

# Protein polymerization simulation for amyloid diseases (Prion, Alzheimer's)

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# Outline

## □ A brief overview:

- The mathematical context
- The biological motivation and main goal
- The reference model

## □ 3 case studies

- A growth-nucleation model applied to Huntington's
- A growth-fragmentation model applied to Prion
- A new application of Lifshitz-Slyozov system

# The mathematical context

## □ Coagulation/fragmentation equations in physics

Lifshitz-Slyozov / Bekker-Döring equations

Application to dust formation, gelation, aerosols, etc.

Ball, Carr & Penrose (1986), Niethammer & Pego (2000), etc.

**Probabilistic school:** Bertoin (2006), Aldous & Pitman (1998), etc.

## □ (Size-)structured populations in biology

Applications for cancer cells, parasite infection etc.

Metz & Diekmann (1986), Gyllenberg & Thieme (1984)

Perthame & Ryzhik (2004), Escobedo, Laurençot & Mischler (2003) etc.

## Common point between:

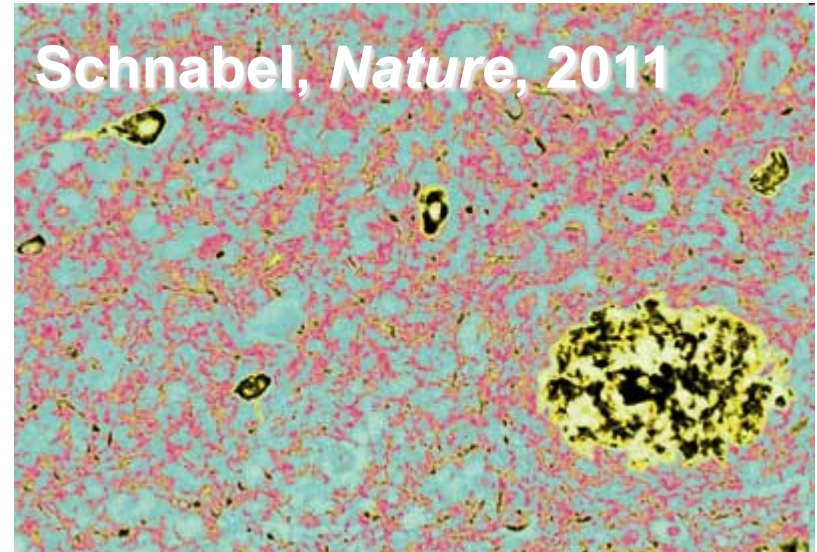
- Alzheimer's (illustrated)
- Prion (mad cow)
- Huntington's
- and some others (Parkinson's, etc)?

Neurodegenerative diseases  
characterized by

**abnormal accumulation  
of protein aggregates** called AMYLOIDS

Healthy state: **monomeric** protein  
(PrP Prion, A $\beta$  Alzheimer's, PolyQ Huntington's)

Disease state: **polymers**



## Main challenge:

### Key polymerization mechanisms

Address quantitatively major biological questions:  
Transient species? Most infectious polymer size?

Application to several proteins

PrPc (Prion), A $\beta$  (Alzheimer's), PolyQ (Huntington's)

In constant interaction with biologists

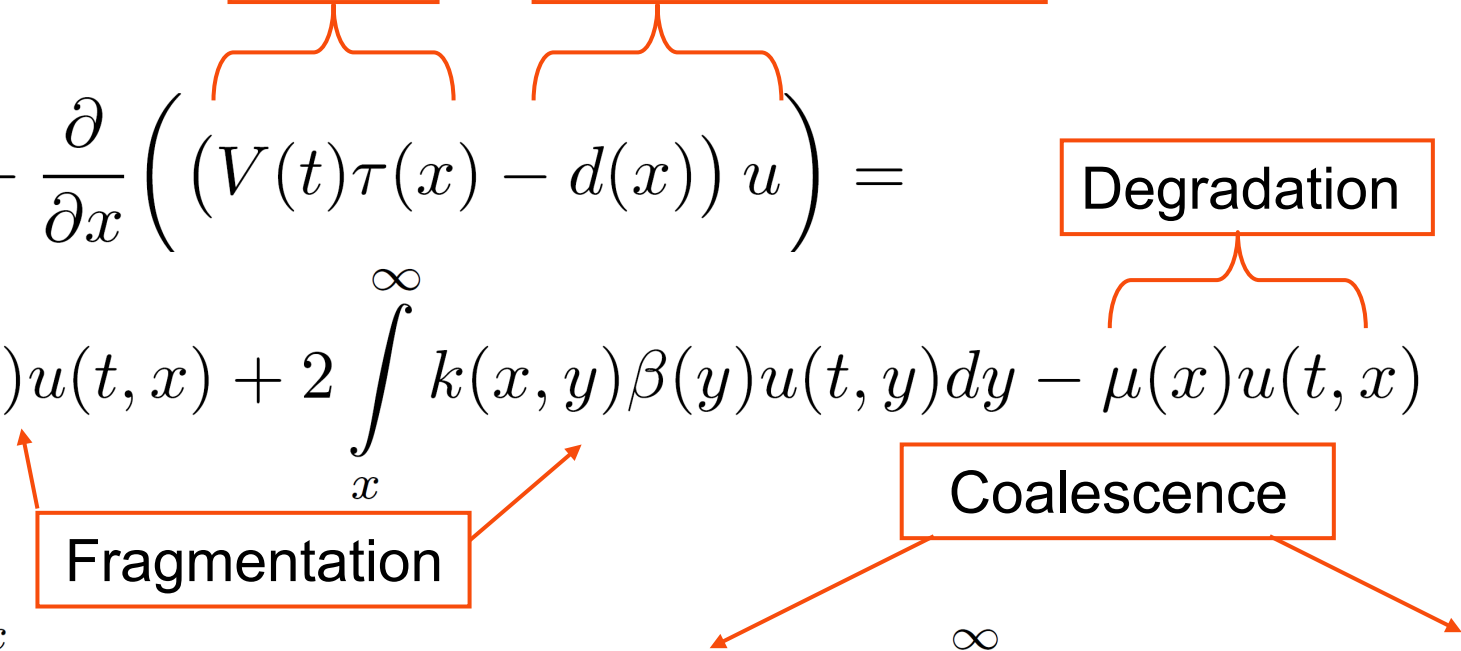
To design and validate model and experiments



