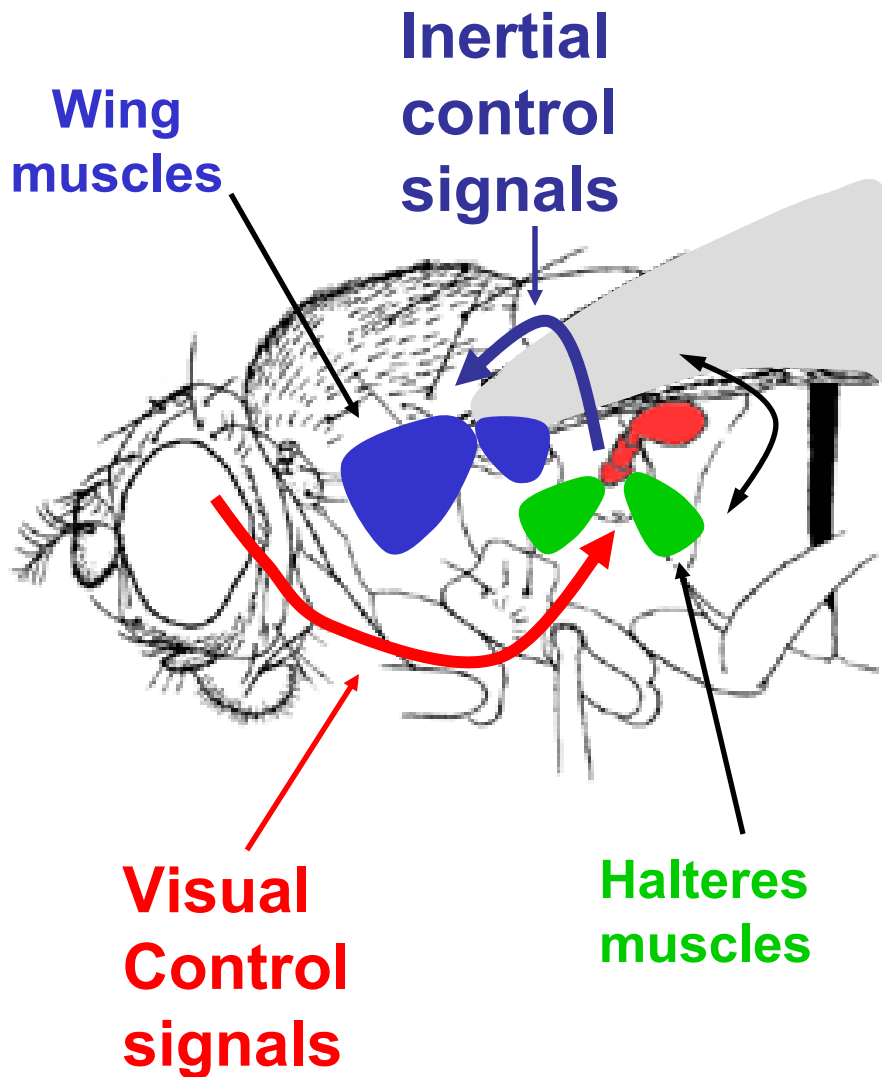
Control architecture in animals



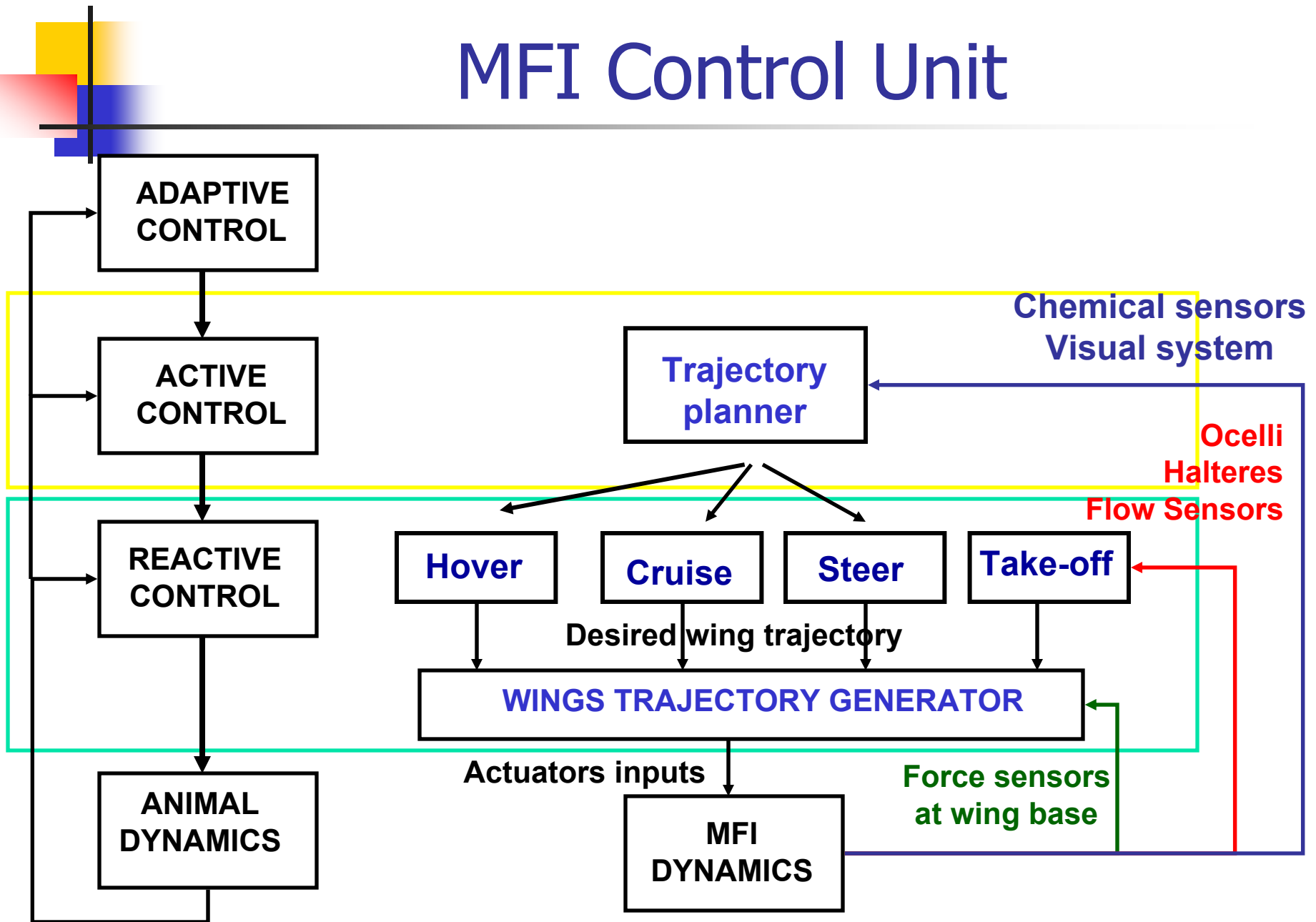
Purely hierarchical

Partially hierarchical

Neuromotor Control in Insects



MFI Control Unit





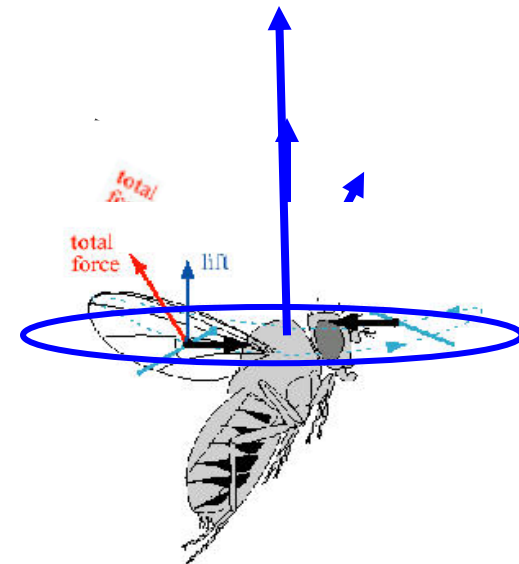
Talk overview:

- **Insect Flight Modeling**
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 - **Flight Control Mechanisms in insects and Helicopter**
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Insects and helicopters

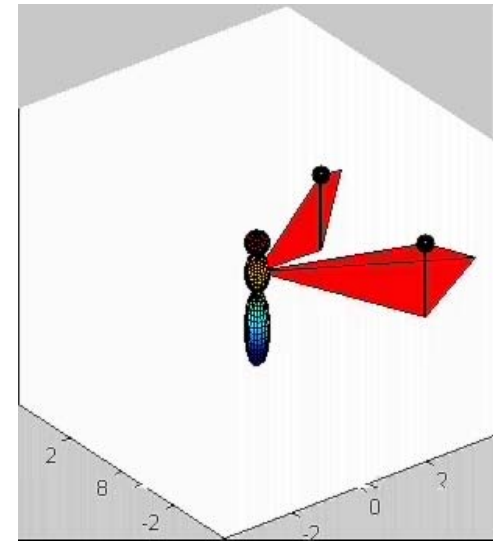
■ Analogies:

- Control of position by changing the orientation
- Control of altitude by changing lift



■ Differences:

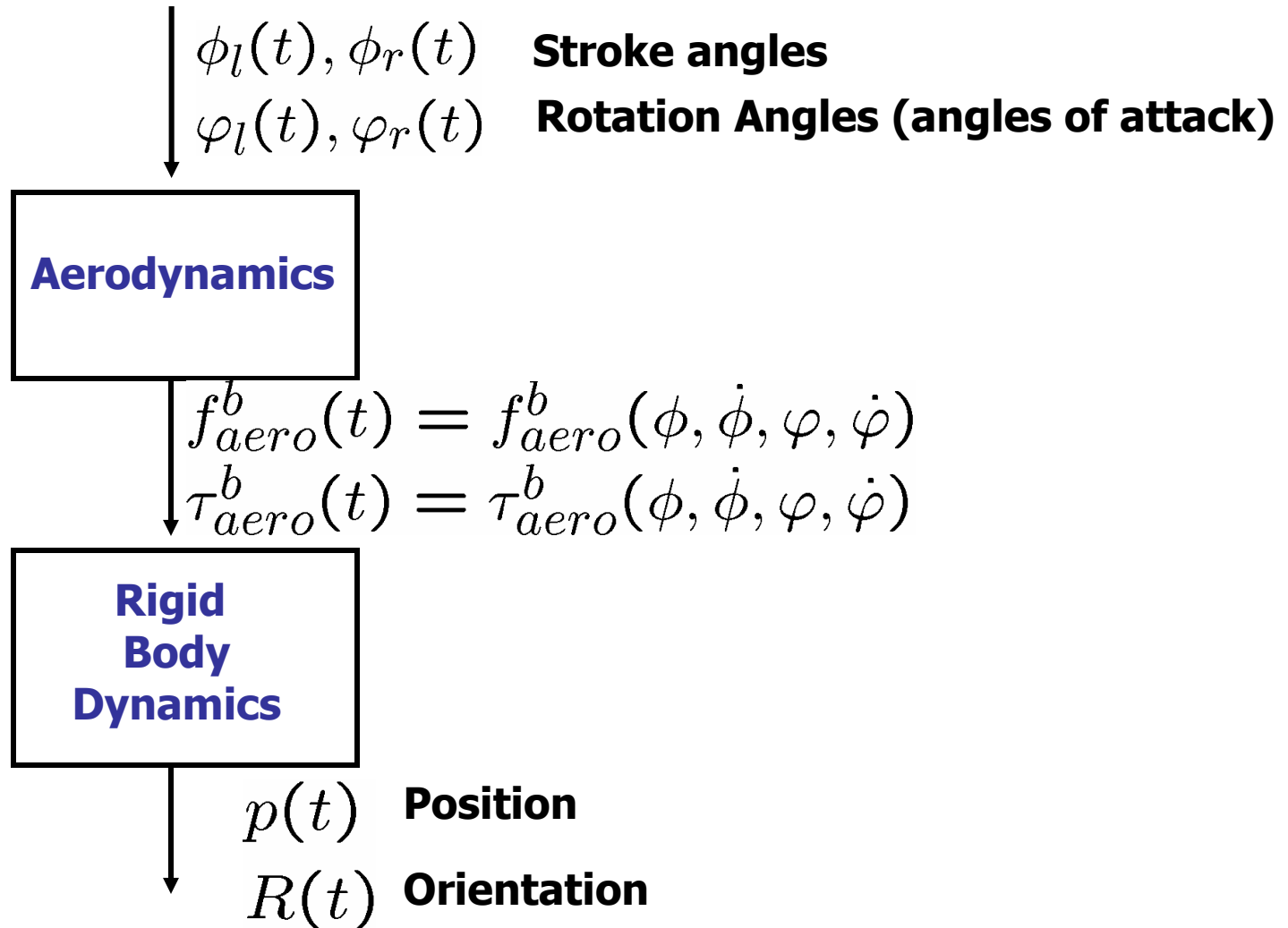
- Cannot control forces and torques directly since they are **coupled time-varying complex functions of wings position and velocity**



Flight Control mechanisms in real insects

- Kinematic parameters of wing motion have been correlated to observed maneuvers [Taylor01]
 - **Stroke amplitude:**
 - Symmetric change → climb/dive
 - Asymmetric change → roll rotation
 - **Stroke offset:**
 - Symmetric change → pitch rotation
 - **Timing of rotation**
 - Asymmetric → yaw/roll rotation
 - Symmetric → pitch rotation
 - **Angle of attack**
 - Asymmetric → forward thrust

Dynamics of insects



Dynamics of insects

Input

$$\begin{matrix} \downarrow \\ \phi_l(t), \phi_r(t) \\ \varphi_l(t), \varphi_l(t) \end{matrix}$$

Stroke angles

Rotation Angles (angles of attack)

Aerodynamics

**Rigid
Body
Dynamics**

Output

$p(t)$ **Position**

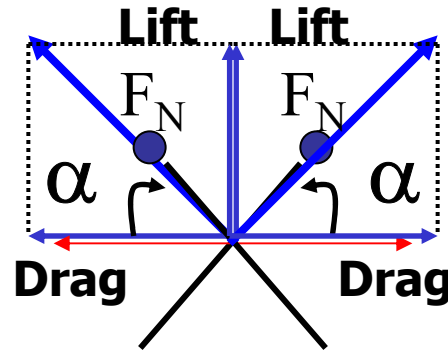
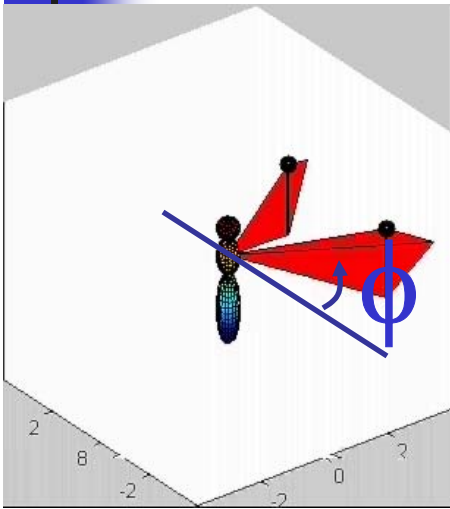
$R(t)$ **Orientation**



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Toy model for insect dynamics



$$\alpha = 45^\circ$$

$$F_N \propto \dot{\phi}^2$$

$$f_a^b = \begin{bmatrix} f_x \\ f_y \\ f_z \end{bmatrix} = A \begin{bmatrix} \dot{\phi}_l |\dot{\phi}_l| + \dot{\phi}_r |\dot{\phi}_r| \\ 0 \\ \dot{\phi}_l^2 + \dot{\phi}_r^2 \end{bmatrix}$$

$$\tau_a^b = \begin{bmatrix} \tau_x \\ \tau_y \\ \tau_z \end{bmatrix} = B \begin{bmatrix} \dot{\phi}_l^2 - \dot{\phi}_r^2 \\ \dot{\phi}_l^2 \phi_l + \dot{\phi}_r^2 \phi_r \\ \dot{\phi}_l |\dot{\phi}_l| - \dot{\phi}_r |\dot{\phi}_r| \end{bmatrix}$$

2 Inputs: (ϕ_l, ϕ_r)

6 Degrees of freedom:
 (x,y,z) position
 (roll,pitch,yaw) angles



Key ideas:

- Averaging Theory for high frequency periodic systems
- Biomimetics to teach us how to move wings to generate the desired forces

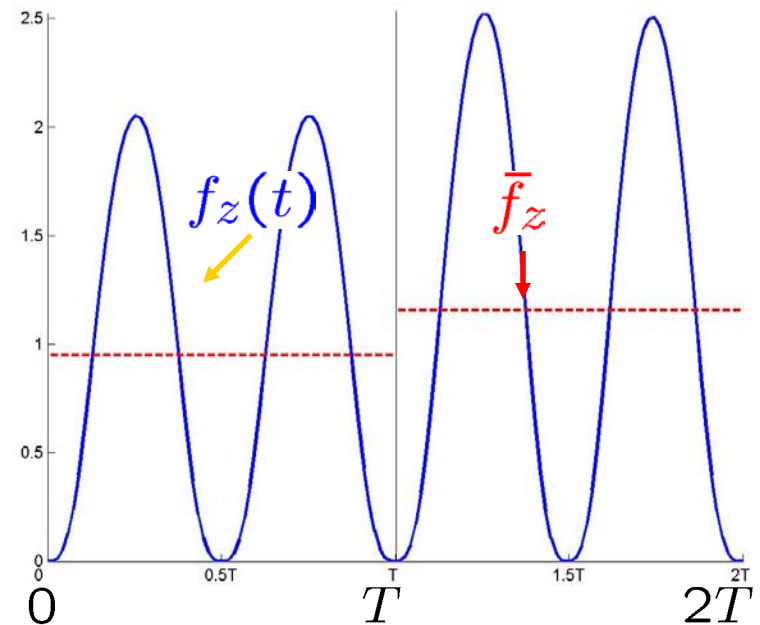
Averaging Theory:

- If forces change very rapidly relative to body dynamics, only **mean** forces and torques determine

$$f_a^b(t) = \begin{bmatrix} \bar{f}_x \\ \bar{f}_y \\ \bar{f}_z \\ \bar{\tau}_x \\ \bar{\tau}_y \\ \bar{\tau}_z \end{bmatrix} + \begin{bmatrix} \tilde{f}_x(t) \\ \tilde{f}_y(t) \\ \tilde{f}_z(t) \\ \tilde{\tau}_x(t) \\ \tilde{\tau}_y(t) \\ \tilde{\tau}_z(t) \end{bmatrix}$$

Mean forces/torques

Zero-mean forces/torques





Averaging for linear systems:

System with periodic forcing

$$\dot{x} = f(x, t) = -x + \sin\left(\frac{t}{T}\right)$$

$$x(t) = e^{-t}x_0 + \frac{T}{\sqrt{1+T^2}} \sin\left(\frac{t}{T} - \tan^{-1}(T)\right)$$

$$|x(t) - \bar{x}(t)| \leq kT$$

Averaged system

$$\dot{\bar{x}} = \bar{f}(\bar{x}) = -\bar{x}$$

$$\bar{f}(\bar{x}) = \frac{1}{T} \int_0^T f(\bar{x}, t) dt$$

$$\bar{x}(t) = e^{-t}x_0$$

$$\lim_{t \rightarrow \infty} x(t) = x_T(t)$$

$$x_T(t + T) = x_T(t)$$

$$|x_T(t)| \leq kT$$



Averaging Theorem (Russian School '60s):

Periodic system

$$\begin{aligned}\dot{x} &= f(x, t) \\ f(x, t) &= f(x, t + T)\end{aligned}$$

Averaged system

$$\begin{aligned}\dot{x}_m &= \bar{f}(x_m) \\ \bar{f}(x) &\triangleq \frac{1}{T} \int_0^T f(x, t) dt\end{aligned}$$

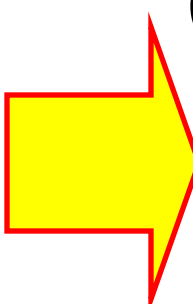
Theorem:

If origin of

$$\dot{x}_m = \bar{f}(x_m)$$

exponentially stable

(1) $|x(t) - x_m(t)| \leq kT$



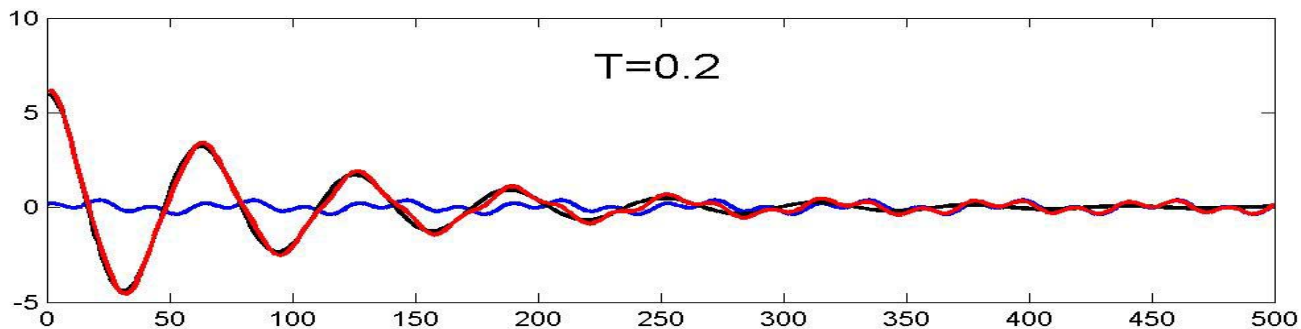
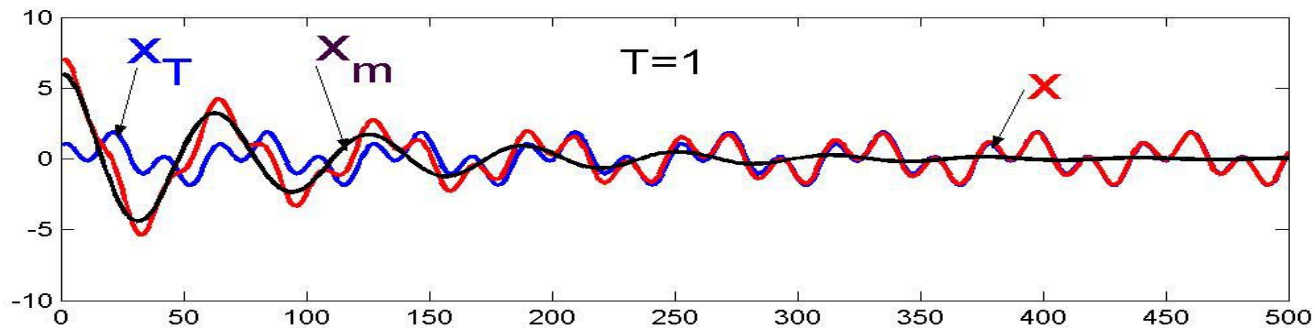
(2) $\lim_{t \rightarrow \infty} x(t) = x_T(t)$
 $x_T(t + T) = x_T(t)$
 $|x_T(t)| \leq kT$

Averaging Theorem (Russian School '60s):

x: Periodic system

x_m : Averaged system

X_T : Limit cycle





Averaging: system with inputs

Original problem 1. Find a feedback law $g(x)$ such that the system

$$\begin{aligned}\dot{x} &= f(x, u) \\ u &= g(x)\end{aligned}\tag{1}$$

is asymptotically stable.



New Problem 1. Find periodic input $u = w(v, t)$ and a feedback law $h(x)$ such that the system

$$\begin{aligned}\dot{x} &= \bar{f}(x, v) \\ \bar{f}(x, v) &= \frac{1}{T} \int_0^T f(x, w(v, t)) dt \\ v &= h(x)\end{aligned}\tag{1}$$

is asymptotically stable.



Why doing it ? 3 Issues

New Problem 1. Find periodic input $u = w(v, t)$ and a feedback law $h(x)$ such that the system

$$\begin{aligned} \dot{x} &= \bar{f}(x, v) \\ \bar{f}(x, v) &= \frac{1}{T} \int_0^T f(x, w(v, t)) dt \\ v &= h(x) \end{aligned} \quad (1)$$

is asymptotically stable.

- How do we choose the T-periodic function $w(v, t)$?
- How can we compute $\bar{f}(x, v) = \frac{1}{T} \int_0^T f(x, w(v, t)) dt$?
- How small should the period T of the periodic input

Advantages of High frequency: a toy example

$$\begin{cases} \dot{x} = u^2 - 1 \\ \dot{y} = u \end{cases}$$

1 Input: u
2 Degrees of freedom: (x,y)
Want $(x,y) \rightarrow 0$ for all initial conditions

- Origin $(x,y)=(0,0)$ is NOT an equilibrium point
- # degs of freedom $>$ # input available

Advantages of High frequency: a toy example

$$\begin{cases} \dot{x} = u^2 - 1 \\ \dot{y} = u \end{cases} \quad \begin{array}{l} 1 \text{ Input: } u \\ 2 \text{ Degrees of freedom: } (x,y) \\ \text{Want } (x,y) \rightarrow 0 \text{ for all initial conditions} \end{array}$$

+

$$u = w(v, t) = v_1 + v_2 \sin \frac{t}{T}$$

↓

$$\begin{cases} \dot{\bar{x}} \approx v_2 - \sqrt{25}v_2^2 - 1^2 - 1 \\ \dot{\bar{y}} \approx v_1 \end{cases} \quad \begin{cases} v_2 = \sqrt{2} - \bar{x} \\ v_1 = -\bar{y} \end{cases}$$

Two linear independent virtual input: v_1, v_2 !!!!

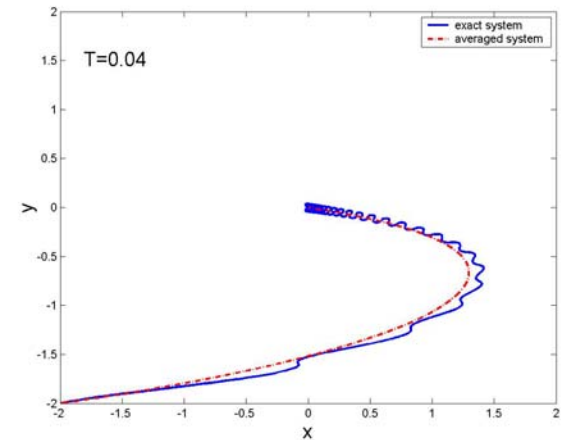
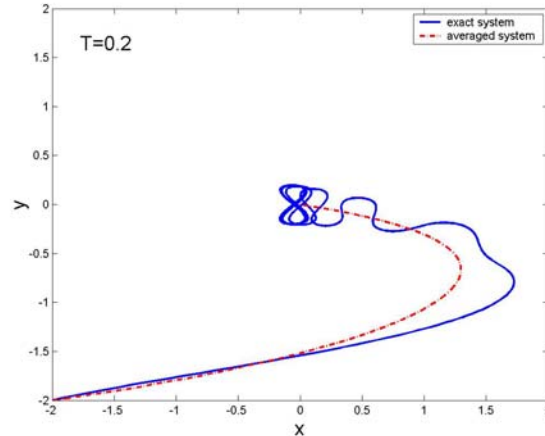
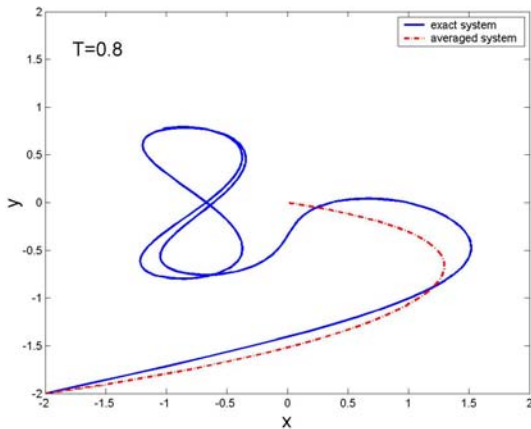
Advantages of High frequency: a toy example

Closed loop system

$$\begin{cases} \dot{x} = u^2 - 1 \\ \dot{y} = u \\ u = -y + (\sqrt{2} - x) \sin \frac{t}{T} \end{cases}$$

Averaged Closed loop system

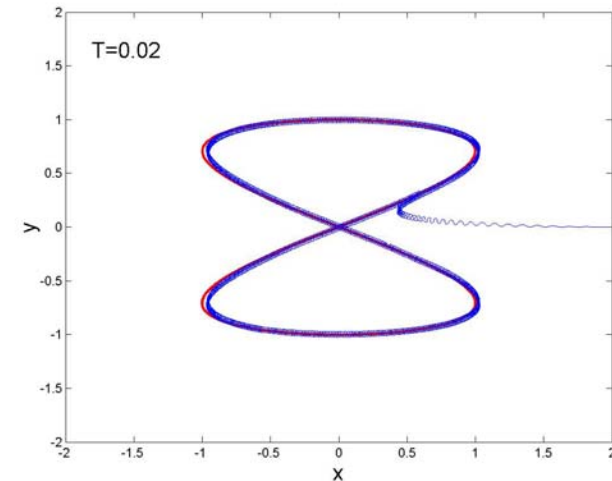
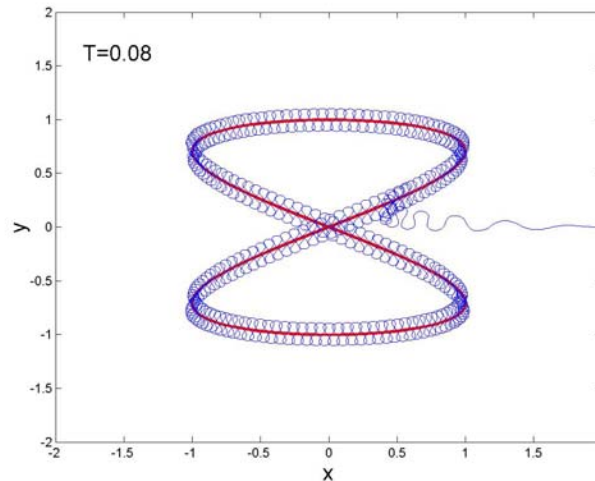
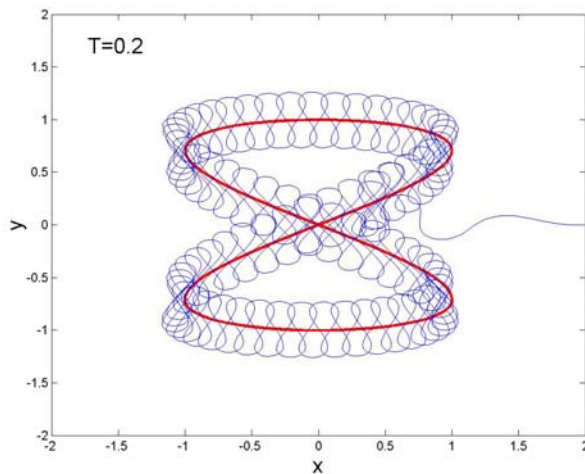
$$\begin{cases} \dot{\bar{x}} = \bar{y}^2 + 0.5(\sqrt{2} - \bar{x})^2 - 1 \\ \dot{\bar{y}} = -\bar{y} \end{cases}$$



