Modelling nucleocytoplasmic transport with application to the intracellular dynamics of the tumor suppressor protein p53

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## Summary

### 1. A model for p53 intracellular dynamics

- biology of p53 basics
- a new model to reproduce its dynamics

### 2. A model for protein transport within the cell

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- biology of intracellular transport basics
- locating a single microtubule

## What is p53?

In 1979 a protein of molecular mass of 53 kDa was isolated. It was named **p53**.



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### p53 roles: the Guardian of the Genome

<u>After a stress</u> p53 acts as a **transcription factor**:

- blocks the cell cycle progress.
- repairs the DNA.
- launches apoptosis (programmed cell death).

It has a **huge** network of interactions- hard to model!



## Healthy or Stressed cell

In healthy cells p53 is dangerous, Mdm2 keeps a balanced cellular level of p53.

- Mdm2 induces degradation of p53 and blocks its nuclear import.
- p53 transcribes the mRNA of Mdm2.

In <u>stressed cells</u> p53 concentration rises to **prevent** the transmission of harmful **mutations**.



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### Two different "states"



### How to switch from a state to the other?

#### **Healthy cells**: blocked import + increased degradation



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### How to switch from a state to the other?

**Stressed cells**: modifications block p53-Mdm2 interactions. Principal factor in case of DNA damage: **ATM** 



## p53 dynamics

#### the p53-Mdm2 network has an oscillatory behavior



Figure: in vitro experiments

## A time-lapse movie of one cell nucleus after exposure to a 5Gy gamma dose of a MCF7 breast cancer cell line

Oscillations and variability in the p53 system Geva-Zatorsky et al., Molecular Systems Biology 2006

doi: 10.1038/msb4100068

### Mathematical models of p53

Why study p53?

- explain oscillations (which mechanism): HOW?
- understanding its behaviour: WHY?

Literature **ODE** models  $\rightsquigarrow$  mean concentrations - depend on time

• Use **delay**: 
$$\frac{du}{dt}(t) = f(t - \tau)$$

Use negative and positive feedback.



Lev-Bar-Or et al. 2001, Monk et al. 2003, Ma et al. 2005, Ciliberto et al. 2005, Chickarmane et al. 2007, Ouattara et al. 2010

### Mathematical models of p53

#### Introducing space:

- "Operations" in Nucleus and Cytoplasm are not homogeneous (transcription-translation-degradation depends on compartment).
- ► Temporal dynamics: different space scales (p53's "radius" is 2,4 nm - diameter of a cell can be 30µm)



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Sturrock et al. - JTB 2011, Sturrock et al. - Bull Math Biol. 2012

### Model: biological hypotheses





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Model variables (nuclear and cytoplasmic concentrations)

- ▶ [p53]<sup>(n)</sup> and [p53]<sup>(c)</sup>
- active p53:  $[p53_p]^{(n)}$  and  $[p53_p]^{(c)}$
- ▶ [*Mdm*2]<sup>(n)</sup> and [*Mdm*2]<sup>(c)</sup>
- $[mdm2_RNA]^{(n)}$  and  $[mdm2_RNA]^{(c)}$

All variables diffuse within each compartment



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### The Model: Nucleus



## The Model: Cytoplasm

$$\begin{cases} \frac{\partial [p53]}{\partial t} = k_{S} + k_{dph} \frac{[p53_{p}]}{K_{dph} + [p53_{p}]} + d_{p}\Delta [p53] - k_{1}[Mdm2] \frac{[p53]}{K_{1} + [p53]} \\ -k_{3}ATM \frac{[p53]}{K_{ATM} + [p53]} - \delta_{p53}[p53] \end{cases}$$

$$\frac{\partial [Mdm2]}{\partial t} = d_{m}\Delta [mdm2] + \overbrace{k_{tr}[mdm2_{RNA}]}^{translation} - \delta_{m}[mdm2] \\ \frac{\partial [mdm2_{RNA}]}{\partial t} = d_{mRNA}\Delta [mdm2_{RNA}] - k_{tr}[mdm2_{RNA}] \\ -\delta_{mRNA}[mdm2_{RNA}] \\ \frac{\partial [p53_{p}]}{\partial t} = k_{3}ATM \frac{[p53]}{K_{ATM} + [p53]} + d_{p'}\Delta [p53_{p}] - k_{dph} \frac{[p53_{p}]}{K_{dph} + [p53_{p}]} \end{cases}$$