# The reference PDE model

# A reference biologically-derived PDE model

$$\begin{aligned}
 & \frac{\partial u}{\partial t} + \frac{\partial}{\partial x} \left( \overbrace{(V(t)\tau(x) - d(x))}^{\text{Polym} \quad \text{Depolymerization}} u \right) = \overbrace{-\mu(x)u(t, x)}^{\text{Degradation}} \\
 & - \beta(x)u(t, x) + 2 \int_x^\infty k(x, y)\beta(y)u(t, y)dy - \underbrace{\mu(x)u(t, x)}_{\text{Coalescence}} \\
 & + \frac{1}{2} \int_0^x c(y, x-y)u(t, y)u(t, x-y)dy - \int_0^\infty c(x, y)u(t, x)u(t, y)dy,
 \end{aligned}$$



$u(t, x)$  concentration of polymers of size  $x$  at time  $t$

$V(t)$  concentration of monomers at time  $t$

# A reference biologically-derived PDE model

original derivation in D, Prigent, Rezaei et al, Plos One, 2012

Previous work: D, Goudon, Lepoutre, 2009,

Laurençot-Mischler, 2005, Collet, Goudon, Poupaud, Vasseur 2004

Formation

Degrad.

Depolym

Polymerization

$$\frac{dV}{dt} = \lambda - \mu_0 V + \int_0^{\infty} (d(x) - V \tau(x)) u(t, x) dx,$$

boundary condition: nucleation

$$u(t, x = 0) = \frac{k_{\text{on}} V^{i_0}}{k_{\text{off}} + \tau(0) V}$$

$i_0$ : size of the nucleus



# About the reference PDE model

## □ Present situation: **Oversimplifications**

Xue, Radford *et al*, PNAS (2008) - Knowles *et al*, Science (2009)

Lack of physical justification Silveira *et al*, Nature (2005)