Tracking: Figure-of-eight

Tracking is very easy to be designed

$$\begin{cases} \dot{x} = u^2 - 1 \\ \dot{y} = u \\ u = -(y - \sin(2t)) + (\sqrt{2} - (x - \sin(t))) \sin \frac{t}{T} \end{cases}$$





Back to the 3 Issues

- How do we choose the T-periodic function $w(v,t)$?
 - Geometric control (read Lie Brackets) [Bullo00][Vela03] ..
 - **BIOMETICS**: mimic insect wings trajectory
- How can we compute $\bar{f}(x, v) = \frac{1}{T} \int_0^T f(x, w(v, t)) dt$?
 - For insect flight this boils down to computing **mean forces and torques** over a wingbeat period:
 - Simulations
 - Force platform (for example Dickinson's Robofly)
- How small must the period T of the periodic input be?
 - **Wingbeat period** of all insects is good enough



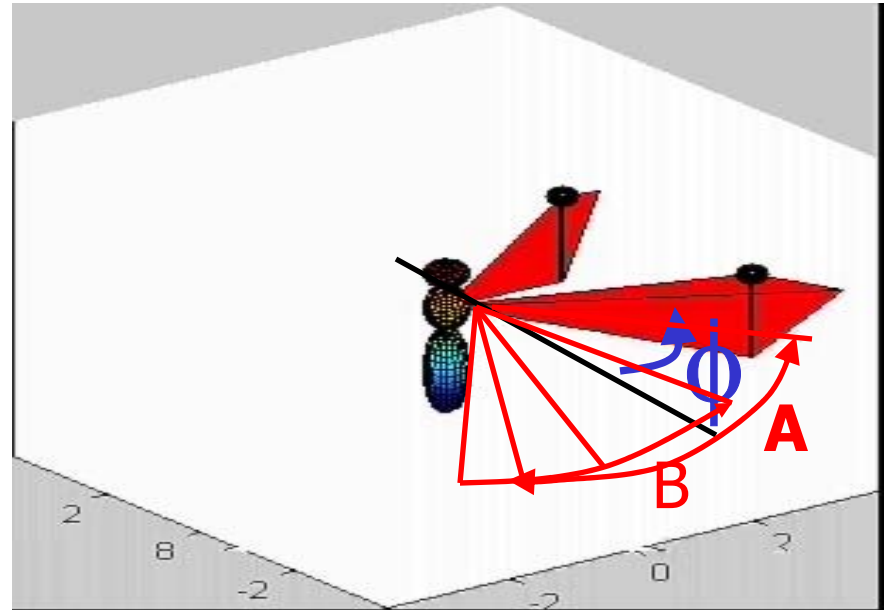
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Back to insect toy-model

$$f_a^b = \begin{bmatrix} f_x \\ f_y \\ f_z \end{bmatrix} = a \begin{bmatrix} \dot{\phi}_l |\dot{\phi}_l| + \dot{\phi}_r |\dot{\phi}_r| \\ 0 \\ \dot{\phi}_l^2 + \dot{\phi}_r^2 \end{bmatrix}$$

$$\tau_a^b = \begin{bmatrix} \tau_x \\ \tau_y \\ \tau_z \end{bmatrix} = b \begin{bmatrix} \dot{\phi}_l^2 - \dot{\phi}_r^2 \\ \dot{\phi}_l^2 \phi_l + \dot{\phi}_r^2 \phi_r \\ \dot{\phi}_l |\dot{\phi}_l| - \dot{\phi}_r |\dot{\phi}_r| \end{bmatrix}$$

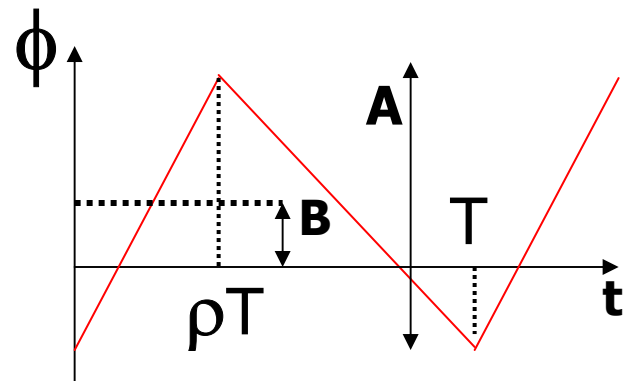


Saw-tooth input

$$u = (\phi_l, \phi_r)$$

$$v = (\rho_l, A_l, B_l, \rho_r, A_r, B_r)$$

$$u = w(v, t)$$



Averaged forces and torques

$$f_a^b(t) = \begin{bmatrix} f_x \\ f_y \\ f_z \end{bmatrix} = a \begin{bmatrix} \dot{\phi}_l |\dot{\phi}_l| + \dot{\phi}_r |\dot{\phi}_r| \\ 0 \\ \dot{\phi}_l^2 + \dot{\phi}_r^2 \end{bmatrix}$$

$$\tau_a^b(t) = \begin{bmatrix} \tau_x \\ \tau_y \\ \tau_z \end{bmatrix} = b \begin{bmatrix} \dot{\phi}_l^2 - \dot{\phi}_r^2 \\ \dot{\phi}_l^2 \phi_l + \dot{\phi}_r^2 \phi_r \\ \dot{\phi}_l |\dot{\phi}_l| - \dot{\phi}_r |\dot{\phi}_r| \end{bmatrix}$$

+ $(\phi_l, \phi_r) =$ Saw-tooth motion

Symmetric change

$$\bar{f}_a^b \approx \begin{bmatrix} 0 \\ 0 \\ mg \end{bmatrix} + c \begin{bmatrix} (\rho_l - 0.5) + (\rho_r - 0.5) \\ 0 \\ (A_l - A_0) + (A_r - A_0) \end{bmatrix}$$

$$\bar{\tau}_a^b \approx d \begin{bmatrix} (A_l - A_0) - (A_r - A_0) \\ B_l + B_r \\ (\rho_l - 0.5) - (\rho_r - 0.5) \end{bmatrix}$$

Averaged forces
as functions of wings
kinematic parameters

5 independent and decoupled control of degrees of freedom
Using asymmetric or anti-symmetric wing motion

Anti-symmetric change



Talk overview:

- **Insect Flight Modeling**
 - Aerodynamics
 - Body Dynamics
 - Neuromotor control architecture
 - Flight Control Mechanisms in real insects
- **Averaging theory**
- **Flight control design methodology**
 - MFI toy-model
 - **MFI realistic model**
 - MFI realistic model + actuators and sensors
- **Conclusions**

Flight Control mechanisms in real insects

- Kinematic parameters of wing motion have been correlated to observed maneuvers [Taylor01]
 - **Stroke amplitude:**
 - Symmetric change → climb/dive
 - Asymmetric change → roll rotation
 - **Stroke offset:**
 - Symmetric change → pitch rotation
 - **Timing of rotation**
 - Asymmetric → yaw/roll rotation
 - Symmetric → pitch rotation
 - **Angle of attack**
 - Asymmetric → forward thrust

Parameterization of wing motion

Stroke angle

$$\phi_i(t) = \frac{\pi}{3} \cos(\omega t) + v_1 \frac{\pi}{6} \cos(\omega t) + \frac{\pi}{15} v_2$$

$$\varphi_i(t) = \frac{\pi}{4} \sin(\omega t) + v_3 \frac{\pi}{4} g(t)$$

$(i \in \{l, r\})$

Rotation angle

Stroke amplitude

Offset of stroke angle

Gussed function that does the job

$$g(t) = -\frac{\pi}{15} \sin^3\left(\frac{1}{2}\omega t\right)$$

Timing of rotation

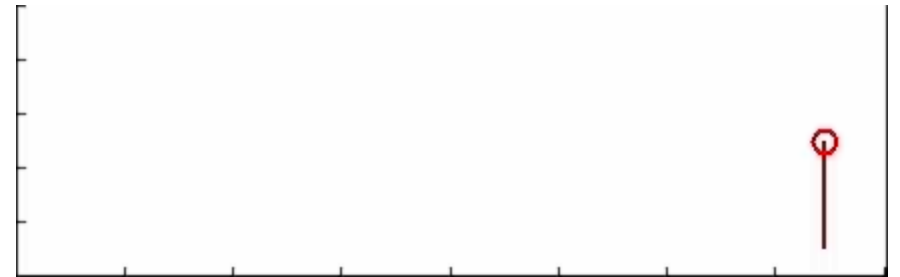
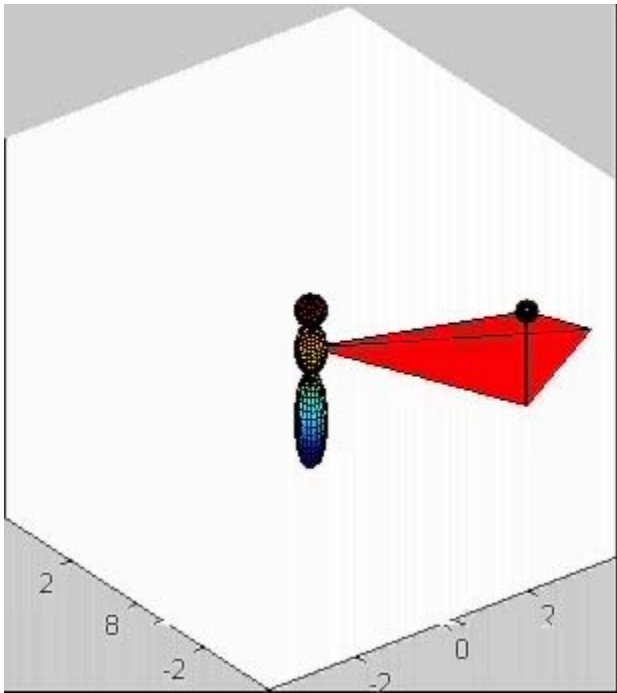
$$u = (\phi_l, \varphi_l, \phi_r, \varphi_r) \quad \text{Wings angles}$$

$$v = ((v_1, v_2, v_3)_l, (v_1, v_2, v_3)_r) \quad \text{Wing Kinematic paramaters}$$

$$u = g_0(t) + G(t)v$$

$g_0(t), G(t)$
T-periodic functions

Parameterization of wing motion



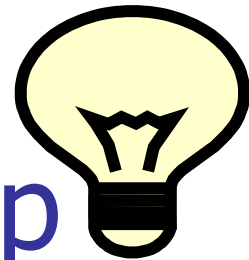
-60 **0** **60**
 $v_1 = 1$ $v_1 = 0$ $v_1 = -1$