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#### Kedem-Katchalsky boundary conditions

$$\begin{cases} d_{p} \frac{\partial [p53]^{(n)}}{\partial \mathbf{n}} = p_{p53}([p53]^{(c)} - [p53]^{(n)}) = -d_{p} \frac{\partial [p53]^{(c)}}{\partial \mathbf{n}} \\ d_{p'} \frac{\partial [p53_{p}]^{(n)}}{\partial \mathbf{n}} = p_{pp}[p53]^{(c)}_{p} = -d_{p'} \frac{\partial [p53_{p}]^{(c)}}{\partial \mathbf{n}} \\ d_{m} \frac{\partial [Mdm2]^{(n)}}{\partial \mathbf{n}} = p_{mdm2}([Mdm2]^{(c)} - [Mdm2]^{(n)}) = -d_{m} \frac{\partial [Mdm2]^{(c)}}{\partial \mathbf{n}} \\ d_{mRNA} \frac{\partial [mdm2_{RNA}]^{(n)}}{\partial \mathbf{n}} = -p_{mRNA}[mdm2_{RNA}]^{(n)} = -d_{mRNA} \frac{\partial [mdm2_{RNA}]^{(c)}}{\partial \mathbf{n}} \end{cases}$$

on the common boundary  $\Gamma$ .



A. Cangiani and R. Natalini. A spatial model of cellular molecular trafficking including active transport along microtubules. Journal of Theoretical Biology, 2010.

## The Spatial Environment(s!)

The spatial environment is the cell

compartmental model (ODE system)

$$\mathsf{NUCLEUS}\longleftrightarrow\mathsf{CYTOPLASM}$$

spatial model (PDE system): 1D and 2D domains



Let **S** be one of the species S = p53, Mdm2, mdm2RNA, or  $p53_p$ ,  $S^{(n)}$  its nuclear concentration,  $S^{(c)}$  its cytoplasmic concentration.

$$\frac{dS^{(n)}}{dt} = \text{Nuclear Reactions} - \rho_{S} V_{r} (S^{(n)} - S^{(c)}) \\ \frac{dS^{(c)}}{dt} = \text{Cytoplasmic Reactions} + \rho_{S} (S^{(n)} - S^{(c)})$$

where  $V_r = \frac{\text{cytoplasmic volume}}{\text{nuclear volume}}$ 

## ODE system: positivity of solutions and sustainend oscillations

### Proposition

The positive quadrant is invariant for the flow of the system if ATM > 0.

#### Numerics

Sustained oscillations appear for  $ATM_{min} < ATM < ATM_{max}$ .



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## Supercritical Hopf bifurcation and oscillations

 ATM and oscillations: existence of a supercritical Hopf Bifurcation



red dotted curve: unstable equilibrium point + marked curve: amplitude of oscillations blue curve: period of the oscillations (minutes)

 Hypothesis of the Hopf bifurcation theorem satisfied by our model -numerical proof



### Simulations in a 1-dimensional PDE system



Figure: Simulations of the 1-dimensional PDE system; Left: temporal evolution of p53 nuclear concentrations. Right: 'Bifurcation diagram' over ATM

# The 1-dimensional environment does not permit a 'spatial' analysis



Figure: Simulations of the 1-dimensional PDE system; Left: 'Bifurcation diagram' over the diffusion coefficients . Right: temporal evolution of p53 nuclear concentrations for different diffusion values

### Simulations in a 2-dimensional PDE system



# Oscillations appear for realistic diffusion and permeability values

Parameter	Description	Ref. values	values for oscillations
Vol	Total area of the simulations domain	$300 \mu m^2$	$Vol > 0(\mu m^2)$
Vr	Volume ratio Cytoplasm:Nucleus	10	$2 \leq V_r \leq 100$
p <sub>i</sub>	Protein permeabilities	$10 \mu m/{ m min}$	$5 \leq p_S \leq 5000 (\mu m/{ m min})$
Di	Protein diffusion coefficients	$600 \mu m^2/min$	$10 \leq D_S \leq 1000 (\mu m^2/{ m min})$

Table: Parameter ranges of spatial values for which oscillations occurs. the ratio "protein diffusion:mRNA diffusion" has been fixed to 100:1.



D. Fusco et al., Curr. Biol 2003, Shav Tal et al. Science 2004, Hong et al. J Biomater Nanobiotechnol 2010 👘 🤊 🔍

## The geometry of the domain does not influence the dynamics of the system



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- Spatial physiological model that reproduces the oscillations
- ATM as a 'natural' bifurcation value
- Oscillations appear for realistic diffusion and permeability values
- The geometry of the domain does not influence the dynamics of the system

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### Future directions - Part I

- include the import and export pathways (NLS-NES)
- in silico experiments with drugs
- How the mutations act on the dynamics?
- 3D extension



Figure: A basic example of DNA repair: a few oscillations occur. Here the bifurcation parameter ATM is a variable of the system

Also we need to compare the model with real biological data! ,

### 1. A model for p53 intracellular dynamics

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biology of intracellular transport - basics

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locating a single microtubule

### Diffusion to model transport

Transport of proteins is modeled by **DIFFUSION**.

Diffusion alone can be an efficient mechanism...



in such a crowded environment?

Diffusion means **average** Direction is random Is this mechanism **always** efficient?

### Transport a signal

Approach faster to the nucleus  $\implies$  use **MICROTUBULE** structure.



Fig: Wikimedia commons.