## □ Our approach:

### **keep the original system**

- Nonlinear
- Nonlocal

### **Adapt it to specific biology-driven problems**

- Nucleation
- Prion model

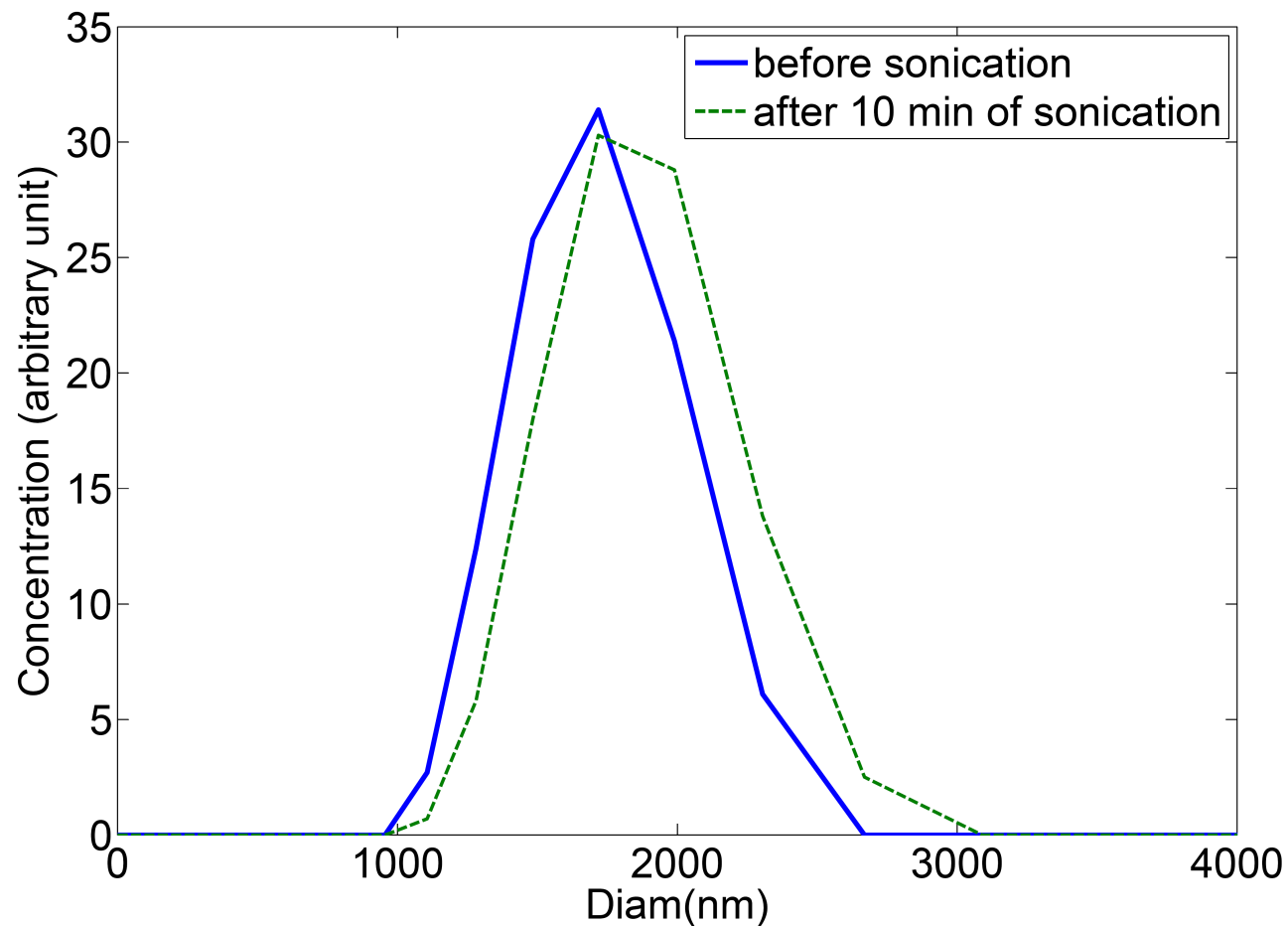
## Case study 1

A simple **nucleation** problem  
for PolyQ polymerisation (Huntington's disease):  
an identification question

(D, Prigent, Rezaei et al., Plos One, 2012)

## Case 1: Huntington's disease (PolyQ)

No fragmentation & No coalescence - experimental proof:



# A simple nucleation model

- ❑ No coalescence nor fragmentation (experimental proof)
- ❑ Here a still simplified version for clarity
- ❑ Nucleation – **what is the value of  $i_0$ ?**

