



CENTRO DE CIENCIAS  
MATEMÁTICAS

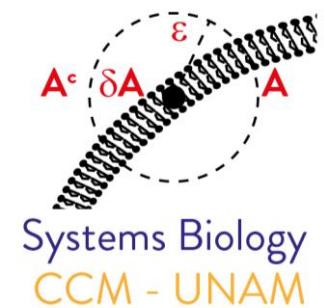
# Sistemas dinámicos no lineales para estudiar, prevenir y tratar enfermedades epiteliales complejas

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Dra. Elisa Domínguez-Hüttinger

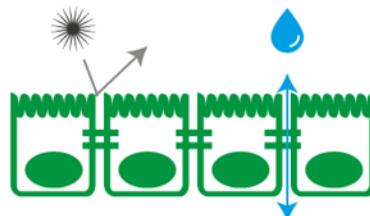
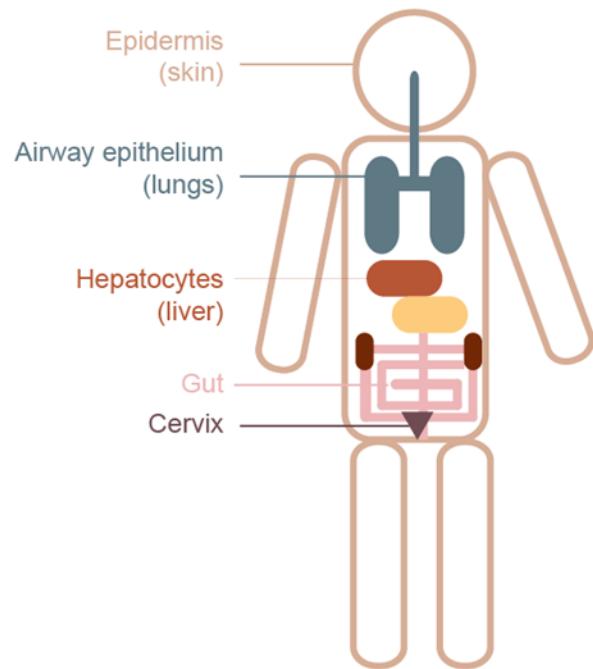
Centro de Ciencias Matemáticas  
UNAM - Morelia

Febrero 2019

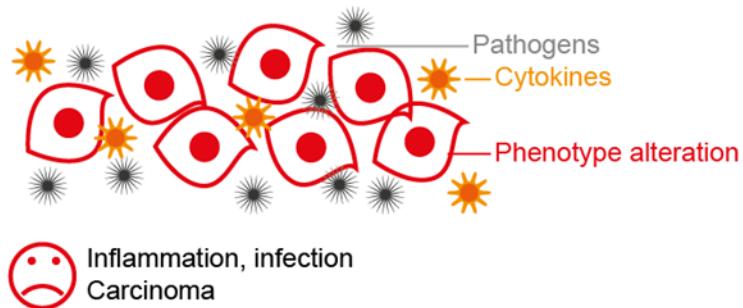


Systems Biology  
CCM - UNAM

# Epitelios

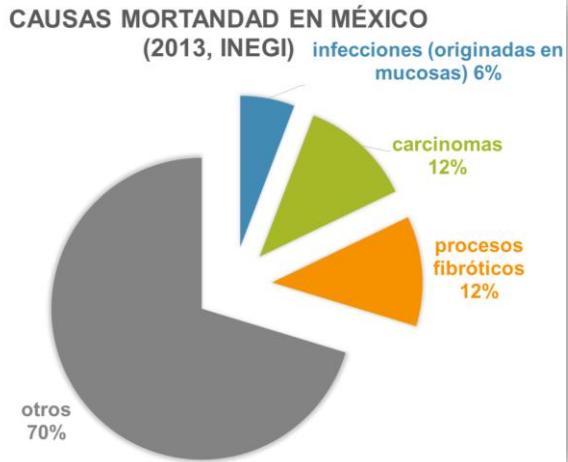


Regulated exchange with the environment  
Protection against aggressors



# Urgencia de mejorar el entendimiento, diagnóstico, prevención y tratamiento de estas enfermedades

## Muerte



## Marcha atópica

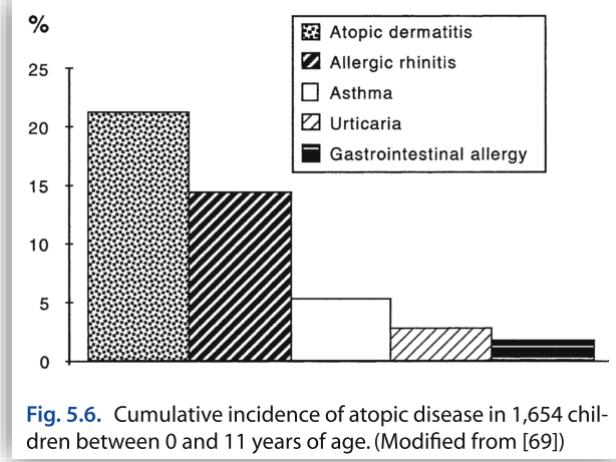
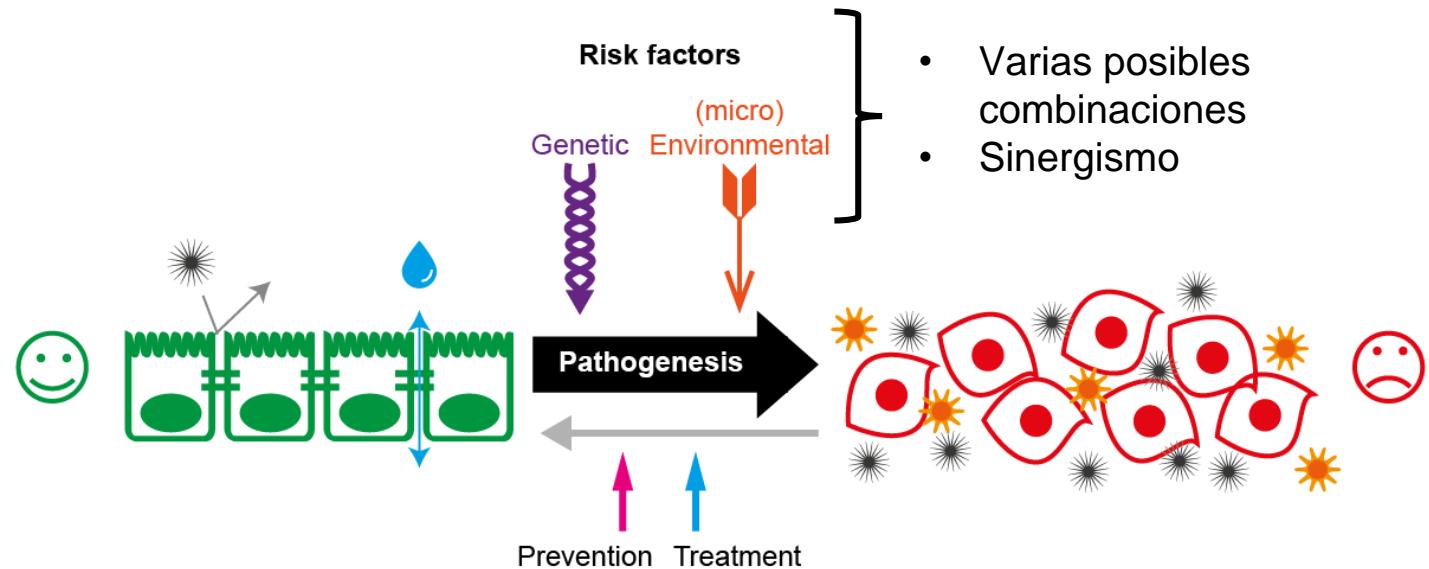


Fig. 5.6. Cumulative incidence of atopic disease in 1,654 children between 0 and 11 years of age. (Modified from [69])

Thomsen, S. F. *Eur. Clin. Respir. J.* **2**, 24642 (2015).

