

Diffusion et ondes dans les milieux à gradient de propriétés 1D.
Construction de profils analytiquement solubles
avec leurs solutions associées.
Applications en CND thermique,
optique des couches minces, et micro-météorologie

Journée SFT, 20 juin 2019

Jean-Claude KRAPEZ

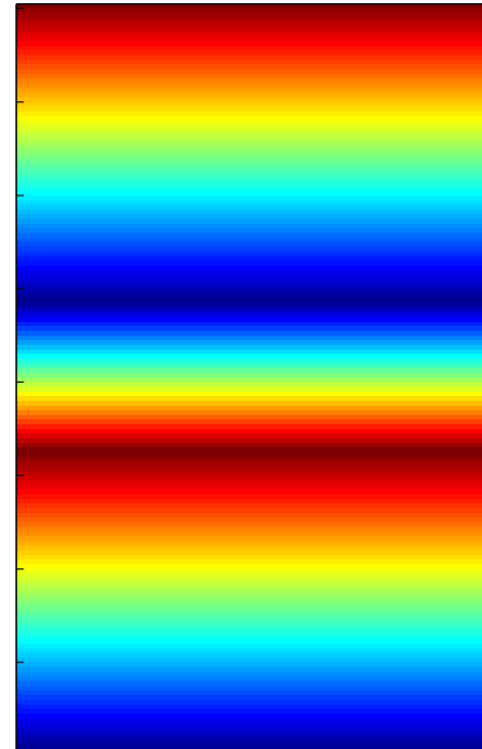
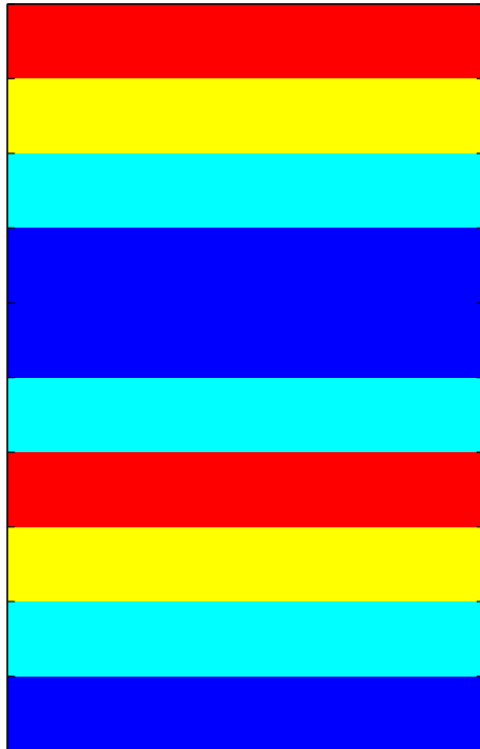
ONERA



THE FRENCH AEROSPACE LAB

Foreword (1/5): Modeling of transfer phenomena in heterogeneous media

An analytical journey from
the world of **piece-wise constant** properties to the world of **continuous** properties



Foreword (2/5): Heat equation in graded media

Heat equation for 1D **heat diffusion** in a **graded medium**

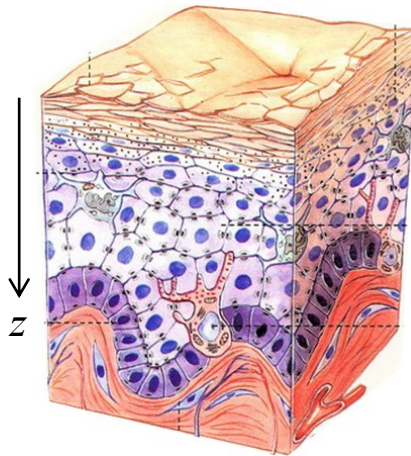
$$c(z) \frac{\partial T}{\partial t} = \frac{\partial}{\partial z} \left(\lambda(z) \frac{\partial T}{\partial z} \right)$$

variable volumetric heat capacity

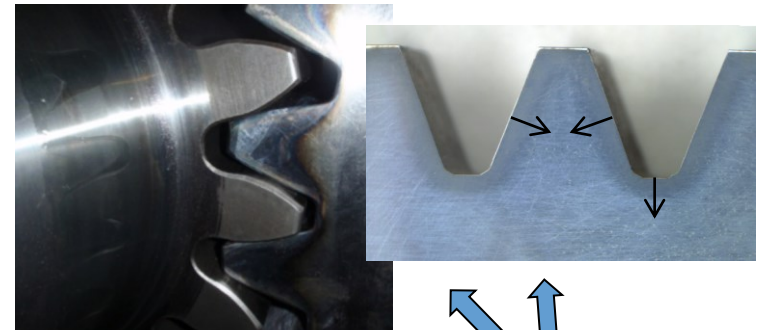
variable thermal conductivity



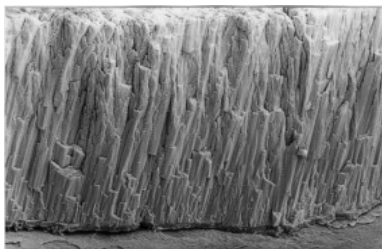
Soils



Skin

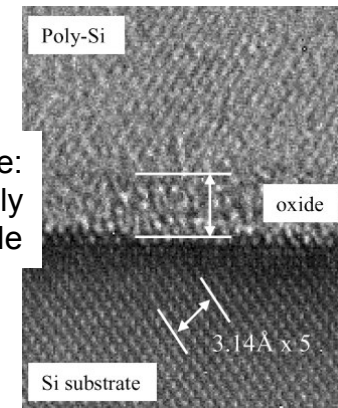


Gear teeth. Carburized **case-hardened** steel



Thermal Barrier Coating

Graded interface at nanoscale:
Oxygen concentration in thermally grown ultrathin SiO_x gate oxide

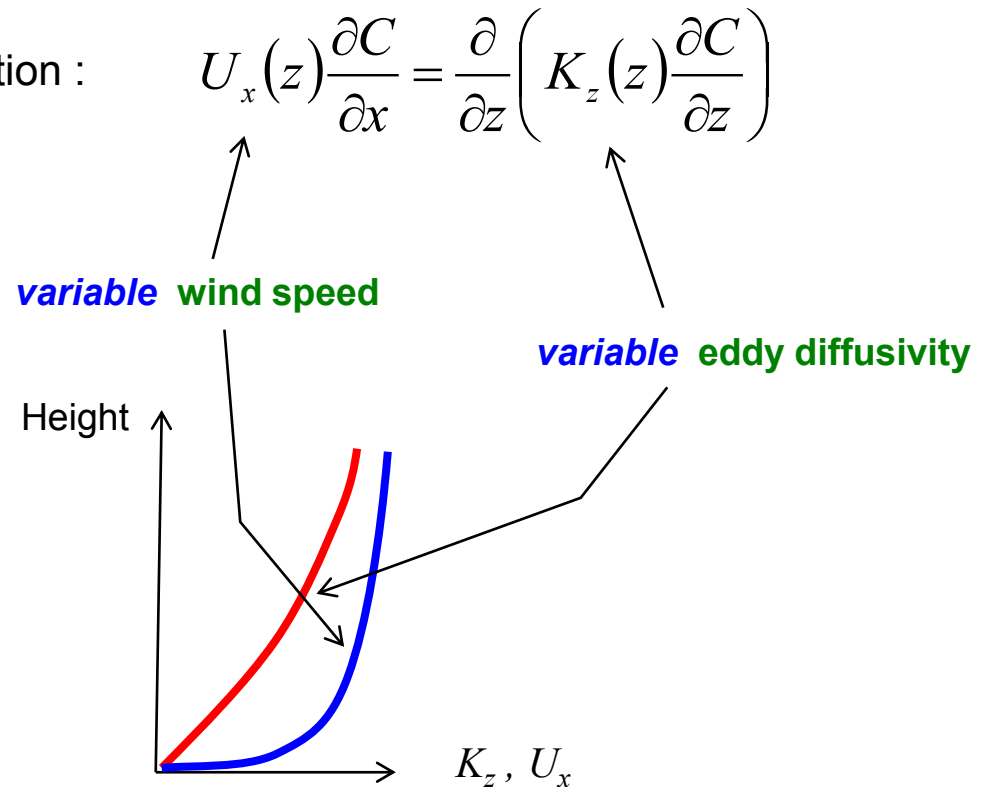


Foreword (3/5): Other (diffusion) equations of the same form

- Stationary, 2D, **advection-diffusion** equation :



e.g.: **pollutant dispersion**
in the atmosphere



- **Matter diffusion** (Fick's law) with **variable diffusion coefficient**
- **Electric transmission lines (tapered RC lines : $R(z), C(z)$)**
- **Graetz problem, etc...**

Foreword (4/5): Wave equations of “similar” form

EM waves (Maxwell's equations)

$$-\omega^2 \varepsilon(z) E = \frac{d}{dz} \left(\frac{1}{\mu(z)} \frac{dE}{dz} \right)$$

electric field

variable permittivity

variable permeability

Acoustic waves

$$-\omega^2 \frac{1}{\rho(z) c^2(z)} P = \frac{d}{dz} \left(\frac{1}{\rho(z)} \frac{dP}{dz} \right)$$

pressure

variable velocity of sound

variable mass density

Elastic longitudinal/shear waves

$$-\omega^2 \rho(z) u = \frac{d}{dz} \left(E(z) \frac{du}{dz} \right)$$

displacement

variable mass density

variable modulus

Electric transmission lines (tapered LC lines : $L(z), C(z)$)

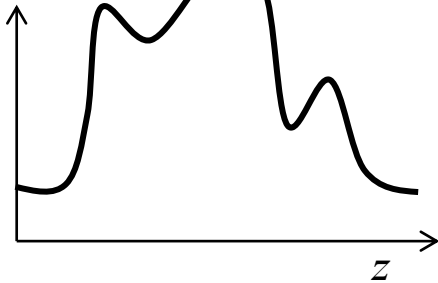
Ocean gravity waves, ...

Foreword (5/5): Motivation and objectives

1- The profile is one of known analytically solvable profiles (linear, power law, ...)

- exact solution
- limited flexibility
- special functions (CPU time \uparrow)

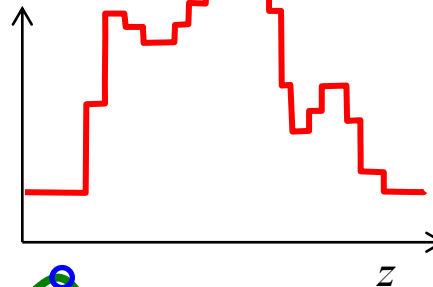
Graded profile



Standard approaches

2- Staircase approximation + Analytical Transfer Matrix method (standard **quadrupole**)

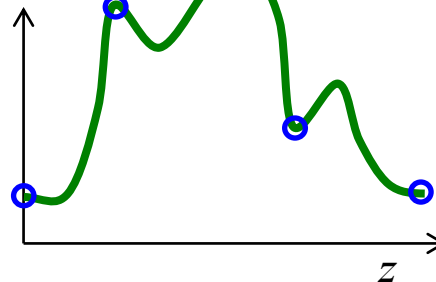
- easy to implement
- approximate; constraint for good accuracy.



Proposed method

3- Piece-wise solution with :

- elementary **solvable profiles** with
- high flexibility
- elementary functions (CPU time \downarrow)



Heat equations for temperature **and** for heat flux

Hypotheses:

- 1D transfer
- Linear
- No heat sources
- Transient or steady periodic

Energy-balance

$$\begin{cases} c(z) \frac{\partial T}{\partial t} = - \frac{\partial \varphi}{\partial z} \\ \varphi = -\lambda(z) \frac{\partial T}{\partial z} \end{cases}$$

Fourier law

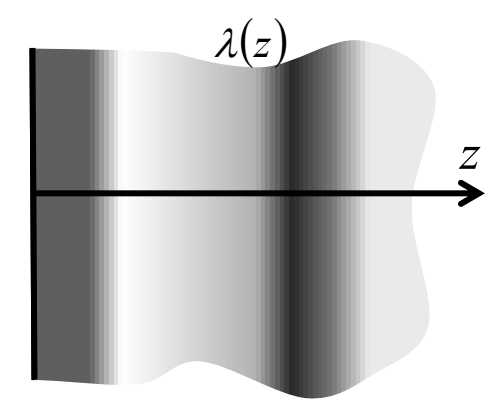
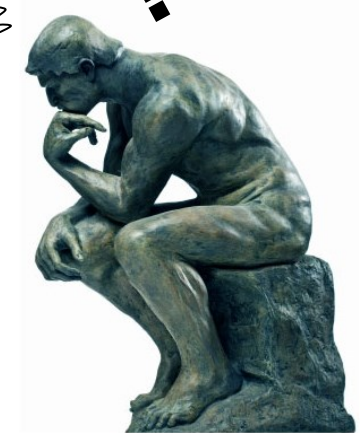
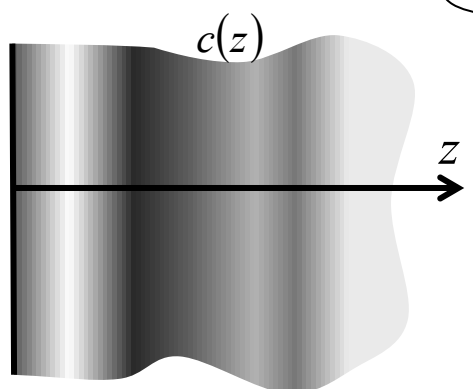
$\langle T \rangle:$
$$\frac{\partial T}{\partial t} = \frac{1}{c(z)} \frac{\partial}{\partial z} \left(\lambda(z) \frac{\partial T}{\partial z} \right)$$

$\langle \varphi \rangle:$
$$\frac{\partial \varphi}{\partial t} = \lambda(z) \frac{\partial}{\partial z} \left(\frac{1}{c(z)} \frac{\partial \varphi}{\partial z} \right)$$

$c(z)$ $\lambda(z)$



2nd order PDEs with **two variable coefficients**



TRANSFORMERS

4



J. Fourier

P.-S. Laplace



J. Liouville



G. Darboux

Laplace or Fourier transform



Elimination of the time-derivative
Multiplication by « p » variable

p : Laplace variable
(complex)
Fourier variable $i\omega$
(pure imaginary)

$$\langle T \rangle : p\theta = \frac{1}{c(z)} \frac{d}{dz} \left(\lambda(z) \frac{d\theta}{dz} \right)$$

$$\langle \phi \rangle : p\phi = \lambda(z) \frac{d}{dz} \left(\frac{1}{c(z)} \frac{d\phi}{dz} \right)$$

2nd order ODEs with **two variable coefficients**

Liouville transformation (1897). First step

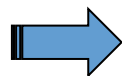


First step : a **change of the independent-variable**:

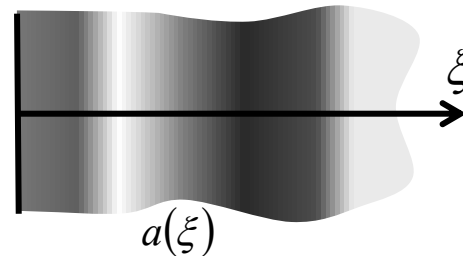
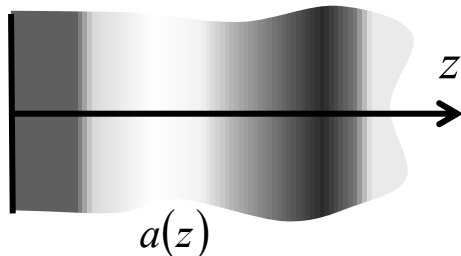
$$z \rightarrow \xi(z) := \int_0^z \frac{du}{\sqrt{a(u)}}$$

Transformation involving the **diffusivity** profile: $a(z) := \lambda(z)/c(z)$

Physical coordinate z



Square-root of diffusion time (SRDT) ξ



$$\langle T \rangle : p\theta = b^{-1}(b\theta)'$$

$$\langle \varphi \rangle : p\phi = b(b^{-1}\phi)'$$

2nd order ODEs with **only one variable coefficient**:

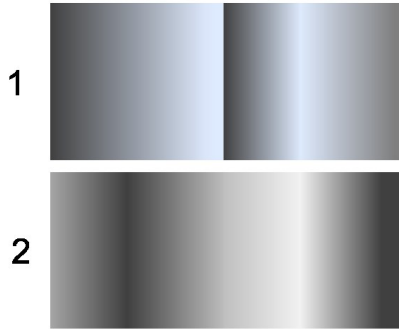
Effusivity $b(\xi) := \sqrt{\lambda(\xi)c(\xi)}$

- **Outstanding importance** of the **effusivity profile**
- $b(\xi)$ is **solvable** \leftrightarrow $b^{-1}(\xi)$ is **solvable**

Who is responsible for the thermal contrast ?



