



## Preface – Outline

#### Introduction

- Motivation
- Bionic aspects
- Living paradigms
- Anatomy

#### Part II – Vibrissae

- 1. Introduction
- 2. Functionality
- 3. Application
- 4. State of art

#### 5. Modeling - Stages 1-4 - Multi-body Systems

- Stage 5 Continuous Systems
  - 5a Natural Frequencies
  - 5b Object Distance
  - 5c Object Contour
  - 5d Object Texture
  - 5e Flows

#### Part I – Mechanoreceptors

- 1. Inspiration from biology
- 2. Modeling
- 3. Scope, problem & goal
- 4. Mathematical model
- 5. Control strategies
- 6. Adaptors
- 7. Simulations
- 8. Experiments
- 9. Conclusions



Outlook





## Introduction – Motivation

#### Main Focus / Aim:

Tactile sensing of environmental information



Approach: Inspiration from Biology

**Animal Vibrissae** 



**Transfer Functionalities to Engineering:** 

**BIONICS** 

#### **Analytical Treatment / Simulation / Prototypes**





## Introduction – Bionic aspects

- 1. analyzing live biological systems, e.g. vibrissae,
- 2. **quantifying** the mechanical and environmental behavior: identifying and quantifying mechanosensitive responses (e.g., pressure, vibrations) and their mechanisms as adaptation,
- 3. modeling live paradigms with basic features developed before,
- 4. **exploiting** corresponding mathematical models in order to understand details of internal processes and,
- 5. **coming** to artificial prototypes (e.g., sensors in robotics), which exhibit features of the real paradigms.

#### Important:

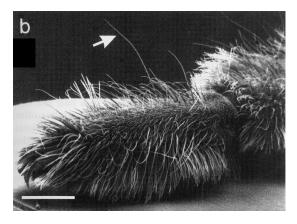
- focus is **not** on "copying" the solution from biology / animality
- not to construct prototypes with one-to-one properties of, e.g., a vibrissa



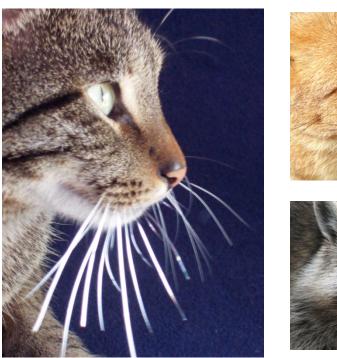
## Introduction – Living paradigms

Different names: vibrissa, whisker, tactile hair, sensory hair, sensillum, ...















[www]

 $\rightarrow$  variability in length, diameter, shape (curvature) and conical structure

13/11/2016

Slide 04



# Introduction – Living paradigms

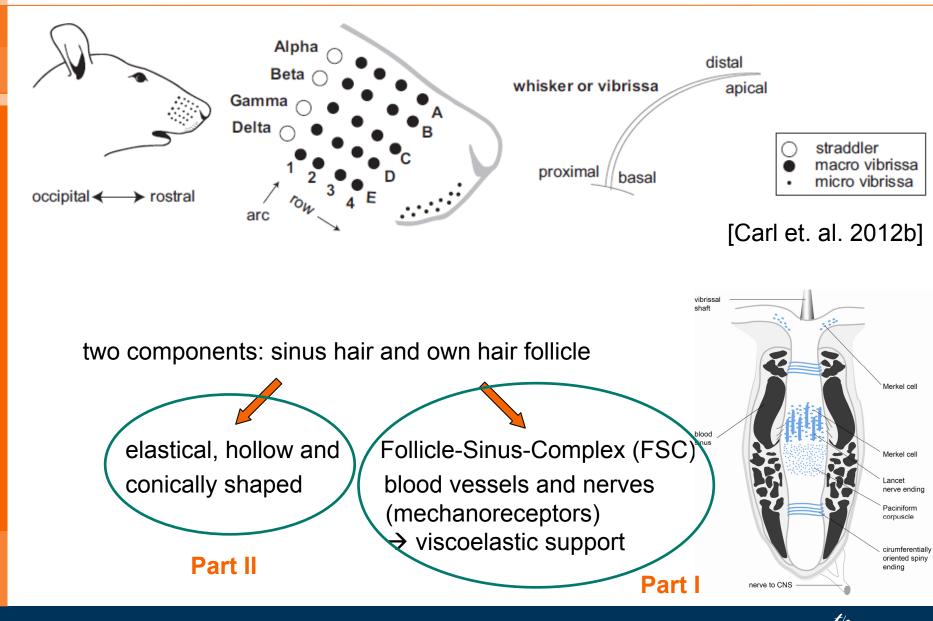
#### Tactile sensing of environmental informations

- complex tactile sensory organ: sense of vibrations
- "near field"-sense in contrast to "far field"-senses (e.g., vision)
- tactile hairs / vibrissae in the region around the snoot mystacial vibrissae
- vibrissa is used as lever for force transmission
- found in nocturnal / non-visual animals (best developed in rodents e.g. rats)





### Introduction – Anatomy of vibrissae



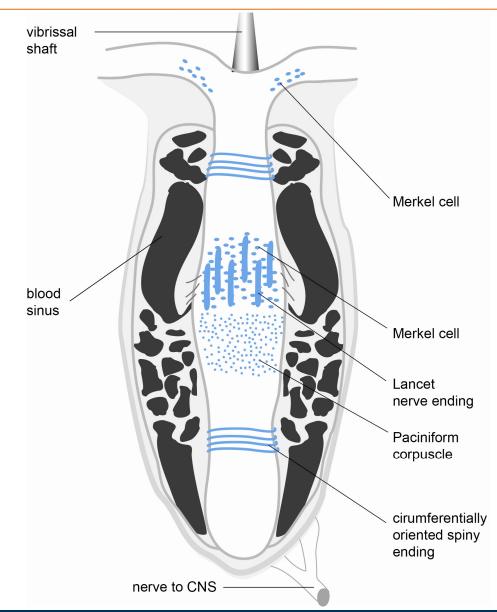
13/11/2016 Slide 06

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features" TECHNISCHE UNIVERSITÄT

# Part I: Mechanoreceptors – 1. Inspiration from biology

Mechanoreceptors of sensory hair systems:

- Follicle-Sinus-Complex (FSC) with blood vessels, nerves and mechanoreceptors (right side)
- Detection of vibrissa displacements by mechanoreceptors in the FSC
- Receptors have only one function: transduce a (mechanical) stimulus to neural impulses

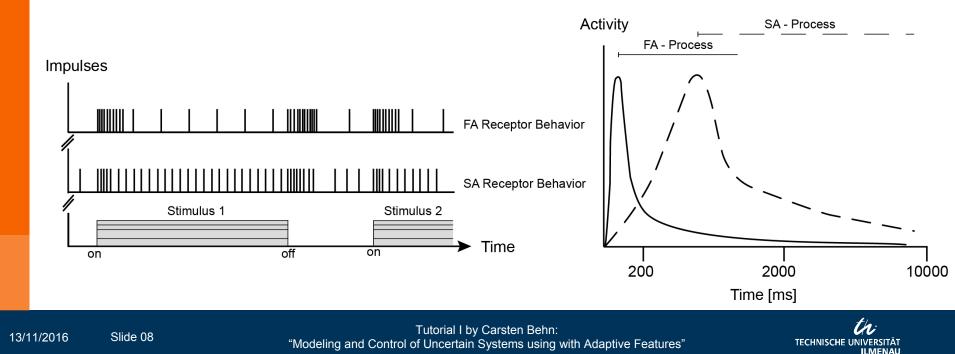


ILMENAU



# Part I: Mechanoreceptors – 1. Inspiration from biology

- a receptor never continues to respond to a non-changing stimulus in transducing impulses to the CNS
- the neuron's reaction is controlled:
  - $\rightarrow$  is being suppressed, enhanced or left unaltered
- hence, depending on the stimulus, a receptor offers a rapid and brief response; then, this response declines if the stimulus is un-changing (stimulus is damped, is considered irrelevant once it has been perceived)



## Part I: Mechanoreceptors – 1. Inspiration from biology

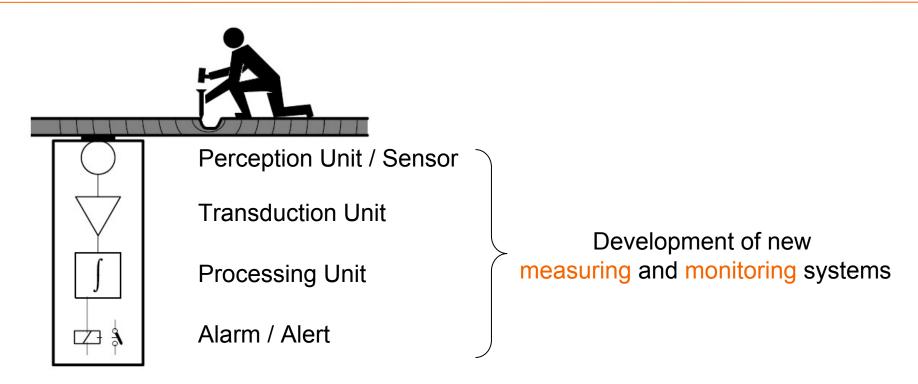
- sensibility of FA-receptor-cells is continuously adjusted in such a way that the whole systems tends to its rest position – despite a continued excitation

- "waiting" / sensitive for new stimulus

- due to permanently changing environment the receptor has to be in a permanent state of adaptation
- Example: think of a cat
  - exposed to wind
  - this stimulus is perceived and damped (irrelevant)
  - cat encounters obstacle, receptor should perceive this sudden deviation of the whiskers, while wind persists
  - $\rightarrow$  enduring sensitivity



## Part I: Mechanoreceptors – 2. Modeling



- Adjustment and adaptation of its sensitiviy to the environment

- obvious: unknown surroundings
- → treatment of uncertain systems: How to design an effective processing unit?



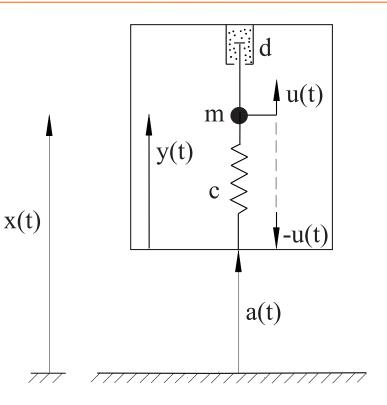
## Part I: Mechanoreceptors – 2. Modeling

Receptor model:

- linear spring-mass-damper-system within a rigid frame
- forced by an unknown time-dependent displacement  $a(\cdot)$

- adjustment: assuming control force  $u(\cdot)$  acting on inner mass

in relative coordinate y = x - a as the measured output



$$\begin{pmatrix} y(t) \\ \dot{y}(t) \end{pmatrix}^{\bullet} = \begin{bmatrix} 0 & 1 \\ -\frac{c}{m} & -\frac{d}{m} \end{bmatrix} \begin{pmatrix} y(t) \\ \dot{y}(t) \end{pmatrix} + \begin{bmatrix} 0 \\ \frac{1}{m} \end{bmatrix} u(t) + \begin{bmatrix} 0 \\ -\ddot{a}(t) \end{bmatrix}$$

$$y(0) = x_0 - a(0) , \quad \dot{y}(0) = x_1 - \dot{a}(0) .$$



ILMENAU

# Part I: Mechanoreceptors – 3. Scope, problem & goal

Scope:

- achieve a predefined movement of the receptor mass as stabilization of the sensor system or tracking of a reference trajectory
- sole possibility: control force  $u(\cdot)$
- find a suitable control strategy to reproduce the specialities of the biological system
- compensate unknown ground excitations

Problem:

- many open-loop and closed-loop controls are based on exactly known parameters
- here: highly uncertain control system (due to biological complexity)
  - unknown external perturbation
  - unknown system parameters
  - only structural properties known

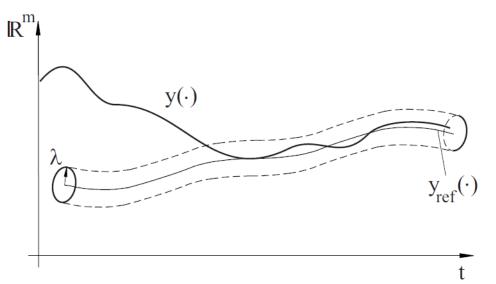
What to do if the system is not known precisely?



# Part I: Mechanoreceptors – 3. Scope, problem & goal

#### Goal:

Design an adaptive controller, which learns from the behavior of the system, so automatically adjusts its parameters and achieves ...



 $\lambda$  - tracking (not exact tracking)

- (i) every solution of the closed-loop system is defined and bounded,
- (ii) the output  $y(\cdot)$  tracks the given reference signal with asymptotic accuracy  $\lambda$ .

#### Requirements:

- ability to apply controllers without knowledge about system parameters
- simple feedback / controller structure
- small level of gain parameters, level of error inside the tube
- ability to quickly adapt to parameter changes



## Part I: Mechanoreceptors – 4. Mathematical model

 $\left. \begin{array}{l} \ddot{y}(t) = A_2 \, \dot{y}(t) + f_1 \big( s_1(t), y(t), z(t) \big) + G \, u(t) \, , \\ \dot{z}(t) = A_5 \, z(t) + A_0 \, \dot{y}(t) + f_2 \big( s_2(t), y(t) \big) \, , \\ y(t_0) = y_0 \, , \quad \dot{y}(t_0) = y_1 \, , \quad z(t_0) = z_0 \, , \end{array} \right\}$ 

General System Class:

• 
$$y(t), y_0, y_1, u(t) \in \mathbb{R}^m, z(t), z_0 \in \mathbb{R}^{n-2m};$$

- real valued  $A_2$ , G,  $A_5$ ,  $A_0$  of appropriate dimensions;
- $n \ge 2m;$
- quadratic, finite-dimensional, nonlinearly perturbed, *m*-input  $u(\cdot)$ , *m*-output  $y(\cdot)$  control system (MIMO) with strict relative degree two;
- spec(G) ⊂ C<sub>+</sub>, i.e., the spectrum of the "high-frequency gain" lies in the open right-half complex plane;

#### Properties:

- spec $(A_5) \subset \mathbb{C}_-$ , i.e., the unperturbed system is minimum phase (stable zero dynamics);
- functions  $f_1$  and  $f_2$  are continuous and linearly affine bounded;
- $s_1$  and  $s_2$  may be thought of as (bounded) disturbance terms;



## Part I: Mechanoreceptors – 4. Mathematical model

 $\begin{cases} \ddot{y}(t) = A_2 \, \dot{y}(t) + f_1 \big( s_1(t), y(t), z(t) \big) + G \, u(t) \,, \\ \dot{z}(t) = A_5 \, z(t) + f_2 \big( s_2(t), y(t) \big) \,, \\ y(t_0) = y_0 \,, \quad \dot{y}(t_0) = y_1 \,, \quad z(t_0) = z_0 \,, \end{cases} \end{cases}$ 

- Special System Subclass:
- $y(t), y_0, y_1, u(t) \in \mathbb{R}, z(t), z_0 \in \mathbb{R}^{n-2};$
- real valued  $A_2$ , G,  $A_5$  of appropriate dimensions;
- $n \ge 2;$

restriction

- quadratic, finite-dimensional, nonlinearly perturbed, SISO-control system with strict relative degree two;
- G > 0, i.e., positive input gain;

Properties:

- spec $(A_5) \subset \mathbb{C}_-$ , i.e., the unperturbed system is minimum phase (stable zero dynamics);
- functions  $f_1$  and  $f_2$  are continuous and linearly affine bounded;
- $s_1$  and  $s_2$  may be thought of as (bounded) disturbance terms;
- $A_2 < 0$ , i.e., stable zero-center;



### Part I: Mechanoreceptors – 5. Control strategies

Modified from literature, high-gain controllers:

<u>Controller 1:</u> (using the derivative of the output)

$$e(t) := y(t) - y_{ref}(t),$$

$$u(t) = -\left(k(t)e(t) + \frac{d}{dt}\left(k(t)e(t)\right)\right),$$

$$\dot{k}(t) = \gamma\left(\max\left\{0, \left\|e(t)\right\| - \lambda\right\}\right)^{2}, \quad k(0) = k_{0} \in \mathbb{R}\right\}$$
World class

Works for general class, proven 2006

Controller 2: (includes a dynamic compensator, no derivative measurement)  $e(t) := y(t) - y_{ref}(t)$ ,  $u(t) = -k(t)\,\theta(t) - \frac{d}{dt} \left(k(t)\,\theta(t)\right),$ Works for general  $\dot{\theta}(t) = -k(t)^2 \theta(t) + k(t)^2 e(t), \quad \theta(0) = \theta_0 \in \mathbb{R}^m$   $\dot{k}(t) = \gamma \max\left\{0, \left\|e(t)\right\| - \lambda\right\}^2, \quad k(0) = k_0 \in \mathbb{R}$ class, proven 2011 Controller 3: (controller of order 1, P-structure) Works only for  $e(t) := y(t) - y_{\text{ref}}(t),$ special subclass,  $u(t) = -k(t) e(t) \,,$ proven 2013, not  $\dot{k}(t) = \gamma \max\{0, |e(t)| - \lambda\}^2, \quad k(0) = k_0 \in \mathbb{R}_+$ extendable to MIMO