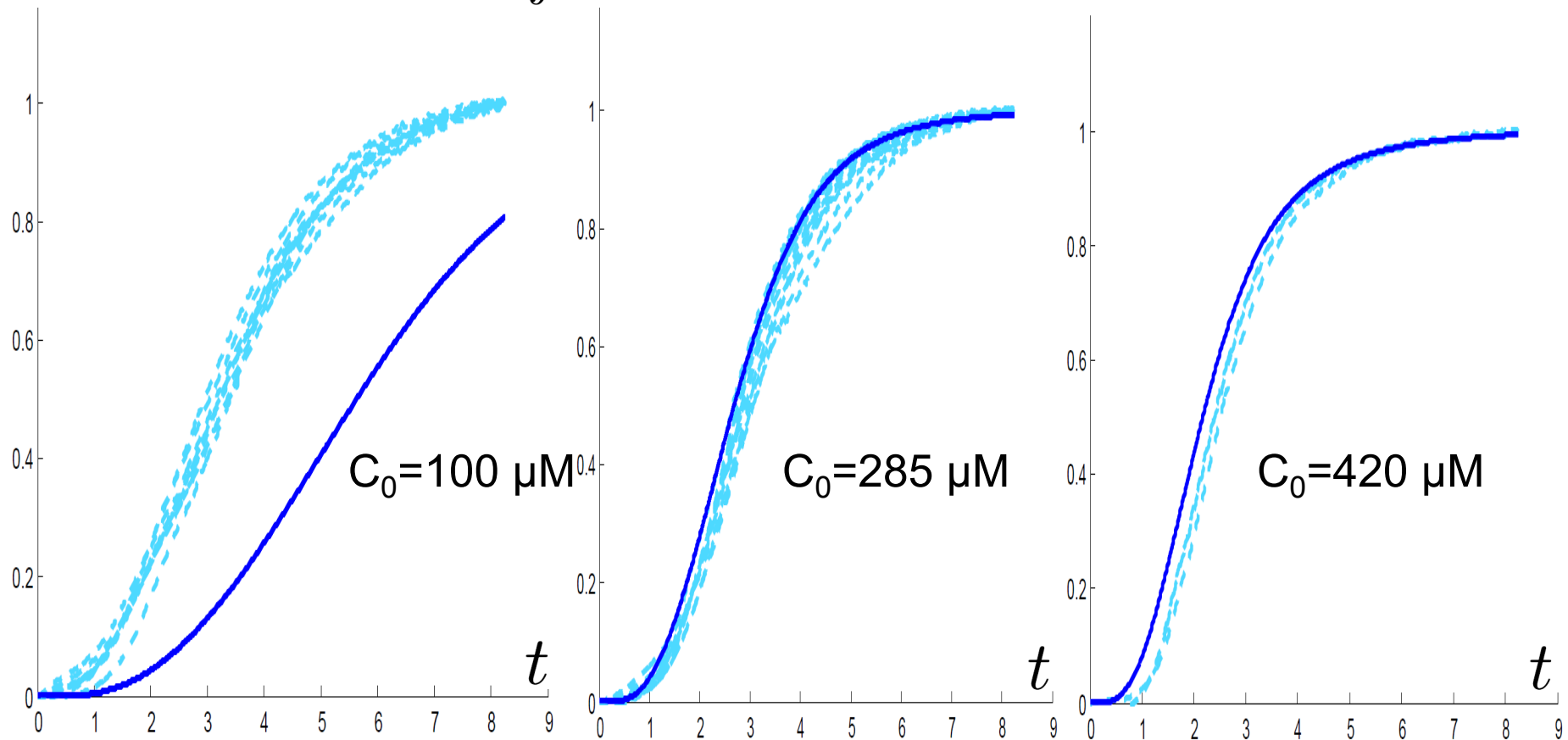
$$\frac{\partial u(t, x)}{\partial t} + V \frac{\partial}{\partial x} (\tau(x) u(t, x)) = 0,$$

$$\frac{dV}{dt} = -V \int_0^{\infty} \tau(x) u(t, x) dx, \quad u(t, x=0) = \frac{k_{\text{on}} V^{i_0}}{k_{\text{off}} + \tau(0)V},$$

# In vitro PolyQ spontaneous polymerization

Comparison **experiments** & **simulations** (with A. Ballesta, post-doc)