Two heterogeneous materials

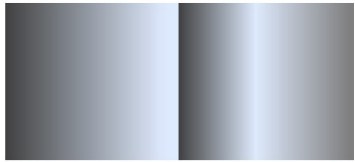


Who is responsible for the thermal contrast ?

Two heterogeneous materials



1

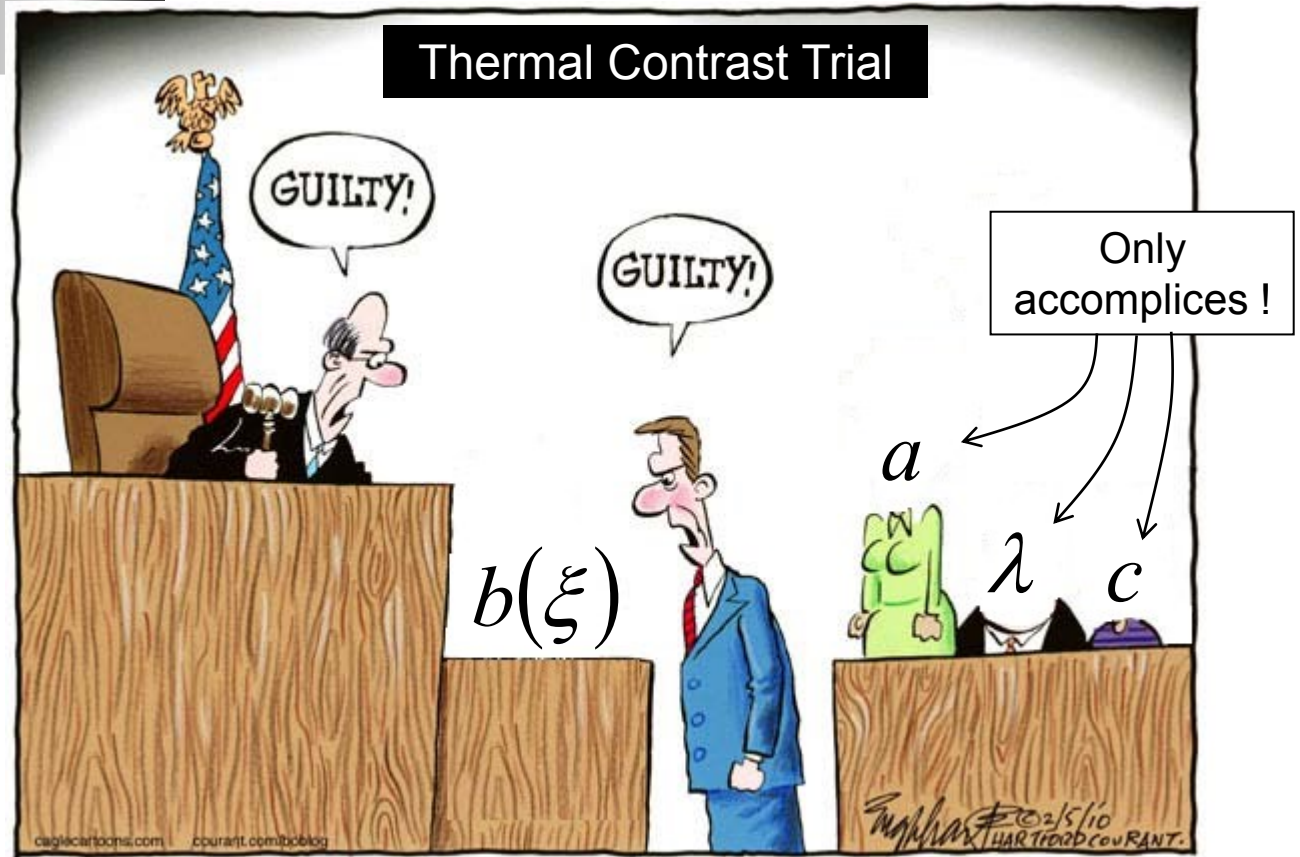


2



IR sensor

The **effusivity profile**
 $b(\xi)$
is the brain of the band !



I apologize to B. Englehart for the misappropriation of his cartoon ...

Liouville transformation (1897). Second step

Second step : a **change of the dependent-variable**: $\begin{cases} \langle T \rangle : \theta \rightarrow \psi := \theta b^{+1/2}(\xi) \\ \langle \varphi \rangle : \phi \rightarrow \psi := \phi b^{-1/2}(\xi) \end{cases}$

In both cases we obtain a **Stationary Schrödinger Equation (SSE)**

$$\psi'' = (V + p)\psi$$

“**potential**” $V(\xi) := \frac{s''}{s}$ **reduced 2nd derivative**

The “**metaproperty**” $s(\xi)$ is defined by: $s := \begin{cases} b^{+1/2} & ; \langle T \rangle - \text{form} \\ b^{-1/2} & ; \langle \varphi \rangle - \text{form} \end{cases}$

Reduced 2nd derivative. So what?



The TRICK: cast the SSE equation into **two homologous SSEs**

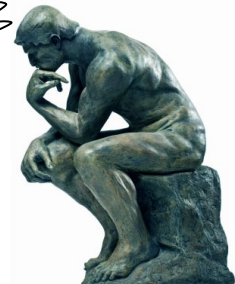
Recast the definition of the “potential” $V(\xi) := s''/s \quad \longrightarrow \quad s'' = V(\xi)s$

↳

$$\begin{aligned} \psi'' &= (V(\xi) + p)\psi \\ s'' &= V(\xi)s \end{aligned}$$

- the **thermal field** ψ
 - the **meta-property** s
- } satisfy two **homologous** Schrödinger equations (i.e. with the **same potential**)

How to find solvable potentials V ?



Constant potential \longrightarrow « Fundamental solutions »

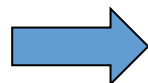
$$\psi'' = (V(\xi) + p)\psi$$

$$s'' = V(\xi)s$$

$$\langle T \rangle - \text{form: } s = b^{+1/2} ; \psi = \theta b^{+1/2}$$

$$\langle \varphi \rangle - \text{form: } s = b^{-1/2} ; \psi = \varphi b^{-1/2}$$

$$V(\xi) = \beta = 0$$



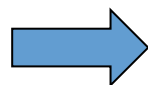
Linear solutions for

$$V(\xi) = \beta > 0$$



Hyperbolic solutions for

$$V(\xi) = \beta < 0$$



Trigonometric solutions for

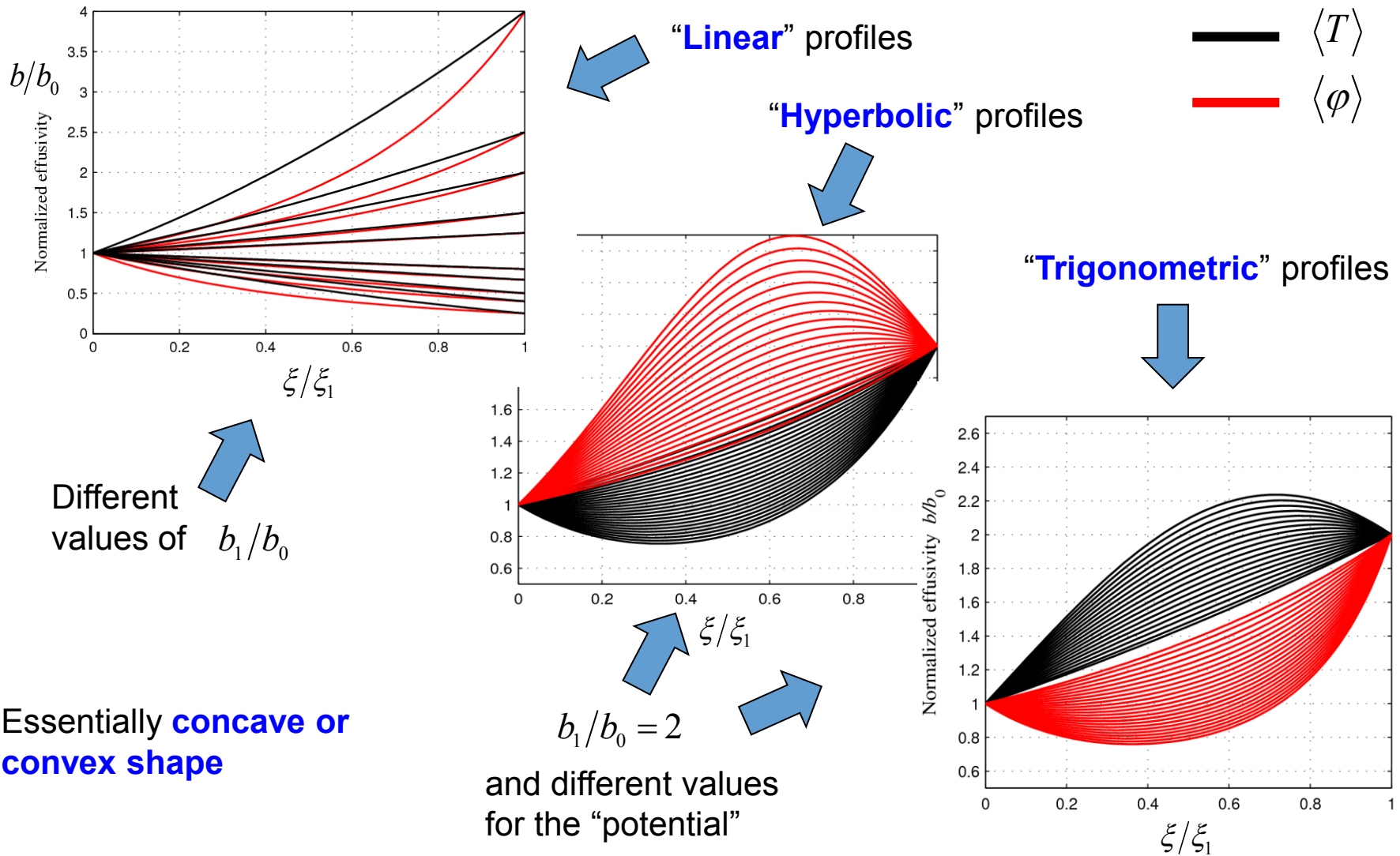
$$b^{\pm 1/2}(\xi)$$

Solution for the field function:

$$\psi(\xi, p) \propto \begin{bmatrix} \cosh\left(\sqrt{p + \beta\xi}\right) \\ \sinh\left(\sqrt{p + \beta\xi}\right) \end{bmatrix}$$

Generalization of the particular case with constant diffusivity:
Sutradhar A. et al., *Comput. Meth. Appl. Mech. Engrg.* (2004)

A few “fundamental profiles” of the effusivity



Darboux transformation (DT)

« Un curieux théorème d'analyse » (1882, 1889)



★ $\psi'' = (V_n(\xi) + p)\psi$

Given a **solvable** SSE

↳ $\psi'' = (V_{n+1}(\xi) + p)\psi$

Construction of another **solvable** SSE
with a **new potential function** $V_{n+1}(\xi)$

- ❖ A **cascade** procedure for finding **closed-form** analytical solutions **for both** :

- Effusivity profile
- Temperature/heat-flux distribution

↳ joint **Property & Field Darboux Transformation (PROFIDT)**

- ❖ Up to **2 additional parameters** per step

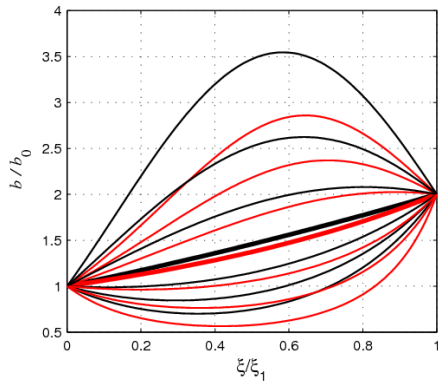
↳ profiles with **increasingly complex shape**

- ❖ When starting with a **constant seed-potential**

↳ all solutions involve only **elementary** functions

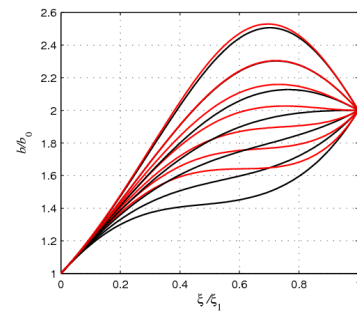
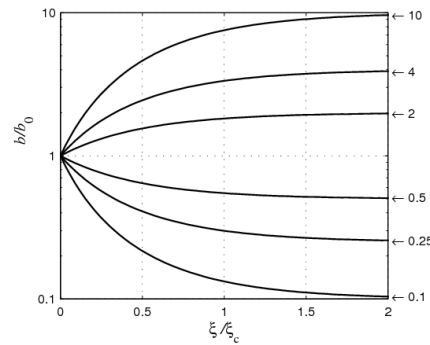
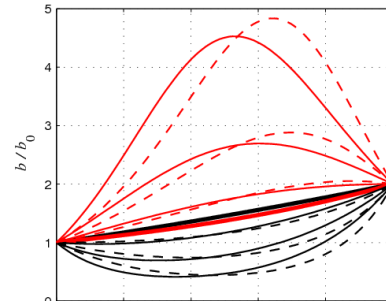