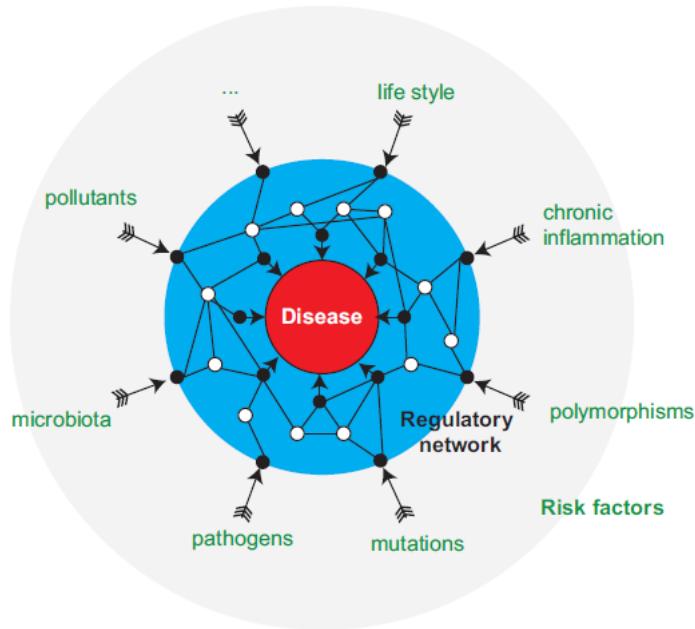
# Enfermedades epiteliales complejas: retos



- Progresión patológica gradual      Efectos secundarios no deseados
- Estadios iniciales de difícil diagnóstico

**Entender, diagnosticar, prevenir, revertir (óptimamente)**

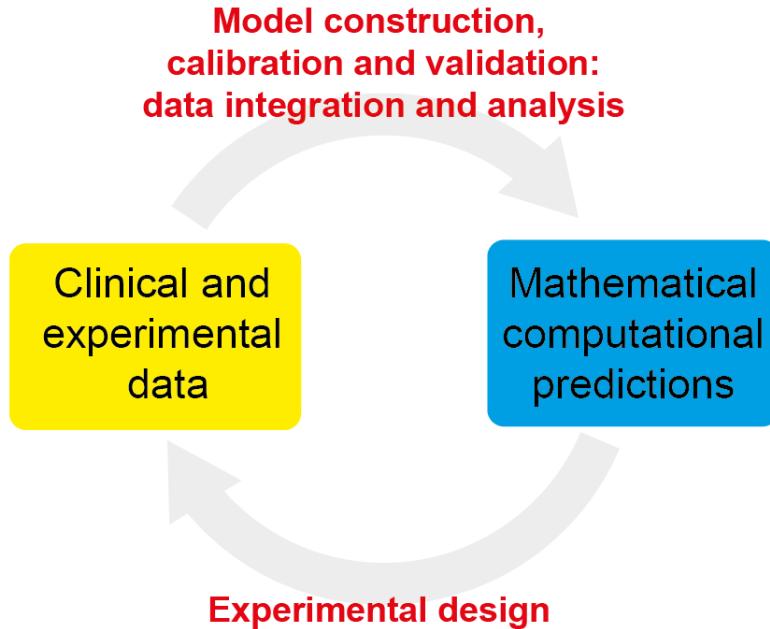
# Propiedades emergentes de redes dinámicas de interacciones regulatorias