Polymerised mass:  $\int xu(t, x)dx$

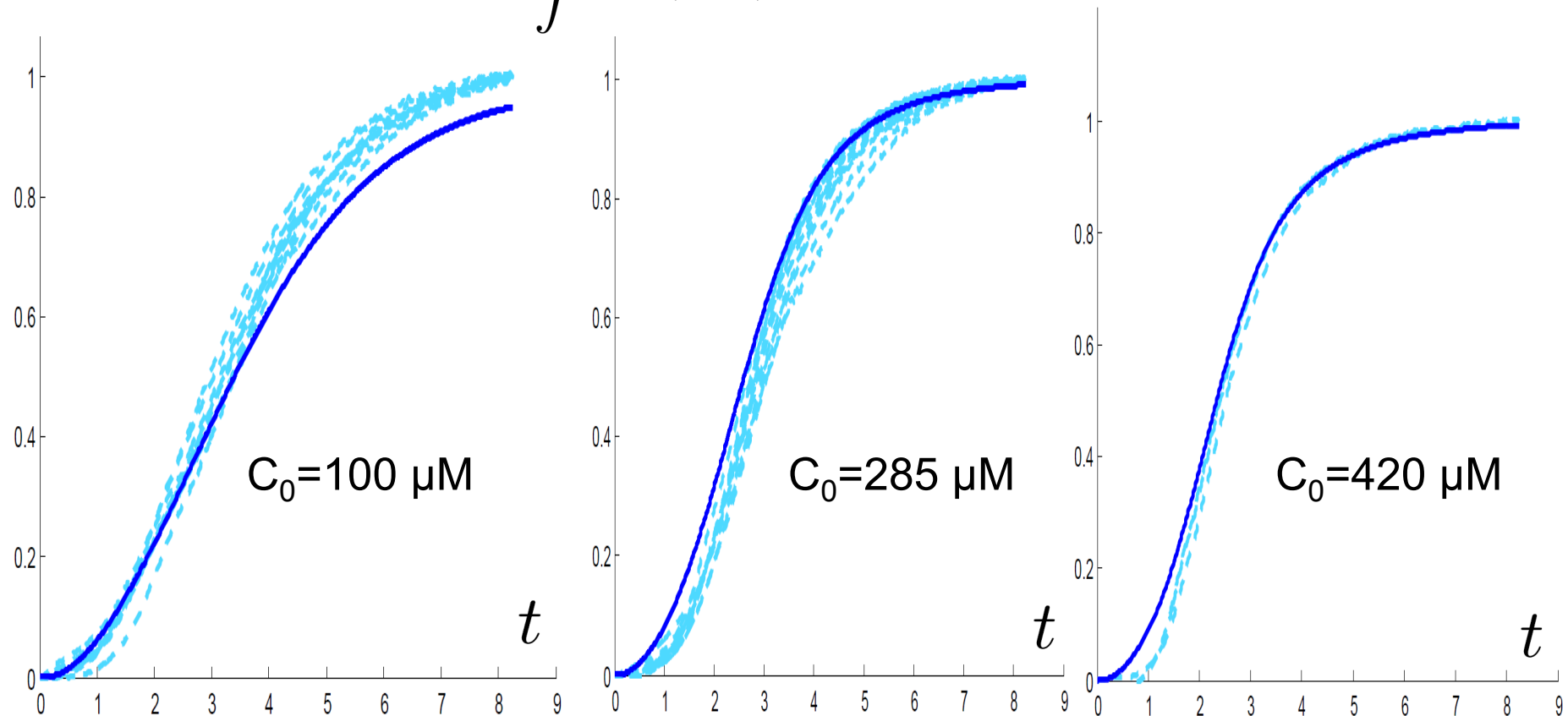


Nucleus size  $i_0=3$  – global error: 40% - **not satisfactory**

# In vitro PolyQ spontaneous polymerization

Comparison **experiments** & **simulations** (with A. Ballesta, post-doc)

Polymerised mass:  $\int xu(t, x)dx$



Nucleus size  **$i_0=1$**  – global error: 10%: **relevant**

# Open problems

- ❑ Sensitivity analysis (H.T. Banks)

Inverse problem: observability - methodology (D. Chapelle, P. Moireau)

- ❑ Stochastic model for intrinsic variability (P. Robert)

- ❑ Test and validate our predictions on new experimental data

## Case study 2

The **growth-fragmentation** equation  
and the **nonlinear** Prion model:


mathematical analysis

(Calvez, D, Gabriel, JMPA, 2012)



# The Prion model

First studied by Greer, Pujo-Menjouet, Prüss, Webb et al. (2004-2006)


$$\frac{\partial u(t, x)}{\partial t} + \frac{\partial}{\partial x} (V(t)\tau(x) u(t, x)) = -\beta(x)u(t, x) + 2 \int_x^\infty k(x, y)\beta(y)u(t, y)dy,$$
$$\frac{dV}{dt} = \lambda - \mu_0 V - V \int_0^\infty \tau(x)u(t, x)dx, \quad u(t, x = 0) = 0.$$

The growth-fragmentation / cell division equation:

## □ A rich model

Diekmann, Gyllenberg & Thieme (1984) – Escobedo, Mischler (2004) – etc.

## □ Recent inverse problem solution

Doumic, Perthame, Zubelli *et al.* (2009 to 2012)

# A counter-intuitive behaviour

**Theorem.** [Calvez, D, Gabriel, J. Math. Pures Appl. (2012)]

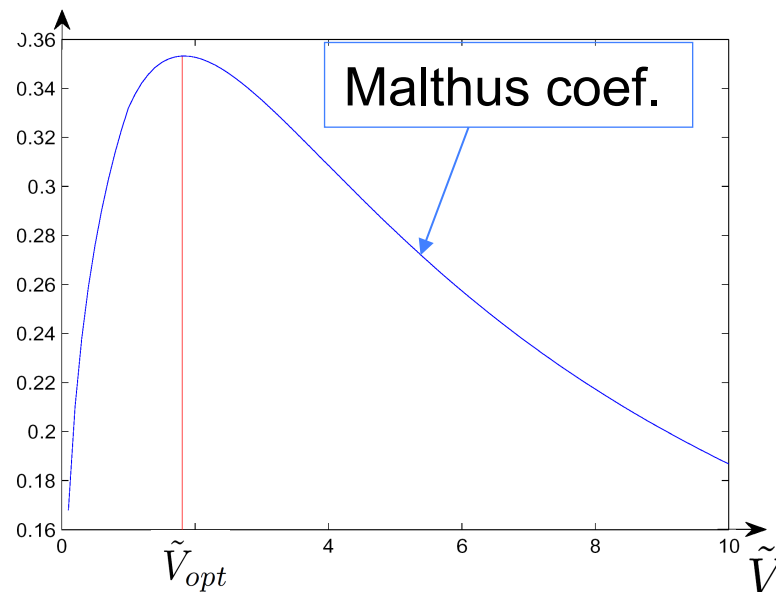
The Malthus coefficient (first eigenvalue) **does not** necessarily depend in a monotonous way on  $V$ .