13/11/2016 Slide 15



## Part I: Mechanoreceptors – 5. Control strategies

Let  $\lambda > 0$ ,  $y_{\text{ref}}(\cdot) \in \mathcal{R}$ ,  $s_1(\cdot) \in \mathcal{L}^{\infty}(\mathbb{R}_{\geq 0}; \mathbb{R}^{q_1})$  and  $s_2(\cdot) \in \mathcal{L}^{\infty}(\mathbb{R}_{\geq 0}; \mathbb{R}^{q_2})$ . Then the presented adaptive  $\lambda$ -trackers applied to every system of the general system class yields for any initial data  $(y_0, y_1, z_0, \theta_0, k_0) \in \mathbb{R}^m \times \mathbb{R}^m \times \mathbb{R}^{n-2m} \times \mathbb{R}^m \times \mathbb{R}_{>0}$ 

$$egin{aligned} \dot{y}(t) &= \zeta(t), & y(0) = y_0, \ \dot{\zeta}(t) &= A_2\,\zeta(t) + f_1ig(s_1(t),y(t),z(t)ig) & & \ -Gig[k(t)\, heta(t) + k(t)^3ig[y(t) - y_{ ext{ref}}(t)ig] & & \ + \maxig\{0, ig\|\,y(t) - y_{ ext{ref}}(t)ig\| - \lambdaig\}^2 heta(t) - k(t)^3\, heta(t)ig], \ \zeta(0) &= y_1\,, \ \dot{z}(t) &= A_5\,z(t) + A_0\,\zeta(t) + f_2ig(s_2(t),y(t)ig), & z(0) = z_0\,, \ \dot{ heta}(t) &= -k(t)^2\, heta(t) + k(t)^2ig[y(t) - y_{ ext{ref}}(t)ig], & eta(0) &= heta_0\,, \ \dot{k}(t) &= \maxigg\{0, ig\|\,y(t) - y_{ ext{ref}}(t)ig\| - \lambdaigg\}^2, & k(0) = k_0\,, \ \end{aligned}$$

which has a maximal solution  $(y, \zeta, z, \theta, k) : [0, t') \to \mathbb{R}^m \times \mathbb{R}^m \times \mathbb{R}^m \times \mathbb{R}^m \times \mathbb{R}_{>0}$ with:

- (i)  $t' = \infty$ , i.e. there does not exist a finite escape time;
- (ii)  $\lim_{t\to\infty} k(t)$  exists and is finite;
- (iii) the solution,  $\dot{\zeta}(\cdot)$ ,  $\dot{z}(\cdot)$ ,  $\dot{\theta}(\cdot)$  and  $u(\cdot)$  are bounded;
- $ext{(iv)} \limsup_{t o \infty} \left\| y(t) y_{ ext{ref}}(t) 
  ight\| \leq \lambda;$
- $(\mathbf{v})\,\limsup_{t\to\infty}\left\|\theta(t)\right\|\leq\lambda.$

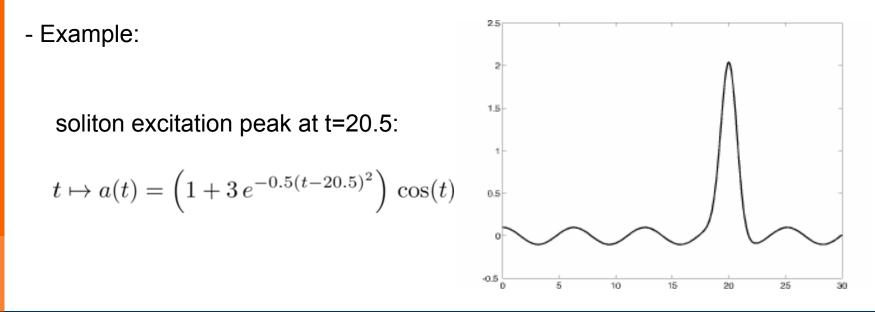


**Problems** 

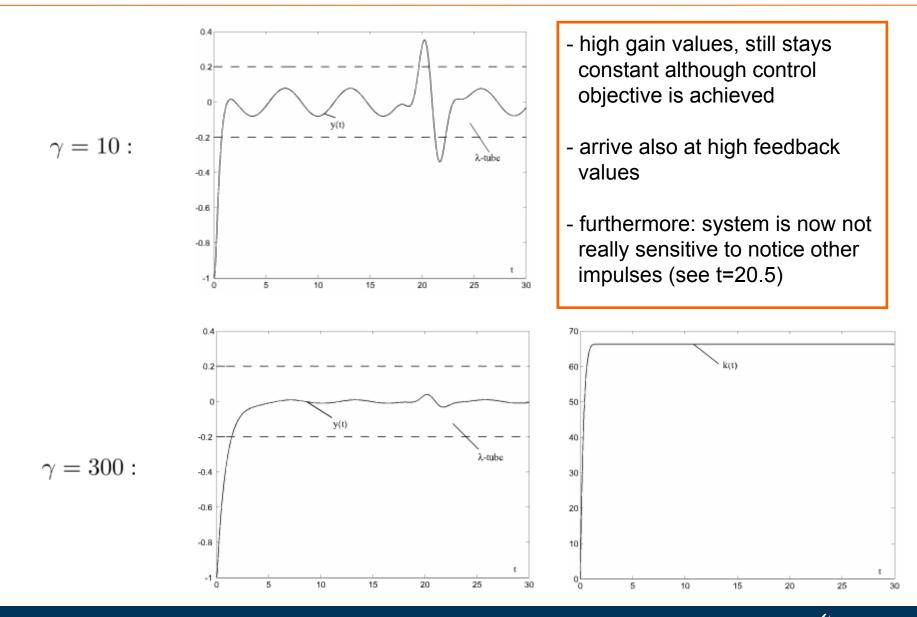
- stabilization and tracking are guaranteed / proven
- slow convergence of controller gain: introducing new parameter  $\gamma$

$$\dot{k}(t) = \gamma \left( \max\left\{ 0, \left\| e(t) \right\| - \lambda \right\} \right)^2, \quad k(0) = k_0 \in \mathbb{R}$$

- this parameter strongly determines the growth of the gain parameter (sufficiently large enough)







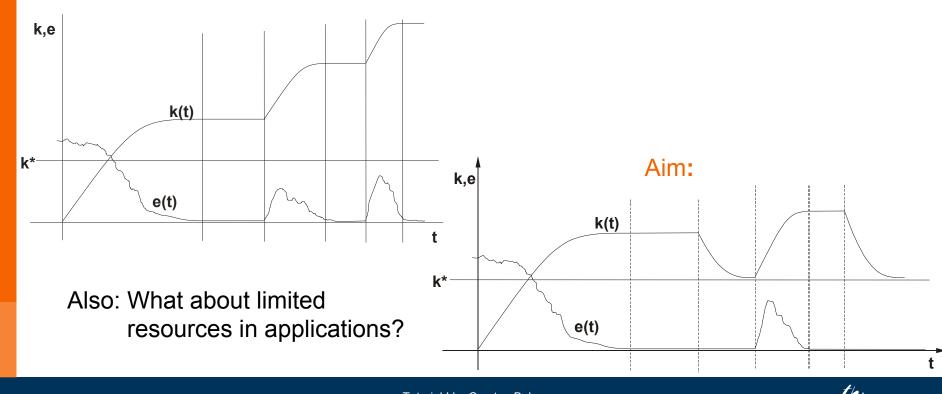
13/11/2016 Slide 18

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features" technische Universität ILMENAU

- closed-loop system is getting insensitive for changes of the stimulus
- caused by only monotonic increase of the gain parameter (classical adaptor)

$$\dot{k}(t) = \gamma \left( \max\left\{ 0, \left\| e(t) \right\| - \lambda \right\} \right)^2$$

- also do almost all controllers existing in the literature



Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"

ILMENAU

<u>Attempt 1:</u> so-called "sigma-modification" (in the literature):

$$\dot{k}(t) = -\sigma \, k(t) + \gamma \left( \max\left\{ 0, \left\| e(t) \right\| - \lambda \right\} \right)^2, \quad \lambda > 0 \,, \sigma > 0 \,, \gamma \gg 1$$

- this adaptor achieves damping and increase of the gain k simultaneously when e is outside the tube
- this law (often) leads to chaotic behavior of the system

<u>Attempt 2:</u> first simple modification:

$$\dot{k}(t) = \begin{cases} \gamma \left( \left\| e(t) \right\| - \lambda \right)^2, & \left\| e(t) \right\| \ge \lambda, \\ -\sigma k(t), & \left\| e(t) \right\| < \lambda, \end{cases} \quad \lambda > 0, \sigma > 0, \gamma \gg 1$$

- also showing alternating increase and exponential decrease of k
- Problem:

It could happen that e rapidly traverses the tube. Then it would be inadequate to immediately decrease k after e entered the tube.



Attempt 3: Distinguishing three cases:

- 1. increasing k while e is outside the tube,
- 2. constant k after e entered the tube no longer than a pre-specified duration  $t_d$  of stay,
- 3. decreasing k after this duration has been exceeded:

$$\dot{k}(t) = \begin{cases} \gamma \left( \left\| e(t) \right\| - \lambda \right)^2, & \left\| e(t) \right\| \ge \lambda, \\ 0, & \left( \left\| e(t) \right\| < \lambda \right) \land (t - t_E < t_d), \\ -\sigma k(t), & \left( \left\| e(t) \right\| < \lambda \right) \land (t - t_E \ge t_d), \\ \lambda > 0, \sigma > 0, \gamma \gg 1, t_d > 0, t_E \text{ internal} \end{cases}$$

<u>Attempt 4:</u> In order to make the attraction of the tube stronger using different exponents for large/small distance from the tube:

$$\dot{k}(t) = \begin{cases} \gamma \left( \|e(t)\| - \lambda \right)^2, & \|e(t)\| \ge \lambda + 1, \\ \gamma \left( \|e(t)\| - \lambda \right)^{0.5}, & \lambda + 1 > \|e(t)\| \ge \lambda, \\ 0, & \left( \|e(t)\| < \lambda \right) \land (t - t_E < t_d), \\ -\sigma k(t), & \left( \|e(t)\| < \lambda \right) \land (t - t_E \ge t_d), \end{cases}$$



<u>Attempt 5:</u> One way to guarantee that e will not leave the tube after entering the tube and k is going to be decreased, is tracking of a smaller value than the desired one, for example  $\varepsilon = 0.7$ :

$$\dot{k}(t) = \begin{cases} \gamma \left( \left\| e(t) \right\| - \varepsilon \lambda \right)^2, & \left\| e(t) \right\| \ge \varepsilon \lambda + 1, \\ \gamma \left( \left\| e(t) \right\| - \varepsilon \lambda \right)^{\frac{1}{2}}, & \varepsilon \lambda + 1 > \left\| e(t) \right\| \ge \varepsilon \lambda, \\ 0, & \left( \left\| e(t) \right\| < \varepsilon \lambda \right) \wedge (t - t_E < t_d), \\ -\sigma k(t), & \left( \left\| e(t) \right\| < \varepsilon \lambda \right) \wedge (t - t_E \ge t_d), \end{cases} \end{cases}$$

- turns out as the to-be-favoured one

- "  $\varepsilon$ – safe  $\lambda$ – tracking"



- adaptive nature: arbitrary choice of the system parameters
- obvious (for numerical simulation) to choose system data fixed and known, but controllers adjust their gain parameter to each set of system data
- parameters: arbitrarily chosen, not measured, not identified from biological paradigm
  - sensor system: sensor mass m = 1, damping coefficient d = 5, spring stiffness c = 10;
  - initial values  $(y(0), \dot{y}(0)) = (-a(0), -\dot{a}(0))$
  - reference signal  $t \mapsto y_{ref}(t) = 0$  (rest position)
  - ground excitation  $t \mapsto a(t) = \sin(2\pi t)$
  - $\varepsilon$ -safe  $\lambda$ -tracker: initial gain value  $k_0 = 1$ , tracking tolerance  $\lambda = 0.2$ , decrease rate  $\sigma = 1$ , time of duration in tube  $t_d = 3$ , gain convergence parameter  $\gamma = 50$ , safe  $\varepsilon = 0.7$



 $\lambda$ -tracker / classical adaptor Output, tubes vs. t Gain parameter vs. t 0.6 20 18 0.4 λ-tube 16 k(t) 0.2 14 12 0 10 -0.2 8 y(t) ε-tube 6 -0.4 4 -0.6 2 t t 0 -0.8 10 15 20 25 30 5 10 15 20 25 0 5 30

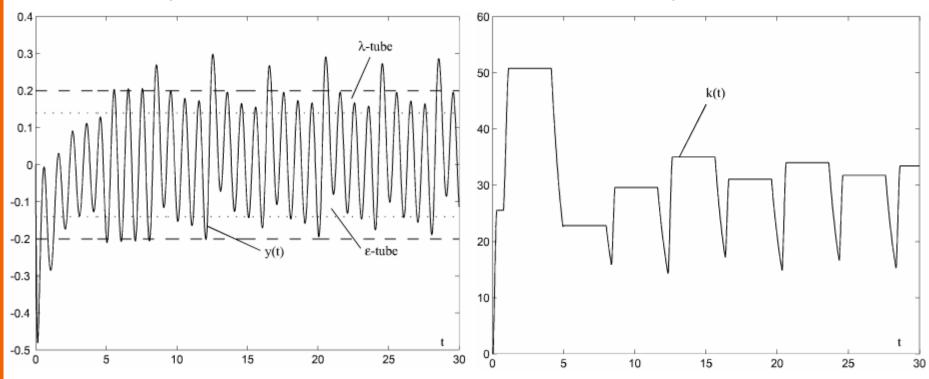
13/11/2016 Slide 24



 $\lambda$ -tracker / Adaptor with two exponents

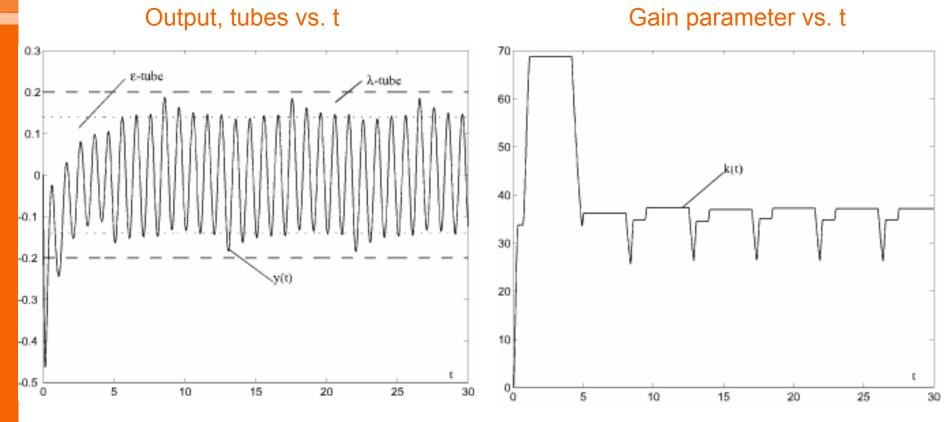
Output, tubes vs. t

Gain parameter vs. t



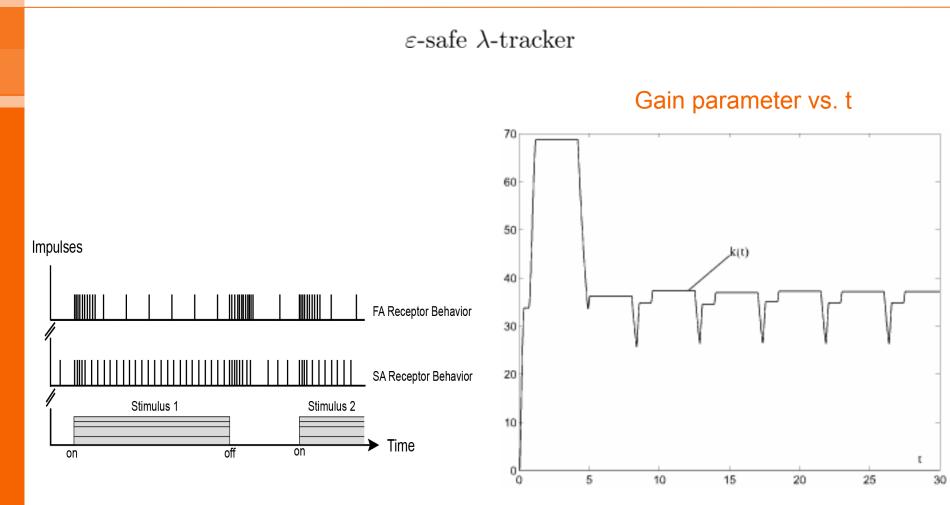


 $\varepsilon$ -safe  $\lambda$ -tracker



- no apparantly leaving of the  $\lambda$  -tube as before - steep increase of  $k(\cdot)$  is due to "switching on" the controller