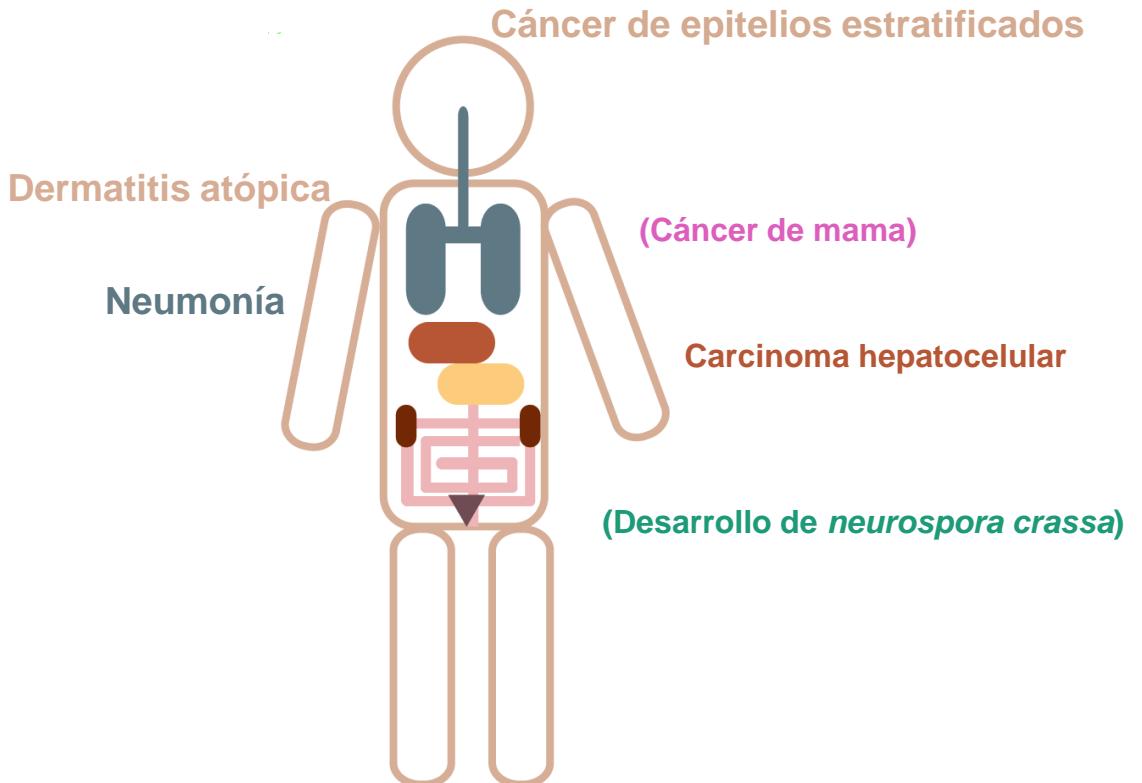


Propagación de perturbaciones / procesamiento de señales

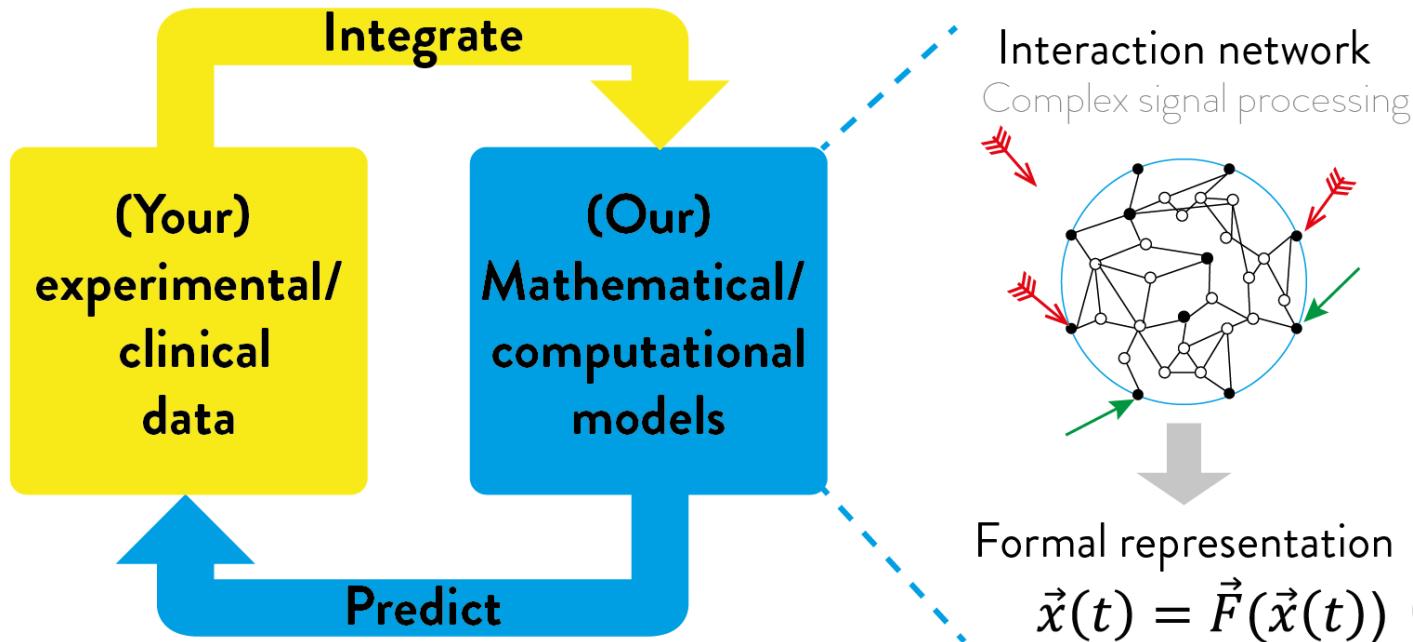
# Biología de sistemas

## ~ biología de interacciones





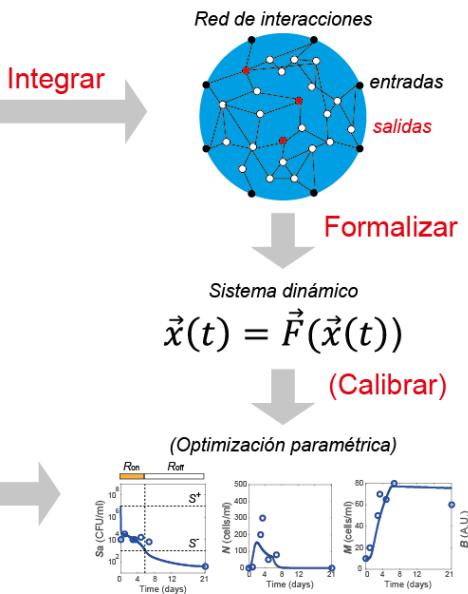
# Biología de sistemas



Perspectiva integrativa, cuantitativa y dinámica

## Datos empíricos

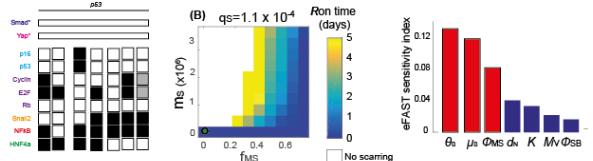
## Modelos matemáticos



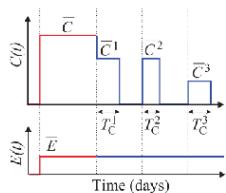
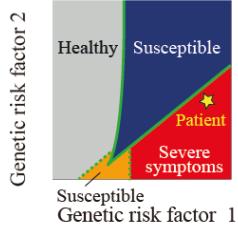
**Predicciones**

## Análisis de perturbaciones

simulación de mutantes análisis de bifurcaciones sensibilidad paramétrica



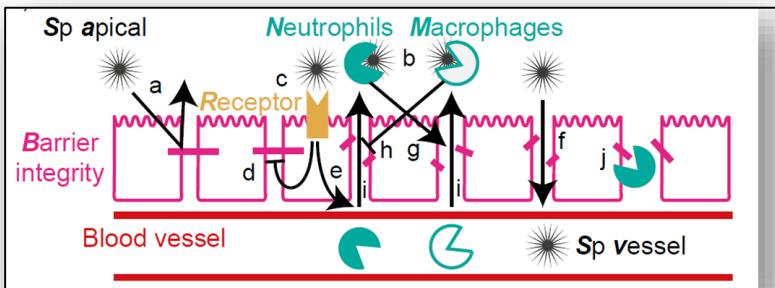
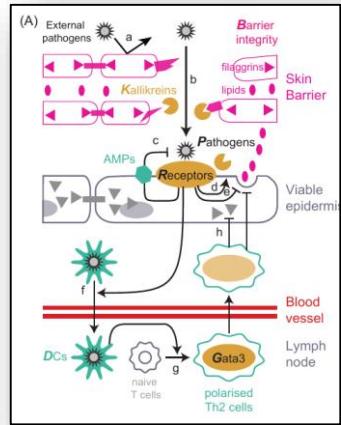
Detección temprana , estratificación Diseño y optimización de intervenciones



*Modeling Methods for Medical Systems Biology*

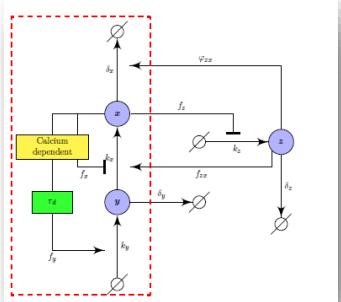


# (1) Integración de la red



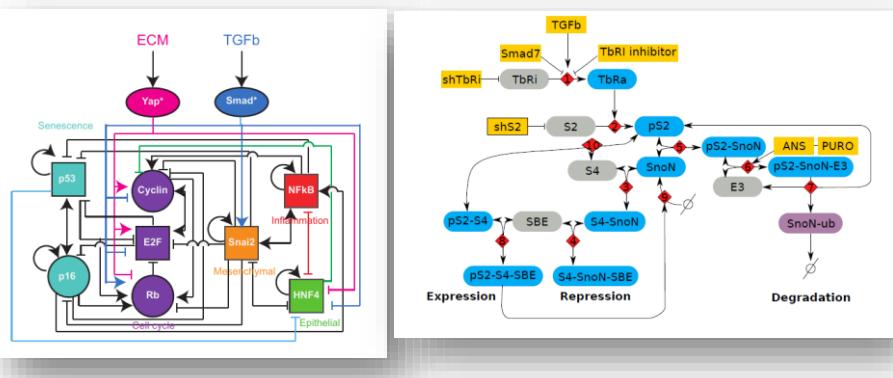
Neumonía (Frontiers in Physiology 2017)

Dermatitis (JACI 2017)



Psoriasis y cancer de piel

2/13/2019



Hepatocarcinoma

# (2) Formalización

$$\begin{aligned}\frac{dP(t)}{dt} &= P_{\text{env}} \frac{\kappa_P}{1 + \gamma_B B(t)} - \alpha_I R(t)P(t) - \delta_P P(t), \\ \frac{dB(t)}{dt} &= \kappa_B \frac{1}{1 + \gamma_R R(t)} \frac{1}{1 + \gamma_G G(t)} (1 - B(t)) - \delta_B K(t)B(t), \\ \frac{dD(t)}{dt} &= \kappa_D R(t) - \delta_D D(t),\end{aligned}$$

$$(R(t), K(t)) = \begin{cases} (R_{\text{off}}, K_{\text{off}}) & \text{if } P(t) < P^- \text{ or } \{P^- \leq P(t) \leq P^+ \text{ and } R(t^-) = R_{\text{off}}\} \\ (R_{\text{on}}, K_{\text{on}}) & m_{\text{on}}P(t) - \beta \text{ if } P(t) > P^+ \text{ or } \{P^- \leq P(t) \leq P^+ \\ & \text{and } R(t^-) = R_{\text{on}}\} \end{cases} \quad (2)$$

$$G(t) = \begin{cases} G_{\text{off}} & \text{if } D(t) < D^+ \text{ and } G(t^-) = G_{\text{off}} \\ G_{\text{on}} & \text{if } D(t) \geq D^+ \text{ or } G(t^-) = G_{\text{on}} \end{cases} \quad (3)$$