*To be more specific, under technical assumptions, it behaves like the fragmentation rate  $\beta$  behaves:*

□ *around  $\infty$  if  $V$  tends to  $\infty$*

□ *or around 0 if  $V$  tends to 0*

*(+ eigenvector profile obtained by self-similarity)*



**Illustration:** example with  $\beta$  vanishing at 0 and  $\infty$

## Open problems linked to the growth-frag. eq.

- ❑ Nonlinear behaviour, spectral gap
- ❑ Asymptotics when no steady profile
- ❑ Inverse Problem for general fragmentation kernels  
(PhD of T. Bourgeron, in progress)
- ❑ Adapt to different growth pathways Rezaei et al, PNAS (2008)
- ❑ Include the nucleation step & coagulation

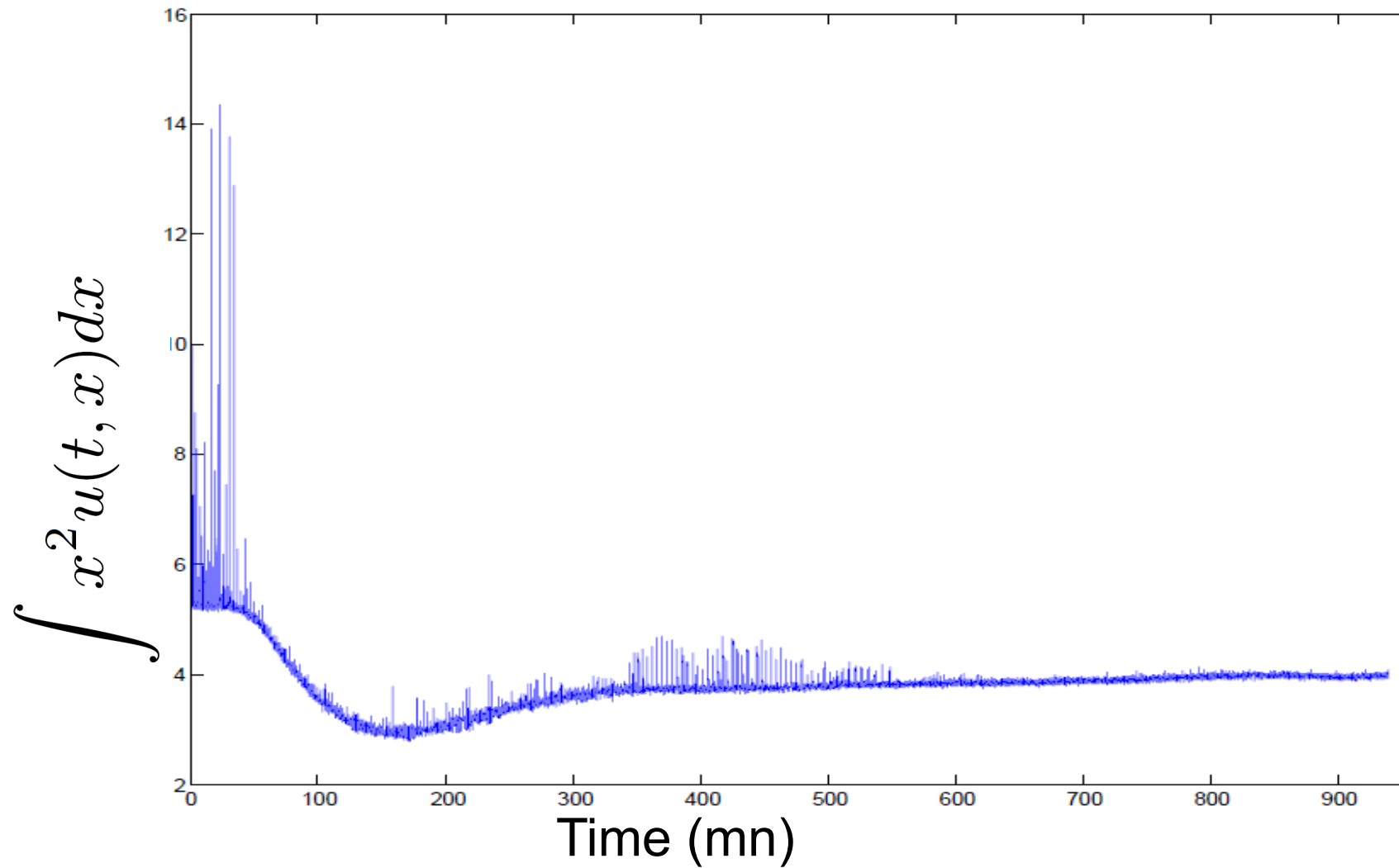
## Case study 3 (still in progress)