-60 **0** **60**
 $v_3 = 1$ $v_3 = 0$ $v_3 = -1$

$$\phi_i(t) = \frac{\pi}{3} \cos(\omega t) + v_1 \frac{\pi}{6} \cos(\omega t) + \frac{\pi}{15} v_2$$

$$\varphi_i(t) = \frac{\pi}{4} \sin(\omega t) + v_3 \frac{\pi}{4} g(t)$$



Mean forces/torques map

Wings trajectory

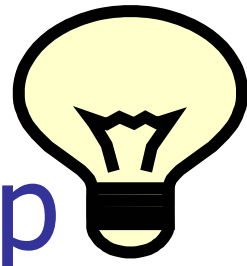
$$u = g_0(t) + G(t)v$$

Kinematical parameters

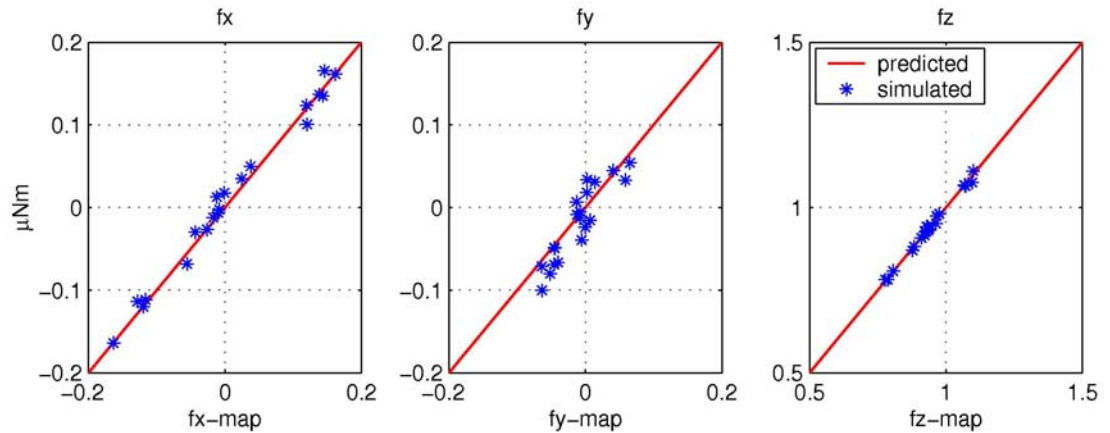
Independent control of 5 degrees of freedom

$$|v_i| \leq 1 \quad \begin{bmatrix} \bar{f}_x \\ \bar{f}_y \\ \bar{f}_z \end{bmatrix} \approx \begin{bmatrix} 0 \\ 0 \\ mg \end{bmatrix} + 0.2mg \begin{bmatrix} v_1 \\ 0 \\ v_3 \end{bmatrix}$$
$$\begin{bmatrix} \bar{\tau}_x \\ \bar{\tau}_y \\ \bar{\tau}_z \end{bmatrix} \approx 0.2mgR \begin{bmatrix} v_4 \\ v_5 \\ v_6 \end{bmatrix}$$

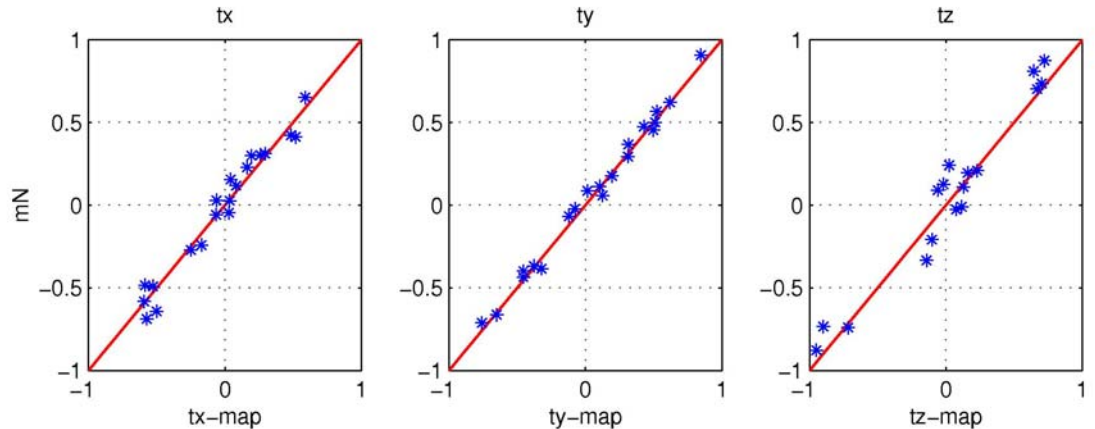
Mean forces/torques map



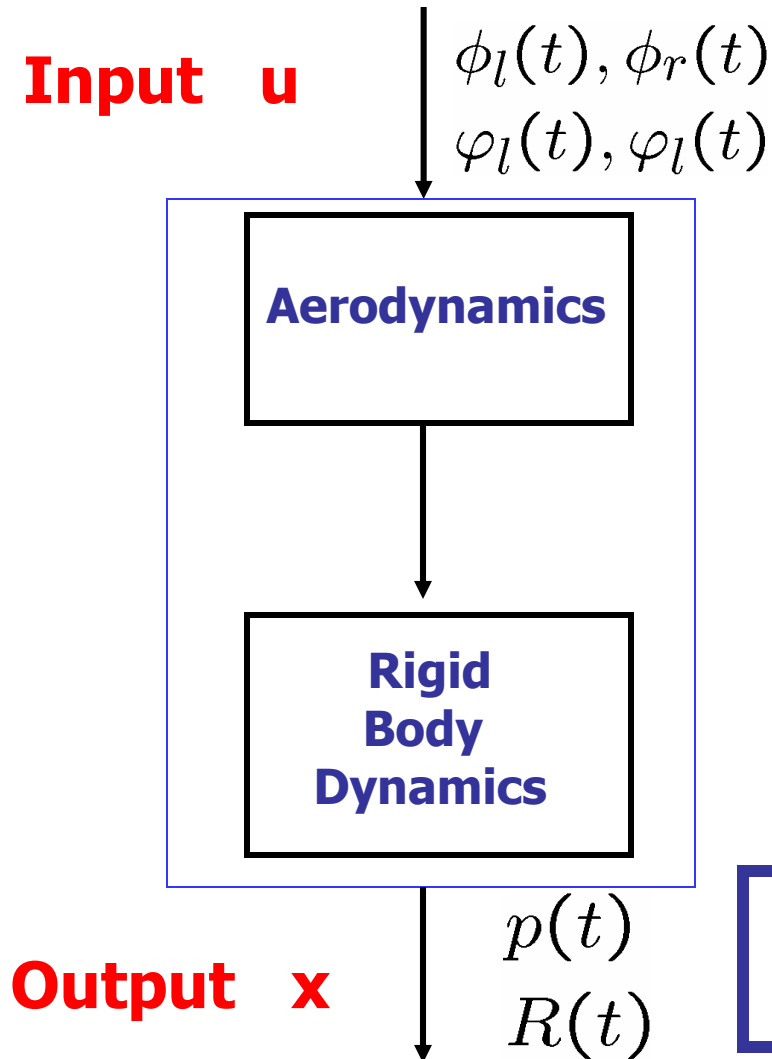
$$\begin{bmatrix} \bar{f}_x \\ \bar{f}_y \\ \bar{f}_z \end{bmatrix} \approx \begin{bmatrix} 0 \\ 0 \\ mg \end{bmatrix} + 0.2mg \begin{bmatrix} v_1 \\ 0 \\ v_3 \end{bmatrix}$$



$$\begin{bmatrix} \bar{\tau}_x \\ \bar{\tau}_y \\ \bar{\tau}_z \end{bmatrix} \approx 0.2mgR \begin{bmatrix} v_4 \\ v_5 \\ v_6 \end{bmatrix}$$



Dynamics of insect revised



After averaging
Before averaging

$$\dot{p}_m = v^f$$

$$\dot{p} \quad \dot{v}_m^f = \frac{1}{m} R \begin{bmatrix} v_1 \\ 0 \\ v_2 \end{bmatrix} - g$$

$$\dot{v}^f \quad \dot{R}_m = R \hat{\omega}^b$$

$$\dot{R} \quad \dot{\omega}^b \quad \dot{\omega}_m^b = I_b^{-1} \left(\begin{bmatrix} v_3 \\ v_4 \\ v_5 \end{bmatrix} - \omega^b \times I_b \omega^b \right)$$