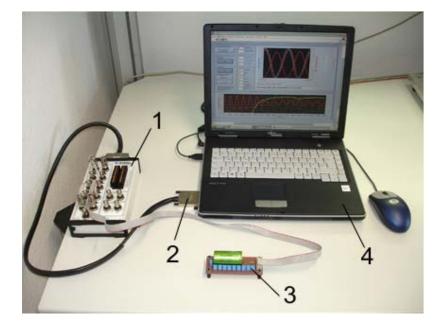


Gain parameter reflects the behavior of the biological paradigm

13/11/2016 Slide 27

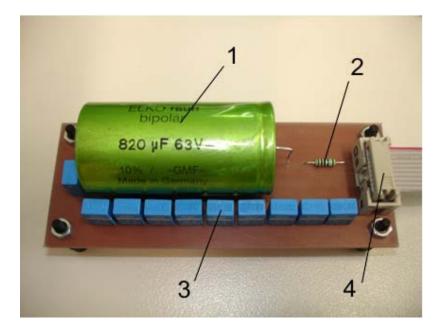


demonstrator in form of an electrical oscillating circuit



Test rig:

- 1 I/O-system (BNC-2110),
- 2 DAQ-6036-PCMCIA-card,
- 3 demonstrator,
- 4 PC with LabView



Circuit:

- 1 capacitor ( $C = 800 \, \mu F$ ),
- 2 resistor  $(R=100\,\Omega)$  ,
- 3 one inductor (overall inductance  $L_{ges} = 640 \ mH$  ),
- 4 communication to PC



Equations of motion:

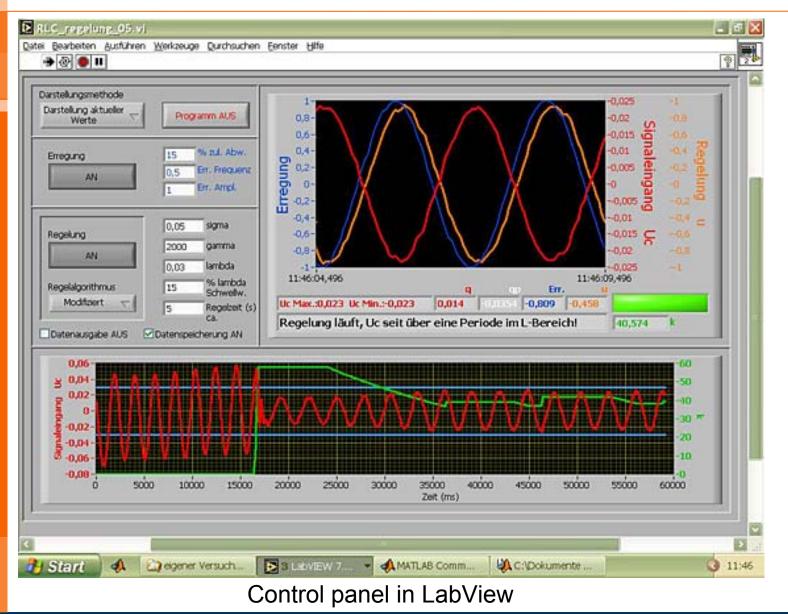
$$L\ddot{q}(t) + R\dot{q}(t) + \frac{1}{C}q(t) = U(t) + u(t).$$

Goal: adaptively compensating changes of  $U(\cdot)$  by means of control input  $u(\cdot)$ 

Control input:  $u := U_C$  (directly control the capacity voltage, depends linearly on measured output charge  $q(\cdot)$ )

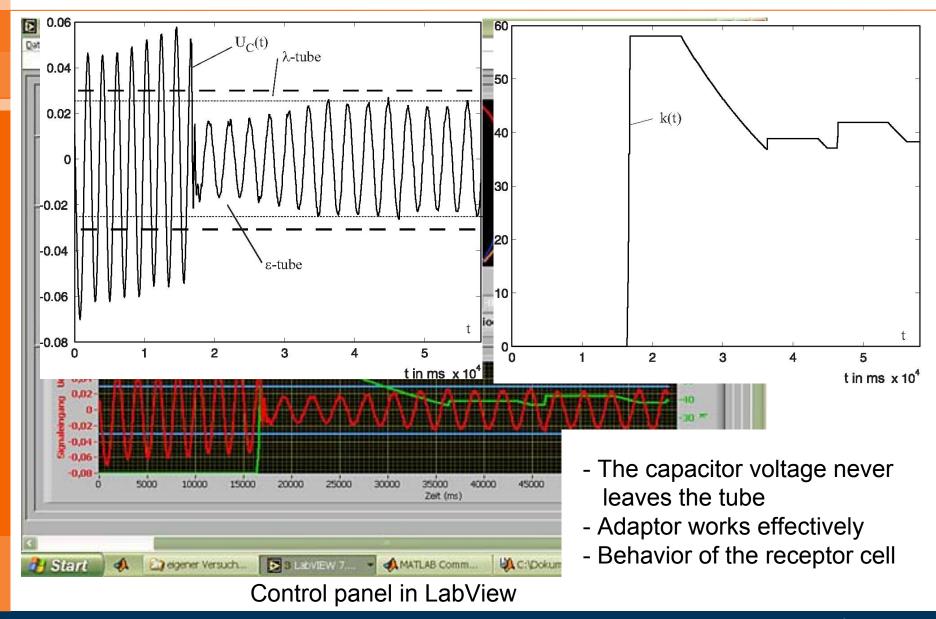
#### Parameters:

- reference signal  $t \mapsto q_{\text{ref}}(t) = 0$
- excitation  $t \mapsto U(t) = U_0 \sin(\omega t)$  with amplitude  $U_0 = 5 V$  and frequency f = 0.5 Hz
- $\varepsilon$ -safe  $\lambda$ -tracker: initial gain value  $k_0 = 1$ , tracking tolerance  $\lambda = 0.03 V$ , decrease rate  $\sigma = 0.05$ , time of duration in tube  $t_d = 1s$ , gain convergence parameter  $\gamma = 100$ , safe  $\varepsilon = 0.7$  (much smaller tolerance)



13/11/2016 Slide 30





13/11/2016 Slide 30

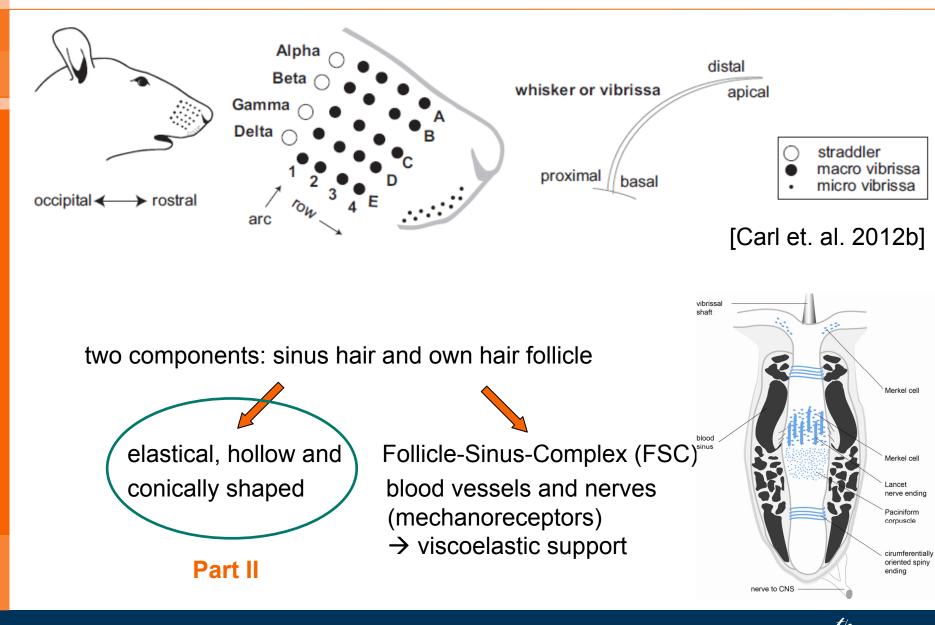


## Part I: Mechanoreceptors – 9. Conclusions

- Development of new control strategies and sensor models
- Motivated by a sensory hair receptor: permanent state of adaptation
- Behavior mimicked by an artificial sensor system via adaptive control
- Supposed high degree of unknown system parameters
- Adaptive control design to dominate an uncertain system with improved gain parameter models with minimal knowledge of system parameters
- Simple control design: rely only on structural properties, do not invoke any estimation or identification mechanism, do not depend on output derivative
- Numerical simulations and experiments have shown that the proposed controller exhibit both sensibility and adaptivity.
- The receptor model rapidly suppresses the persisting stimuli and shows good reactions to sudden changes in the stimulus.



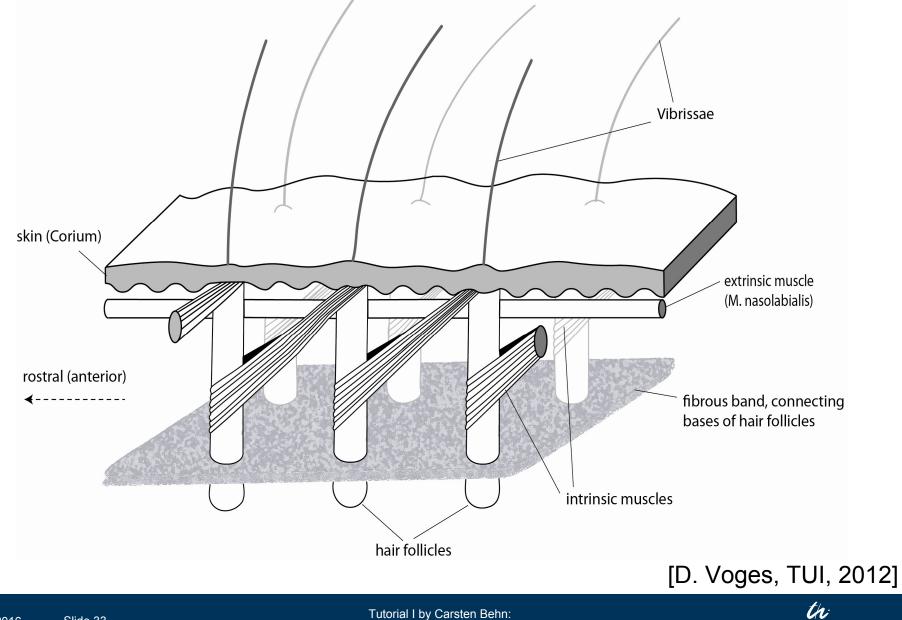
### Part II: Vibrissae – 1. Introduction (Anatomy)



13/11/2016 Slide 32

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"

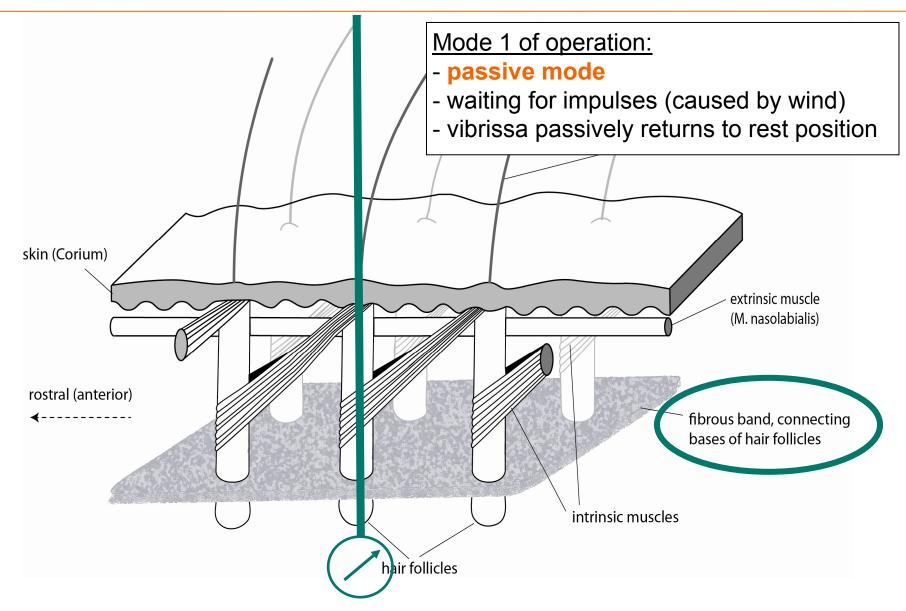
#### Part II: Vibrissae – 1. Introduction (Anatomy)



"Modeling and Control of Uncertain Systems using with Adaptive Features"

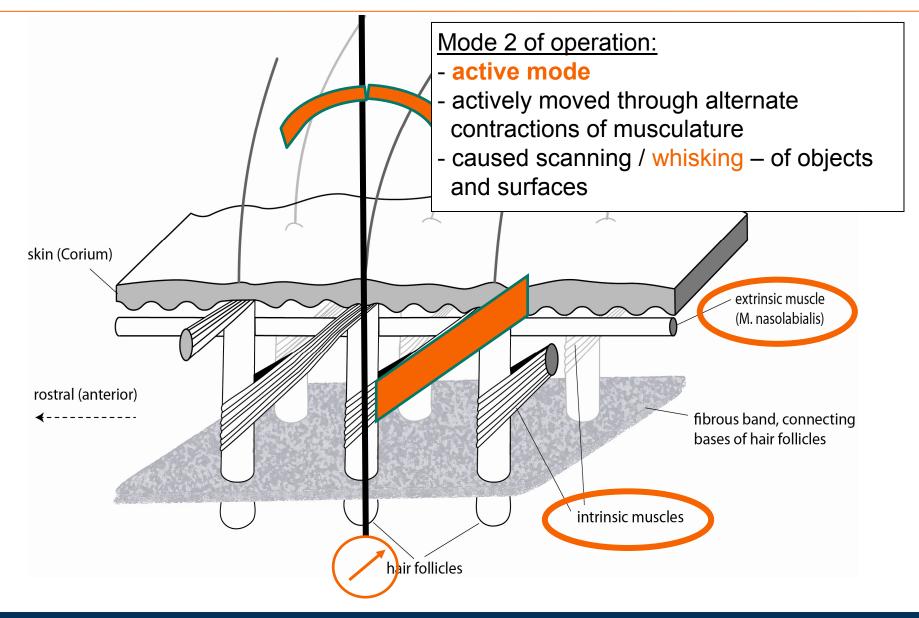
TECHNISCHE UNIVERSITÄT

## Part II: Vibrissae – 2. Functionality





## Part II: Vibrissae – 2. Functionality





### Offering the ability to adapt its sensitivity to its environment:

- detection of vibrissa displacements by mechanoreceptors in the FSC
- a feedback loop (closed-loop control system) enables the rodents to immediately react to an object contact: they slow down the vibrissae
- depending on the mode (passive or active) and the expectations, the neuron's reaction is controlled: is being suppressed, enhanced or left unaltered
- the rodents can *probably* modify the stiffness of the vibrissa support by varying the pressure in the blood-sinus
- active whisking pattern
  - a) exploratory whisking: large amplitudes, low frequency (5-15Hz)
  - b) foveal whisking: small amplitudes, high frequency (15-25Hz)



### still unclear:

How the animals convert these multiple contacts with single objects into coherent information about their surroundings?