Dermatitis (JACI 2017)

$$\dot{x}(t) = k_x f_{zx} \frac{y(t)z(t)}{1 + f_x x(t)} - \delta_x \varphi_{zx} x(t)z(t) - \delta_x x(t)u(t), \quad (1.7)$$

$$\dot{y}(t) = k_y (1 + f_y x(t - \tau_d)) - k_x f_{zx} \frac{y(t)z(t)}{1 + f_x x(t)} - \delta_y y(t), \quad (1.8)$$

$$\dot{z}(t) = \frac{k_z}{1 + f_z x(t)} - \delta_z z(t), \quad (1.9)$$

Psoriasis y cancer de piel

$$\begin{aligned}\frac{dS_a(t)}{dt} &= \frac{\kappa_S}{\mu_S} S_a(t)(1 - S_a(t)) - \frac{\theta_S}{1 + \epsilon_{SB} B(t)} S_a(t) \\ &\quad - \phi_{NS} N(t)S_a(t) - \phi_{MS} M(t)S_a(t), \\ \frac{dS_v(t)}{dt} &= \kappa_S S_v(t) + \frac{\theta_S}{1 + \epsilon_{SB} B(t)} S_a(t) - \frac{\delta_S}{K + S_v(t)} S_v(t), \\ \frac{dN(t)}{dt} &= \alpha \frac{R(S_a(t))}{(1 + \epsilon_{NB} B(t))(1 + \epsilon_{NM} M(t))} N_v - \delta_N N(t), \\ \frac{dM(t)}{dt} &= \beta \frac{N(t)}{1 + \epsilon_{MB} B(t)} M_v - \delta_M M(t), \\ \frac{dB(t)}{dt} &= \frac{\kappa_B}{1 + \epsilon_{BS} R(S_a(t))} B(t)(\tilde{B} - B(t)) \\ &\quad - \phi_{SB} R(S_a(t))B(t) - \phi_{NB} N(t)B(t).\end{aligned}$$

$$R(S_a(t)) = \begin{cases} R_{\text{off}} & \text{if } S_a(t) < S^- \text{ or } \{S^- \leq S_a(t) < S^+ \text{ and} \\ & R(S_a(t^-)) = R_{\text{off}}\}, \\ R_{\text{on}} & \text{if } S_a(t) \geq S^+ \text{ or } \{S^- \leq S_a(t) < S^+ \text{ and} \\ & R(S_a(t^-)) = R_{\text{on}}\}, \end{cases}$$

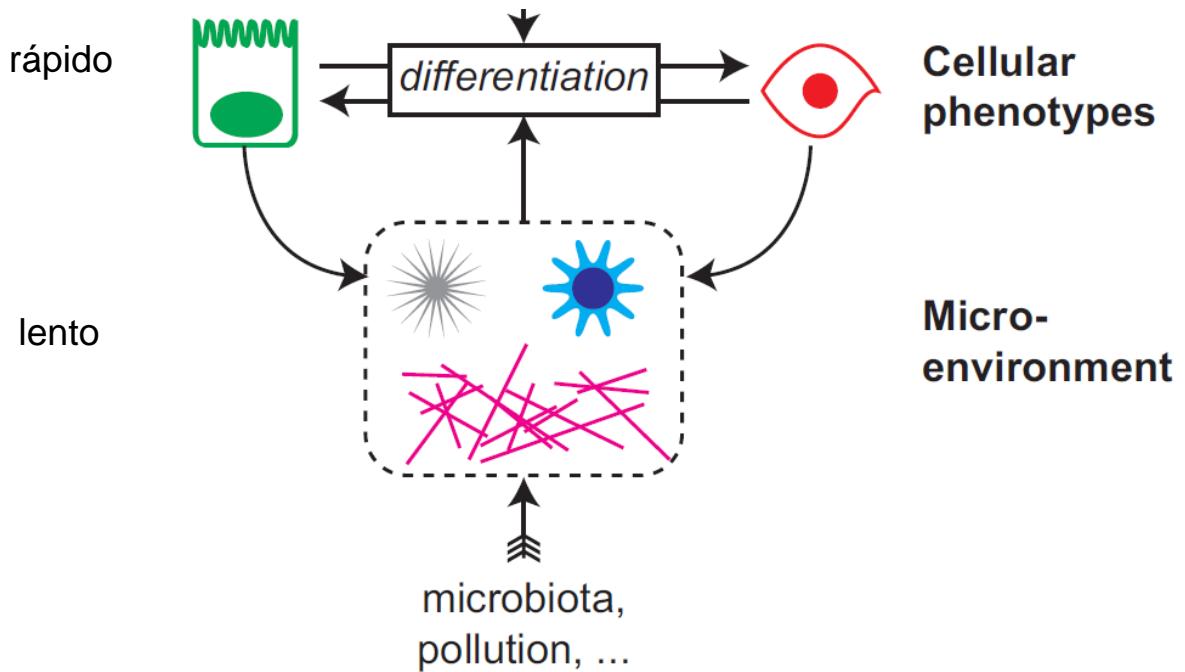
Neumonía (Frontiers in Physiology 2017)

$$\vec{x}(t+1) = \vec{F}(\vec{x}(t))$$

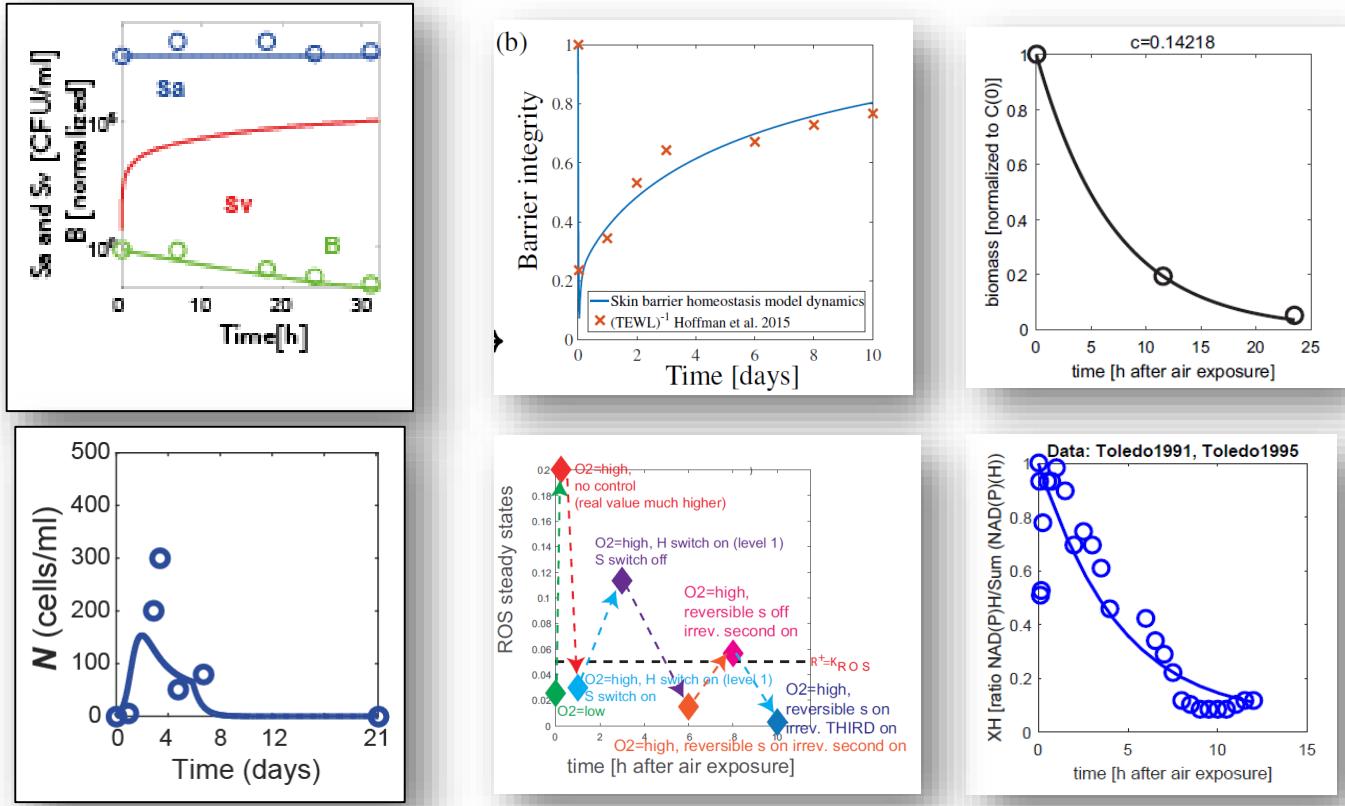
$$\begin{aligned}t &\in \mathbb{N} & \frac{d\vec{y}(t)}{dt} &= \\ x_i &\in \{0,1\} \forall i & \vec{G}(\vec{y}(t), P) &\end{aligned}$$