❖ **Fundamental solutions**
(constant potential)

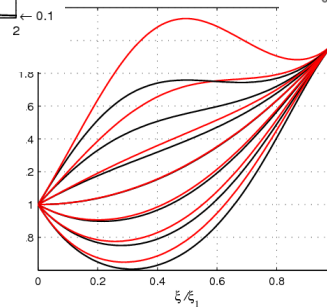
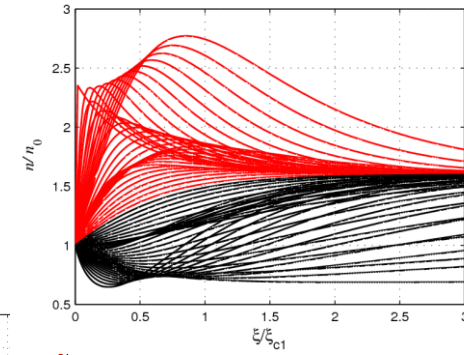
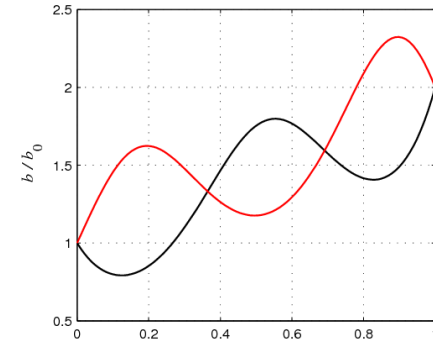


— $\langle T \rangle$
— $\langle \varphi \rangle$

❖ **One PROFIDT**

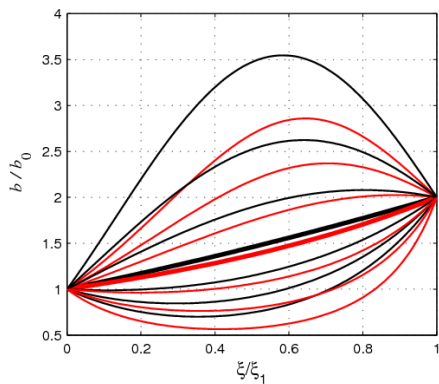


❖ **Two PROFIDTs**



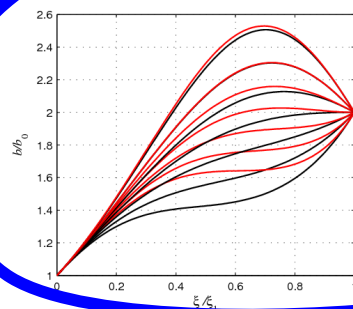
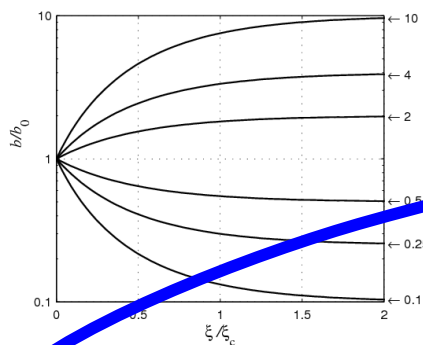
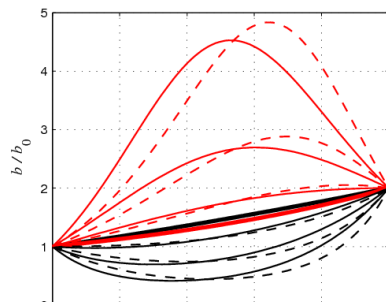


❖ **Fundamental solutions**
(constant potential)

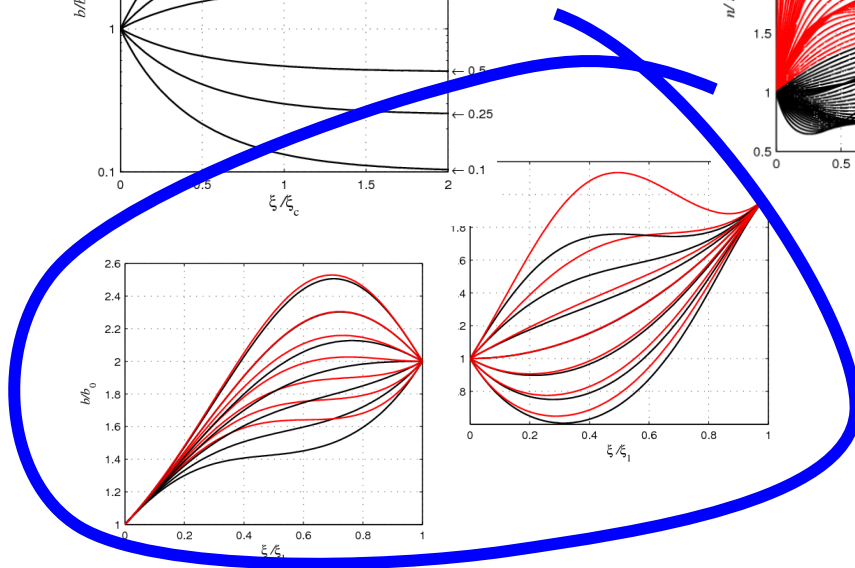
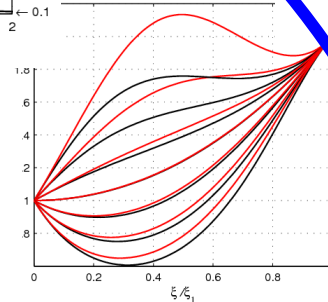
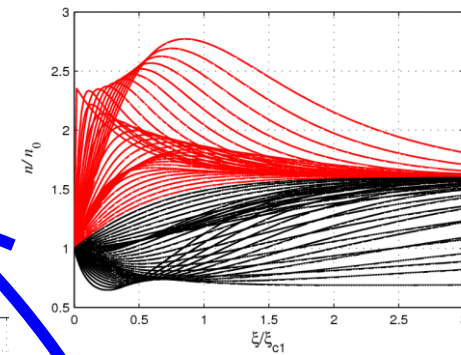
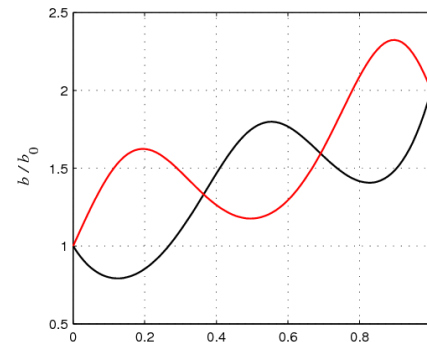


— $\langle T \rangle$
— $\langle \phi \rangle$

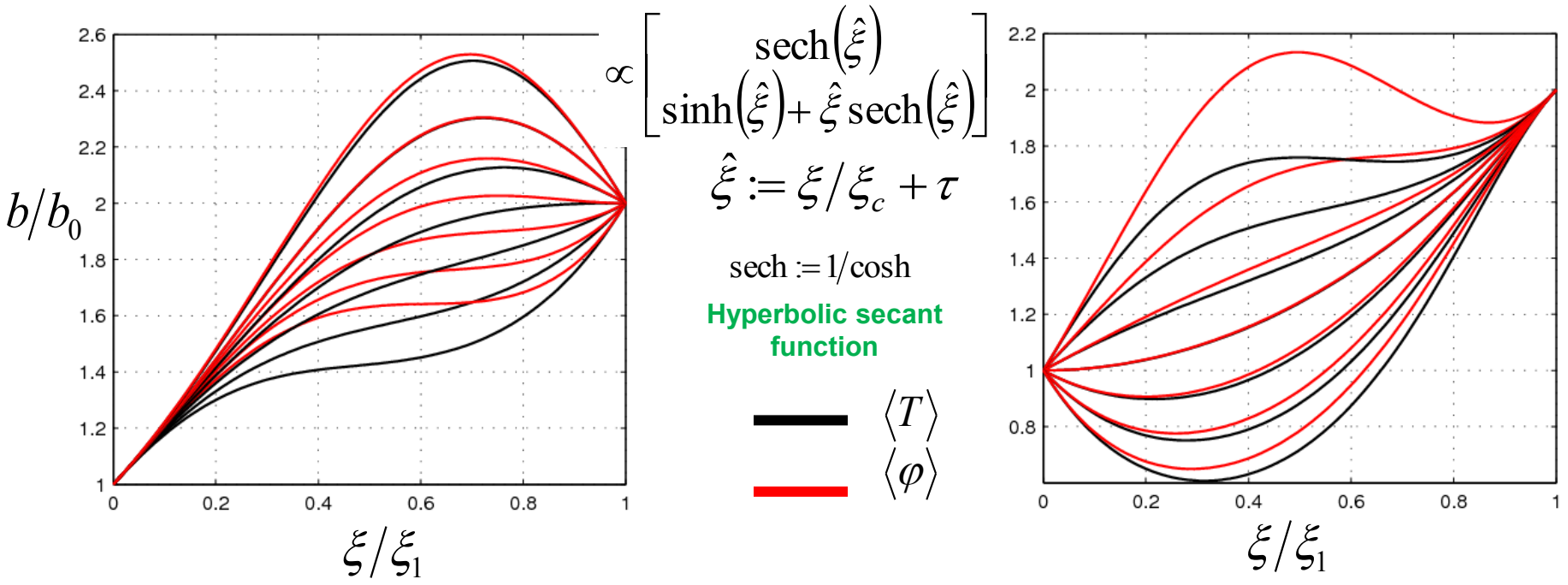
❖ **One PROFIDT**



❖ **Two PROFIDTs**



One single PROFIDT with seed potential $V_0(\xi) = \xi_c^{-2} > 0$ and $p_1 = 0$. Profiles of $\text{sech}(\hat{\xi})$ -type ([sɛk ksi hæʔ])



- **Two sub-classes** of profiles : $\langle T \rangle$ -form and $\langle \varphi \rangle$ -form
- **Relatively simple quadrupole (only exp. functions)**
- **4 adjustable parameters** ξ_c, τ and two multiplicative factors
- **Absolutely flexible** : can accommodate any specification regarding

two end-values
two end-slopes

↳ **Elementary bricks** to perform **spline interpolation** (like cubic polynomials)

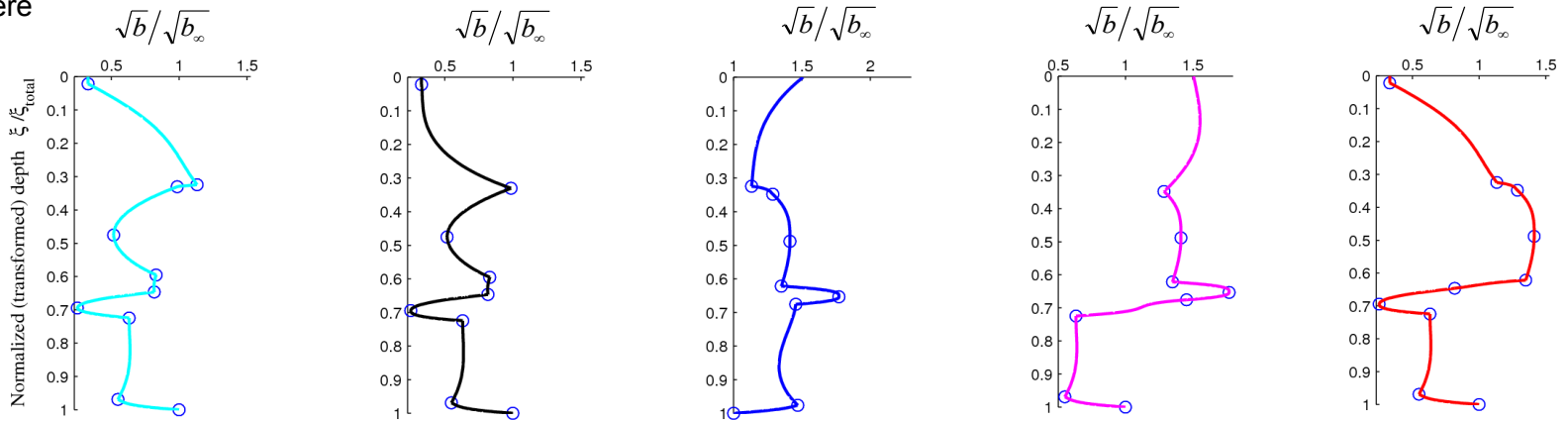


new concept of solvable splines

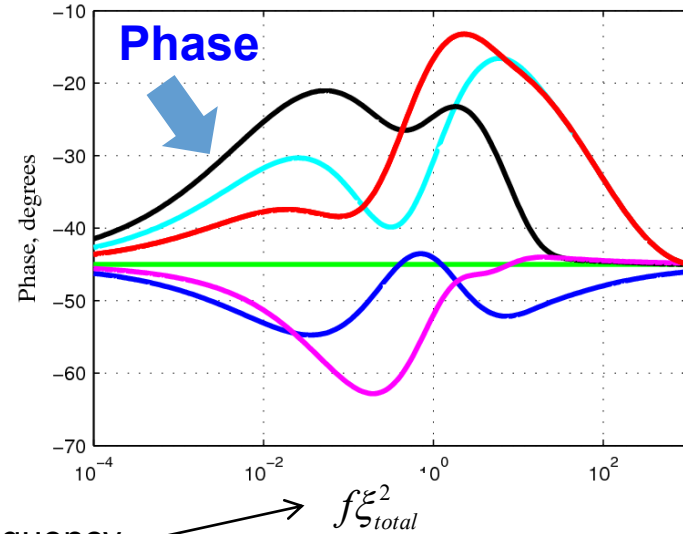
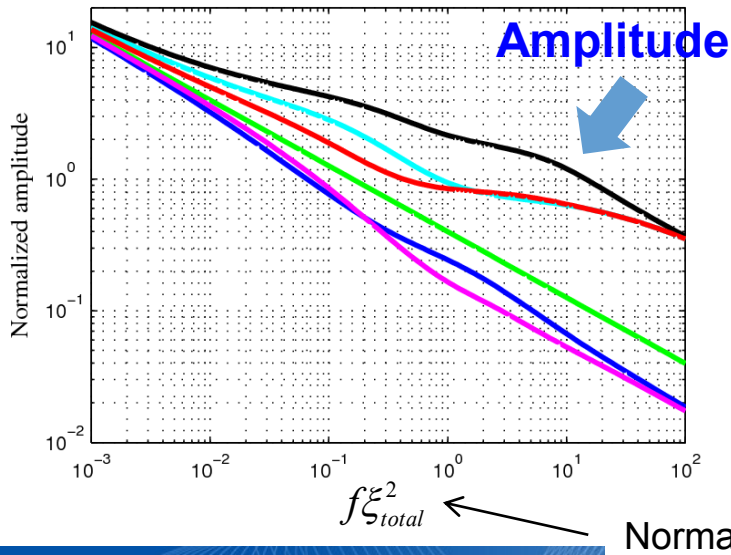
And now, a « light » example of synthetic profiles with the corresponding temperature responses

