# Reaction-diffusion waves in biological applications

V. Volpert (CNRS, Univ. Lyon 1)

 $\frac{\partial u}{\partial t} = \frac{\partial^2 u}{\partial x^2} + F(u)$ 

heat or mass production

mass diffusion or heat conduction

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 Heat explosion
 (Semenov, Frank-Kamenetskii, 1930s)

 $= \Delta u + e^{u}$ 



Figure 1: Explosion thermique

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Pattern formation (Turing, 1952)

$$\frac{\partial u}{\partial t} = d_u \frac{\partial^2 u}{\partial x^2} + F(u,v)$$
$$\frac{\partial v}{\partial t} = d_v \frac{\partial^2 v}{\partial x^2} + G(u,v)$$



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 $\frac{\partial u}{\partial t} = d_u \frac{\partial^2 u}{\partial r^2} + F(u,v)$  $\frac{\partial v}{\partial t} = d_v \frac{\partial^2 v}{\partial r^2} + \mathbf{G}(\mathbf{u}, \mathbf{v})$ 



### Reaction-diffusion waves







W'' + C W' + F(W) = 0

### First works on chemical waves (1906)

#### Propagation of Chemical Reactions in Space

Robert Luther Leipzig, Germany

#### Translated by:

Regina Amold and Kenneth Showatler Department of Ohemistry, West Virginia University, Morgantown, WV 26506 John J. Tyson Department of Biology, Virginia Polytechnic Institute and State University, Biaokaburg, VA 24061

The neutral alkyl sulfates are very stable in aqueous solution but slowly give off sulfuric acid upon acidification. If I introduce some acid on one end of the tube then, under the catalytic influence of H<sup>+</sup>, hydrolysis ensues and new H<sup>+</sup> ions are formed. These ions diffuse to the right and cause the formation of more acid. In this way, the decomposition slowly moves through the tube.

The velocity of propagation is small, only a few centimeters per hour. Based on theory, this is to be expected. In principle, however, there is nothing to prevent any large velocity since the velocity of propagation (V) is given by

$$V = a\sqrt{K \cdot D \cdot C}$$

Geheimrat Nernst—Berlin: Who has derived this formula? Professor Luther—Leipzig: Myself. Geheimrat Nernst—Berlin: But this is not published yet? Professor Luther—Leipzig: No, but it is a simple consequence of the corresponding differential equation.

where a is a numeric factor, D a diffusion coefficient, C a a? ation, and K a rate constant. When K increases tly, so does the velocity of propagation.

Comparison with propagation in nerve impulse

Comparison with combustion waves (cf. Mikhelson)

Reaction-diffusion waves: the beginning (the 1930s)

$$\frac{\partial u}{\partial t} = \frac{\partial^2 u}{\partial x^2} + F(u)$$

 Propagation of dominant gene (Fisher and KPP) Cold flames or branching chain reactions (Semenov)

Combustion (Zeldovich and Frank-Kamenetskii)





# Reaction-diffusion waves in biological applications

### Ecology

Physiology

**Ecological** invasions

Competition of species

**Prey-predator** 

Speciation

Normal

Pathological

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# Reaction-diffusion waves in physiology

#### Excitable medium (nerve impulse, heart)

АМ. ЖАБОТИНСКИЙ КОНЦЕНТРАЦИОННЫЕ АВТОКОЛЕБАНИЯ



### **Blood coagulation**





F. Ataullakhanov et al.

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# Reaction-diffusion waves: spreading diseases

Damaged part of the tissue grows in time

Tumor growth Inflammation Infection Neurodegenerative disease

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# Tumor growth: excessive proliferation of malignant cells

$$\frac{\partial u}{\partial t} = d \, \frac{\partial^2 u}{\partial x^2} + au(1-u)$$





Simulations (hybrid model)