### <u>But:</u>

highly interesting sensory system (autonomous robotics, reliable information in dark, smoky or noisy environments)

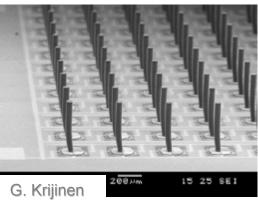


# Part II: Vibrissae – 3. Application

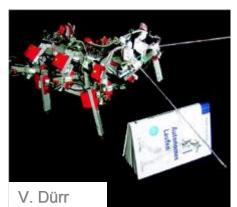
Paradigms of tactile sensors for perceptions in applications:

- quality assurance (e.g., coordinate measuring machines)
- measurements of flow rates
- detection of packaged goods on conveyor belts

### Microsystem Technology

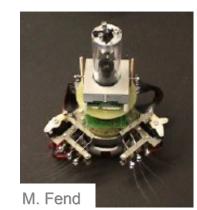


### detection of flow rates

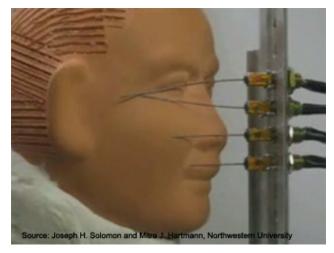


object localization

#### Robotics



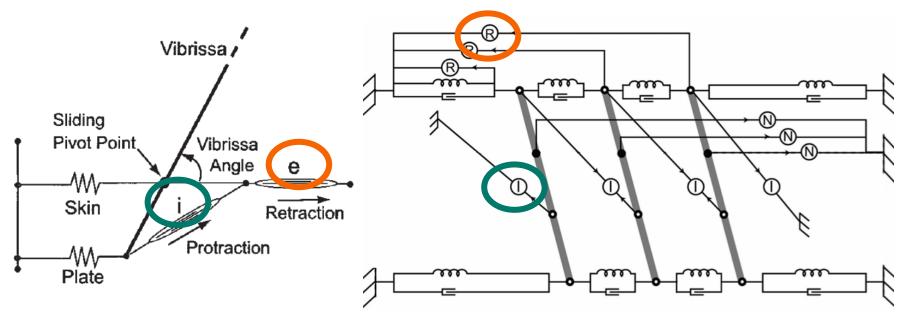
### detection of texture



### detection of surfaces



Rigid body model of a vibrissa / vibrissa row with musculature in [Berg, Kleinfeld 2003] and [Hill et. al. 2008]



 $\oplus$  Implementation of the <u>intrinsic</u> and <u>extrinsic</u> musculature

 $\oplus$  Simulating the viscoelastic properties of the skin

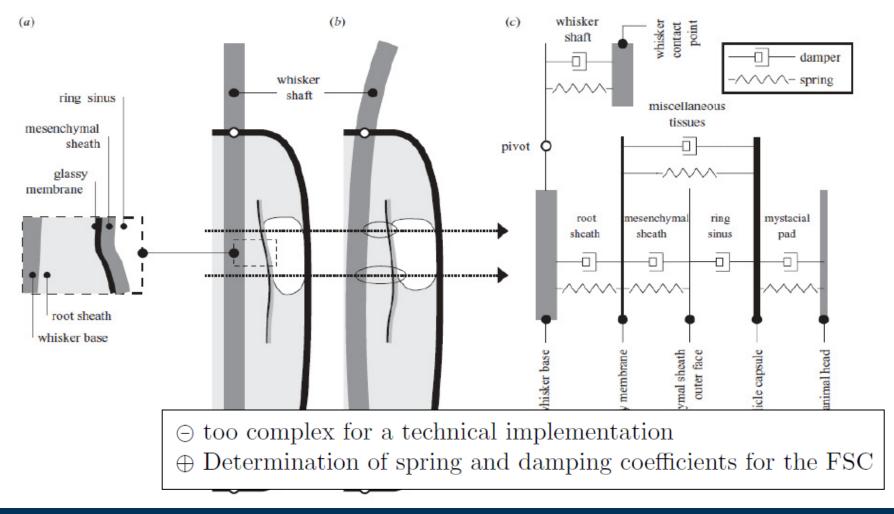
 $\hookrightarrow$  Determination of spring and damping coefficients for the skin

- $\odot$  Neglecting the viscoelastic properties of the FSC
- $\odot$  Connection between the follicles

 $\hookrightarrow$  leads to complex control strategy and high control effort



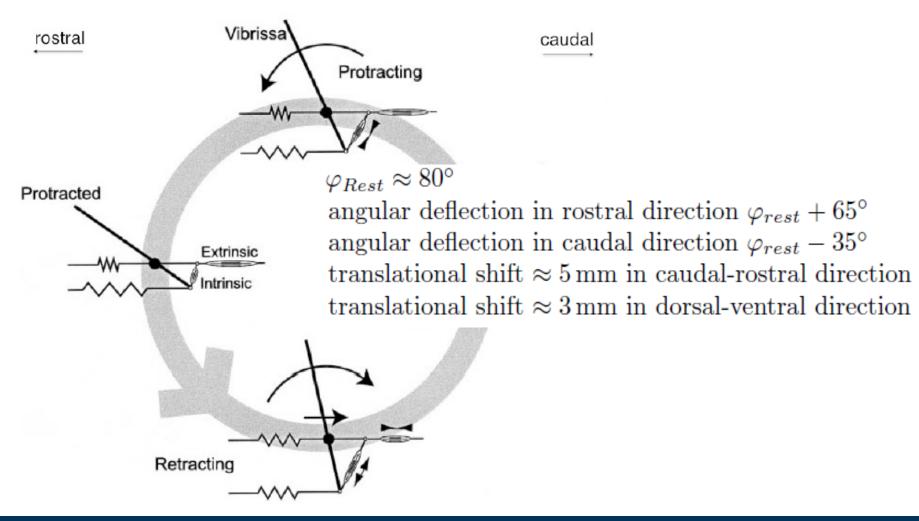
### Rigid body model of the vibrissa / Simulating the compliance of the FSC in [Mitchinson et. al. 2004], [Mitchinson et. al. 2007]



13/11/2016 Slide 40



### Rigid body model of a vibrissa for determination of the range of movement of the vibrissa in [Berg, Kleinfeld 2003]

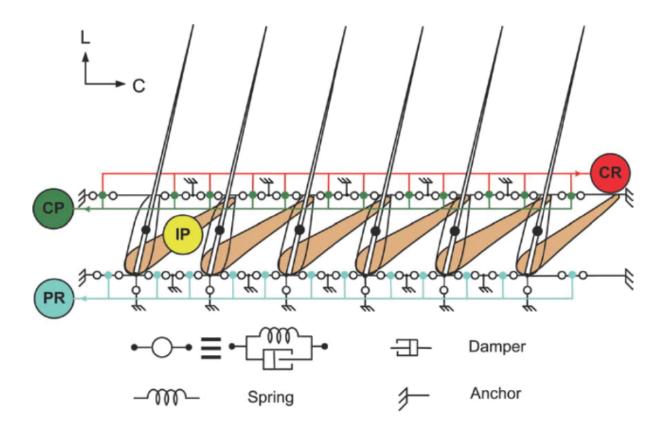


Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"



### Biomechanical model representing one vibrissal row in [Haidarliu et al. 2010] and [Haidarliu et al. 2011]

Goal: modeling the muscle-tissue-system in the mystacial pad

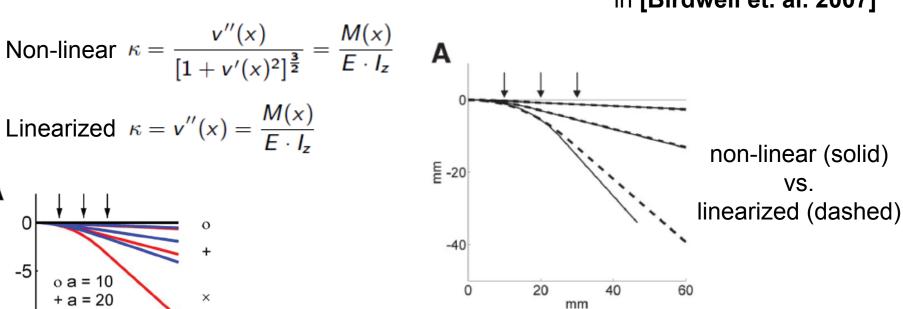


just for illustration, model is too complex to investigate control algorithm, no focus

13/11/2016 Slide 42



#### Analyzing the bending behavior of natural vibrissae using beams in [Birdwell et. al. 2007]



 $\oplus$  suitable to analyze the bending behavior

- $\odot$  Linearized model: only valid for small deflections
- $\oplus$  Consideration of the conical shape of the vibrissa
- $\odot$  Neglecting the support's compliance
- $\oplus$  Finding: Shape of the beam influences the bending behavior  $\hookrightarrow$  not negligible

Slide 43 13/11/2016

0

Α

шШ

o a = 10

× a = 30

cylindrical (blue)

VS.

conical (red)

50

mm



Determination of various vibrissa parameters using the bending behavior in [Birdwell et. al. 2007]

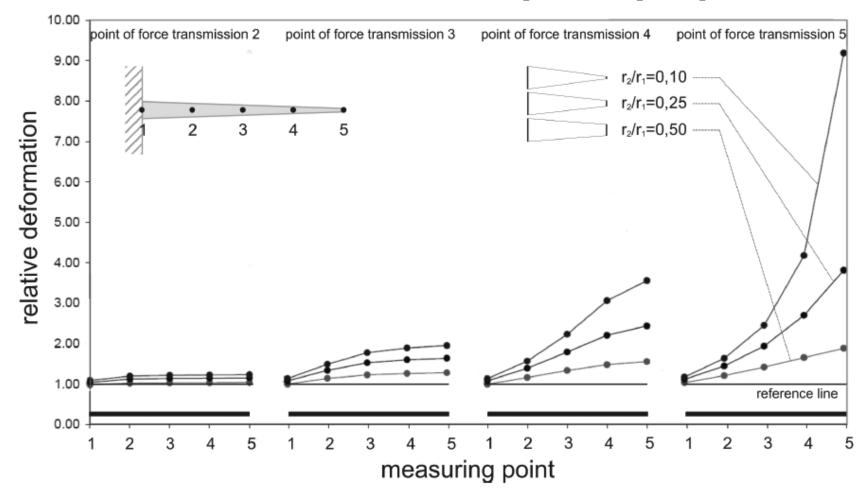
heuristically determined parameters of various vibrissae:

- simulated bending behavior of beams
- photos of deformed vibrissa
- varying Young's modulus if graphs do not match

Vibrissa	Arc length in mm	Base diameter in $\mu {\rm m}$	<b>E</b> modulus in $GPa$
$\beta$	66.2	225	1.40
$\gamma$	60.3	199	3.75
A1	51.7	160	2.75
E2	48.1	232	1.90
B2	41.1	169	2.30
E3	33.3	189	3.90
C3	21.5	119	6.25



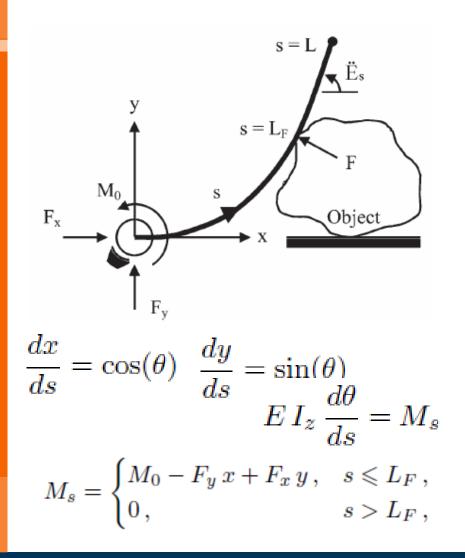
### Investigating the influence of the vibrissa's shape to the bending behavior in [Carl 2009] and [Carl et. al. 2012a]

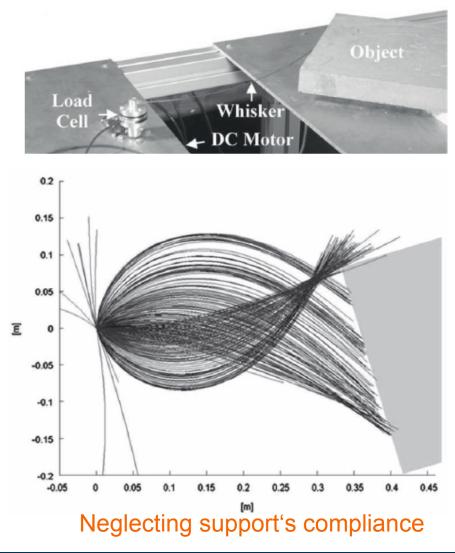


13/11/2016 Slide 45



#### Model for active sensing in [Scholz, Rahn 2004]



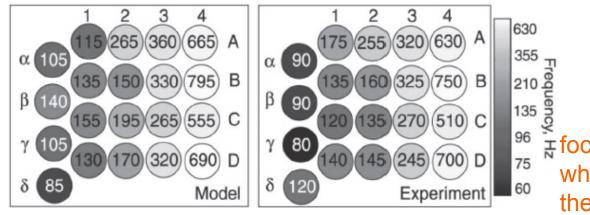


13/11/2016 Slide 46



### Model to determine the influence of the support on the eigenfrequencies in [Neimark et. al. 2003] and [Andermann et. al. 2004]

- infra-red measurements of the first eigenfrequency (EF) of various natural vibrissae
- → connection between first EF and length of vibrissa (length increase, EF decrease)
- → hence systematical arrangement topologically distributed sensitivity in the vibrissa array
- mechanical model of a thin, conical beam and present dynamical investigations (massive influence of the support on the EF  $\rightarrow$  obvious)

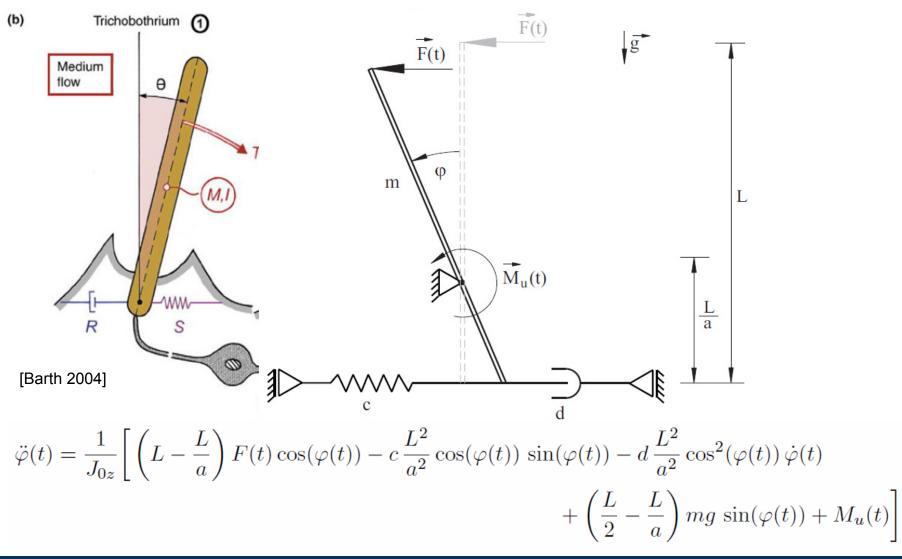


- but: determination only of the first EF of the vibrissae

focus on supports which do not match the real objects sufficiently

13/11/2016 Slide 47

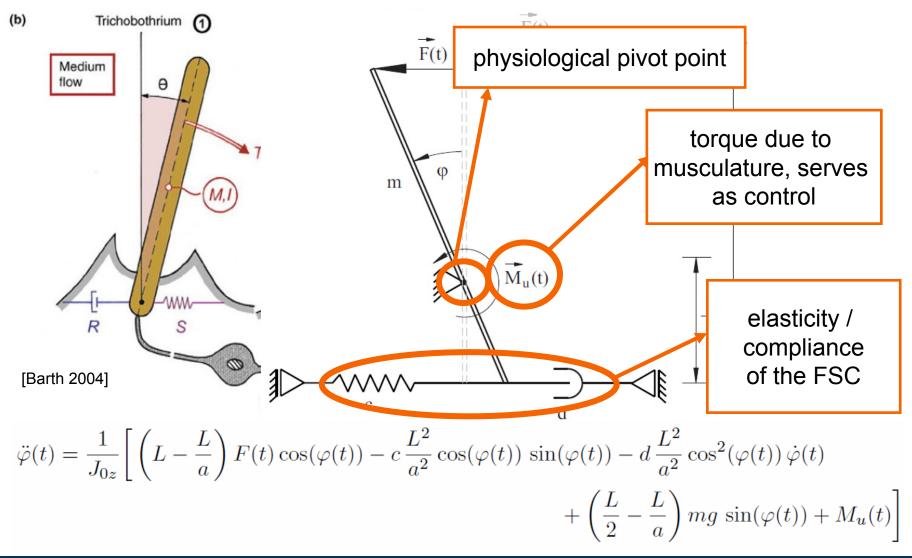
#### Single vibrissa system with DoF=1



لين TECHNISCHE UNIVERSITÄT ILMENAU

13/11/2016 Slide 48

#### Single vibrissa system with DoF=1





13/11/2016 Slide 48

### Goal:

Control the vibrissa system in a chosen mode of operation: passive or active

### Problem:

- many open-loop and closed-loop controls are based on exactly known parameters

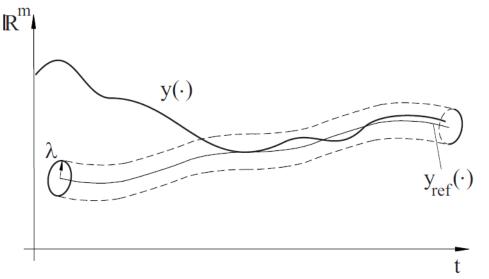
- here: suppose uncertain system (due to biological complexity)
  - unknown system parameters
  - only structural properties known

What to do if the system is not known precisely?