Proportional Feedback

$$v = Kx$$

- Hovering
- Cruising
- Steering



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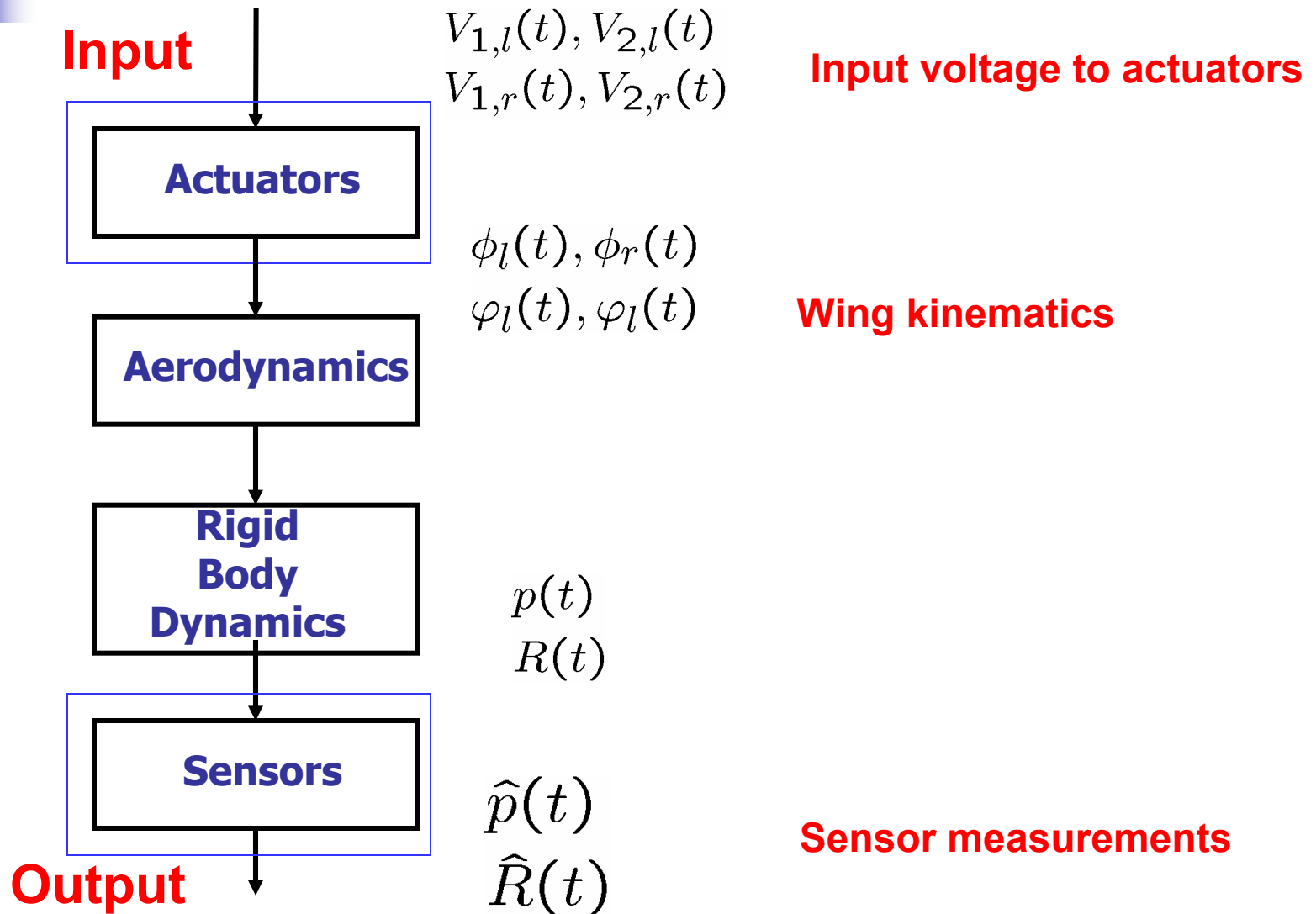
- **Averaging theory**

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- **MFI realistic model + actuators and sensors**

- **Conclusions**

Insect Dynamics: realistic model

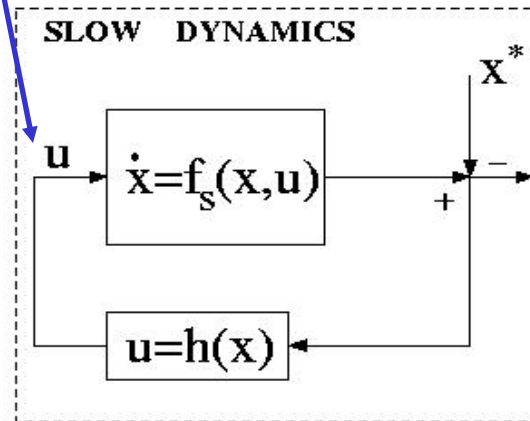


Separation of timescale

Actuators
voltage

Wings position

Insect position



THEOREM: (Extension to [Kokotovic-Khalil 99] work)

If the slow system is slow enough, the cascade system is still stable

The toy model revised

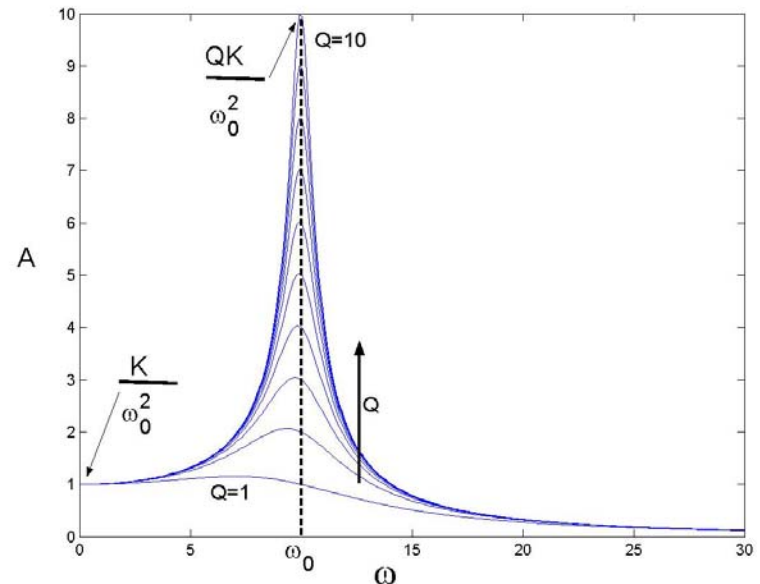
$$\begin{cases} \dot{x} = u^2 - 1 \\ \dot{y} = u \\ \ddot{u} = -\frac{\omega_0}{Q}\dot{u} - \omega_0^2 u + Kv \end{cases}$$

Actuator dynamics:

Q: quality factor

ω_0 : resonant frequency

K: static gain



Poles: $\lambda = -\frac{\omega_0}{2Q} \pm j\omega_0$

$$\tau_{decay} = \frac{Q}{\pi} T$$

The toy model revised

$$\begin{cases} \dot{x} = u^2 - 1 \\ \dot{y} = u \\ \ddot{u} = -\frac{\omega_0}{Q}\dot{u} - \omega_0^2 u + Kv \end{cases}$$



Averaged dynamics

$$\begin{cases} \dot{x} \approx v_2 - \sqrt{2}, \\ \dot{y} \approx v_1 \end{cases}$$

Stabilizing Input

$$\begin{cases} v_2 = \sqrt{2} - \bar{x} \\ v_1 = -\bar{y} \end{cases}$$

Input to fast system

$$v = v_1 \frac{\omega_0^2}{K} + v_2 \frac{\omega_0}{KQ} \sin \omega_0 t$$



Steady state solution of fast system

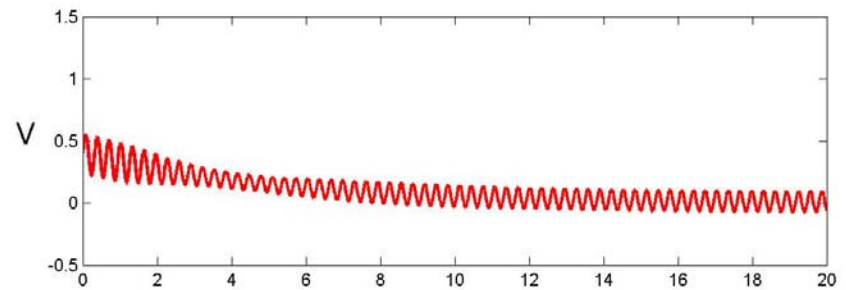
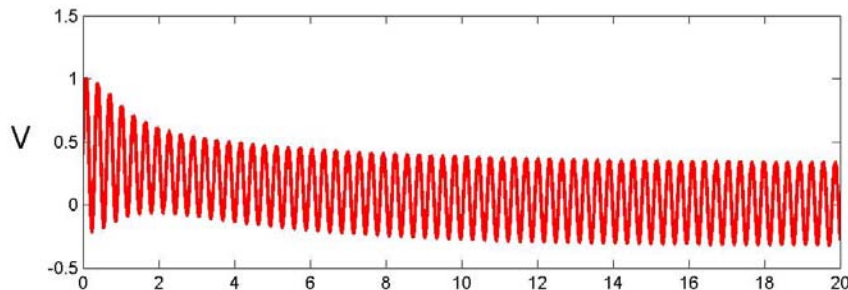
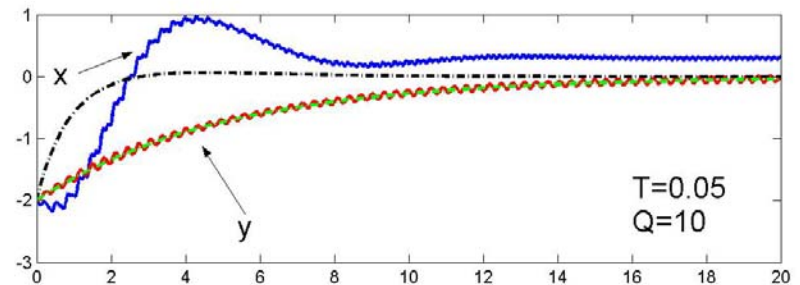
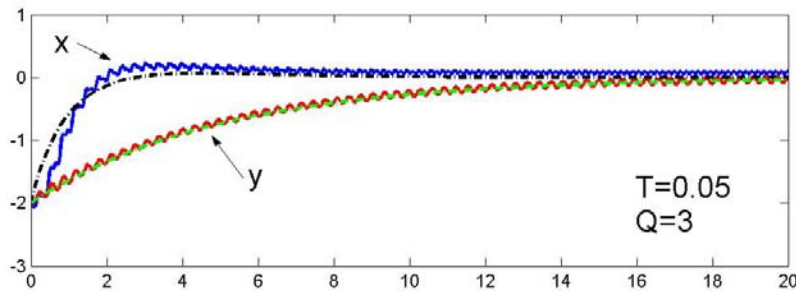
$$u_T = v_1 + v_2 \sin \omega_0 t$$

The toy model revised

$$\begin{cases} \dot{x} = u^2 - 1 \\ \dot{y} = u \\ \ddot{u} = -\frac{\omega_0}{Q}\dot{u} - \omega_0^2 u + Kv \\ v = -y \frac{\omega_0^2}{K} + (\sqrt{2} - x) \frac{\omega_0}{KQ} \sin \omega_0 t \end{cases}$$