Hepatocarcinoma

# Modelos híbridos



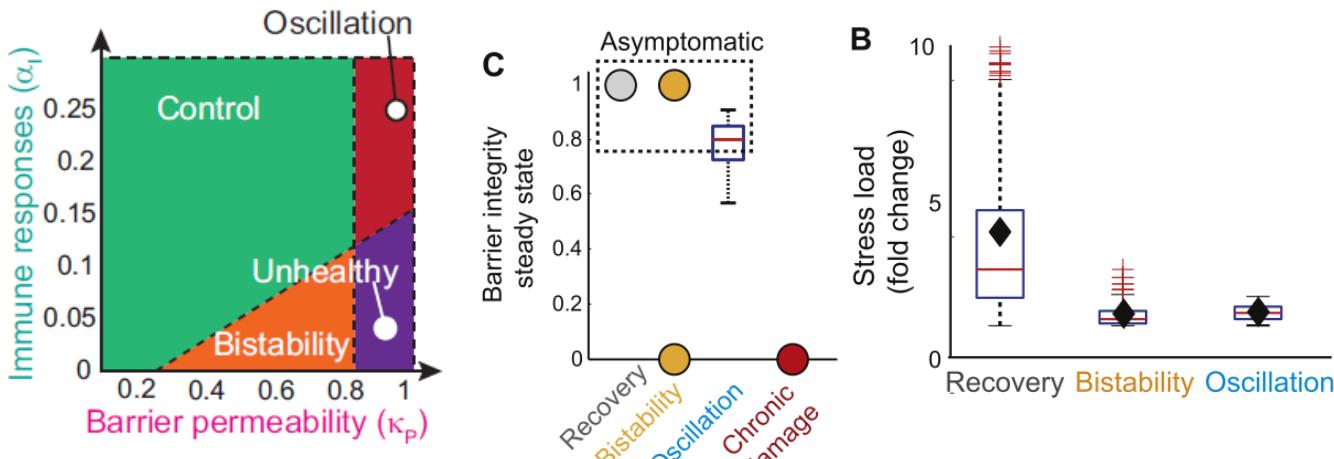
# (3) Calibración (e integración) de datos



## (4) Análisis de perturbaciones

Ahora sí: a hacer predicciones y responder preguntas

## 4.1 ¿Cuál es el efecto de factores de riesgo genéticos y ambientales sobre la homeostasis epitelial? (análisis de bifurcaciones)



Fenotipos asintomáticos susceptibles (dermatitis atópica)

E. Domínguez-Hüttlinger et al. J. Allergy Clin. Immunol. 139, 861-72, June, 2017.

# Los síntomas son producto de “dos golpes”

Hit 1

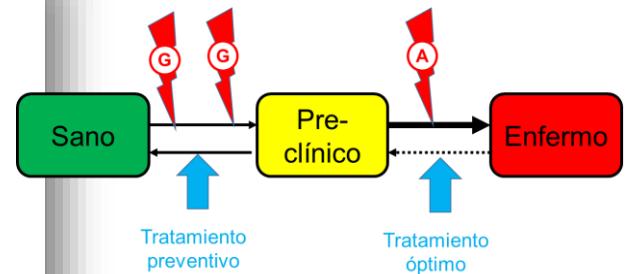
Healthy control (monostable)



Hit 2

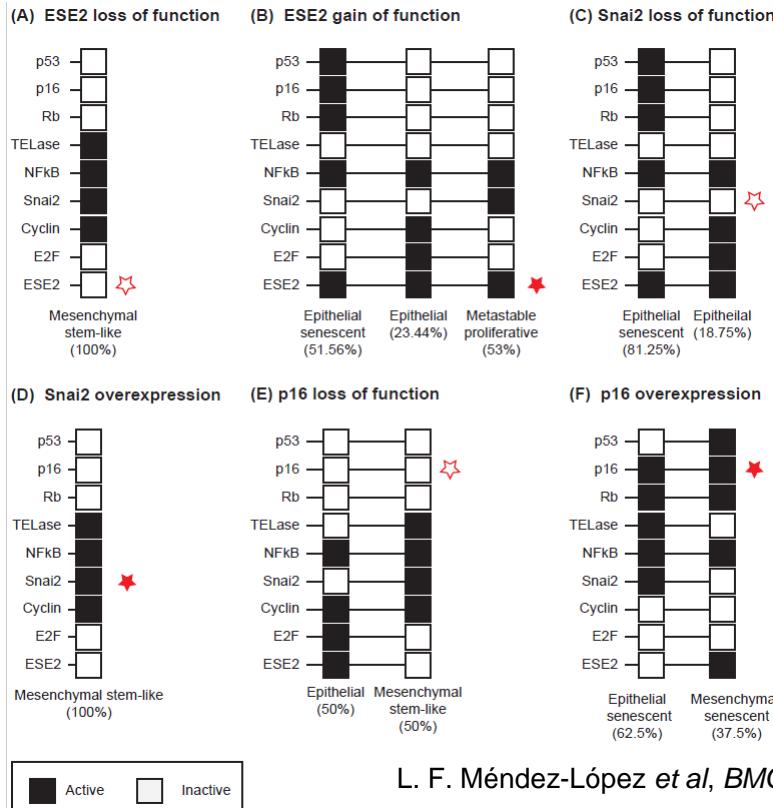


- **Primer golpe:** Factores genéticos
- **Segundo golpe:** Factores ambientales



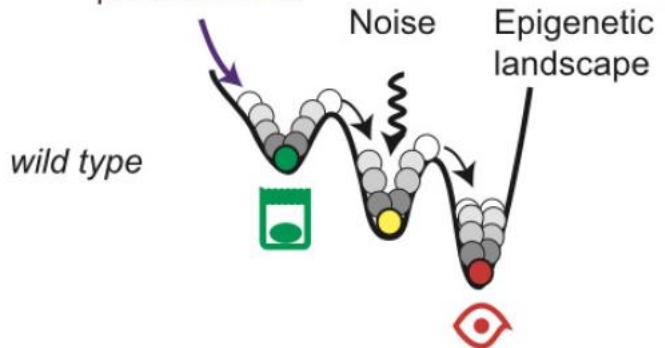
⇒ Es importante detectar las fases pre-clínicas para prevenir la “catástrofe” (transición de fase)

# Efecto de mutaciones sobre la transformación maligna de epitelios

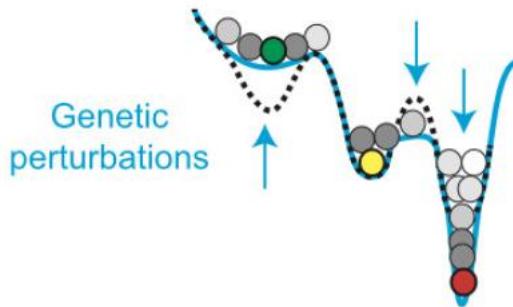


L. F. Méndez-López et al, BMC Syst. Biol. (2017)

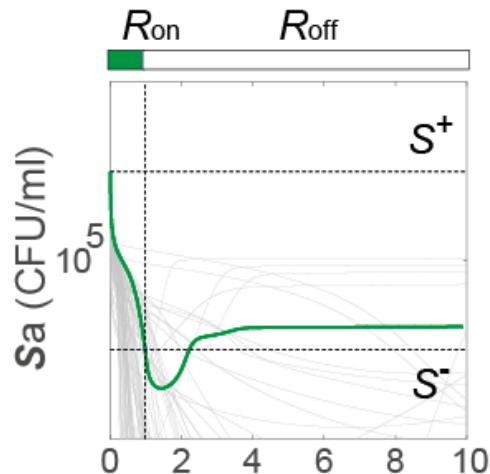
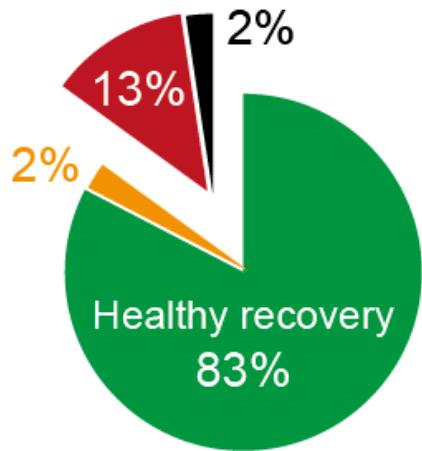
(A) Environmental perturbations