Photothermal experiment from here

Five synthetic profiles of **thermal effusivity** (8 to 10 $\text{sech}(\hat{\xi})$ elements)



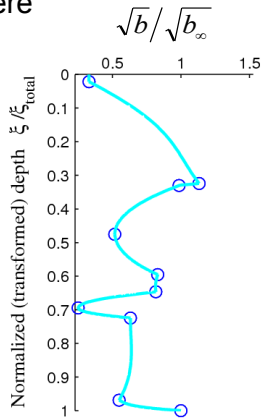
Spectra of the **photothermal response** (modulated surface **temperature**)



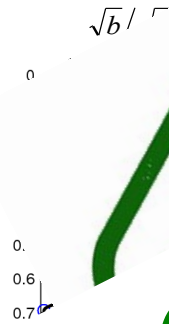
Normalized frequency

And now, a « light » example of synthetic profiles with the corresponding temperature responses

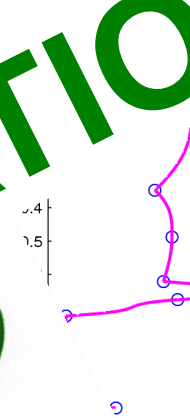
Photothermal experiment from here



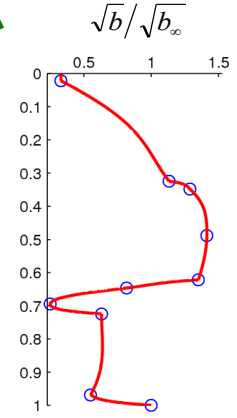
Synthetic profiles



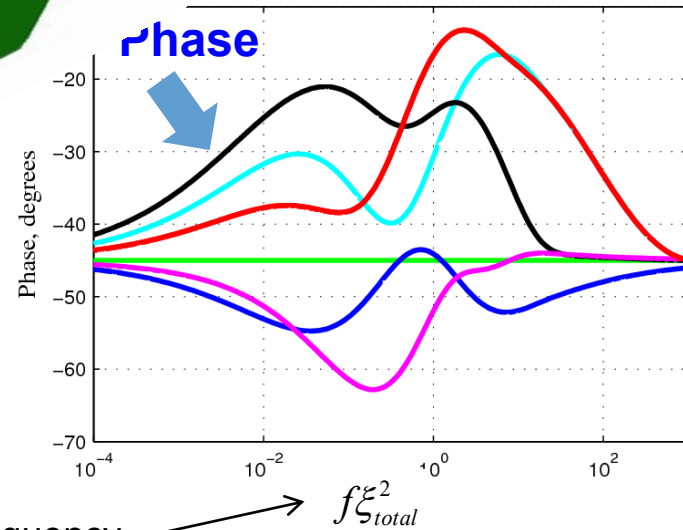
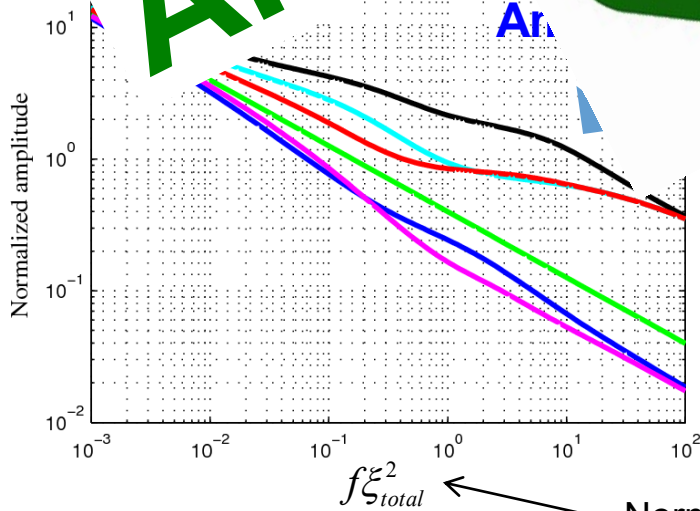
viscosity (8 to 1)



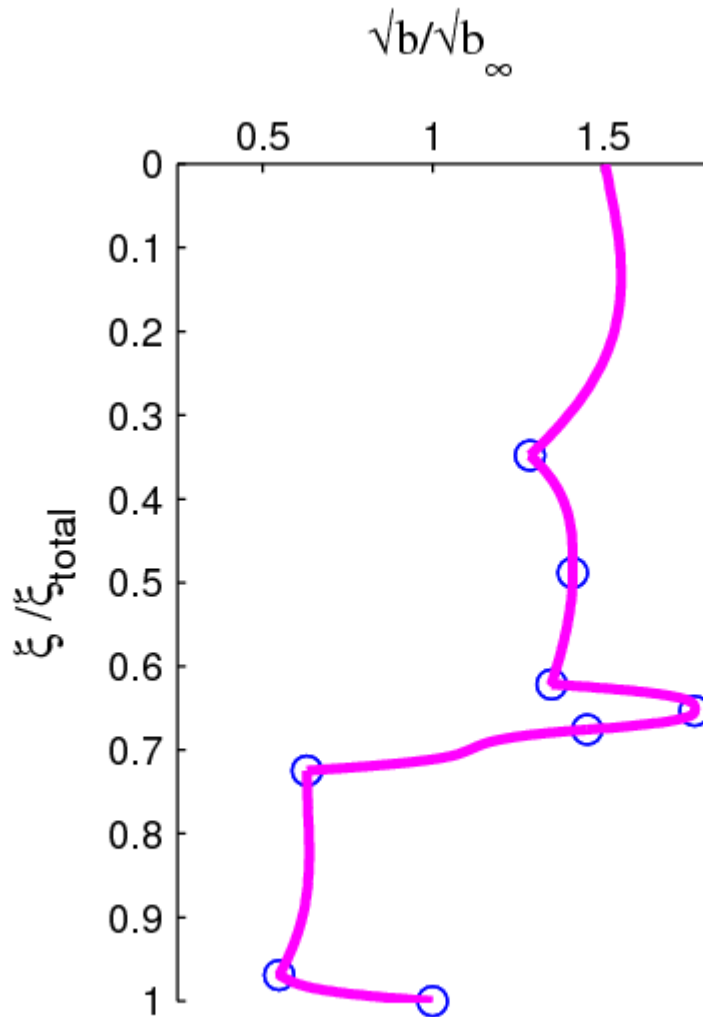
temperatures)



100% Guaranteed
APPROXIMATION
FREE

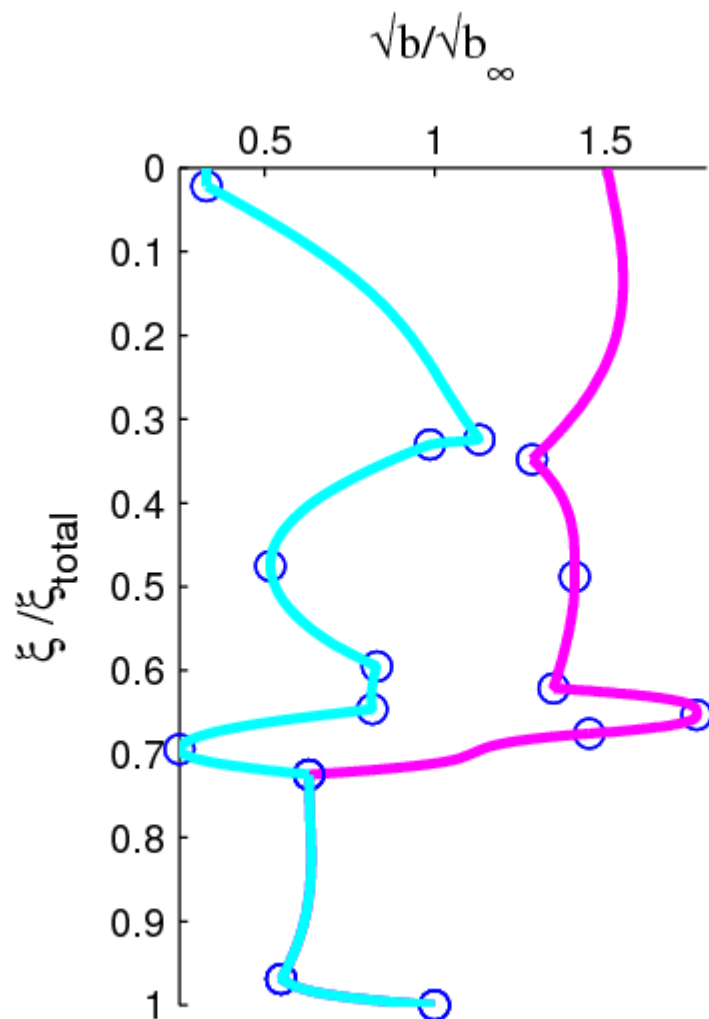


The hidden motivation...



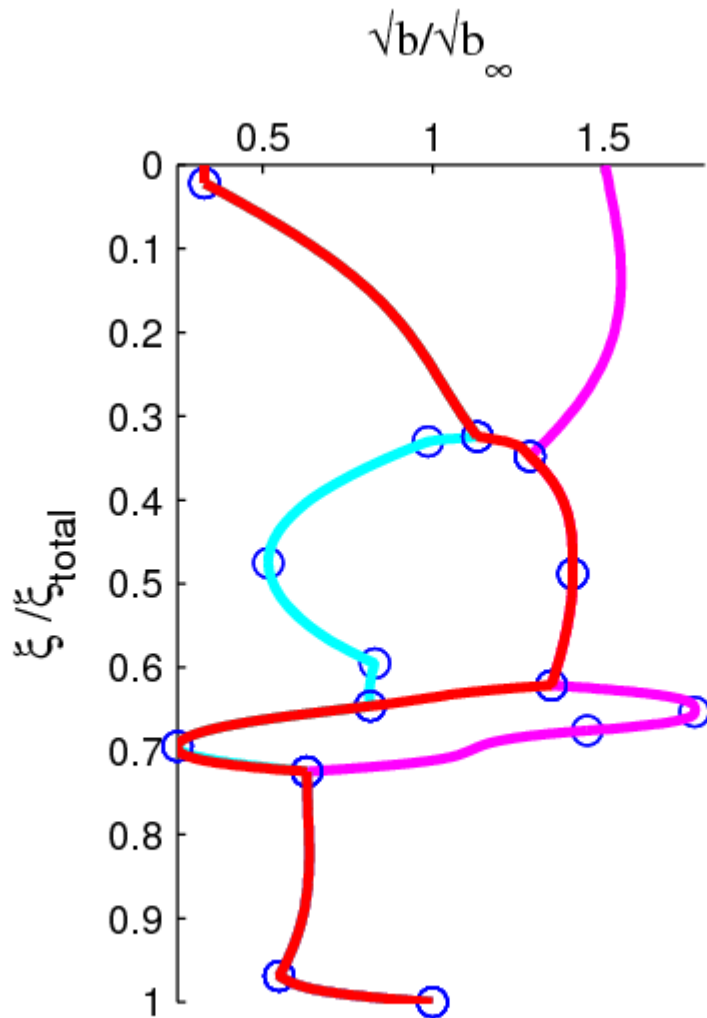
By superimposing all these synthetic profiles...

The hidden motivation...



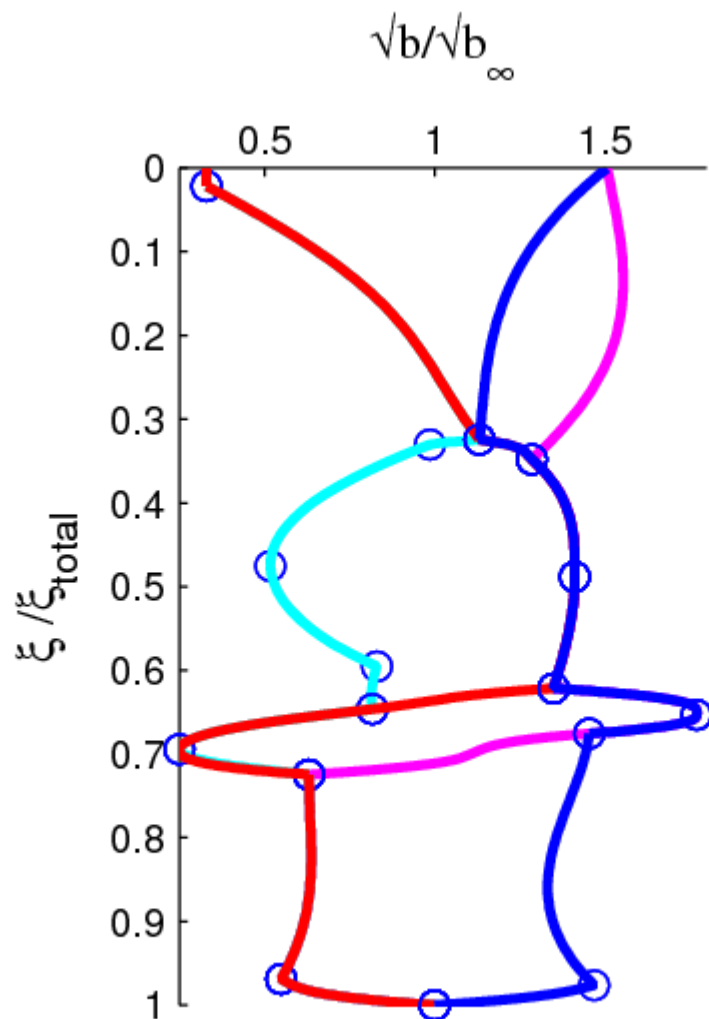
By superimposing all these synthetic profiles...

The hidden motivation...