### Solution:

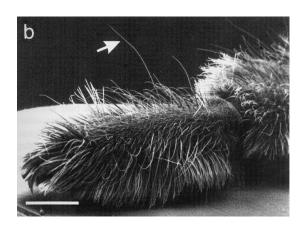
Design an adaptive controller, which learns from the behavior of the system, so automatically adjusts its parameters and achieves

 $\lambda$ -tracking

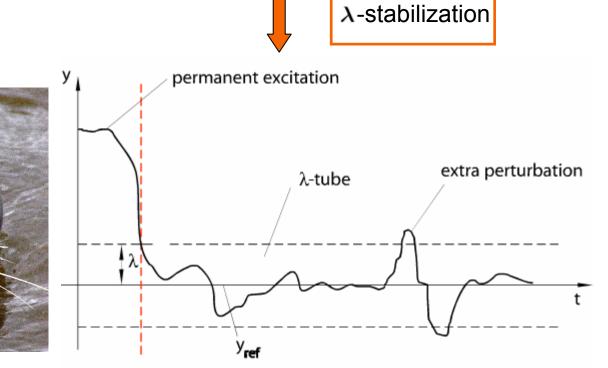




### **Passive Mode**



- stabilize the system under permanent excitation
- while enabling to detect external extra-perturbations (e.g. sensory contact, detect wake of swimming fish)



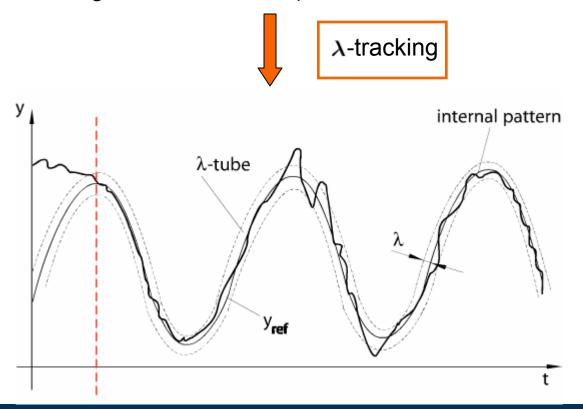


### **Active Mode**





- track an internally generated oscillatory motion pattern
- enable the system to recognize external disturbances of this pattern (caused, e.g., by wind or surface contact scanning of surface texture)





#### Simulations

<u>vibrissa:</u>  $m = 0.000\,003\,\text{kg}, c = 5.7\,\frac{\text{N}}{\text{m}}, d = 0.2\,\frac{\text{Ns}}{\text{m}}, L = 0.04\,\text{m}, a = \frac{L}{10} = 0.004\,\text{m}$ 

environment:  $t \mapsto F(t) = 0.1 \cos(t) + 2 e^{-(t-20)^2} N$ (small permanent oscillation with a gust of wind)

modes of operation: passive mode

13/11/2016

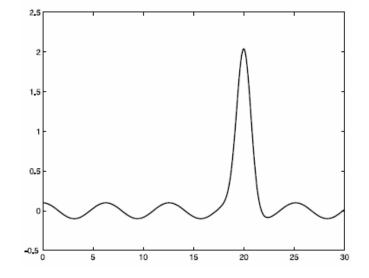
 $t \mapsto \varphi_{\text{ref0}}(t) = 0 \text{ rad}$ 

active mode 1 – exploratory whisking

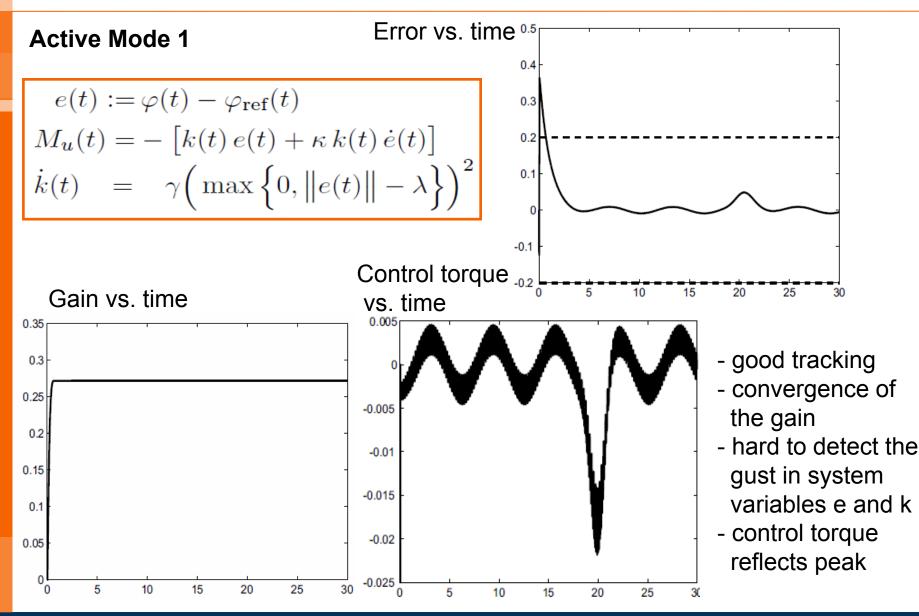
 $t \mapsto \varphi_{\text{ref1}}(t) = 0.8 \sin(2\pi 5 t) \text{ rad}$ 

active mode 2 – foveal whisking

 $t \mapsto \varphi_{\text{ref2}}(t) = 0.2 \sin(2\pi 25 t) \text{ rad}$ 





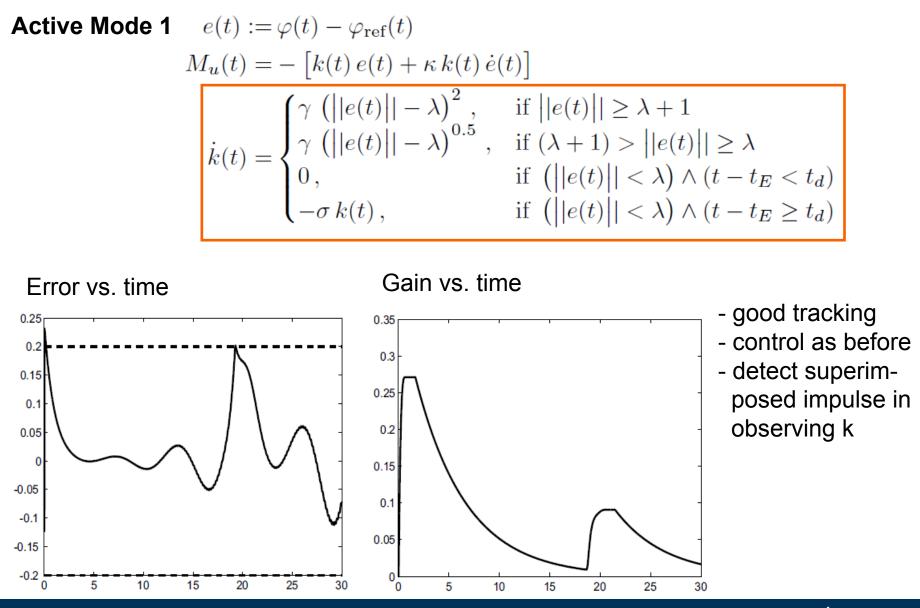


13/11/2016 Slic

Slide 53

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"





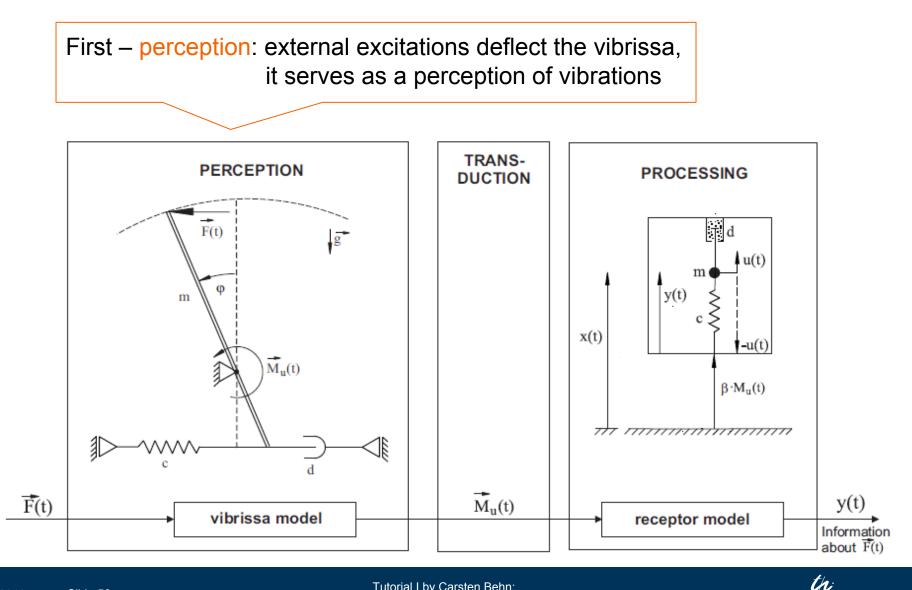
13/11/2016 Slide 54



Short summary:

- adaptive control is promising in application to vibrissa systems
- it allows for both modes of operation (passive or active)
- not easy to detect solitary excitations
- somestimes observe e, k or control input
- some identification techniques to uniformly observe one observable
   → which one?
- Stage 2: seperate extra receptor from vibrissa system, as in paradigm



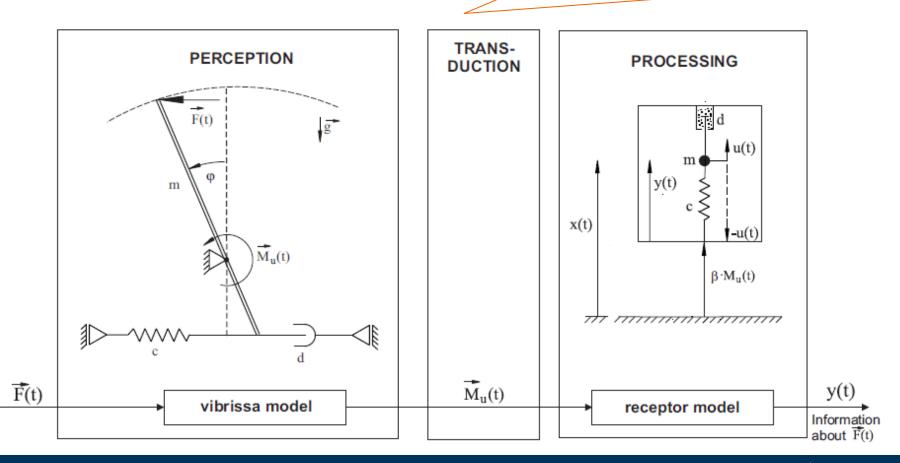


13/11/2016 Slide 56

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"

TECHNISCHE UNIVERSITÄT

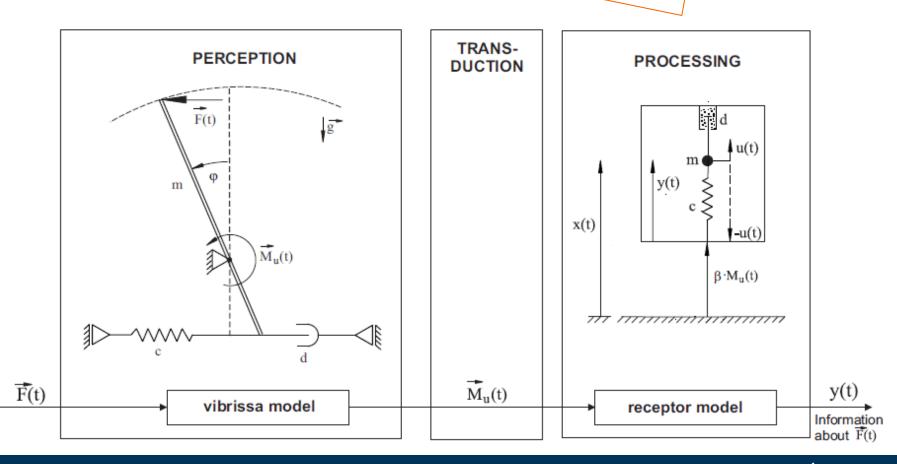
Second - transduction: control the blood supply to achieve passive/active mode, information about the needed supply transmitted to receptor cells



13/11/2016 Slide 56

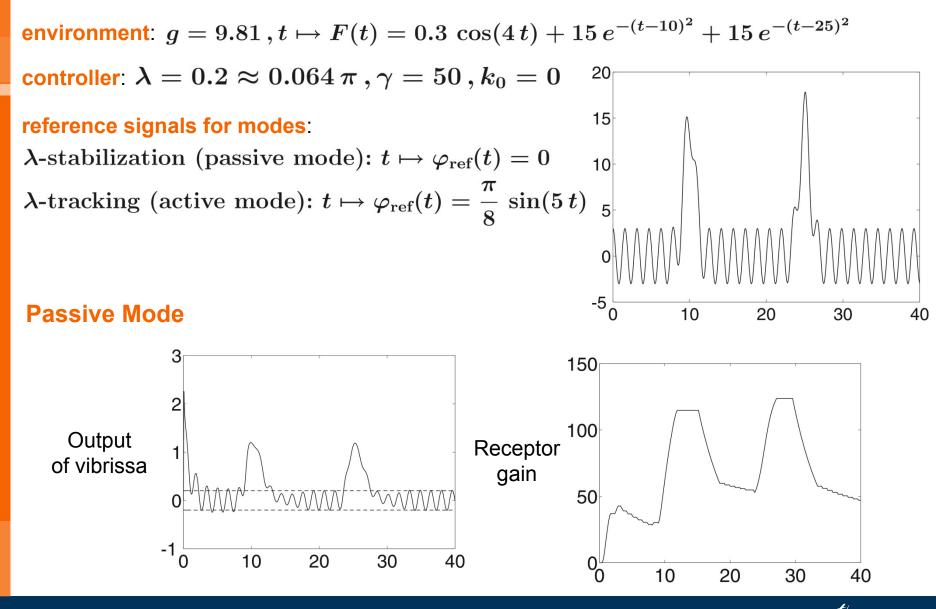
Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features" technische Universität Ilmenau

Third – processing: information analyzed in a receptor cell in such a way to identify some important information about the excitation



13/11/2016 Slid<u>e 56</u>

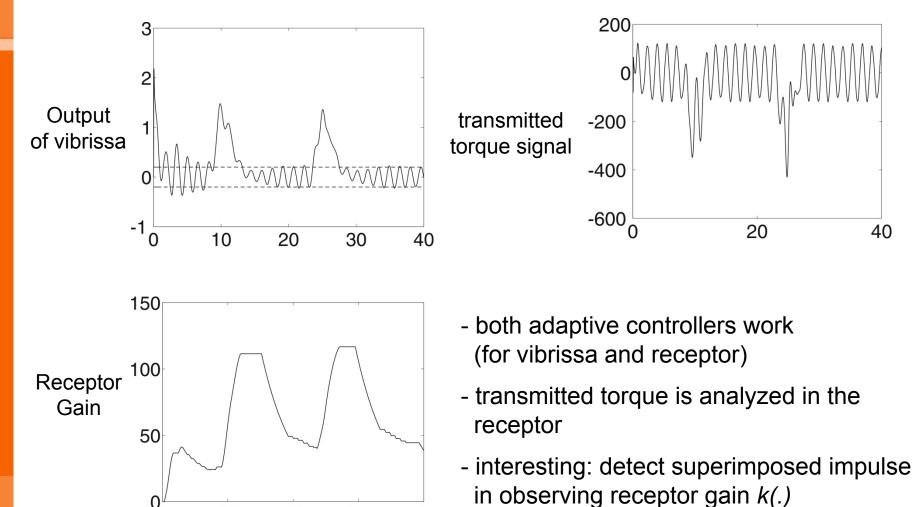




13/11/2016 Slide 57

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features" technische Universität ILMENAU

### **Active Mode**



0

10

20

30

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"

40

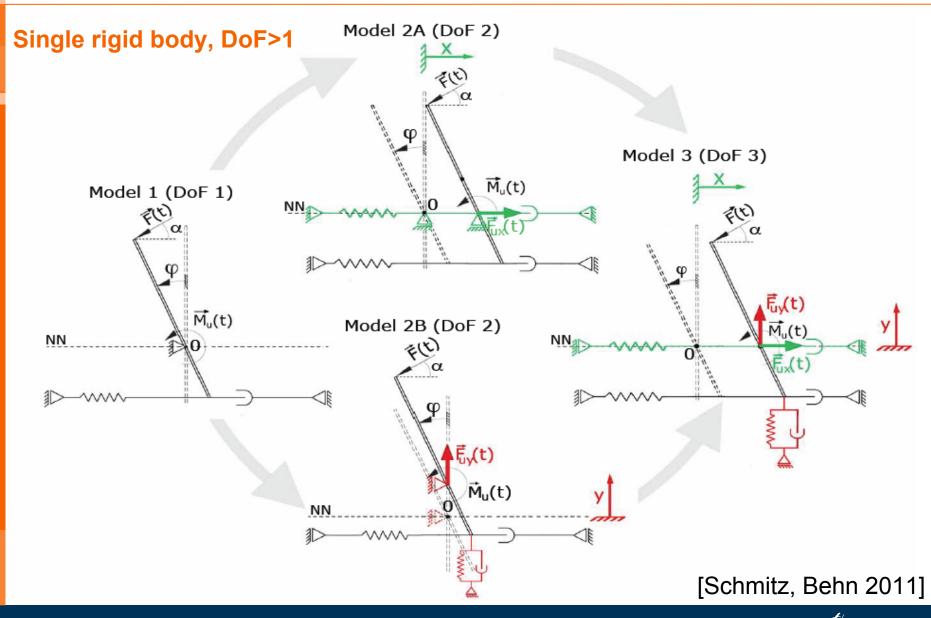


Short summary:

- numerical simulations have shown that this system exhibit also sensibility and adaptivity
- the vibrissa system reacts well to numerous forces
- disturbing forces can clearly be recognized in observing the course of the control torque → suitable observable as input to receptor model
- the receptor model rapidly suppresses the persisting stimuli and shows good reactions to sudden deflections
- main outcome: the "output" of the receptor y, k or u is simultanously immanent in the control torque!
  - $\rightarrow$  further investigations will focus on the perception model
- Drawback: perception of horizontal forces only
- New goal: models for identification of disturbing forces with a larger range of angles of attack