Genetic perturbations



## (4.2) ¿Qué tan robusta es la relación comensal entre *S pneumoniae* y la mucosa respiratoria? (análisis de perturbaciones)



E. Domínguez-Hüttlinger et al. Front. Physiol., 8, 115, 1–14. March, 2017.

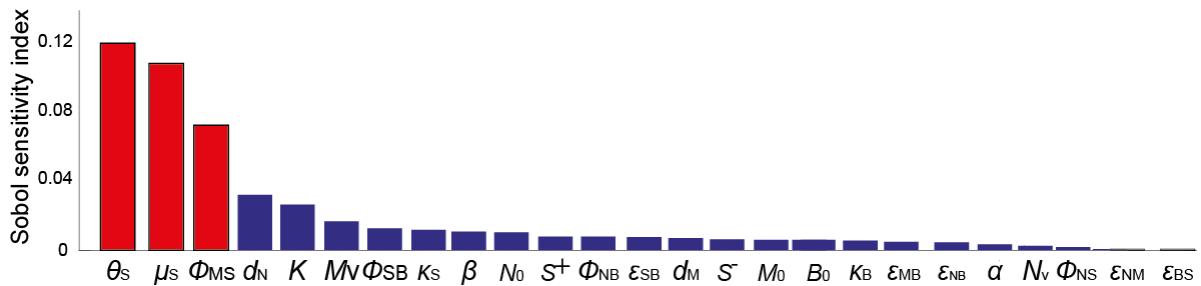
😊 homeostasis



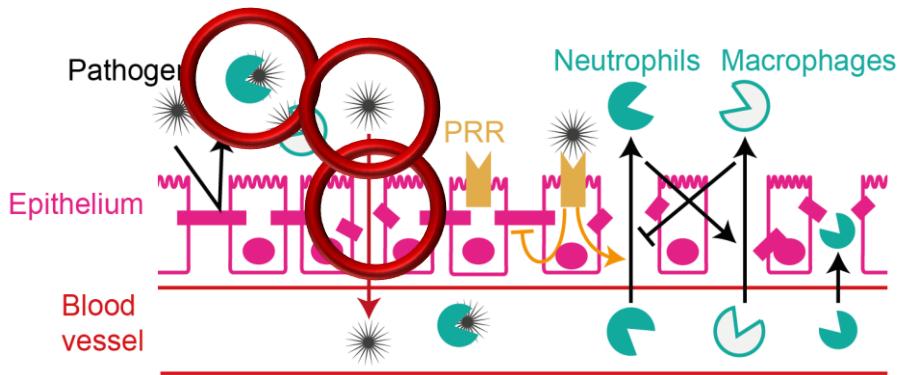
😢 disbiosis



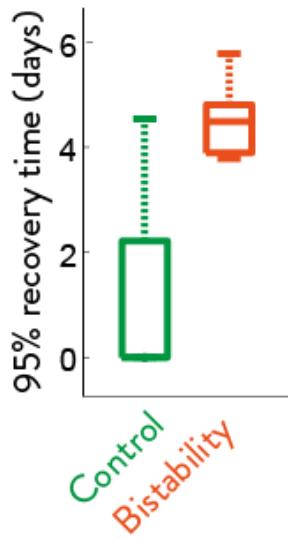
### (3) ¿qué factores pueden causar disbiosis? (análisis de sensibilidad paramétrica)



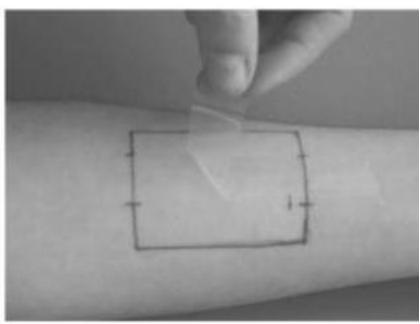
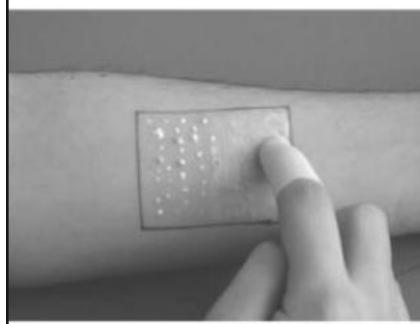
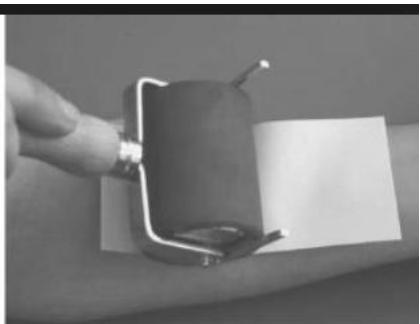
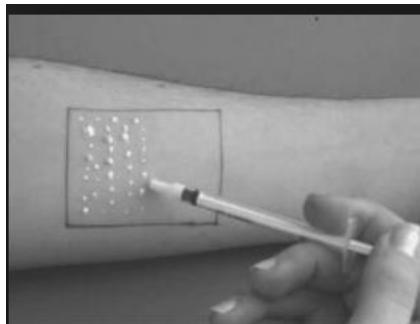
E. Domínguez-Hüttinger et al. Front. Physiol., 8, 115, 1–14. March, 2017.



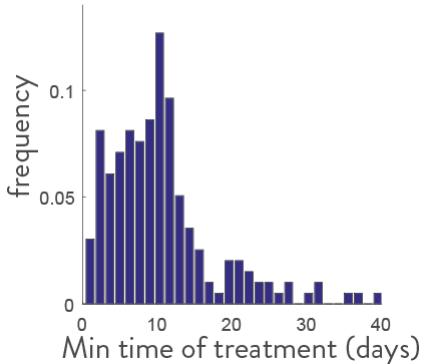
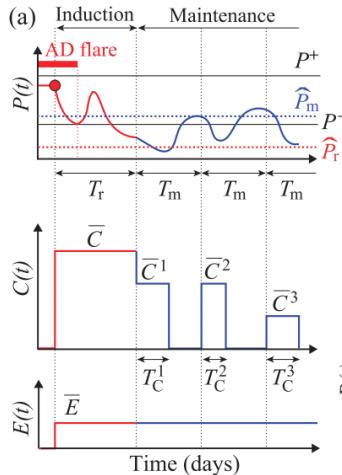
## (4) ¿Cómo podemos detectar pacientes en estados preclínicos? (teoría de catástrofes)



E. Domínguez-Hüttinger et al. J. Allergy Clin. Immunol, 139, 861-72, June, 2017.



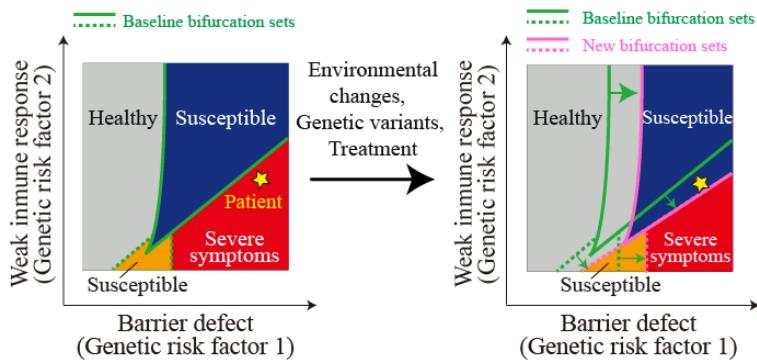
# (5) Diseño, personalización y optimización de tratamientos (teoría de control).