Close to

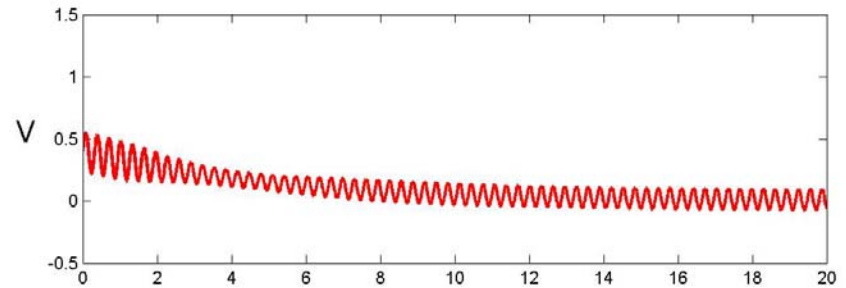
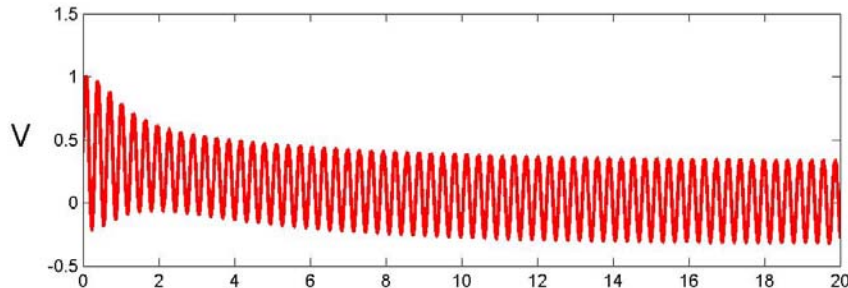
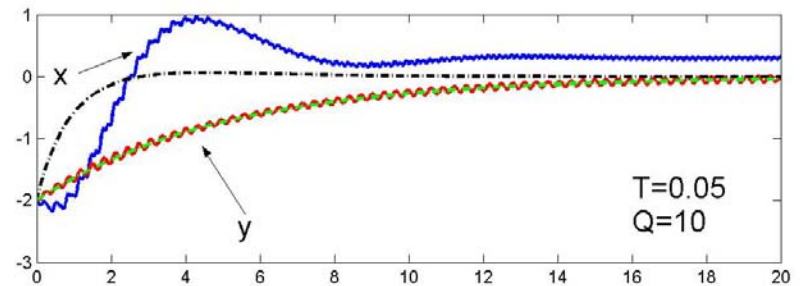
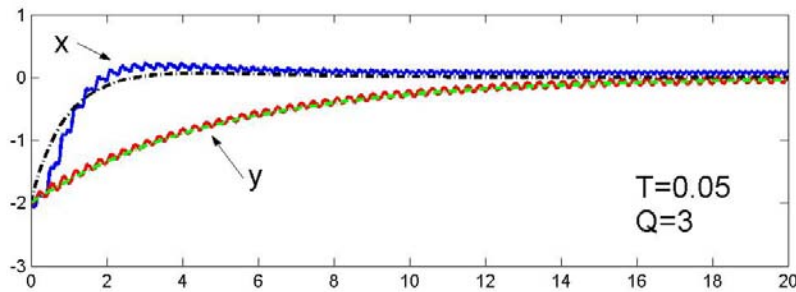
$$\begin{cases} \dot{x} \approx -x \\ \dot{y} \approx -y \end{cases}$$



Responsiveness vs input amplitude trade-off

$$\begin{cases} \dot{x} = u^2 - 1 \\ \dot{y} = u \\ \ddot{u} = -\frac{\omega_0}{Q}\dot{u} - \omega_0^2 u + Kv \\ v = -y \frac{\omega_0^2}{K} + (\sqrt{2} - x) \frac{\omega_0}{KQ} \sin \omega_0 t \end{cases}$$

$$\tau_{decay} = \frac{Q}{\pi} T$$



MFI actuator dynamics

Stable mechanical system

$$M_0 \begin{bmatrix} \ddot{\phi} \\ \ddot{\varphi} \end{bmatrix} + B_0 \begin{bmatrix} \dot{\phi} \\ \dot{\varphi} \end{bmatrix} + K_0 \begin{bmatrix} \phi \\ \varphi \end{bmatrix} = T_0 \begin{bmatrix} V_1 \\ V_2 \end{bmatrix}$$

Wings angles

Input voltage to actuators

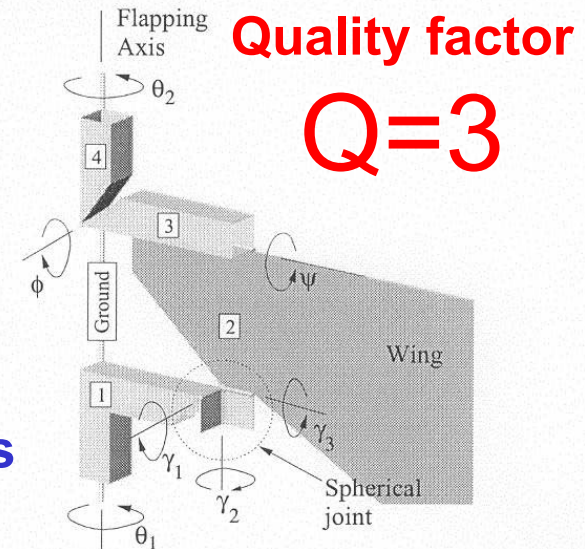
$$u = (\phi_l, \varphi_l, \phi_r, \varphi_r)$$

$$V = (V_{1,l}, V_{2,l}, V_{1,r}, V_{2,r})$$

$$u = g_0(t) + G(t)v$$

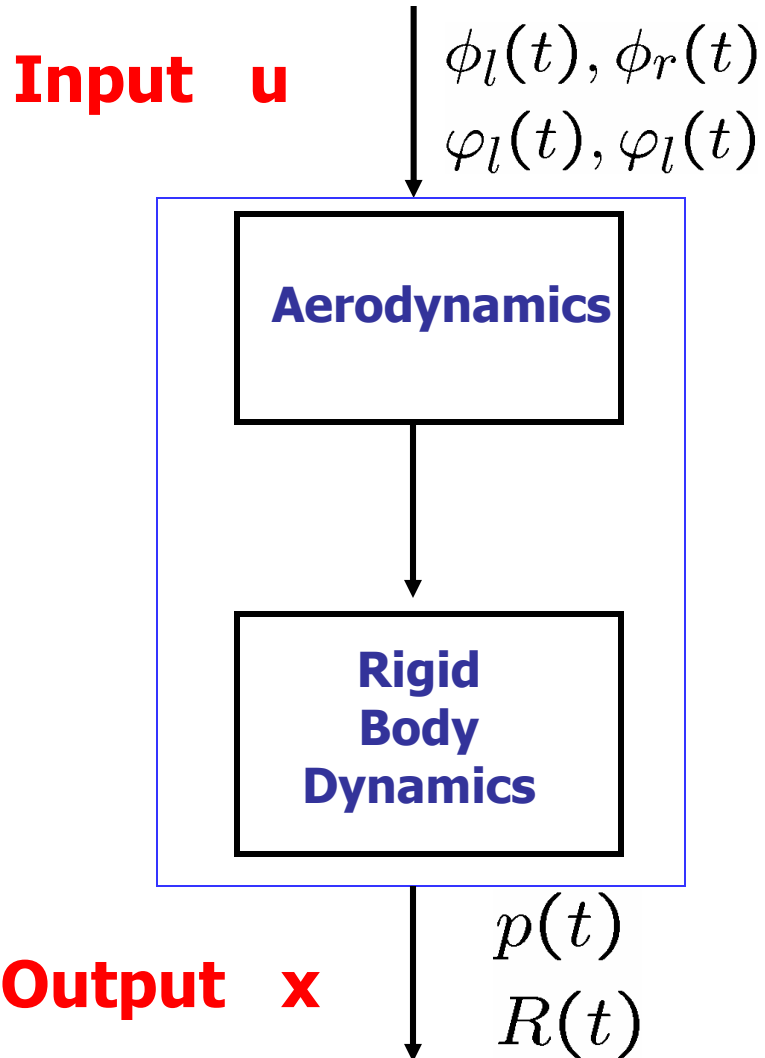
$$V = h_0(t) + H(t)v$$

$h_0(t), H(t)$ obtained by substitution



Model: courtesy of Srinath Avadhanula

Dynamics of insect revised



After averaging

$$\begin{aligned}\dot{p}_m &= v^f \\ \dot{v}_m^f &= \frac{1}{m}R \begin{bmatrix} v_1 \\ 0 \\ v_2 \end{bmatrix} - g \\ \dot{R}_m &= R\hat{\omega}^b \\ \dot{\omega}_m^b &= I_b^{-1} \begin{bmatrix} v_3 \\ v_4 \\ v_5 \end{bmatrix} - \omega^b \times I_b \omega^b\end{aligned}$$

Proportional Feedback

$$v = Kx$$

- Hovering
- Cruising
- Steering

Proportional periodic feedback

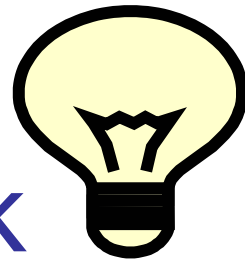
Output from sensors

Input voltages to actuators

$$\begin{bmatrix} V_{1,l}(t) \\ V_{2,l}(t) \\ V_{1,r}(t) \\ V_{2,r}(t) \end{bmatrix} = h(t) + H(t)K \begin{bmatrix} y_c \\ y_1^o \\ y_2^o \\ y_x^h \\ y_y^h \\ y_z^h \end{bmatrix}$$