# Leukemia: competition of normal and malignant cells





Normal bone marrow Leukemic bone marrow



 $\sim 1/1000$  live with leukemia or in remission

Five year relative survival rate: 14% in 1960, 54% in 2005

 Possible causes: radiation, chemicals, but mostly unknown

Median patient age at diagnosis
66 years; 27% of all cancer cases
for children

# Concise cell biology for mathematicians: cell motion and division





### The model of cell competition

$$\begin{cases} \frac{\partial P}{\partial t} = D_P \frac{\partial^2 P}{\partial x^2} + H + (s - d)P(P_0 - P - Q) - aP, \text{ Normal} \\ \frac{\partial Q}{\partial t} = D_Q \frac{\partial^2 Q}{\partial x^2} + (s_m - d_m)Q(P_0 - P - Q) - a_mQ, \text{ mutated} \end{cases}$$

s, d, a – rates of self-renewal, differentiation, apoptosis

Mutation strength

$$M = \frac{s_{m-d_m}}{s-m} \frac{a}{a_m}$$

M small: disease free equilibrium is glob asym stable M large: Leukemia development (reac-diff wave)

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# Atherosclerosis: chronic inflammation in blood vessel walls

#### Vessel walls become thick



Figure 1: Plaque disruption and thrombosis. A. A stenotic coronary plaque containing a huge atheromatous core that is separated from the vascular lumen by a very thin cap of fibrous tissue, ie, a "vulnerable plaque". The fibrous cap is disrupted with superimposed nonocclusive luminal thrombosis. B. Higher magnification of the plaque-thrombus interface. The fibrous cap is very thin (between arrows) and heavily infiltrated by foam cells (fc), probably of macrophage origin. C: contrast medium injected post mortem; T: thrombus

#### Inflammation development



Blood flow changes; plaque rupture; oxygen supply



#### Sites of atherosclerosis



## Atherosclerosis and cholesterol (Genieys, El Khatib, VV, MMNP, 2007)



$$\begin{cases} \frac{dM}{dt} = f_1(A) - \lambda_1 M\\ \frac{dA}{dt} = f_2(A)M - \lambda_2 A \end{cases}$$

$$f_1(A) = \frac{\alpha_1 + \beta_1 A}{1 + A/\tau_1}$$
  $f_2(A) = \frac{\alpha_2 A}{1 + A/\tau_2}$ 



**Cholesterol level:** 

low

#### intermediate

high

## Atherosclerosis: reactiondiffusion waves

$$\begin{pmatrix} \frac{\partial M}{\partial t} &= d_1 \frac{\partial^2 M}{\partial x^2} + f_1(A) - \lambda_1 M \\ \frac{\partial A}{\partial t} &= d_2 \frac{\partial^2 A}{\partial x^2} + f_2(A)M - \lambda_2 A$$











# 2D model: nonlinear boundary conditions



N. Apreutesei, VV

$$\frac{\partial M}{\partial t} = d_M \Delta M - \beta M,$$
$$\frac{\partial A}{\partial t} = d_A \Delta A + f(A)M - \gamma A + b,$$

in the two-dimensional strip  $\Omega \subset \mathbb{R}^2$ ,

$$\Omega = \{(x, y), -\infty < x < \infty, \ 0 \le y \le h\}$$

with the boundary conditions

$$y=0: \ \frac{\partial M}{\partial y}=0, \ \frac{\partial A}{\partial y}=0, \ y=h: \ \frac{\partial M}{\partial y}=g(A), \ \frac{\partial A}{\partial y}=0$$

Cellular automata (Poston, MMNP, 2007)



## First conclusion

Tumor growth, atherosclerosis, other spreading diseases represent reactiondiffusion waves

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## Fisher – KPP equation: propagation of dominant gene

$$\frac{\partial u}{\partial t} = d \; \frac{\partial^2 u}{\partial x^2} + F(u)$$





Existence for all speeds > or = minimal velocity

Global convergence to waves

u(x,t) = w(x-ct)

W'' + C W' + F(W) = 0

### Biological invasions (what is the difference between homo sapiens and influenza?)



Homo sapiens (KPP model)

![](_page_30_Picture_3.jpeg)

Influenza virus (SIR model)

## Competition of species and preypredator models (A. Lotka and V. Volterra)

![](_page_31_Picture_1.jpeg)

$$\frac{du}{dt} = auv - bu$$
$$\frac{dv}{dt} = cv - duv$$

Prey-predator model

$$\frac{du}{dt} = k_1 u (1 - au - bv),$$

$$\frac{dv}{dt} = k_2 v (1 - cu - dv)$$

![](_page_31_Picture_6.jpeg)