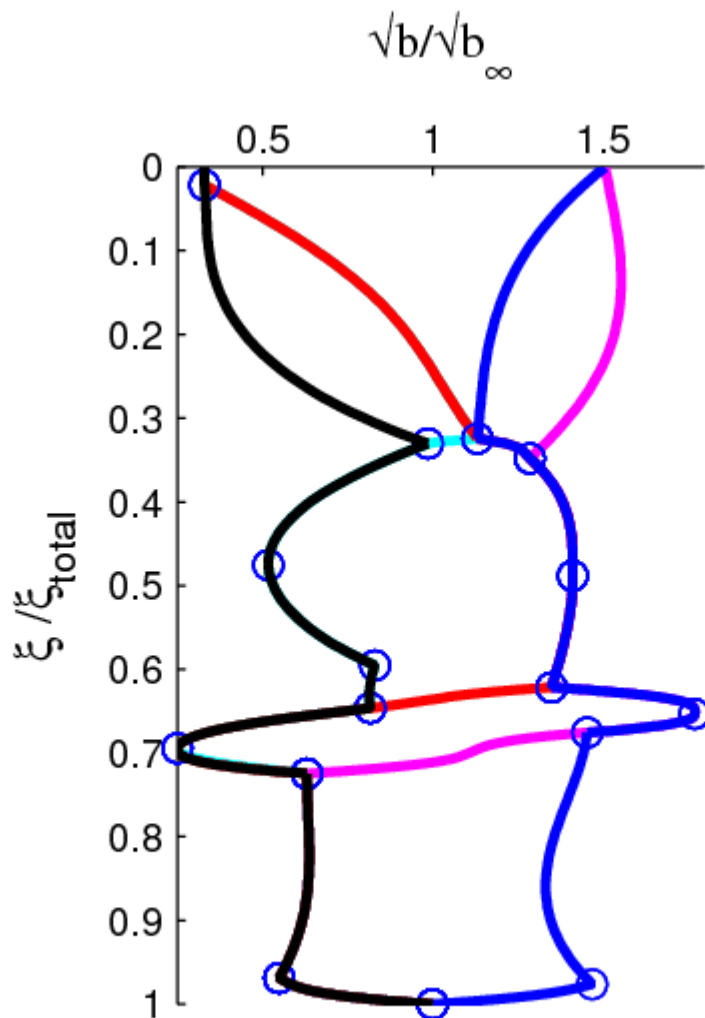
By superimposing all these synthetic profiles...

The hidden motivation...



By superimposing all these synthetic profiles...

Examples of synthetic graded profiles

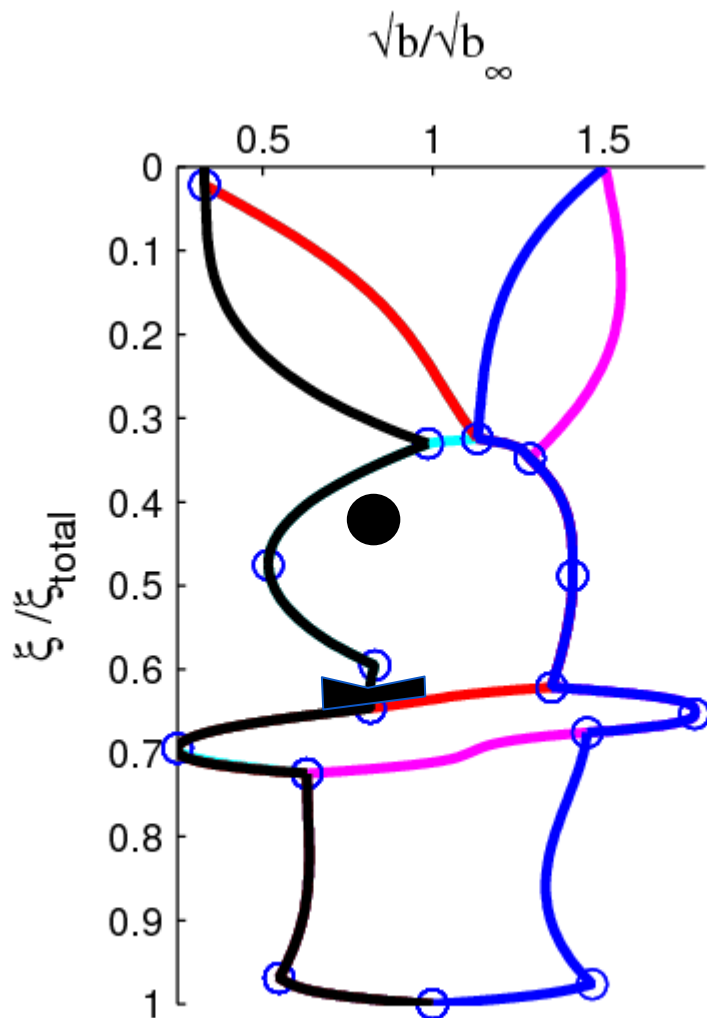


By superimposing all these synthetic profiles...

we come to a representation that :

- illustrates the versatility of the $\text{sech}\left(\frac{\hat{\xi}}{\xi}\right)$ profiles

Examples of synthetic graded profiles



By superimposing all these synthetic profiles...

we come to a representation that :

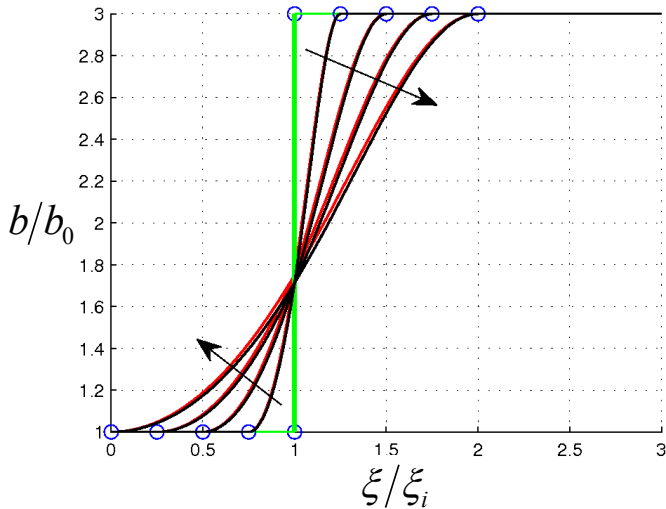
- illustrates the versatility of the $\text{sech}(\hat{\xi})$ profiles
- will allow you to easily memorize the name of these [sɛksi hæʔ] profiles

And now, a « serious » example : diffuse interfaces

Sharp interface vs. diffuse interface

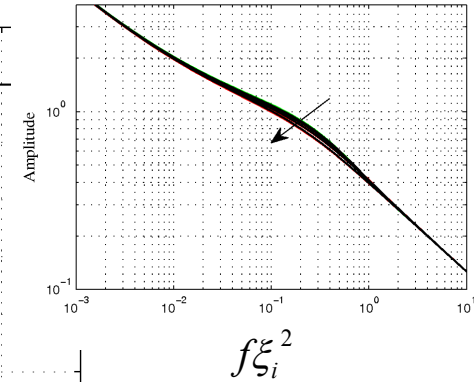
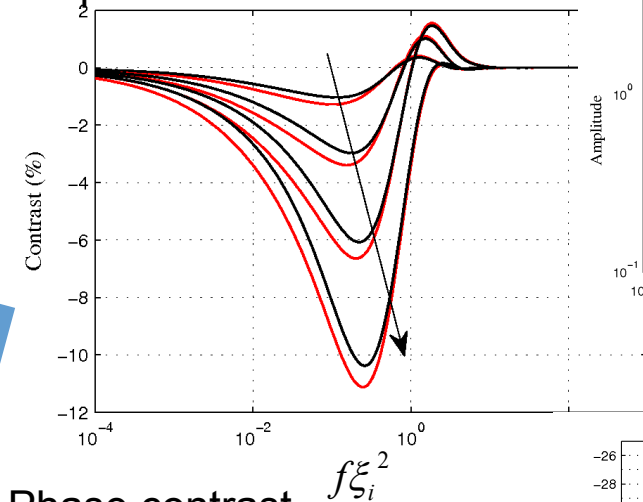


progressively smoother interface

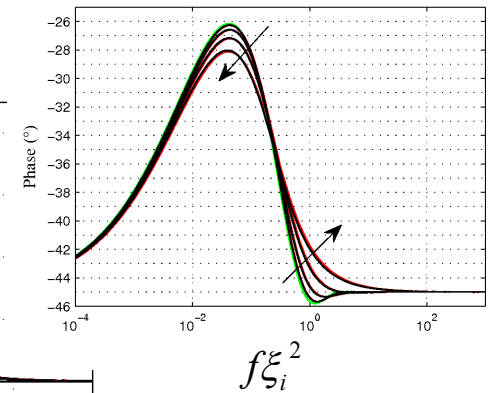
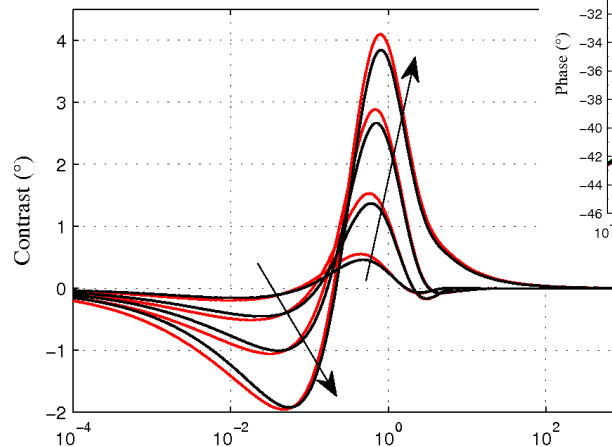


— $\langle T \rangle$
— $\langle \varphi \rangle$

Amplitude contrast



Phase contrast



Modeling of the dispersion of pollutants in the atmosphere

$$U_x(z) \frac{\partial C}{\partial x} = \frac{\partial}{\partial z} \left(K_z(z) \frac{\partial C}{\partial z} \right)$$

Essential parameter : the « **effective inertia** » of the atmosphere (with respect to contamination):

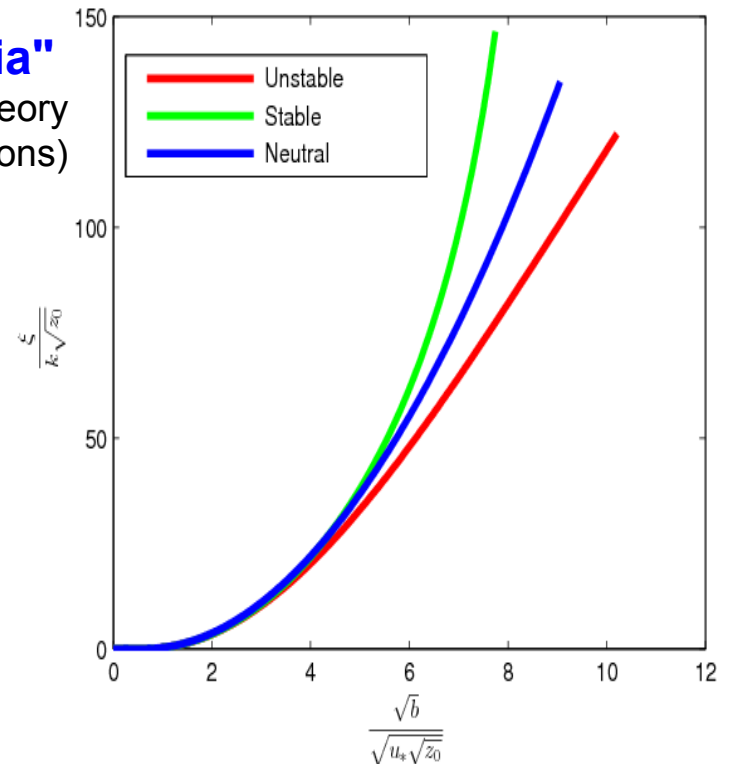
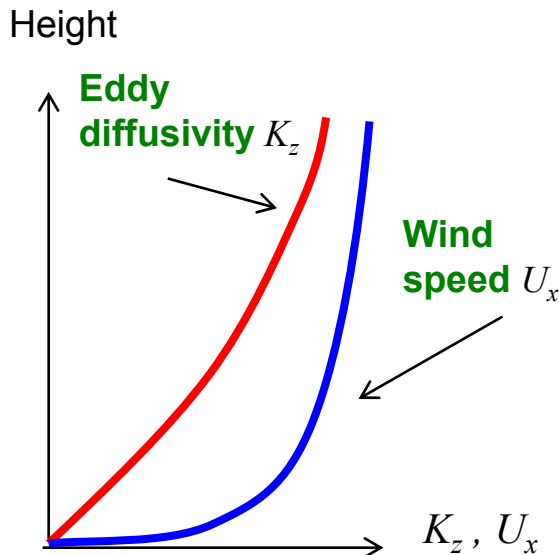
$$b := \sqrt{U_x(z) K_z(z)}$$

New independent variable:

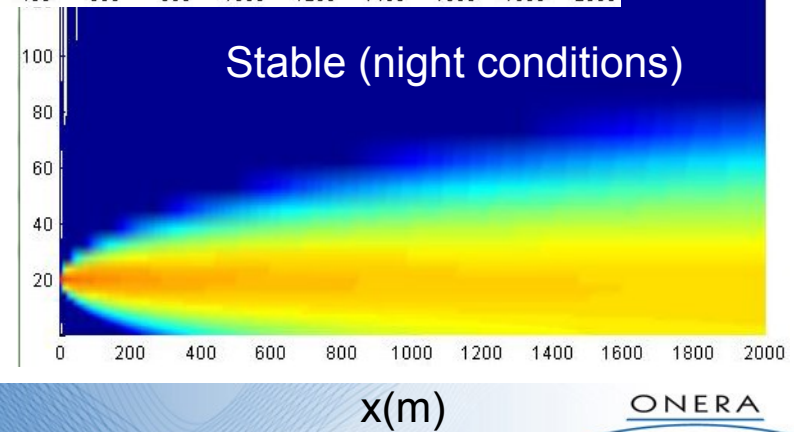
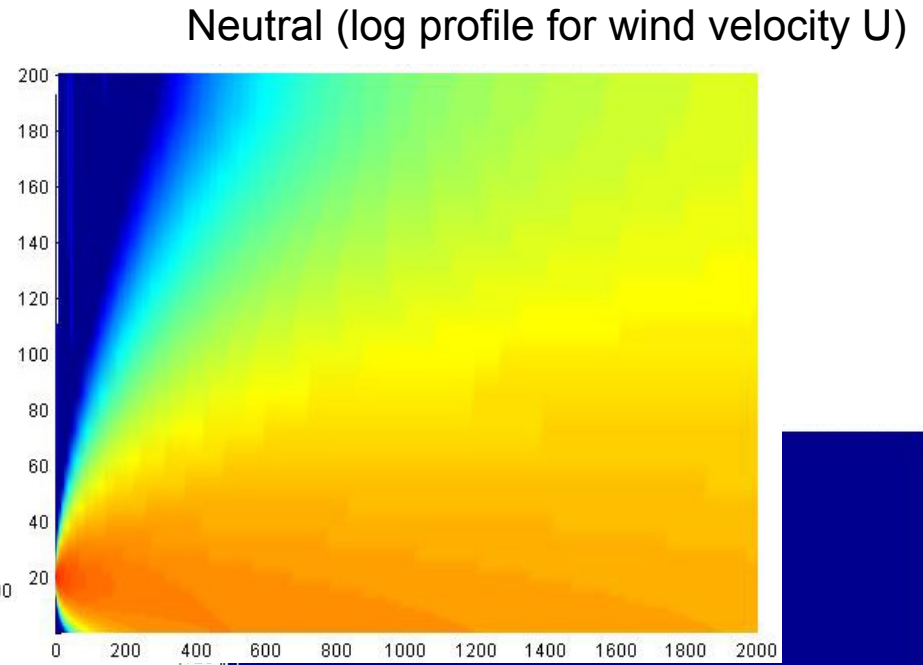
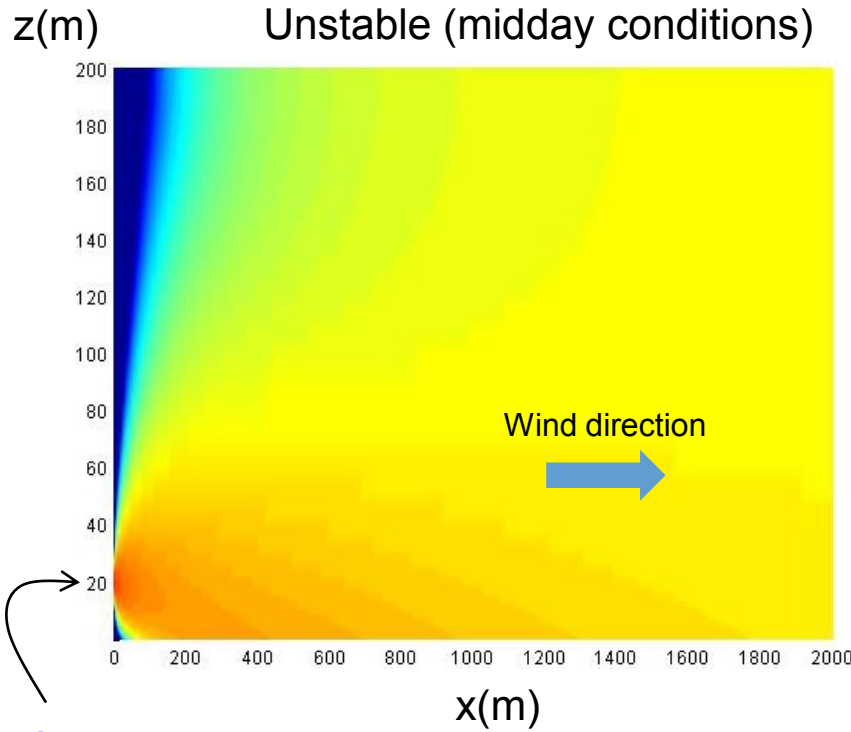
$$\xi := \int_0^z \frac{\sqrt{U_x(z)} dz}{\sqrt{K_z(z)}}$$

"Vertical" profiles of "inertia"

Monin-Obukhov similarity theory
(Businger relations)



x-z distribution of pollutant concentration depending on the atmosphere stability

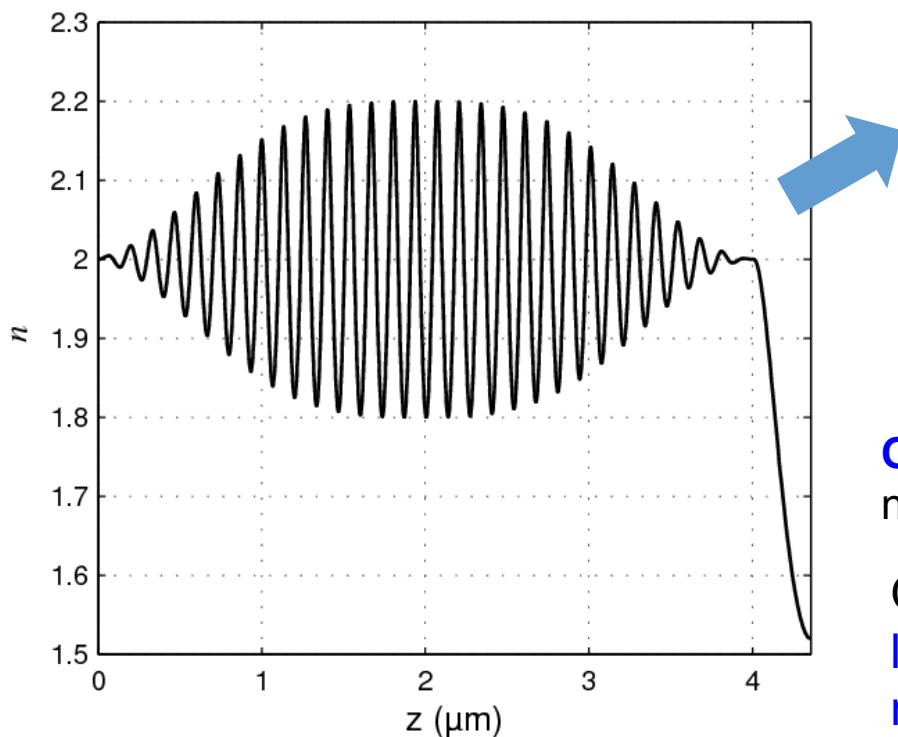


Applications in optics: filter design (dielectric thin films)

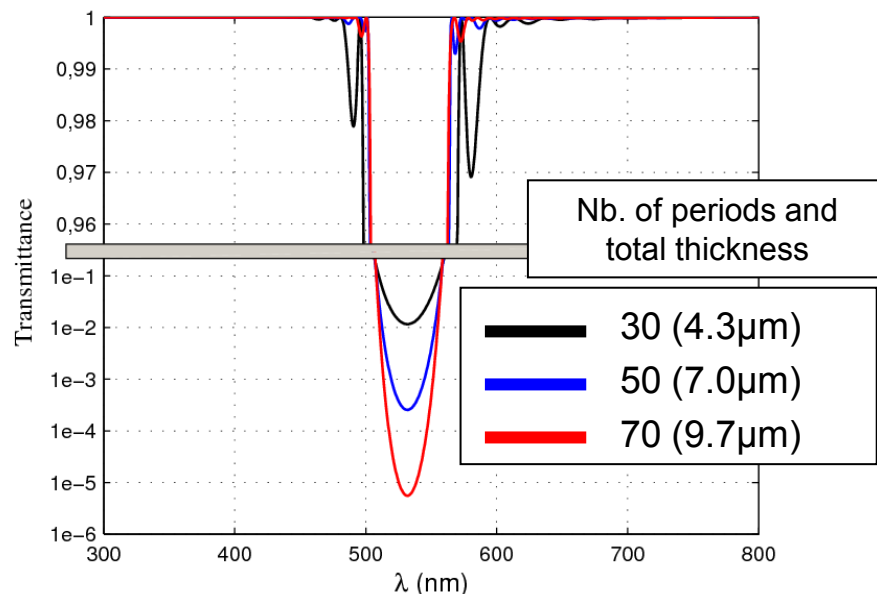
Rugate profile obtained by stitching **60** $\text{sech}\left(\frac{z}{s}\right)$ -type profiles of $\langle E \rangle$ -form (30 periods of 266nm optical thickness)

+ sinus-square **apodisation**

+ **matching layer** with 600nm optical thickness from $n_0 = 2$ down to $n_s = 1.52$ (substrate)



Transmittance spectrum of the notch filter



Only one transfer matrix per alternance (no need for finer discretisation)

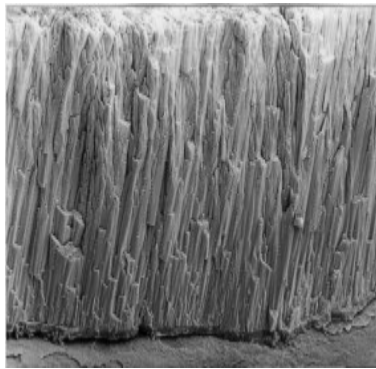
Other applications : **chirped mirrors** (fs lasers) Bragg filters, photonic crystals, matching layers, etc...

Thermal depth-profiling

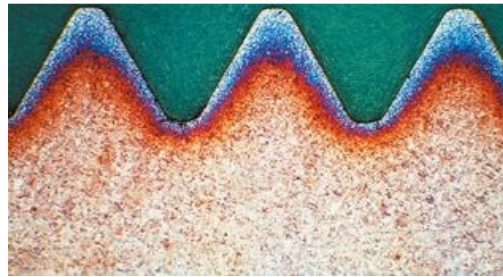
Examples of « materials » with **graded properties**



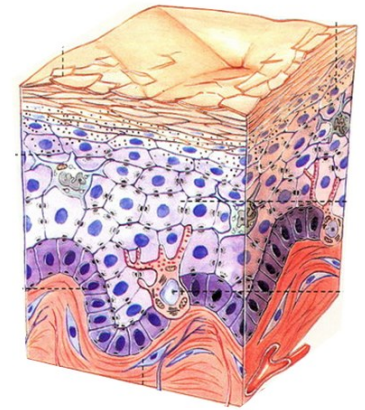
Soil



SEM of Thermal Barrier Coating



Case-hardened steel

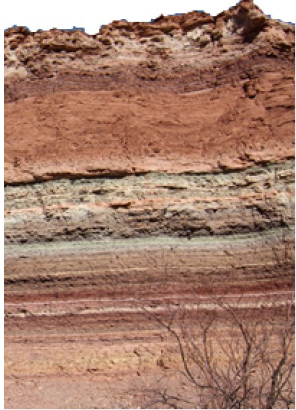


Skin

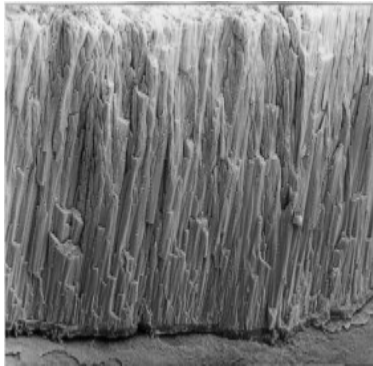
different nature and scales !

Thermal depth-profiling. Typical procedure

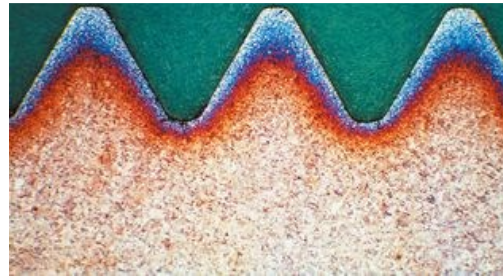
1- heat the surface (pulse or modulated)



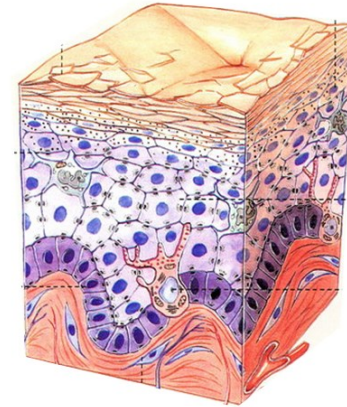
Soil



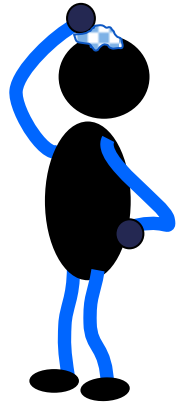
SEM of Thermal Barrier Coating



Case-hardened steel



Skin

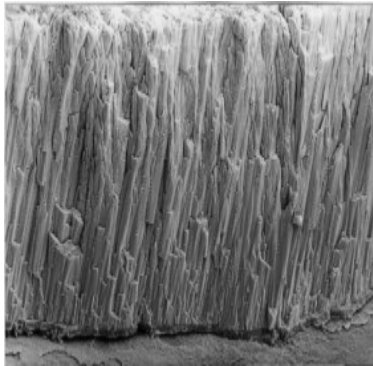


Thermal depth-profiling. Typical procedure

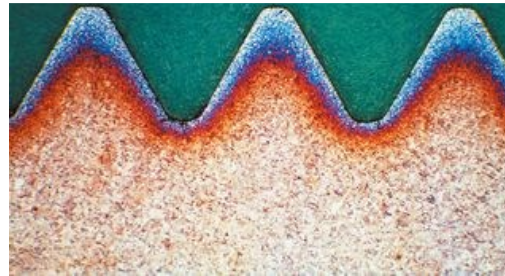
2- measure the temperature response (while heating or just after)



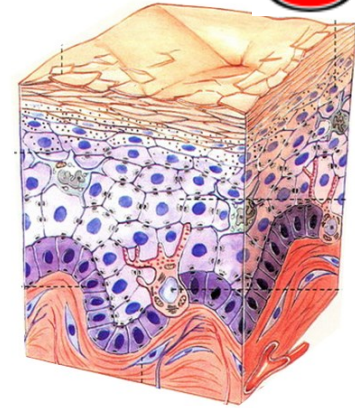
Soil



SEM of Thermal Barrier Coating



Case-hardened steel



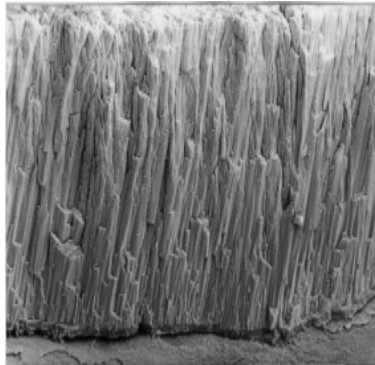
Skin

Thermal depth-profiling. Typical procedure

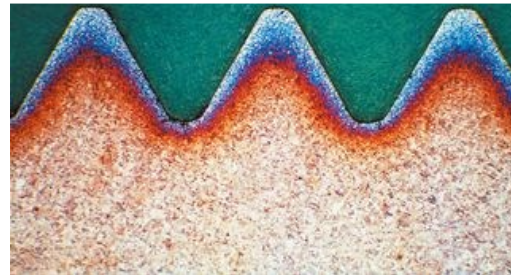
3- (stop heating and) process the data for inversion