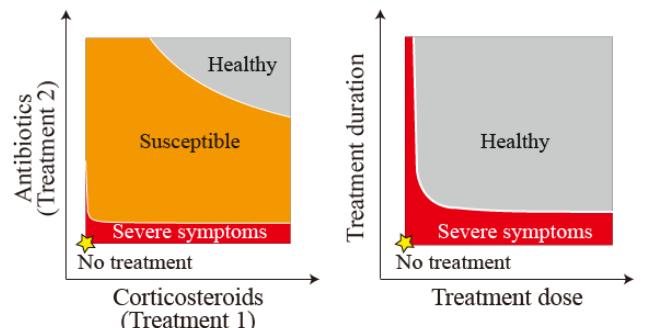
1. P. Christodoulides et al. Phil.Trans.R. Soc. A., 375, 20160285, May, 2017.
2. E. Domínguez-Hüttinger et al. Front. Physiol., 8, 115, 1–14. March, 2017.

# Estratificación de pacientes y diseño de intervenciones (teoría de bifurcaciones)

Patient stratification for atopic dermatitis

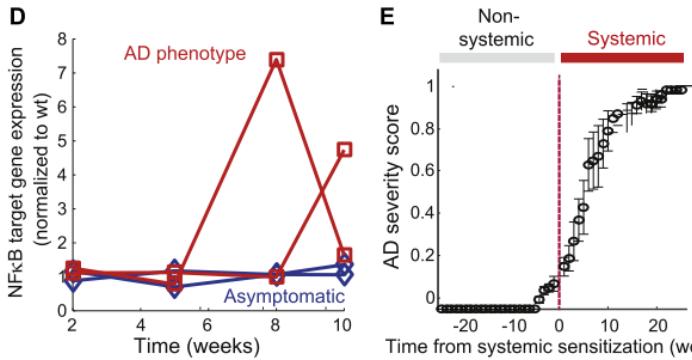


Patient-specific treatment design for atopic dermatitis

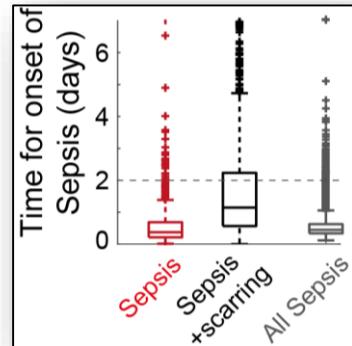


1. G. Tanaka et al. Journal of Theoretical Biology, 448: 66-79. April, 2018.

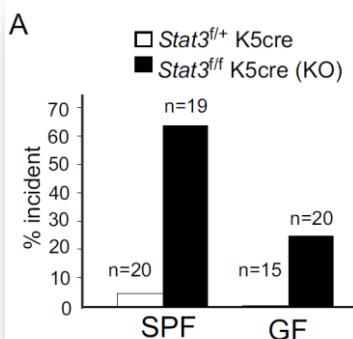
# (6) Predicciones validadas experimentalmente



Domínguez-Hüttner, E. et al., 2017. JACI



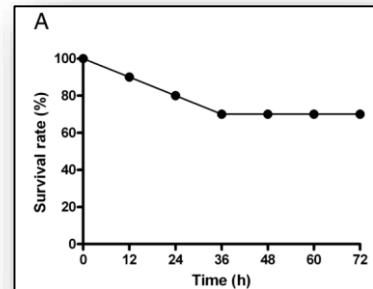
Domínguez-Hüttner, E. et al., 2017. *Frontiers in physiology*