13/11/2016 Slide 59

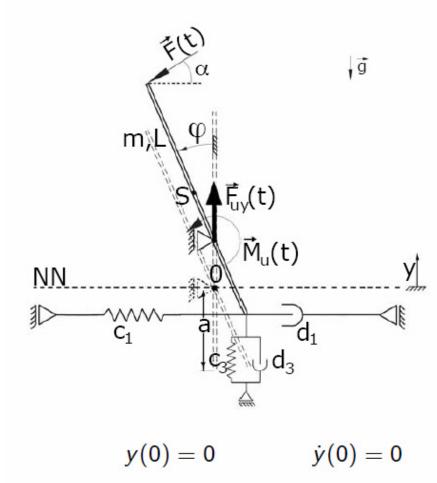






13/11/2016 Slide 60

Equations of motion for Model 2B

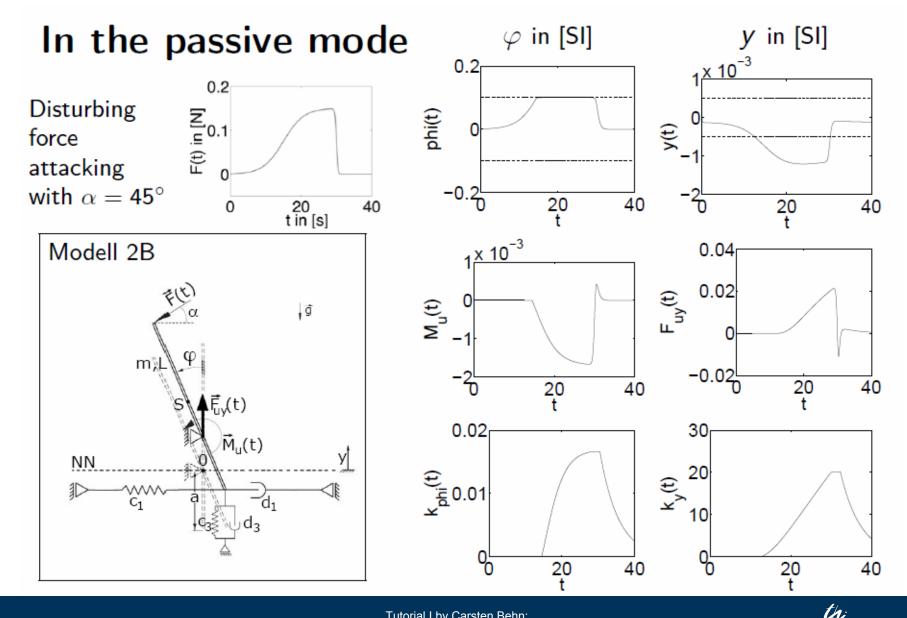


$$\ddot{y}(t) = \frac{1}{m} \left[ m \left( \frac{L}{2} - a \right) \left[ \ddot{\varphi}(t) \sin(\varphi(t)) + \dot{\varphi}(t)^2 \cos(\varphi(t)) \right] - d_3 \dot{y}(t) - c_3 y(t) - mg - F(t) \sin(\alpha) + F_{uy}(t) \right]$$

$$\begin{split} \ddot{\varphi}(t) &= \frac{1}{J_{0z}} \left[ m \left( \frac{L}{2} - a \right) \left[ \ddot{y}(t) \sin(\varphi(t)) \right. \\ &+ g \sin(\varphi(t)) \right] - d_1 a^2 \cos^2(\varphi(t)) \dot{\varphi}(t) \\ &- c_1 a^2 \sin(\varphi(t)) \cos(\varphi(t)) \\ &+ (L - a) F(t) \cos(\varphi(t) - \alpha) + M_u(t) \right] \\ \left. \varphi(0) &= 0 \qquad \dot{\varphi}(0) = 0 \end{split}$$



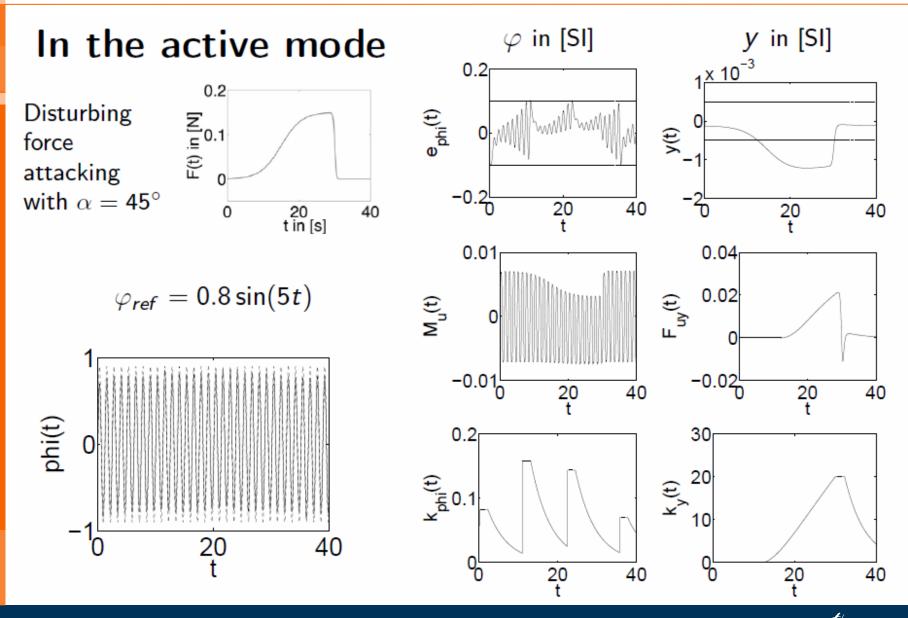
13/11/2016 Slide 61



13/11/2016 Slide 62

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"

TECHNISCHE UNIVERSITÄT



13/11/2016 Slide 63

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features" TECHNISCHE UNIVERSITÄT

Goal: identification of disturbing forces attacking with any angle

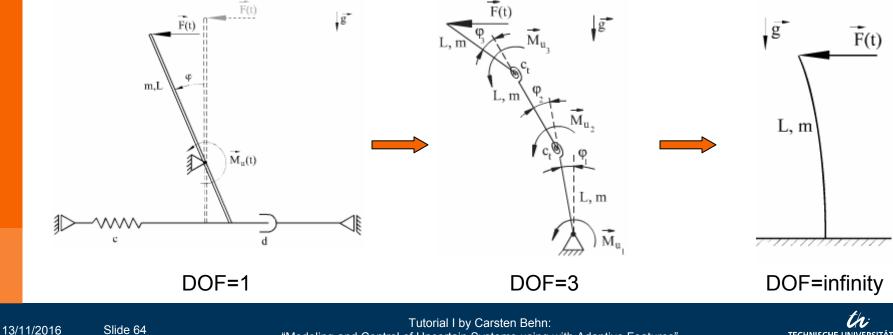
Results: with model 2B disturbance forces can be identified in the passive and active mode for angles of attack reaching from  $\alpha = 0^{\circ}$  tc  $90^{\circ}$ 

 $\rightarrow$  increase elasticity, possible in 2 ways:

a) rigid multi-body system models - Stage 4

b) elastic beam models:

investigation of mechanical models with infinte DoF – Stage 5



"Modeling and Control of Uncertain Systems using with Adaptive Features"

ILMENAU

### *Remind:* Vibrissa is elastical, hollow and conically shaped

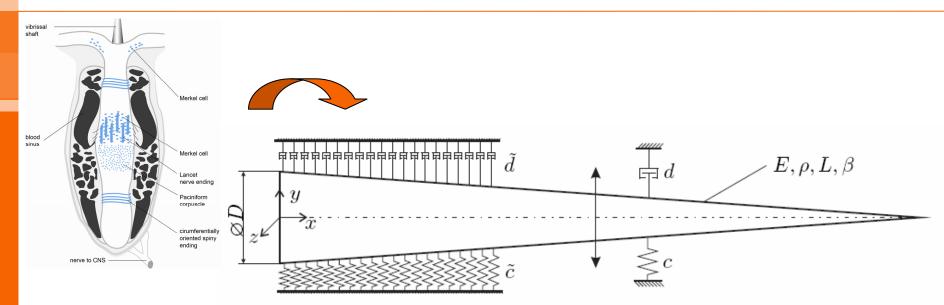
### Function hypotheses in literature:

- The elasticity and the conical shape of the hair are relevant for the functionality of the vibrissa.
- The viscoelastic properties of the support (FSC) are controlled by the blood pressure in the blood sinus.
- The vibrissae are excited with or close to their resonance frequencies during the active mode.

#### Global goal:

- computation of EFs for dimensioning and / or parameter identification (e.g., external forces)
- maybe observing shift of the spectrum of EFs (due to controllable FSC)





### Intermediate goals:

- investigating innovative models of a flexible vibrissa with a viscoelastic support (discrete or continuously distributed)
- analytical computation of EFs of beams depending on material and geometry
- numerical verification using FEM / MBS
- drawing conclusion to complex systems



Example: PDE:  $\ddot{v}(x,t) + k^4 v'''(x,t) = 0$ , with  $k^4 := \frac{E I_z}{2}$ , ρ,Α,I<sub>z</sub>,E,L **BC**: (1):  $v(0,t) = 0 \ \forall t \ge 0$ × 🛉 (2):  $v'(0,t) = 0 \ \forall t \ge 0$  $(3): v''(L,t) = 0 \ \forall t \ge 0$ (4):  $v'''(L,t) E I_z - c v(L,t) = 0 \ \forall t \ge 0$ EVE:  $\lambda^3 L^3 (1 + \cosh(\lambda L) \cos(\lambda L))$  $+ \gamma_c \left( \cosh(\lambda L) \sin(\lambda L) - \cos(\lambda L) \sinh(\lambda L) \right) = 0$ with  $\gamma_c := \frac{c}{c_S} = \frac{c}{\frac{E I_z}{I^3}} = \frac{c L^3}{E I_z}$ Results: steel beam B2 vibrissa jfi  $\lambda_i$ fi  $\omega_i$  $\omega_i$ 1 2.010653.008 103.929843.189 62.369 $\gamma_c = 1$ 2 $4.704 \pm$ 3576.197569.1694617.724 341.5663 7.8579977.433 1587.95812883.248 952.955 $10.996 \pm$ 4 19544.1813110.55325236.2031866.685

5

14.138

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"

32305.127

5141.521

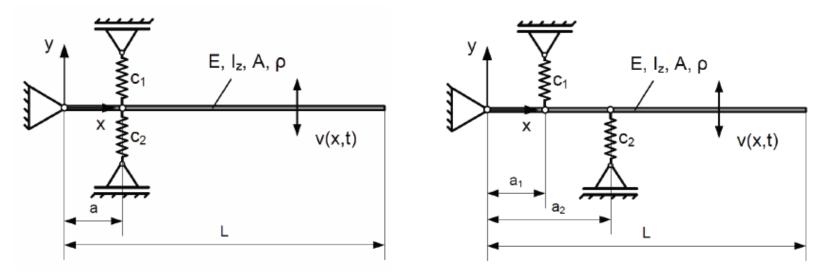
41713.630

3085.496

ILMENAU

th;

### First steps: conservative systems



Modeling: - one and two levels of support compliance: FSC and skin

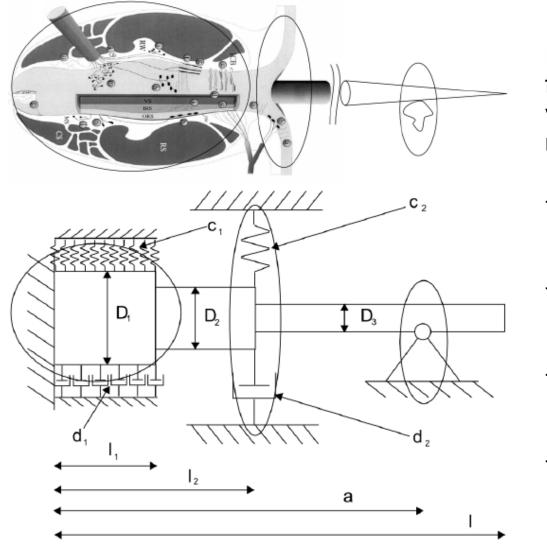
Drawback: - pivot does not match reality

- no damping is considered

Findings (obvious as in literature):

- massive influence of the support on the eigenfrequencies
- massive influence of the conical and hollow shape





Investigating the influence of fundamental properties of the vibrissa from biology to the natural frequencies:

- conical shape /

various cross-sections

- viscoelastic foundation

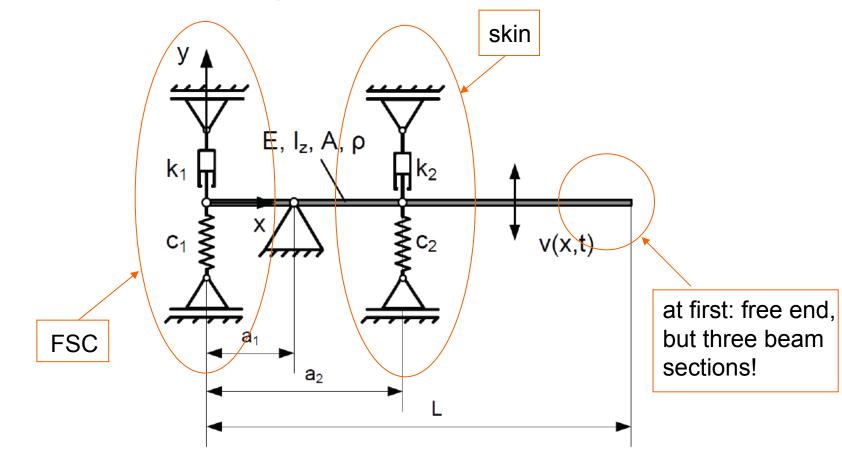
due to FSC

- discrete viscoelastic support due to skin

- bearing due to (sudden) object contact

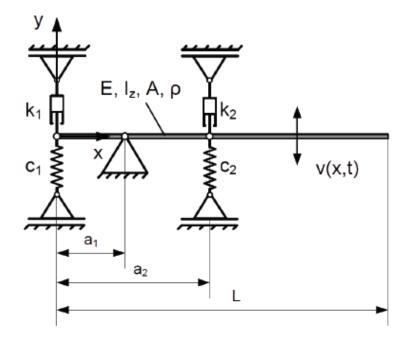


### Next steps: non-conservative systems



12 boundary condition  $\implies$  MVR  $\implies$  EVE (analytically) $\implies$  EV & NF (numerically)





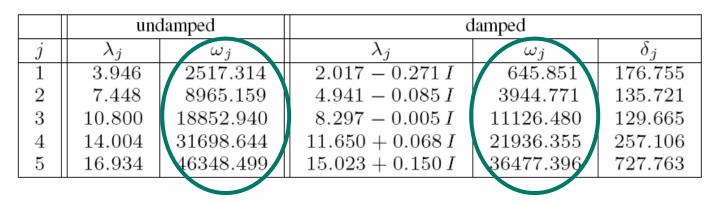
Parameters of B2-vibrissa in [Neimark et. al. 2003]

$$\begin{array}{l} a_1 = 3 \ \mathrm{mm} \,, a_2 = 4 \ \mathrm{mm} \\ r = 0.1 \ \mathrm{mm} \,, \ \mathrm{and} \ L = 40 \ \mathrm{mm} \\ c_1 = c_{\mathrm{FSC}} = 80 \ \frac{\mathrm{N}}{\mathrm{m}} \,, k_1 = d_{\mathrm{FSC}} = 0.5 \ \frac{\mathrm{Ns}}{\mathrm{m}} \\ c_2 = c_{\mathrm{skin}} = 5.7 \ \frac{\mathrm{N}}{\mathrm{m}} \,, \ \mathrm{and} \ k_2 = d_{\mathrm{skin}} = 0.2 \ \frac{\mathrm{Ns}}{\mathrm{m}} \\ E = 2.3 \ \mathrm{GPa} \ \mathrm{and} \ \varrho = 238.732 \ \frac{\mathrm{kg}}{\mathrm{m}^3} \end{array}$$

Tutorial I by Carsten Behn:



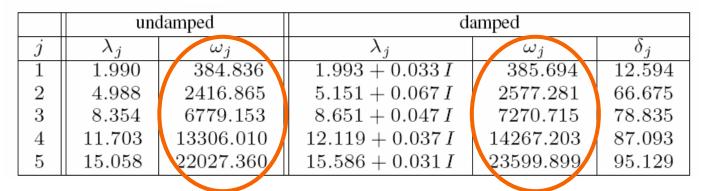
TABLE CALCULATION FOR THE STEEL BEAM.



as expected

TABLE

CALCULATION FOR THE B2 VIBRISSA.



unlike behavior:

increasing natural frequencies if damped





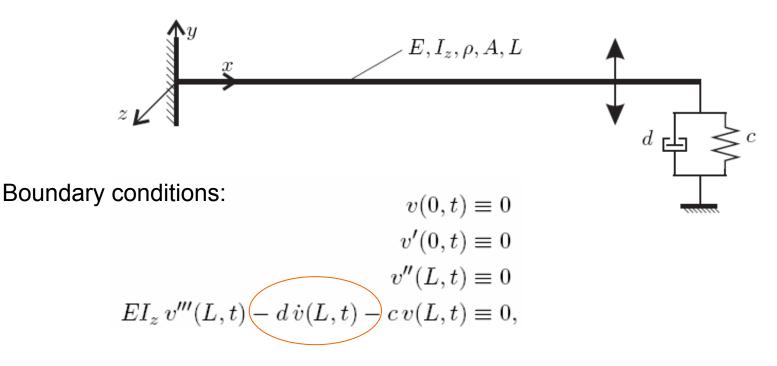
Short summary:

- $\odot$  Neglecting the conical shape of the vibrissa
- $\oplus$  Consideration of the support's compliance
  - $\cdot$  at skin level
  - $\cdot$  at the level of the FSC
- $\oplus$  Finding: massive influence of the support on the natural frequencies
- $\oplus$  Finding: influence of damping elements in the support
  - $\hookrightarrow$  massive for the 1<sup>st</sup> natural frequency
  - $\hookrightarrow$  but: unlike behavior of the natural frequencies

Analyze simple systems to understand effects of boundary damping ...