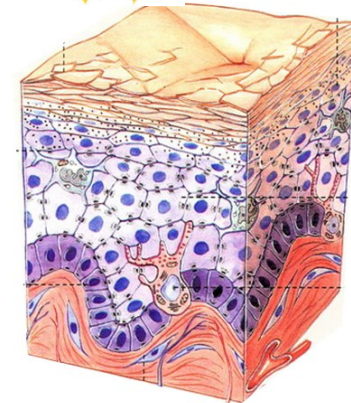
Soil



SEM of Thermal Barrier Coating



Case-hardened steel

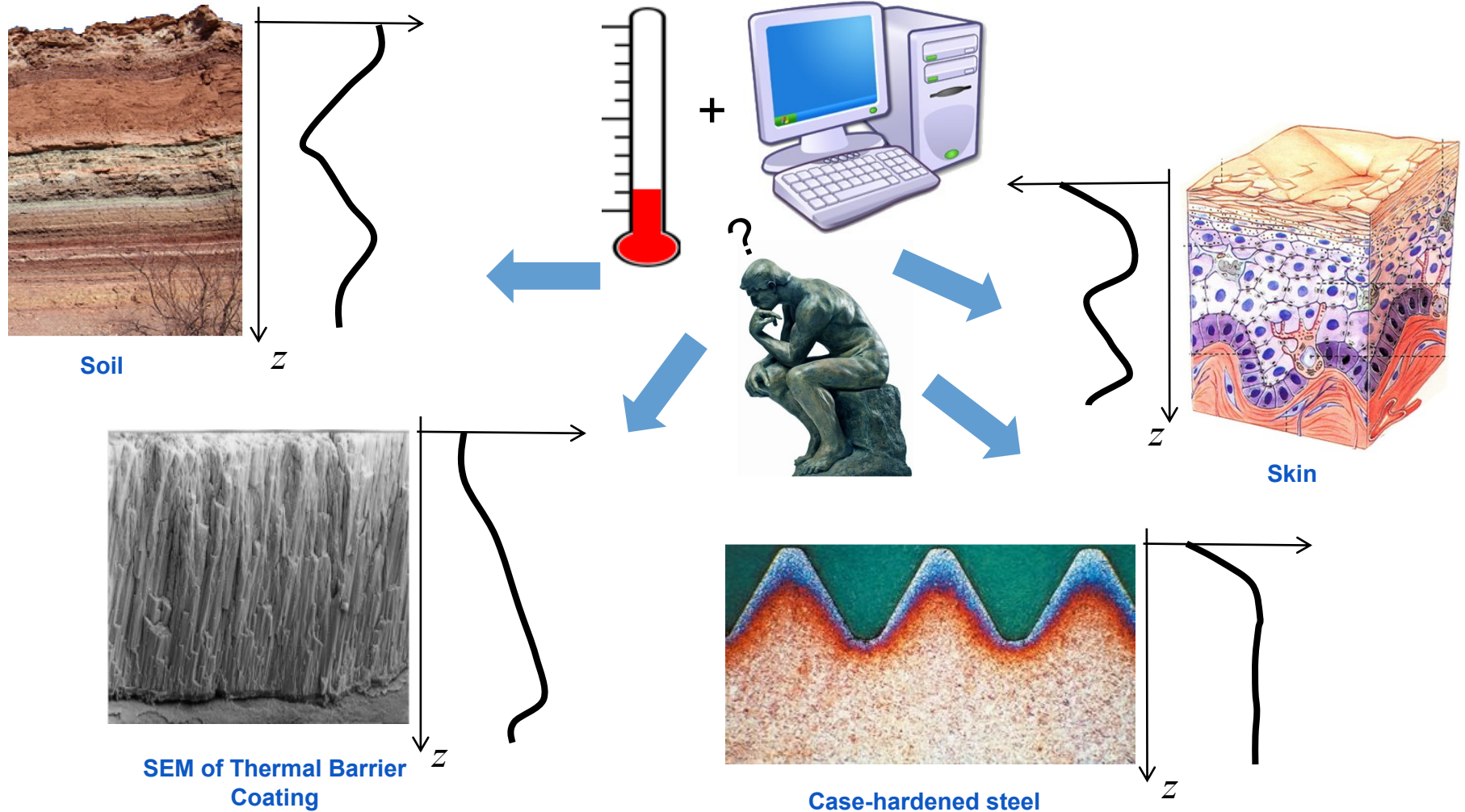


Skin



Thermal depth-profiling. Typical procedure

4- identify the profile of the thermal property (...which one ?)



Inversion principle to evaluate the effusivity profile

- 1- **Minimize the mismatch** between the **experimental data** and the **theoretical data** as given by a **model with continuous parameters**

Cost function:

difference in temperature:

$$F = \sum_{i=1}^n \left(T_{\text{th}}(t_i) - T_{\text{exp}}(t_i) \right)^2$$

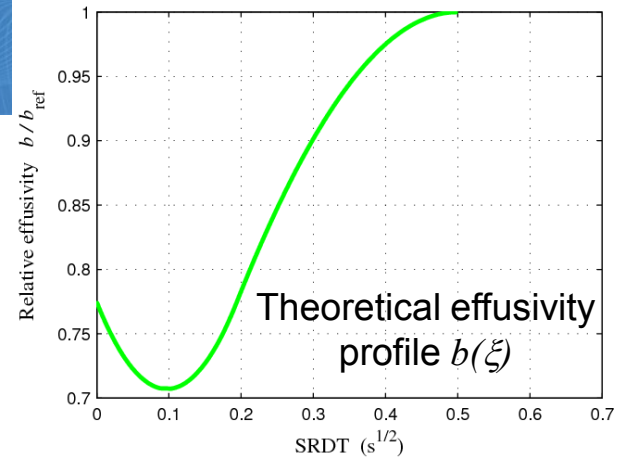
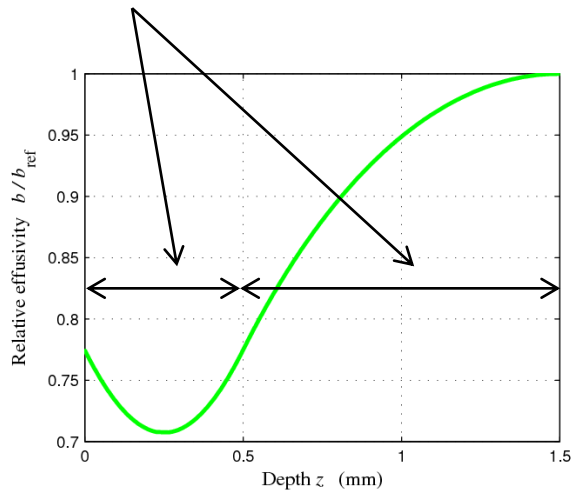
difference in *apparent effusivity*:

$$F = \sum_{i=1}^n \left(\frac{1}{\sqrt{\pi t_i} T_{\text{th}}(t_i)} - \frac{1}{\sqrt{\pi t_i} T_{\text{exp}}(t_i)} \right)^2$$

- 2- **Add as many** $\text{sech}\left(\frac{\hat{\xi}}{\xi}\right)$ -**type profiles as necessary** to reduce residues to an acceptable level (i.e. stop as soon as all non-stochastic features have disappeared)
= **parsimonious regularization**

Inversion. Synthetic data

Theoretical effusivity profile $b(z)$: from a conductivity profile build with **two quadratic polynomials** (ρC assumed constant)

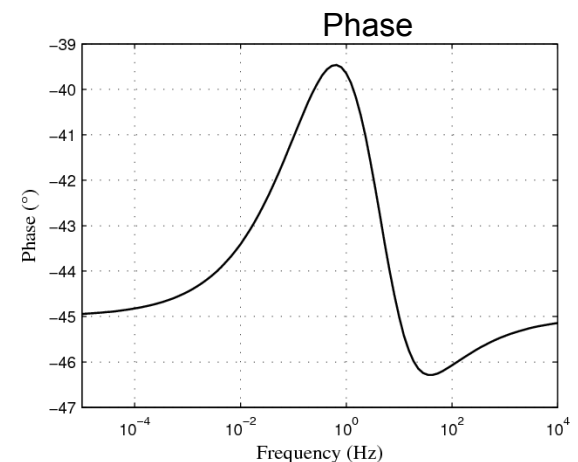
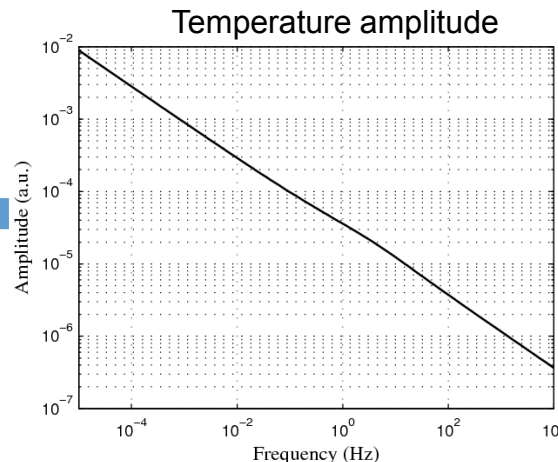
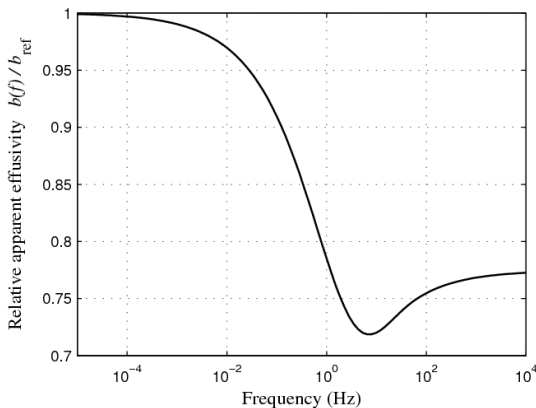


Profile $b(\xi)$ discretized into 507 slices ($\Delta b/b < 0.001$)

Temperature computation with **classical quadrupoles**

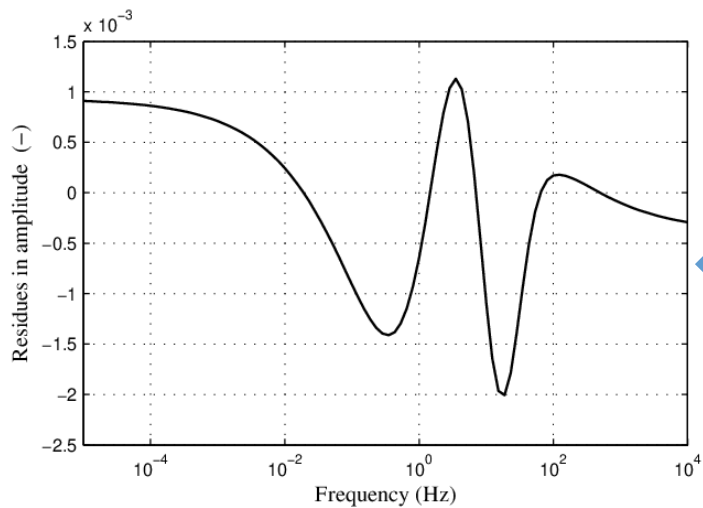
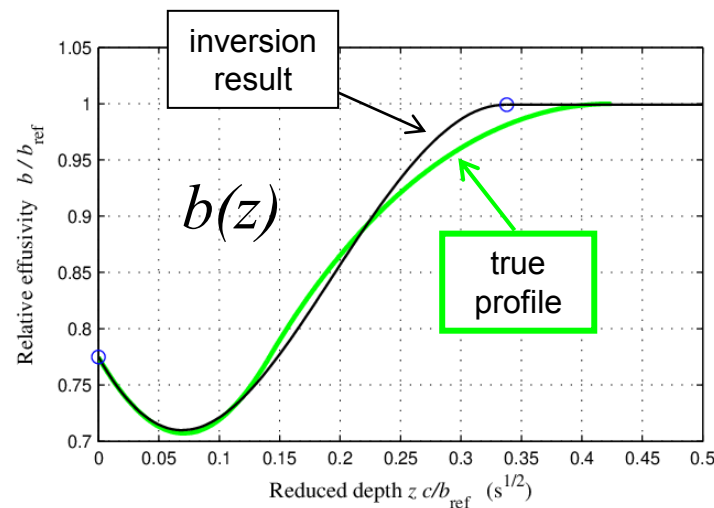
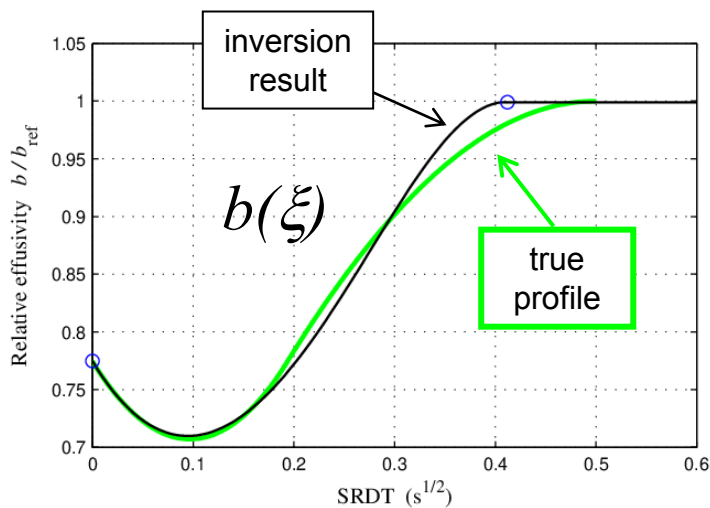
No "inversion crime"

Apparent effusivity $b(f)$ (0-order inversion)



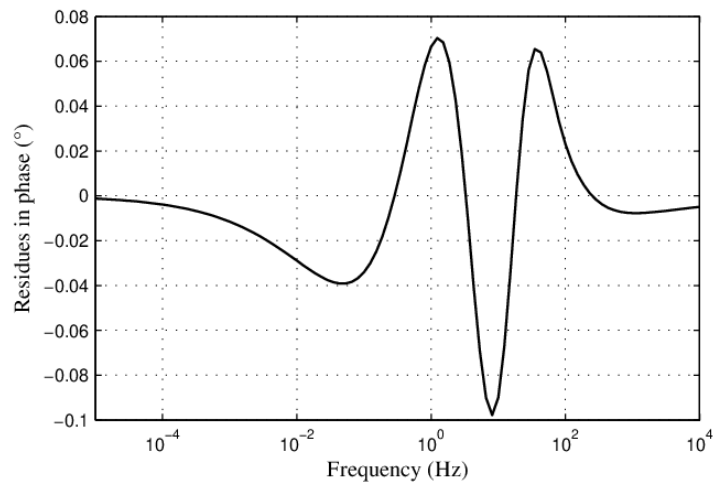
Inversion. Input data with no noise

Inversion attempt with *a priori* hypothesis on the unknown profile : **one $sech(\xi)$ layer + uniform bulk**