A **data-driven** problem and  
a new application for **Lifshitz-Slyozov** system:

Prion fibrils depolymerization

(PhD. Of H.W. Haffaf,  
in collaboration with P. Moireau, S. Prigent, H. Rezaei)

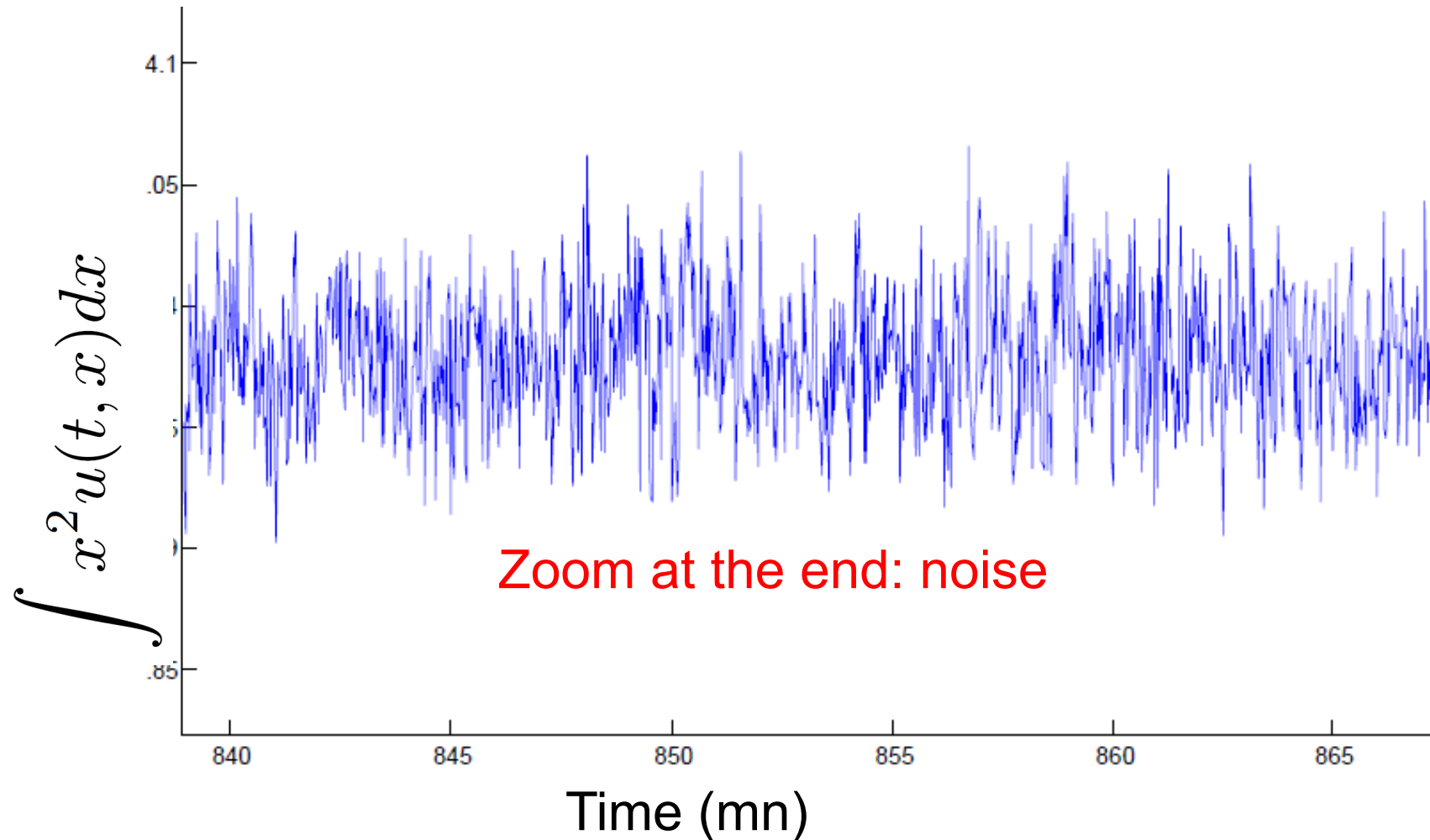
experiments by Human Rezaei and Joan Torrent