Miyauchi et al, submitted to Nature immunology

2/13/2019

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elisa@matmor.unam.mx

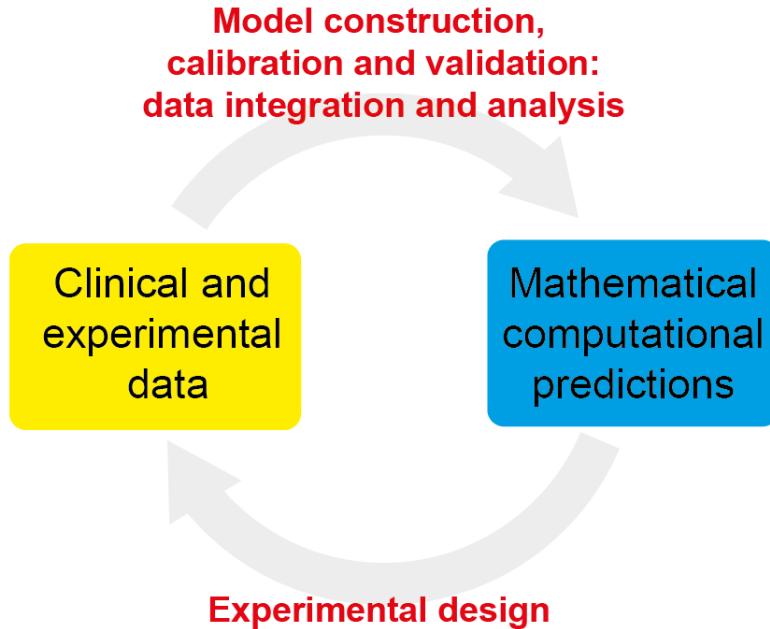


Andonegui et al, Shock 2009

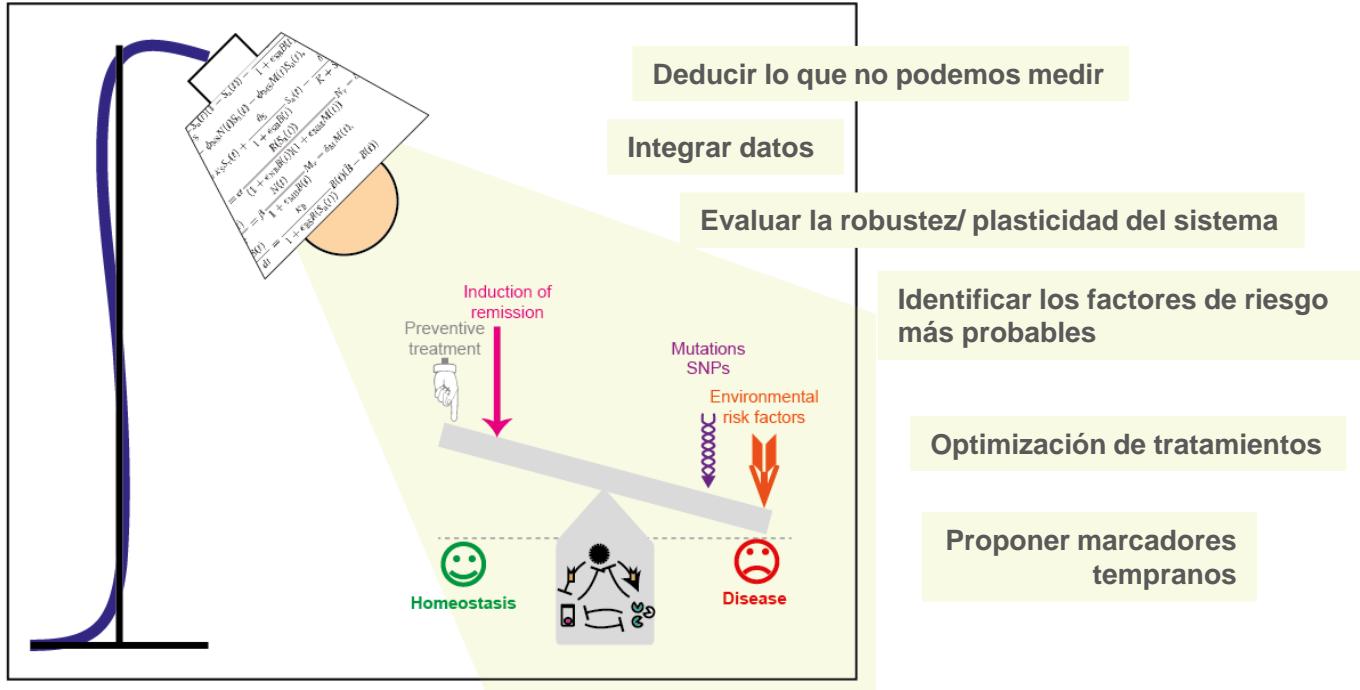
27/35

# Biología de sistemas

## ~ biología de interacciones



# Black box (a bit more) illuminated



# Biología de sistemas para entender, prevenir y revertir:

## Dermatitis atópica

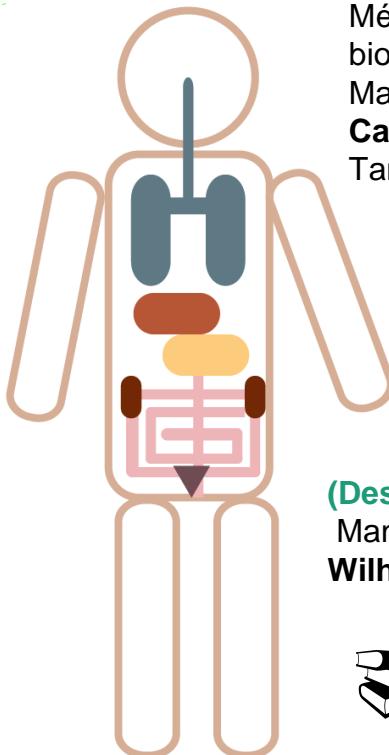
Domínguez-Hüttlinger, E. et al.,  
2017. JACI

Domínguez-Hüttlinger, E. et al.,  
2013. Interface Focus  
Christodoulides, P., 2017.

Philosophical Transactions  
Tanaka, G. et al., 2018. JTB  
Miyauchi et al, submitted to  
Nature Immunology

## Neumonía

Domínguez-Hüttlinger, E. et al.,  
2017. *Frontiers in physiology*



## Cáncer de epitelios estratificados

Méndez-López 2017, BMC systems  
biology

Manuscrito en preparación (c **Jose Luis Caldú-Primo**, Jorge Verdusco, Reiko J Tanaka, Panayiotis Christodoulides)

## Carcinoma hepatocelular

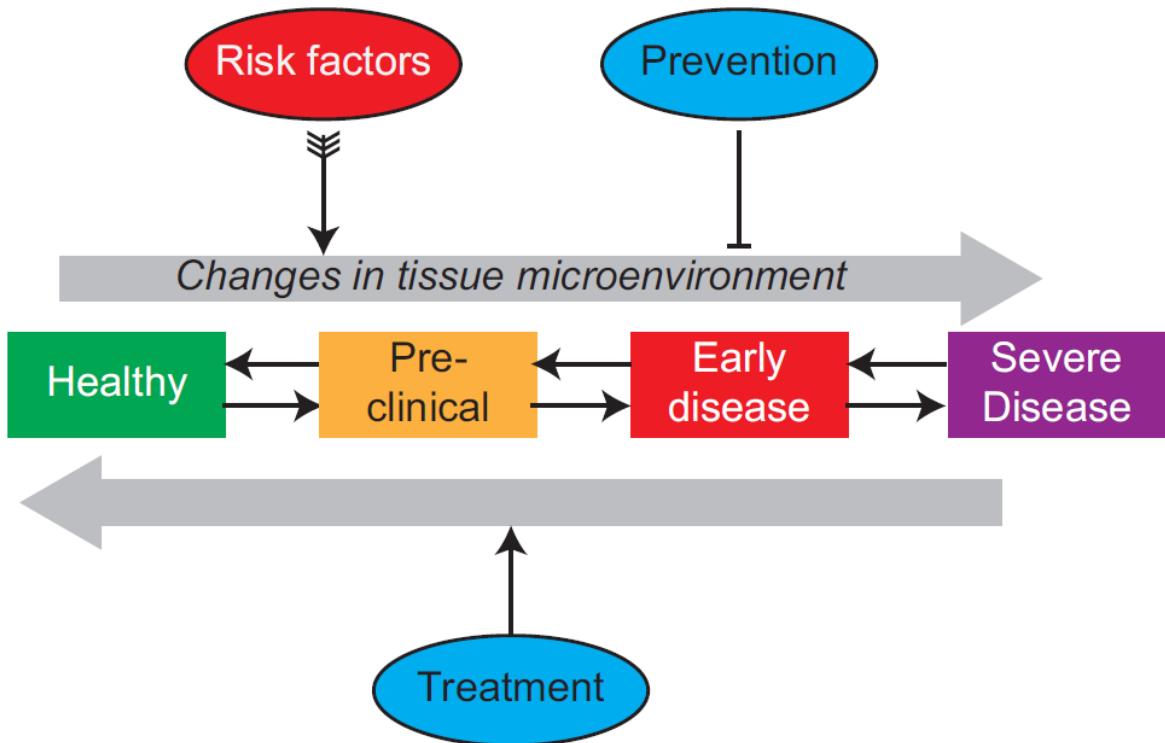
Manuscrito en preparación (c.  
**Francisco J Reyes Mora**, Marina  
Macías Silva, Rosario Pacheco  
Marín, Genaro Vásquez, Mathieu  
Hautefeuille)

## (Desarrollo de *neurospora crassa*)

Manuscrito en preparación (c  
**Wilhelm Hansberg**)



*Modeling Methods for  
Medical Systems Biology*



# Agradecimientos

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Elena Álvarez-Buylla (IE)

Reiko J Tanaka  
Panayiotis Christodoulides

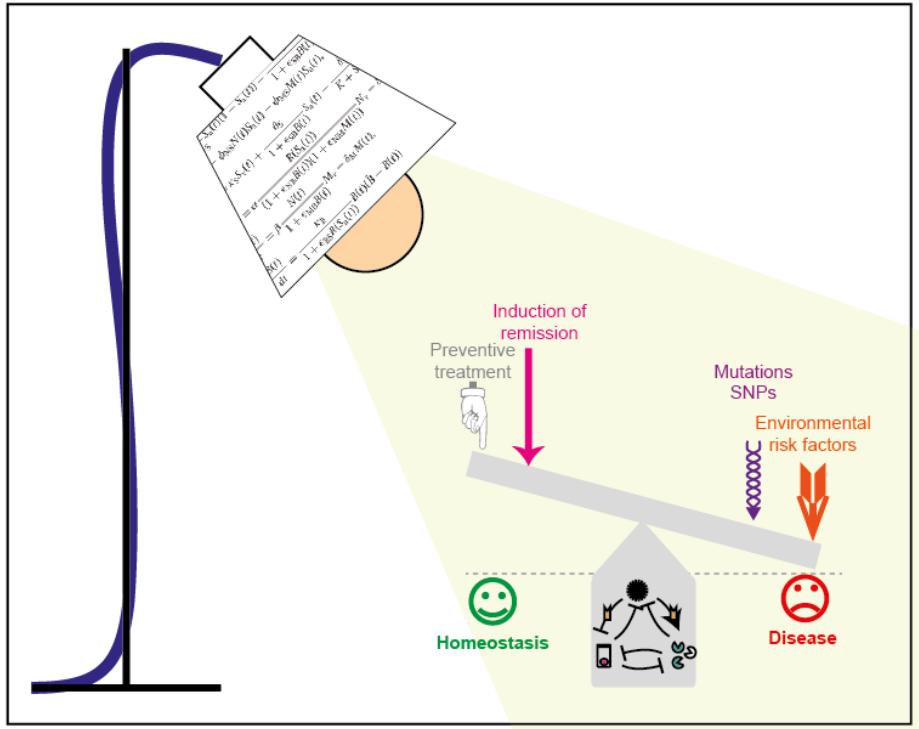
Gouhei Tanaka  
Masato Kubo  
Mariko Okada-Hatakeyama



Imperial College  
London



# Black box (a bit more) illuminated



✉ elisa@matmor.unam.mx