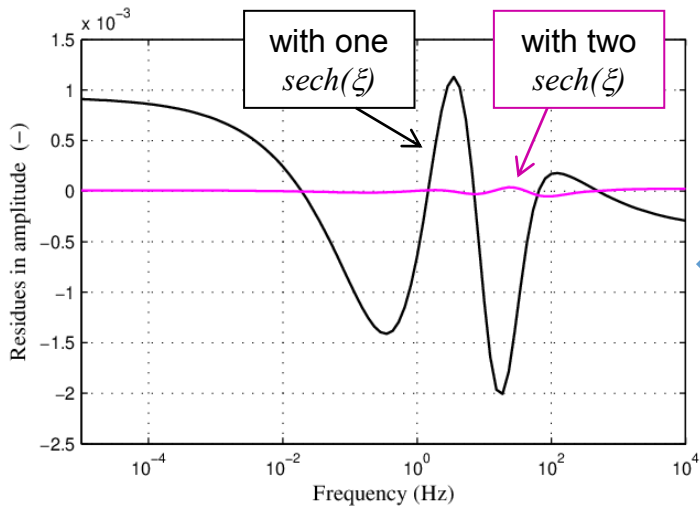
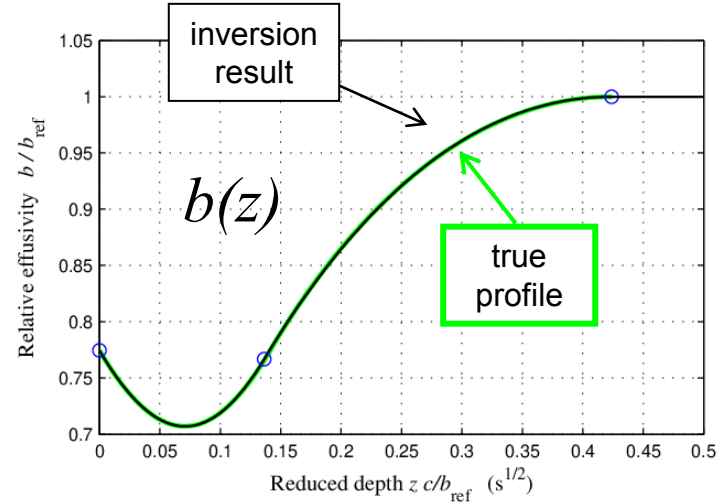
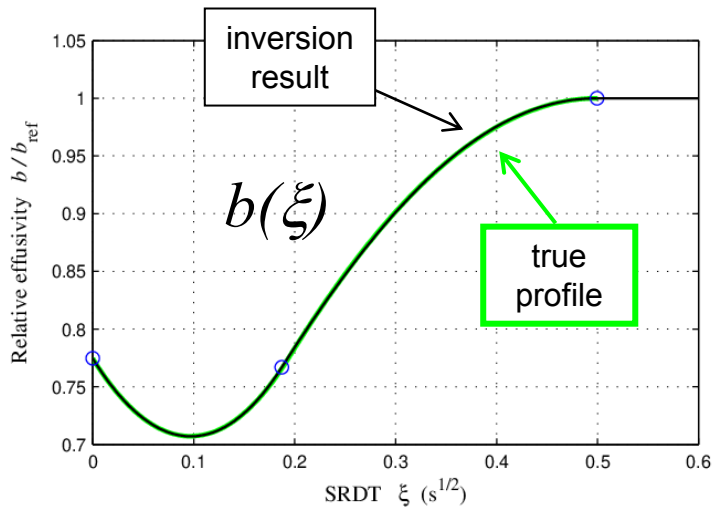
Temperature residues

Amplitude Phase



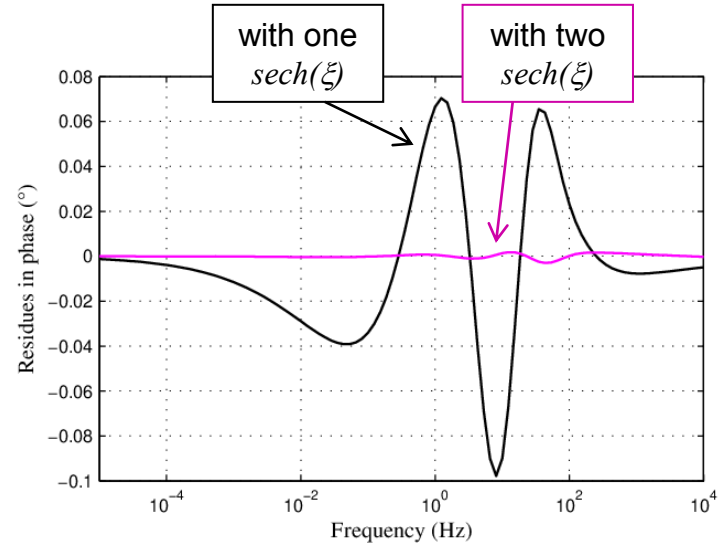
Inversion. Input data with no noise

Inversion attempt with *a priori* hypothesis on the unknown profile : **two $sech(\xi)$ layers + uniform bulk**



Temperature residues

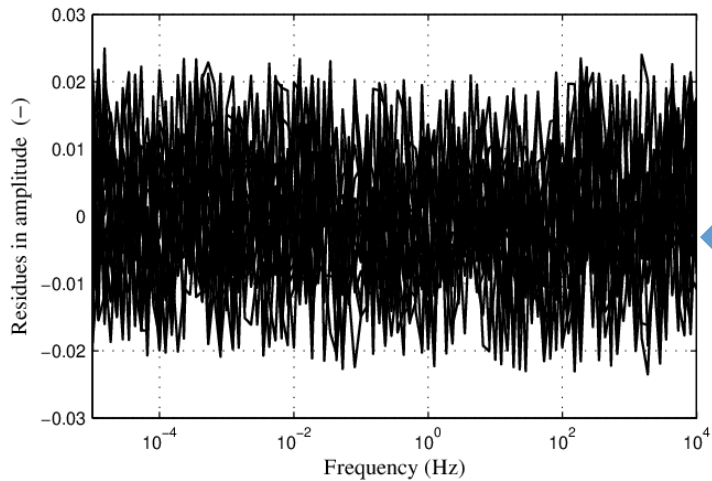
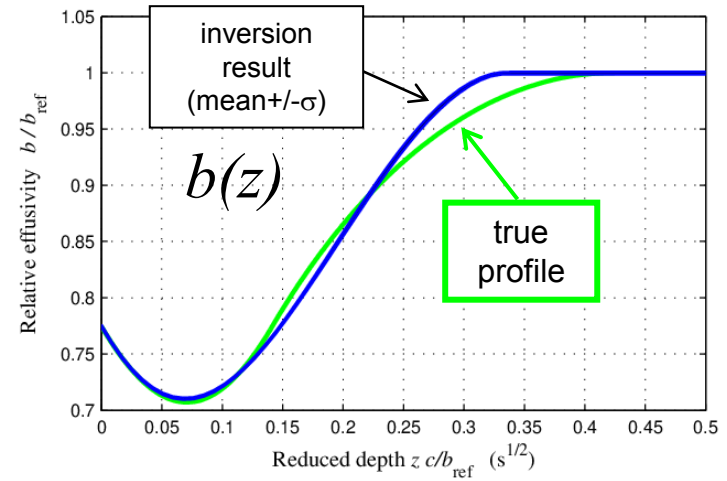
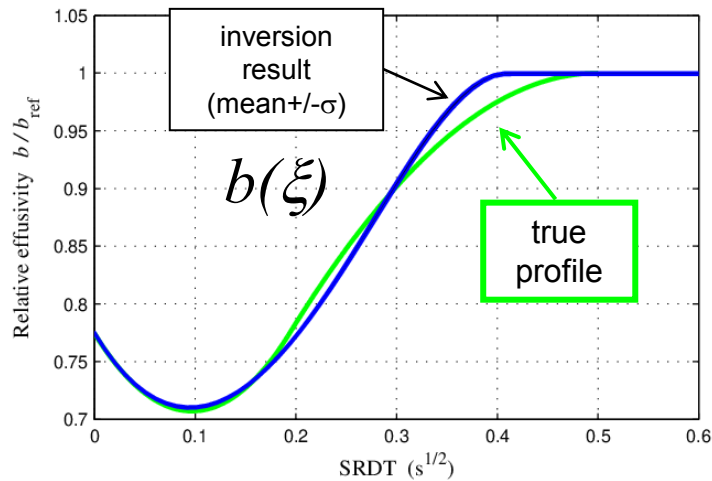
Amplitude Phase



Inversion. Input data with noise (1% on amplitude, 0.1° on phase)

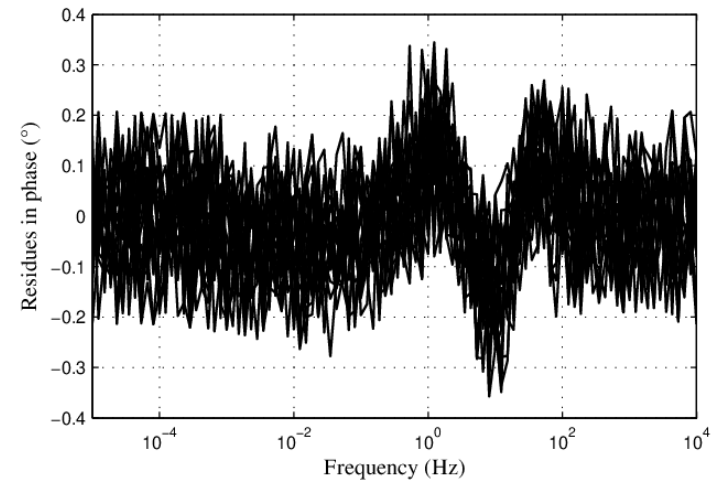
Inversion attempt with *a priori* hypothesis on the unknown profile : **one $\text{sech}(\xi)$ layer + uniform bulk**

Statistics with 20 virtual experiments



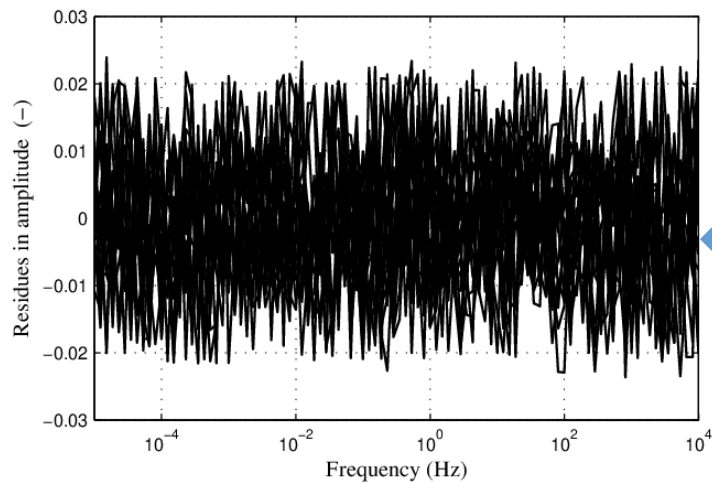
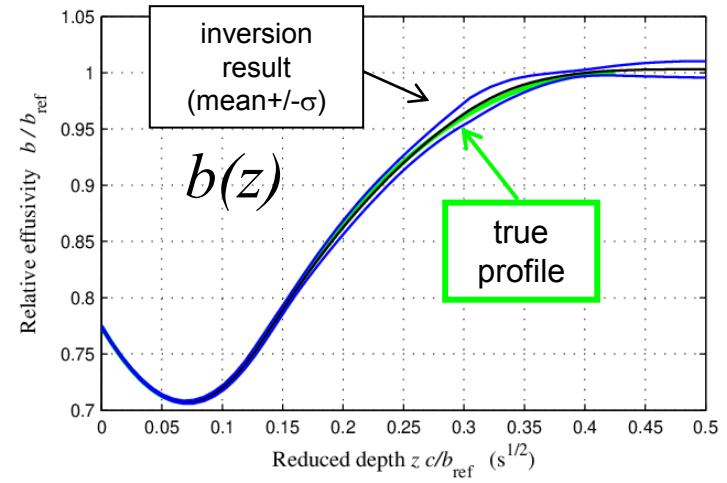
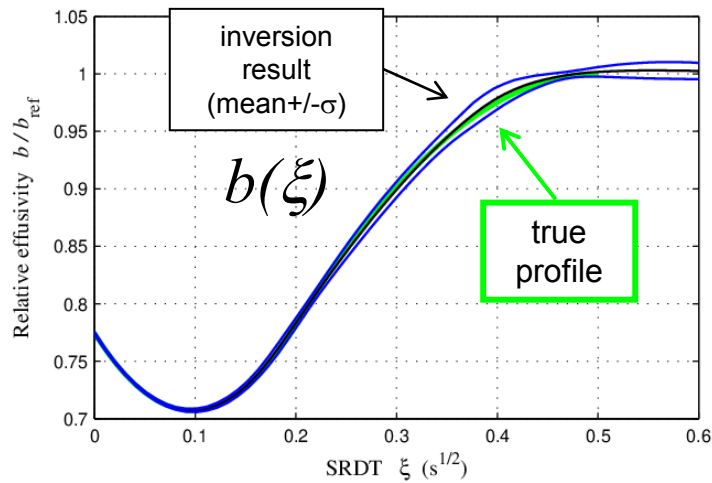
Temperature residues

Amplitude Phase



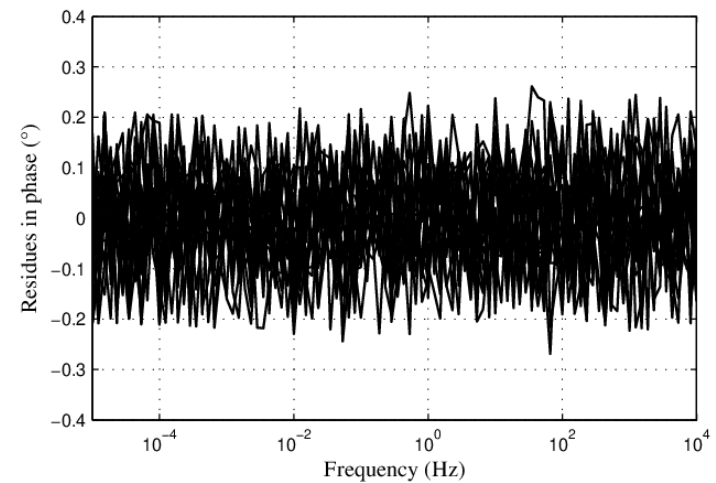
Inversion. Input data with noise (1% on amplitude, 0.1° on phase)

Inversion attempt with *a priori* hypothesis on the unknown profile : **two $sech(\xi)$ layers + uniform bulk**
Statistics with 20 virtual experiments



Temperature residues

Amplitude Phase



Thank you for your attention

Everything you always wanted to know about profiles (but were afraid to ask), is in:

$$\operatorname{sech}\left(\hat{\xi}\right)$$

- Krapez, *Int. J. Heat Mass Tr.*, 99, 485 (2016)
- Krapez, *J. Mod. Opt.*, 64, 1988-2016 (2017)
- Krapez, *Int. J. Thermoph.*, 39:86 (2018)
- Krapez, *J. Opt. Soc. Am.*, 35, 1039 (2018)

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