Simplification: model to analyze discrete damping effects boundary viscoelastic end-support



4-th boundary condition in form of a differential equation!
→ manipulation of this equation



$$-E^{2}I_{z}^{2}\left(\mathbf{X}'''(L)\right)^{2} + 2EI_{z}c\mathbf{X}(L)\mathbf{X}'''(L) - c^{2}\mathbf{X}^{2}(L) - d^{2}\underline{\lambda}^{4}k^{4}\left(\mathbf{X}(L)\right)^{2} = 0$$

 $E^{2}I_{z}^{2} \left( \mathbf{X}''' \left( L \right) \right)^{2} - 2EI_{z}c \,\mathbf{X}(L) \,\mathbf{X}'''(L) + c^{2} \,\mathbf{X}^{2}(L) = \left[ EI_{z} \,\mathbf{X}''' \left( L \right) - c \,\mathbf{X}\left( L \right) \right]^{2}$  $\Rightarrow \qquad \left[ EI_{z} \,\mathbf{X}''' \left( L \right) - c \,\mathbf{X}\left( L \right) \right]^{2} = -d^{2}\underline{\lambda}^{4}k^{4} \,\left( \mathbf{X}\left( L \right) \right)^{2}$ 

final form of 4th equation:  $EI_z X'''(L) - c X(L) = \pm i d \underline{\lambda}^2 k^2 X(L)$ matrix of the matrix-vector-representation:

$$\mathbf{A}(\underline{\lambda}) = \begin{pmatrix} 1 & 0 & 1 & 0 \\ 0 & \underline{\lambda} & 0 & \underline{\lambda} \\ \overline{EI_z \sin(\underline{\lambda}L)\underline{\lambda}^2} & -\overline{EI_z \cos(\underline{\lambda}L)\underline{\lambda}^2} & \overline{EI_z \sinh(\underline{\lambda}L)\underline{\lambda}^2} & \overline{EI_z \cosh(\underline{\lambda}L)\underline{\lambda}^2} \\ \pm \mathrm{i}\,d\underline{\lambda}^2 k^2 \cos(\lambda L) & \pm \mathrm{i}\,d\underline{\lambda}^2 k^2 \sin(\lambda L) & \pm \mathrm{i}\,d\underline{\lambda}^2 k^2 \cosh(\lambda L) & \pm \mathrm{i}\,d\underline{\lambda}^2 k^2 \sinh(\lambda L) \\ -c\cos(\underline{\lambda}L) & -c\sin(\underline{\lambda}L) & -c\sin(\underline{\lambda}L) & -c\sin(\underline{\lambda}L) \\ -\cos(\underline{\lambda}L)\underline{\lambda}^2 & -\sin(\underline{\lambda}L)\underline{\lambda}^2 & \cosh(\underline{\lambda}L)\underline{\lambda}^2 & \sinh(\underline{\lambda}L)\underline{\lambda}^2 \end{pmatrix}$$



Equation to determine the eigenvalues:

$$\det (\mathbf{A} (\underline{\lambda})) = -EI_{z}\underline{\lambda}^{3} - EI_{z}\cos(\underline{\lambda}L)\cosh(\underline{\lambda}L)\underline{\lambda}^{3}$$
  
$$\pm i dk^{2}\sin(\underline{\lambda}L)\cosh(\underline{\lambda}L)\underline{\lambda}^{2} - c\sin(\underline{\lambda}L)\cosh(\underline{\lambda}L)$$
  
$$\mp i dk^{2}\cos(\underline{\lambda}L)\sinh(\underline{\lambda}L)\underline{\lambda}^{2} + c\cos(\underline{\lambda}L)\sinh(\underline{\lambda}L) = 0$$

First test: equation exhibits known eigenvalue-equations of the following systems

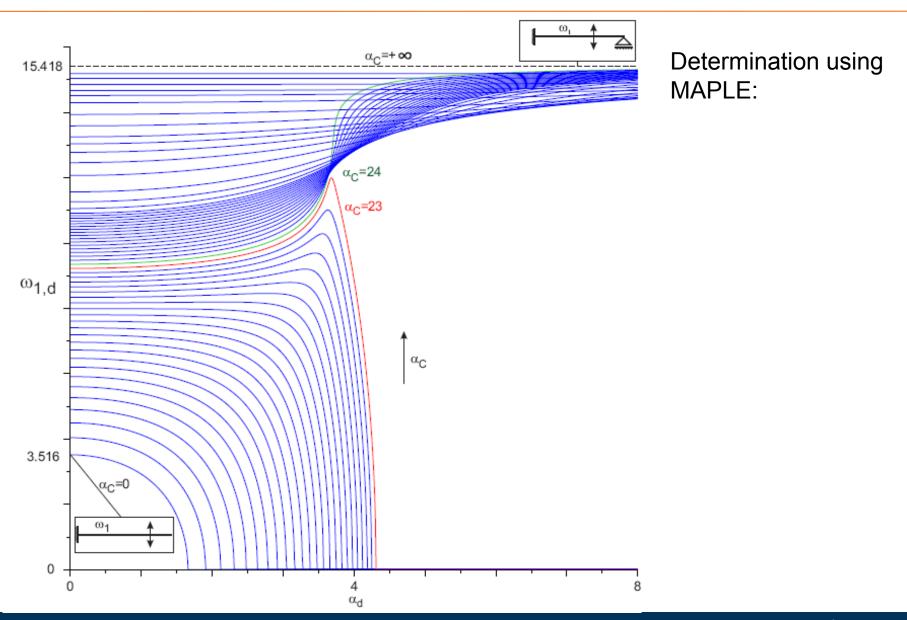
$$z \xrightarrow{y} E, I_z, \rho, A, L \xrightarrow{y} Z \xrightarrow{y} E, I_z, \rho, A, L \xrightarrow{y} Z \xrightarrow{y} Z \xrightarrow{E} Z \xrightarrow{E}$$

Introduction of dimensionless parameters:

$$\begin{split} \alpha_c &:= \frac{c}{\frac{EI_z}{L^3}} \\ \alpha_d &:= \frac{L \, d}{\sqrt{\rho \, A \, E \, I_z}}, \end{split}$$

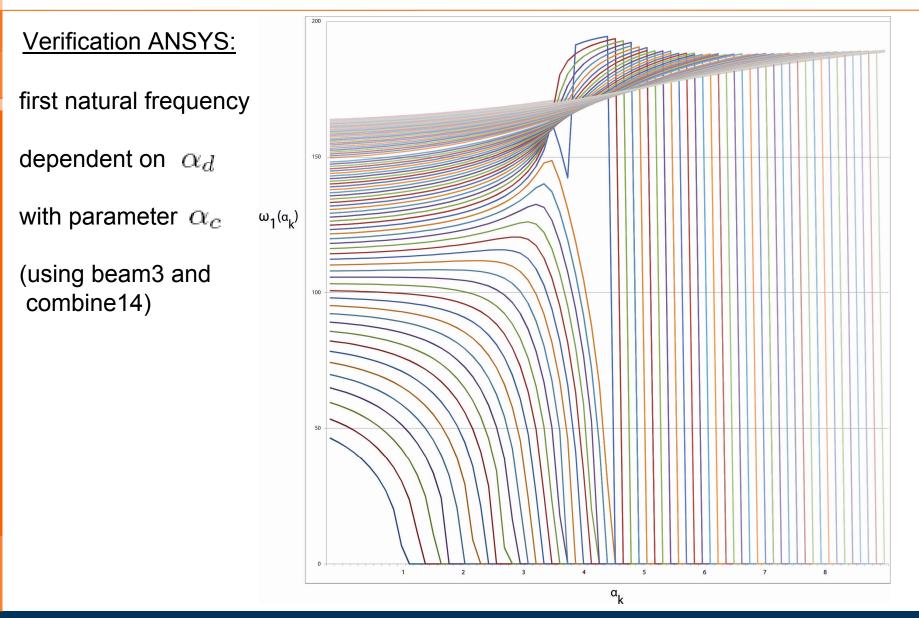


"Modeling and Control of Uncertain Systems using with Adaptive Features"



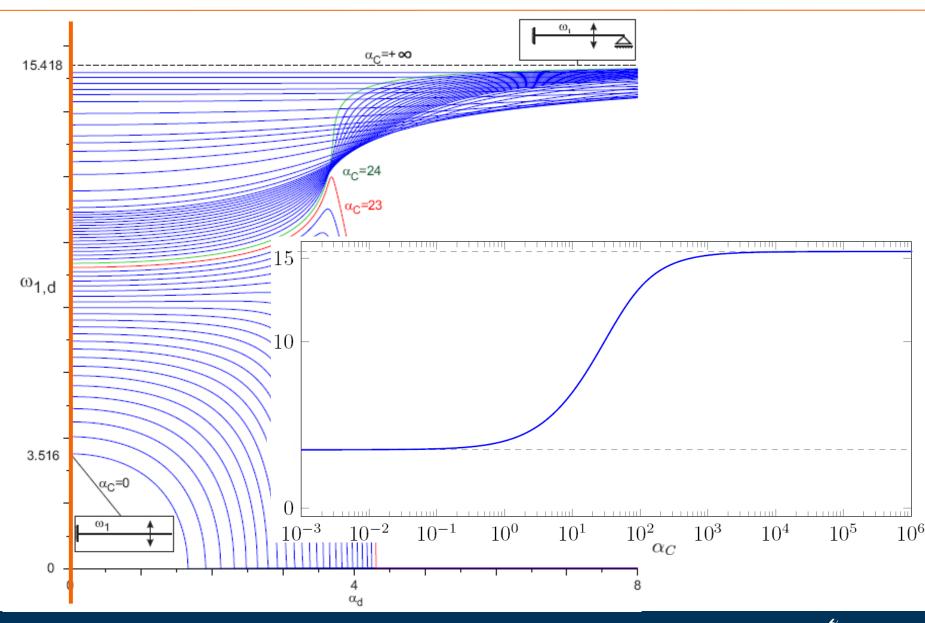
13/11/2016 Slide 77





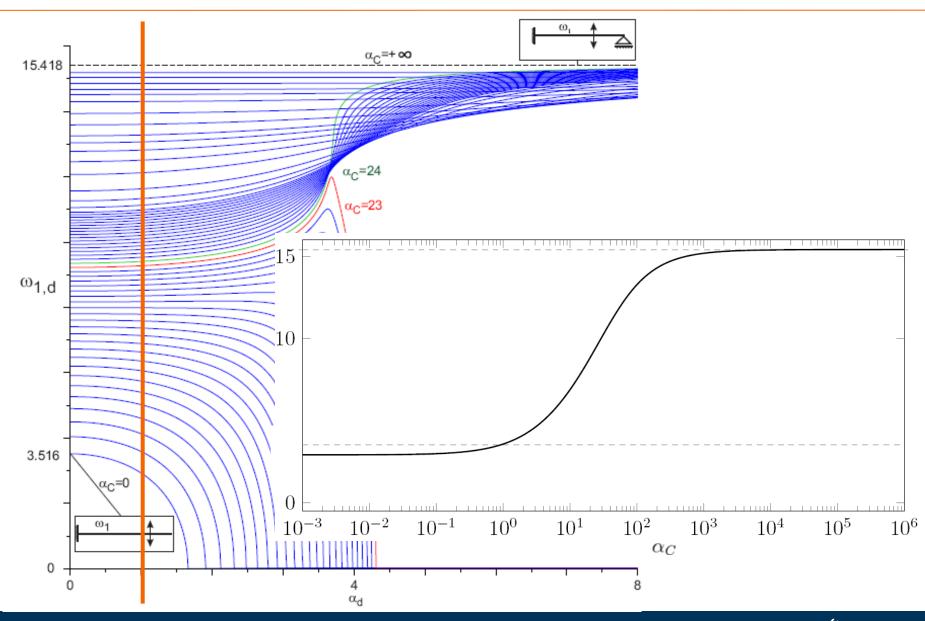
13/11/2016 Slide 78





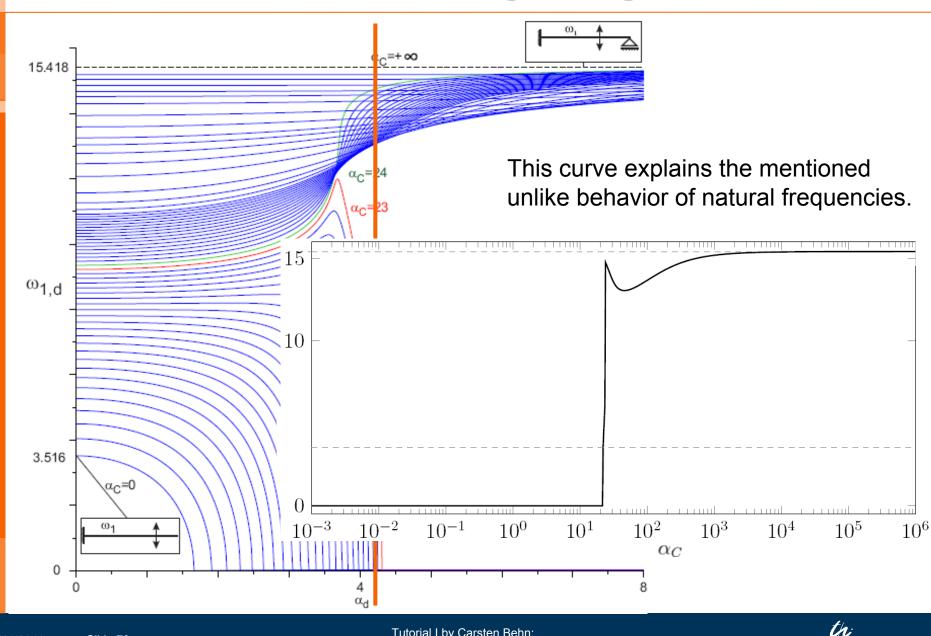
13/11/2016 Slide 79

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features" technische Universität Ilmenau



13/11/2016 Slide 79





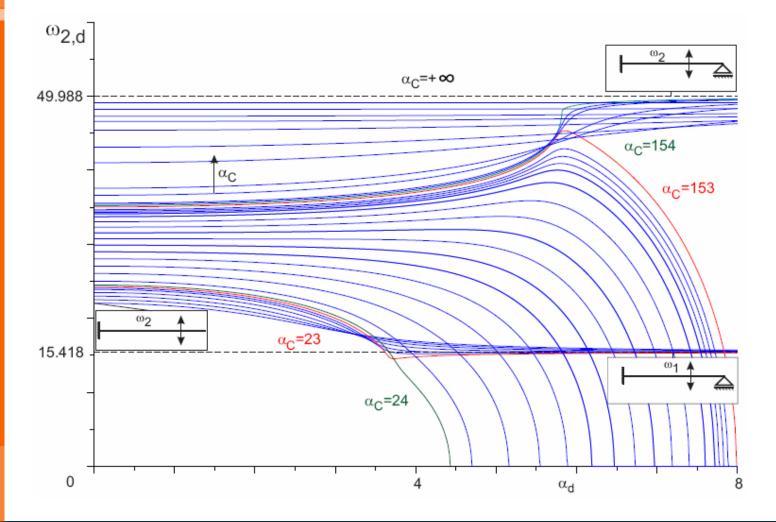
13/11/2016 Slide 79

Tutorial I by Carsten Behn: "Modeling and Control of Uncertain Systems using with Adaptive Features"

TECHNISCHE UNIVERSITÄT

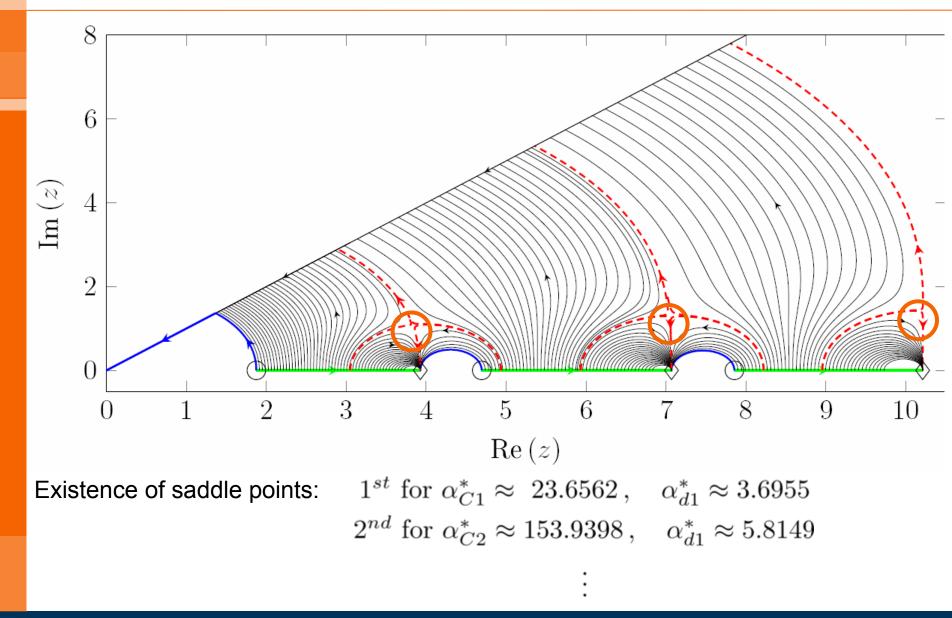
**ILMENAU** 

More complex and unlike behavior in observing the second (or other higher) natural frequencies:





Part II: Vibrissae – 5. Modeling – Stage 5a - EF





### Conclusion from this stage:

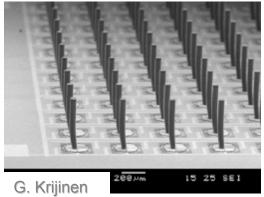
- analytical treatment of beam vibrations to determine the spectrum of natural frequencies
- complex models due to complex structure of biological sensor
- unlike behavior in first models
- analysis of a special example:
  - boundary discrete damping and spring elements
  - classical assertions not valid: increase c then natural frequency will increase
  - this may explain the unlike behavior
  - 0-eigenfrequency rigid-body motion, like strong damping, no oscillation
- still known, but not for beams
- idea: observe shift in spectrum of frequencies due to sudden obstacle contacts detect distance, not only contact / no contact



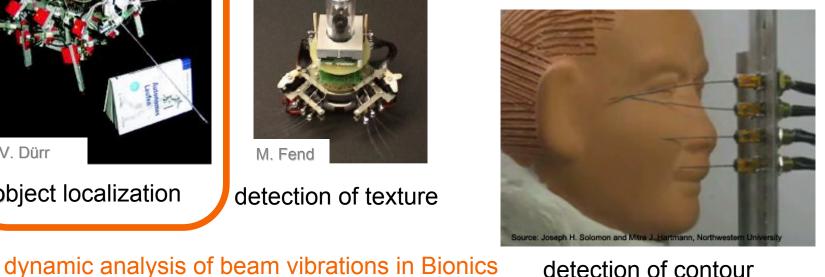
paradigms of tactile sensors for perception in applications:

- quality assurance (e.g., coordinate measuring machines)
- measurements of flow rates
- detection of packaged goods on conveyor belts

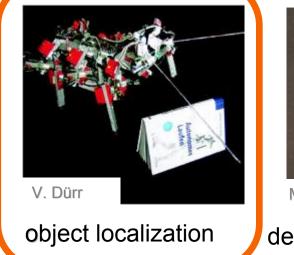
### Microsystem Technology



### detection of flow rates



### detection of contour



**Robotics** 



### detection of texture

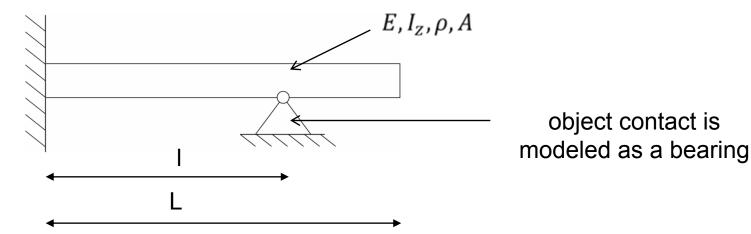
13/11/2016

Slide 83



## [Ueno et al. 1998]

model of the vibrissa



equation of motion: 
$$\ddot{v}(x,t) + k^4 v'''(x,t) = 0$$
, with  $k^4 := \frac{E I_z}{\rho A}$ 

boundary and transition conditions:

 $v_1(0,t) = 0$  •  $v'_1(l,t) = v'_2(l,t)$  $v''_1(0,t) = 0$  •  $v''_1(l,t) = v''_2(l,t)$ 

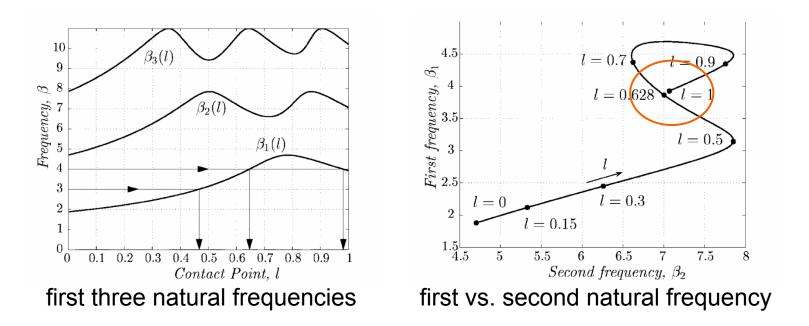
$$v_1''(0,t) = 0$$
 •  $v_1''(l,t) = v_2''(l,t) = 0$   
 $v_1(l,t) = 0$  •  $v_2''(L,t) = 0$ 

• 
$$v_1(l,t) = 0$$

$$v_1(l,t) = 0$$
 •  $v_2'''(L,t) = 0$ 



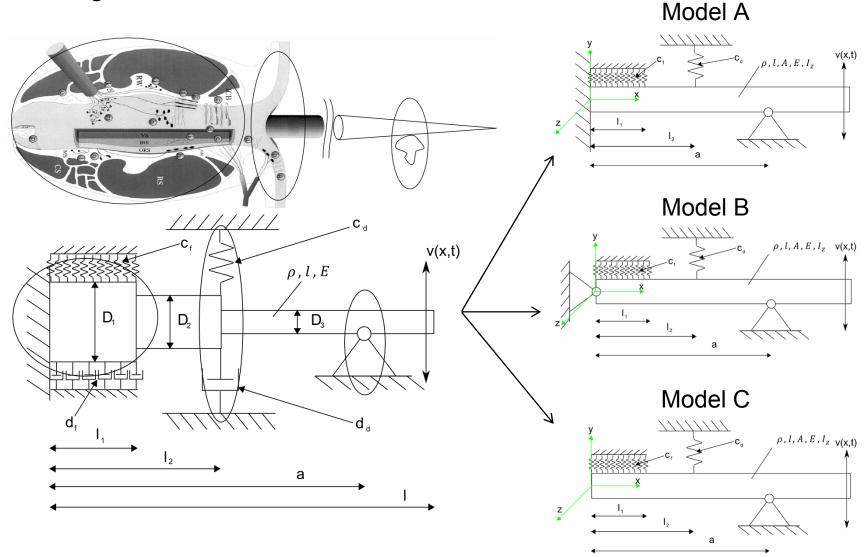
### [Ueno et al. 1998]



- determination of the contact point with the first natural frequency is not possible
- determination of the contact point with the first two natural frequencies is quite hard

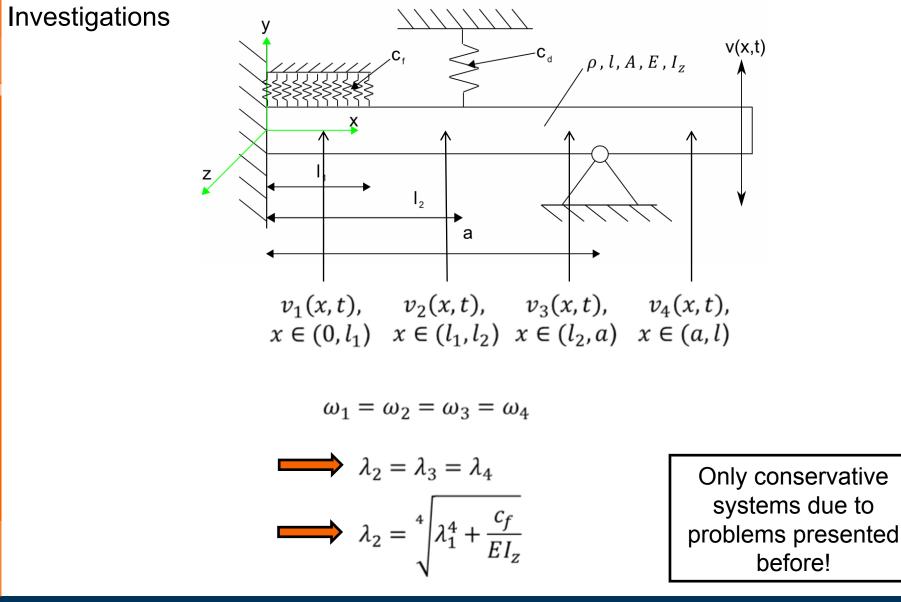


### Modeling



13/11/2016 Slide 86







### Conclusion from this stage:

- focus on dynamical analysis of vibrissa-like beams for obstacle distance detection
- development of several vibrissa-like beams which supports match better the real biological conditions
- idea: investigations of each eigenvalue spectrum
- development:
  - possibility to expand the eigenvalues curve with the discrete spring
  - determination of the contact point by means of two algorithms
- very first experiments show the effectiveness of the algorithms

### To be done:

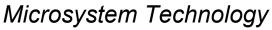
- investigation of models with different cross-sections, pre-curvature, non-conservative
- improve experiments

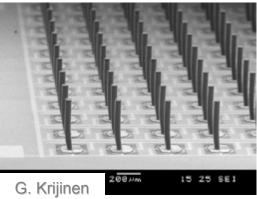


Paradigms of tactile sensors for perception in applications:

- quality assurance (e.g., coordinate measuring machines)
- measurements of flow rates
- detection of packaged goods on conveyor belts

### Robotics





### detection of flow rates



### detection of contour



V. Dürr

### object localization

# M. Fend

### detection of texture

# large deflection of beams in Bionics

13/11/2016 Slide 89

### State of art

 most works focus on numerics from the beginning [Scholz, Rahn 2004]  $\frac{dx}{ds} = \cos(\theta) \quad \frac{dy}{ds} = \sin(\theta) \quad E I_z \frac{d\theta}{ds} = M_s$  $s = L_{\rm E}$  $M_0$ 0.2 Object  $F_x$ 0.15 0.1 0.05  $M_{s} = \begin{cases} M_{0} - F_{y} x + F_{x} y, & s \leq L_{F}, \\ 0, & s > L_{F}, \end{cases}$ Ξ 0 -0.05 -0.1 -0.15 -0.2 -0.05 0.05 0.45 0.150.25 0.35 [m]

### object fits in the field of computed vibrissae

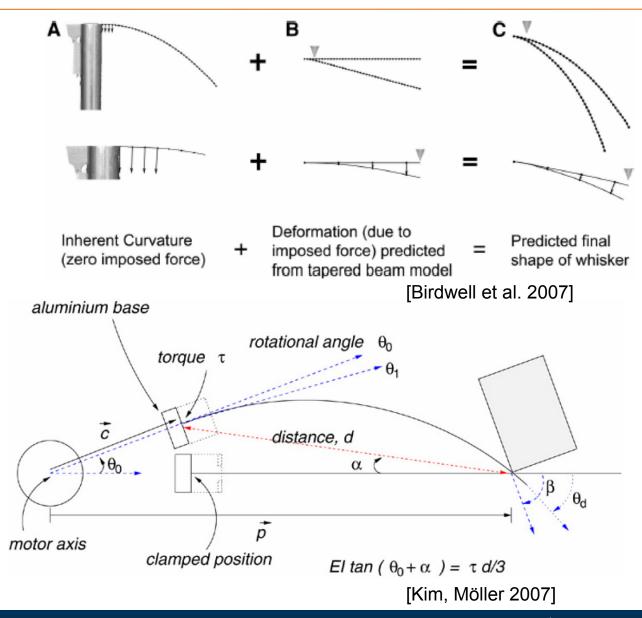
13/11/2016

Slide 90



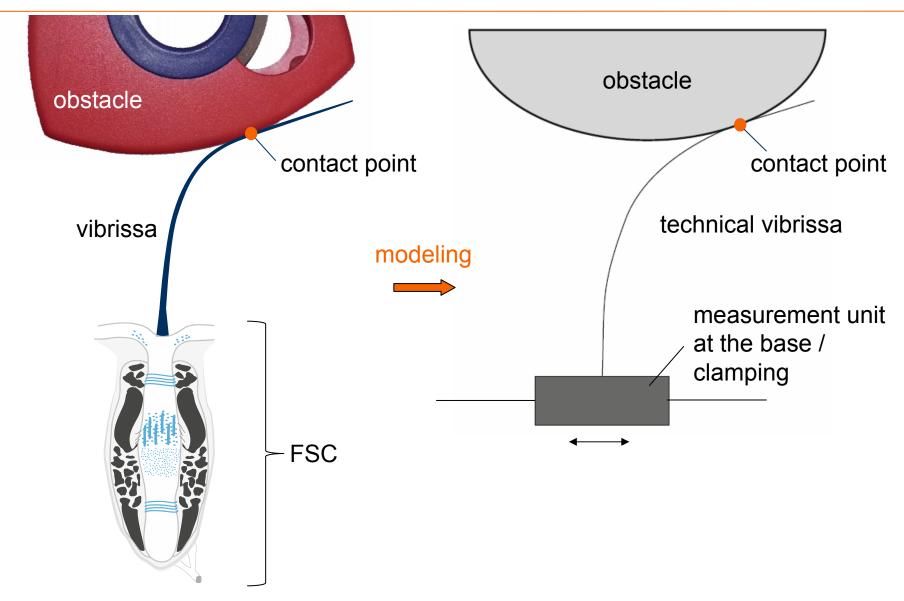
### State of art

- BVP-solvers are used [Hires et al. 2013]
- linear theory is used [Birdwell et al. 2007]
- rigid body systems are used as an approximation [Quist, Hartmann 2012]
- also finite differences [Pammer et al. 2013] and others are used [Kim, Möller 2007]
- no analytical treatment, skipping beam theories at early stages





ILMENAU





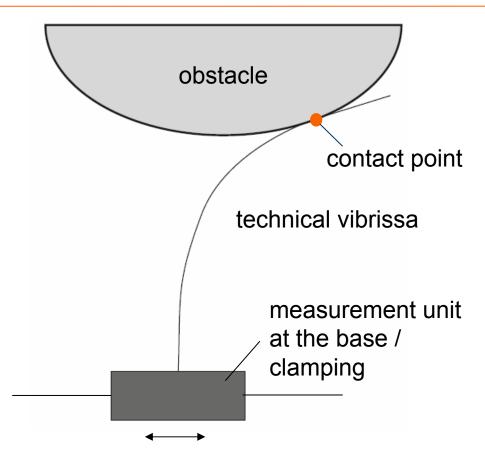
Assumptions on Contour:

smooth, strictly convex
ideal contact, i.e., contact force perpendicular to profile contour
no friction taken into account

Assumptions on Vibrissa:

straight beam (no pre-curvature)
constant 2<sup>nd</sup> moment of area
constant Young's modulus *E*Hooke's law of linear elasticity
ignoring shear stress
Euler-Bernoulli theory for large deflections

•support at base: clamping





### Conclusions from this stage:

-analytical treatment of large deflections of beams

-generation of observables possible for strictly convex surfaces

-sweep has to be divided into two phases

-new insights:

- decision criterion for actual phase, decreases computations
- contact point computation
- no approximation of the problem
- profile contour reconstruction possible with one sweep

-reconstruction with previously computed observables: error within 10<sup>-6</sup>

### To be done:

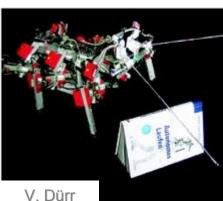
- verification by an experiment
- include pre-curvature, conicity of the beam

Presentation on Monday Session: Intelli 1



Paradigms of tactile sensors for perception in applications:

- quality assurance (e.g., coordinate measuring machines)
- measurements of flow rates
- detection of packaged goods on conveyor belts



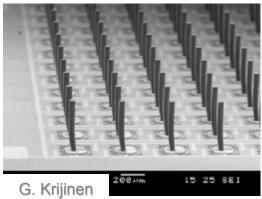
### object localization

### Robotics

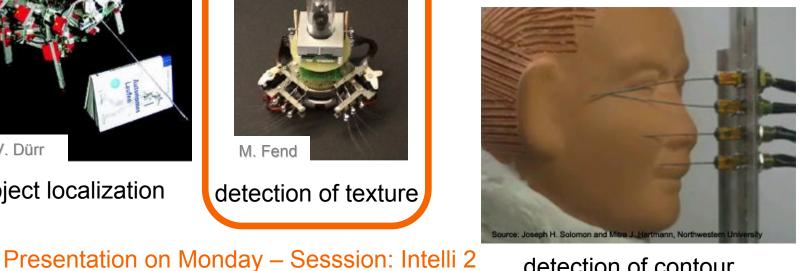


detection of texture

### Microsystem Technology



### detection of flow rates



### detection of contour



Slide 95 13/11/2016

# **Overall conclusions**

13/11/2016 Slide 96