T-Periodic matrix
T is wingbeat period

Proportional periodic feedback



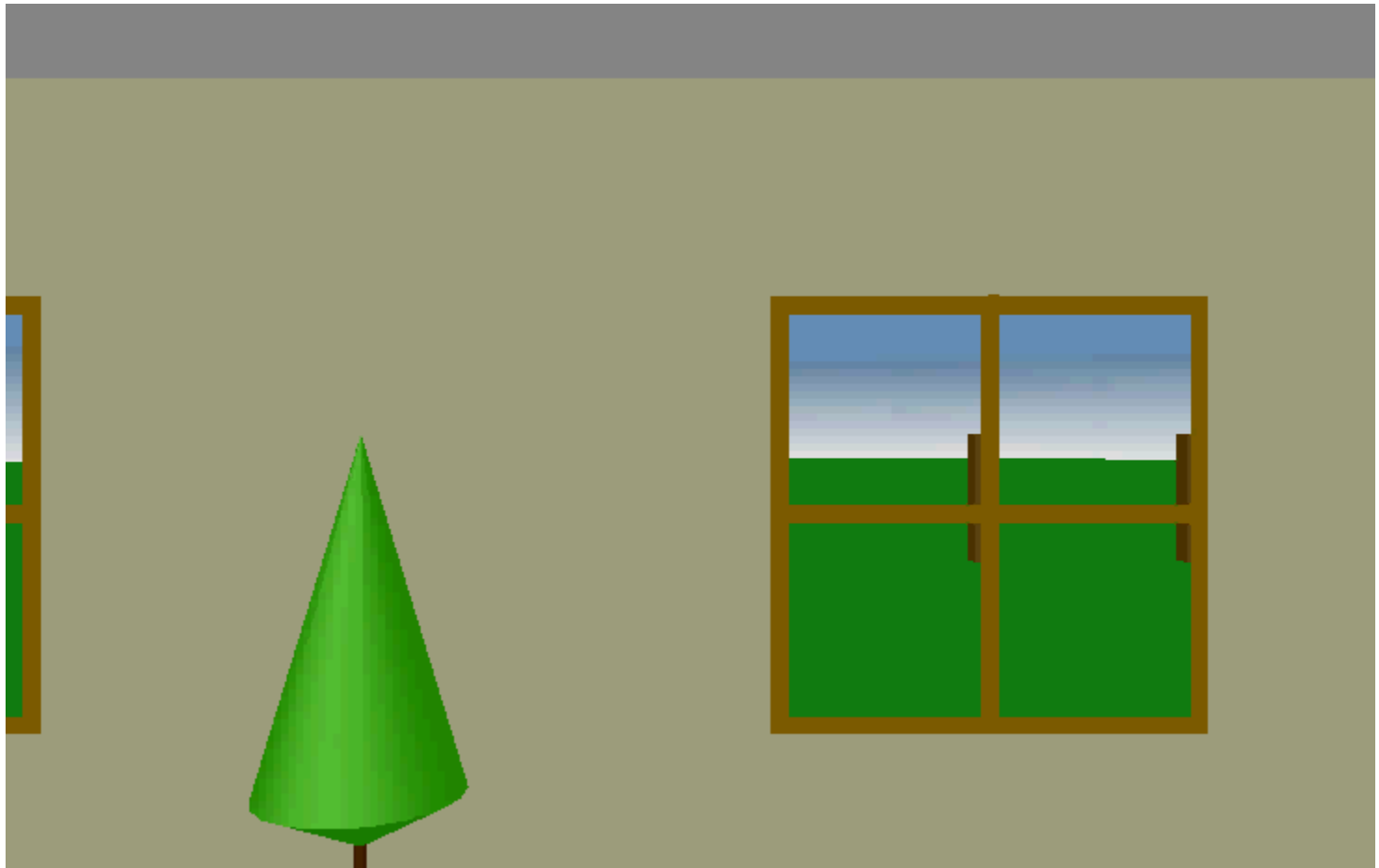
Output from sensors

Input voltages to actuators

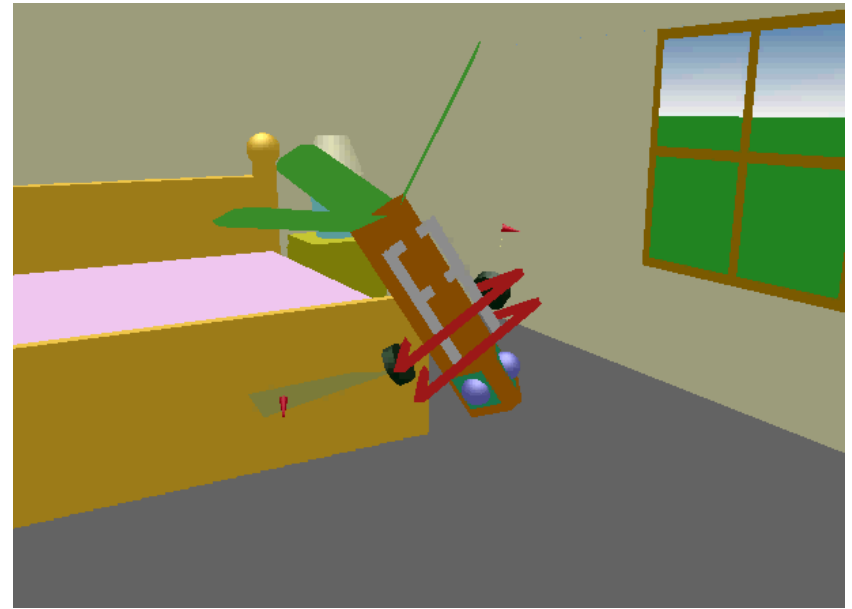
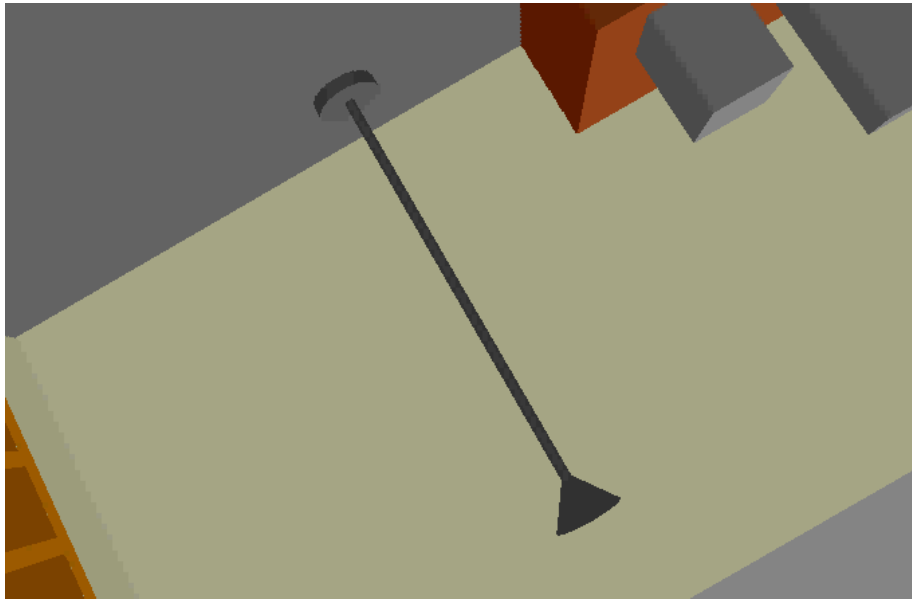
$$\begin{bmatrix} V_{1,l}(t) \\ V_{2,l}(t) \\ V_{1,r}(t) \\ V_{2,r}(t) \end{bmatrix} = h(t) + \tilde{H}(t) \begin{bmatrix} y_c \\ y_1^o \\ y_2^o \\ y_x^h \\ y_y^h \\ y_z^h \end{bmatrix}$$

T-Periodic matrix
T is wingbeat period

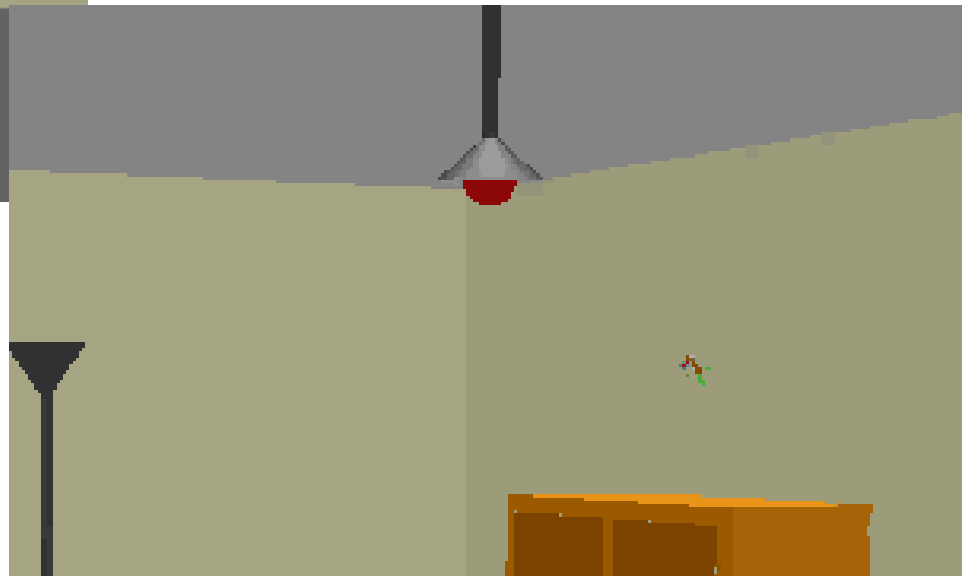
Simulations w/ sensors and actuators: Steering



Simulations w/ sensors and actuators: Recovering



Simulations: Hovering





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Personal contribution:

- **Biological perspective:**

- Flapping flight does allow independent control of 5 degrees of freedom (**using mathematical models**)

- **Technological perspective:**

- Simple control scheme: proportional period feedback from sensors to actuators input
- Quantified limit of performance
- Realistic methodology (when experimental data available)

- **Control Theoretical perspective:**

- Rigorous use of averaging theory to explain flapping flight
- Flapping flight as biological example of high-frequency control of an under-actuated system



Future work

- **Biological perspective:**

- Use experimental data to validate methodology
- Deeper explorations of design trade-offs:
 - quality factor,
 - actuator stiffness,
 - bandwidth of insect dynamics

- **Technological perspective:**

- Extension to 1-degree of freedom wing with passive rotation and PWM control

- **Control Theory perspective:**

- Flapping flight as high frequency control of underactuated system in rigorous terms



Acknowledgments

Work in collaboration with:
X.Deng, W.C. Wu, D. Campolo

Thanks to all MFI group

Project website:
<http://robotics.eecs.berkeley.edu/~ronf/mfi.html>



Q&A

Thank you

150hz.avi

Video courtesy of Erik Steltz