# Third case: a data-driven problem

## Prion fibrils depolymerization

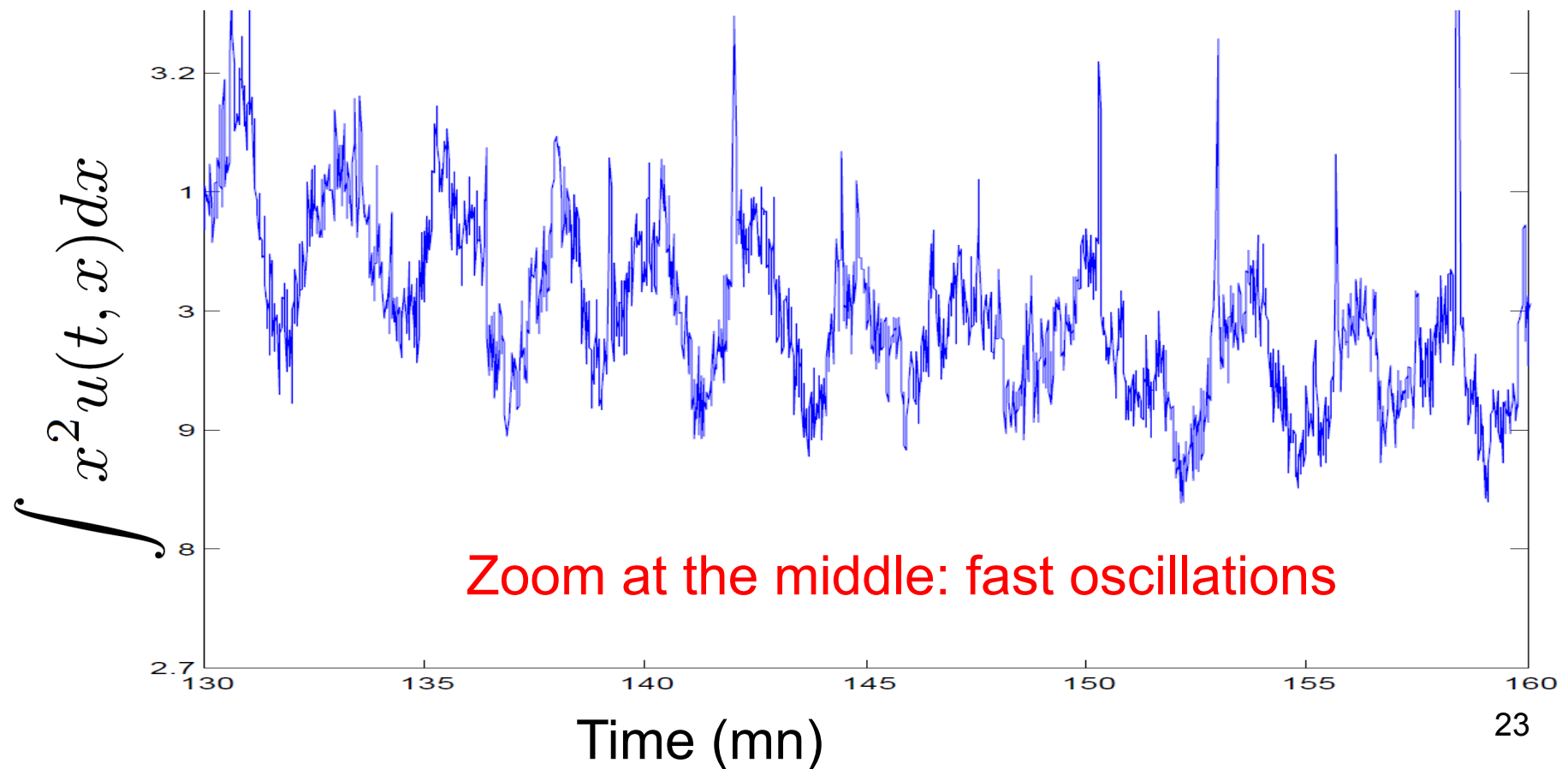
experiments by Human Rezaei and Joan Torrent



# Third case: a data-driven problem

## Prion fibrils depolymerization

experiments by Human Rezaei and Joan Torrent



## Simplest Model: the *Lifshitz-Slyozov* system (*Becker-Döring* : discrete in size)

$$\frac{\partial u}{\partial t} + \frac{\partial}{\partial x} \left( (V(t)\tau(x) - d(x))u \right) = 0,$$

$$\frac{dV}{dt} = \int_0^{\infty} (d(x) - V\tau(x))u(t, x)dx,$$

A seminal model – Lifshitz & Slyozov (1961) - **revisited**  
**new problems:**

- ❑ inverse Problem solution (with P. Moireau) ?
- ❑ How to modify it to understand the oscillations ?
- ❑ Dirac mass solutions and trend to equilibrium ?



# In a nutshell

## □ In Mathematics

- A new light on seminal models : many applications
- Inverse problem for fragmentation/coalescence
- A bridge between statistical and deterministic modelling of coalescence/fragmentation models

## □ In Biology and in Society

- Bring mathematical and numerical research to biologists: analysis will motivate new experiments
- Find the key mechanisms of polymerization
- Identify targets for therapeutics

To be continued...

the ERC starting grant

**MERCI JEAN-PIERRE!**

Simulation of the Kinetic Problem

for the Protein Polymerization in Amyloid Diseases  
(Prion, Alzheimer's)