#### Competition of species

+ diffusion

![](_page_31_Picture_9.jpeg)

# Nonlocal consumption of resources and speciation

## Nonlocal reaction-diffusion equations

![](_page_33_Figure_1.jpeg)

### Stability analysis – Pattern formation

Britton, Gourley, ...

$$\frac{\partial u}{\partial t} = d \, \frac{\partial^2 u}{\partial x^2} + k u \left( 1 - \int_{-\infty}^{\infty} \phi(x - y) u(y, t) dy \right)$$

Homogeneous in space stationary solutions: u = 0, u = 1

Spectrum of the linearized operator

$$du^{''} - \sigma \int_{-\infty}^{\infty} \phi(x-y)u(y)dy = \lambda u$$

Fourier transform

$$-\lambda = d\xi^2 + \frac{\sigma}{\xi N} \sin(\xi N)$$

![](_page_34_Picture_8.jpeg)

Figure 13: L'instabilité de la solution u = 1 et l'emergence de la solution périodique.

## Instability of the constant solution

$$\frac{\partial u}{\partial t} = d \, \frac{\partial^2 u}{\partial x^2} + k u \left( 1 - \int_{-\infty}^{\infty} \phi(x - y) u(y, t) dy \right)$$

![](_page_35_Figure_2.jpeg)

## Periodic wave propagation

$$\frac{\partial u}{\partial t} = d \, \frac{\partial^2 u}{\partial x^2} + k u \left( 1 - \int_{-\infty}^{\infty} \phi(x - y) u(y, t) dy \right)$$

![](_page_36_Figure_2.jpeg)

# Darwin's diagram and its mathematical interpretation

![](_page_37_Picture_1.jpeg)

![](_page_37_Figure_2.jpeg)

#### phenotype

Let A to L represent the species of a genus large in its own country; these species are supposed to resemble each other in unequal degrees, as is so generally the case in nature, and is represented in the diagram by the letters standing at unequal distance ... The little fan of diverging dotted lines of unequal length proceeding from (A), may represent its varying offspring.

# Emergence of species

S, Genieys, VV, P. Auger, MMNP, 2006

$$\frac{\partial u}{\partial t} = \frac{\partial^2 u}{\partial x^2} + k u^2 \left( 1 - \int_{-\infty}^{\infty} \varphi \left( x - y \right) u \left( y, t \right) dy \right) - b u$$

![](_page_38_Figure_3.jpeg)

![](_page_38_Figure_4.jpeg)

# Conditions of (simpatric) speciation

- Nonlocal consumption of resources (intra-specific competition)
- Self-reproduction
- Díffusion (mutations)

![](_page_39_Figure_4.jpeg)

![](_page_39_Figure_5.jpeg)

## Second conclusion

Emergence of species – ecological invasion in the morphological space – periodic reaction-diffusion wave

# Darwin's diagram: survival, disappearance and competition of species

N. Bessonov, N. Reinberg, VV, MMNP, 2015

![](_page_41_Figure_2.jpeg)

## Definition of species: Darwin vs Mayr

M. Banerjee, V. Vougalter, VV. AMM, 2016

Darwin: morphologically similar individuals Mayr: reproduction

$$\frac{\partial u}{\partial t} = D \frac{\partial^2 u}{\partial x^2} + a(S(u))^2 (1 - J(u)) - bu,$$

$$S(u) = \frac{1}{2h_1} \int_{-\infty}^{\infty} \psi(x - y)u(y, t)dy, \quad \psi(z) = \begin{cases} 1, & |z| \le h_1 \\ 0, & |z| > h_1 \end{cases},$$
$$J(u) = r(h_2) \int_{-\infty}^{\infty} \phi(x - y)u(y, t)dy, \quad \phi(z) = \begin{cases} 1, & |z| \le h_2 \\ 0, & |z| > h_2 \end{cases}.$$

Phénotypes of parents can be different

![](_page_42_Figure_6.jpeg)

Species do not emerge if reproduction of different is allowed

Mayr's condition is necessary for Darwin's speciation

### Conclusions

- Biological systems often possess multiple equilibria
- Transition between them are described by reaction-diffusion waves (biological invasions, spreading diseases)
- Mathematical analysis allows us (sometimes) to determine their existence, stability and speed of propagation