Microtubules (MTs) are filaments that carry out several activities (motility of the cell, distribution of vescicles and organelles within the cell). Microtubule Structure

- Filaments of α and β tubulin dimer anchored at the centrosome (MTOC-Microtubule Organizing Centre).
- MTOC is near the nucleus.
- ► They have a polarity (plus and minus end) ⇒ direction
- Radial Structure

### Transport a message

Some proteins such as the pRb (a **TUMOR SUPPRESSOR** protein) use MTs to accumulate **efficiently** in the nucleus.

MTs integrity and dinamicity is **not** a **REQUIREMENT** but still useful for **efficient** accumulation.



Figure: Quantitative analysis of nuclear import in cells treated with TAXOL.*Roth et al, Traffic 2007; 8: 673686* 

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### Here's a CARTOON of how it works...



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### Previous works

Point out the importance of MT for efficient transport within the cell



Cangiani-Natalini, J Theor Biol. 2010 Dec 21;267(4):614-25



uter: andrea Sun Sep 14 15:25:31 2008

Smith one dimensional model: lateral diffusion is supposed to homogenize any concentration gradient. *Smith-Simmons, Biophys J. 2001 Jan;80(1):45-68.* 

## The model

### We introduce a simplified 2-dimensional model



Figure: Considered area of the cytoplasm:  $\Omega = [0, L_x] \times [0, L_y]$ . The yellow area  $(I \times J = [x_{In}, x_{Fi}] \times [y_0 - \delta, y_0 + \delta])$  is the attraction area of the microtubule filament, the red strip is the MT in  $y_0$ .

### Main features:

- positioning the microtubule
- considering one way motor protein
- cargo and cargo + protein representation: bi-dimensional and 1-dimensional equations

### The Mathematical Model

We define: u, v and W (free cargo, cargo+motor and transported cargo).

Applying **Fick**'s law of diffusion and **Mass Action Law** for kinetic Reactions we get:

$$\begin{cases} \frac{\partial u}{\partial t} = d_u \Delta u - ku + k_- v, & \text{in } \Omega_c, \\\\ \frac{\partial v}{\partial t} = d_v \Delta v + ku - k_- v - k_1 v \mathbb{1}_{I \times J} + k_{-1} W \frac{\mathbb{1}_{I \times J}}{|J|} \\ + c W(x_{Fi}) \delta_0(x - x_{Fi}, y - y_0), & \text{in } \Omega_c, \\\\ \frac{\partial W}{\partial t} + c \frac{\partial W}{\partial x} = -k_{-1} W + k_1 \int_J v dy, & \text{in } ]x_{In}, x_{Fi}[. \end{cases}$$



### Boundary conditions

We suppose the microtubules homogeneously distributed within the cell  $\implies$  on the long side of the domains we use periodic boundary conditions.

$$\begin{cases} \frac{\partial u}{\partial n} = 0, \\ \frac{\partial v}{\partial n} = 0, & \text{on } \Gamma_4, \\ d_u \frac{\partial u}{\partial n} + p_u u = 0, \\ d_v \frac{\partial u}{\partial n} + p_v v = 0, & \text{on } \Gamma_2, \\ w(x_{ln}) = 0. \end{cases}$$



Left: Neumann homogeneous boundary conditions no crossing of the membrane (cytoplasmic side). Right: outgoing flow proportional to the species concentration (Robin boundary condition).

### Results

$$\begin{split} \phi_u(t) &= -d_u \int_0^{L_y} \nabla u(\bar{x}, y) \cdot \mathbf{n}(\bar{x}, y) dy, \\ \phi_v(t) &= -d_v \int_0^{L_y} \nabla v(\bar{x}, y) \cdot \mathbf{n}(\bar{x}, y) dy, \end{split}$$

integrating over time we define:

$$F_u(t) = \int_0^t \phi_u(t) dt$$
 and  $F_v(t) = \int_0^t \phi_v(t) dt$ .



## Detachment and attachment rates from the MT increase the total flow

$$k_1$$
 : attachment rate,  $k_{-1}$  : detachment rate  $au_{on} = rac{1}{k_{-1}}$   $au_{off} = rac{1}{k_1}$ 



We couple our model with a model of import pathway and we add a nuclear compartment.



### Adding the nuclear compartment







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## The microtubule attracts the cargo and its import is slowed down



- No import pathway: the macromolecules flow increases with MT activity (diffusion coeff up to 6µm<sup>2</sup>/s)
- No import pathway: detachment and attachment rates from the MT increase the total flow

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Import pathway: the competition between importin and microtubule subtracts free cargo to import

## Future Directions - Part II

 Highlight the importance of microtubule activity in NLS proteins transport (Ran Pathway).



- Various geometries
- basis for studying the transmission of DNA vaccines (Maria Grazia Notarangelo Ph.D Thesis)



### Modelling nucleocytoplasmic transport with application to the intracellular dynamics of the tumor suppressor protein p53

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