

# Anomalous dynamics of cell migration

P. Dieterich<sup>1</sup>   R. Klages<sup>2</sup>   R. Preuss<sup>3</sup>   A. Schwab<sup>4</sup>

<sup>1</sup>Institute for Physiology, Dresden University of Technology

<sup>2</sup>School of Mathematical Sciences, Queen Mary University of London

<sup>3</sup>Center for Interdisciplinary Plasma Science, MPI for Plasma Physics, Garching

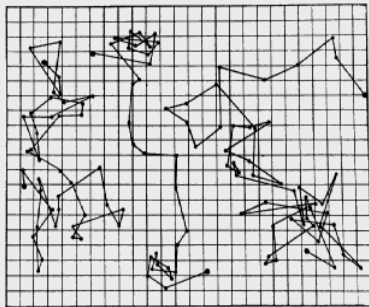
<sup>4</sup>Institute for Physiology II, University of Münster

Nonlinear Dynamics 2010  
University of Bayreuth, 5 October 2010



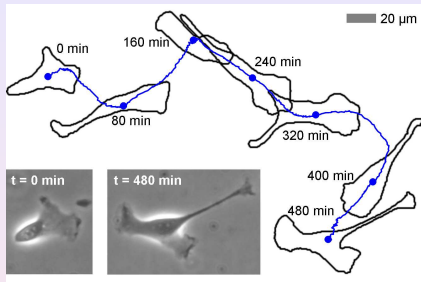
# Brownian motion of migrating cells?

## Brownian motion



Perrin (1913)

three colloidal particles,  
positions joined by straight  
lines



Dieterich et al., PNAS (2008)  
single biological cell crawling on  
a substrate

## Brownian motion?

*conflicting results:*

**yes:** Dunn, Brown (1987)

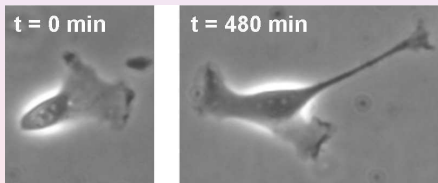
**no:** Hartmann et al. (1994)

# Our cell types and how they migrate

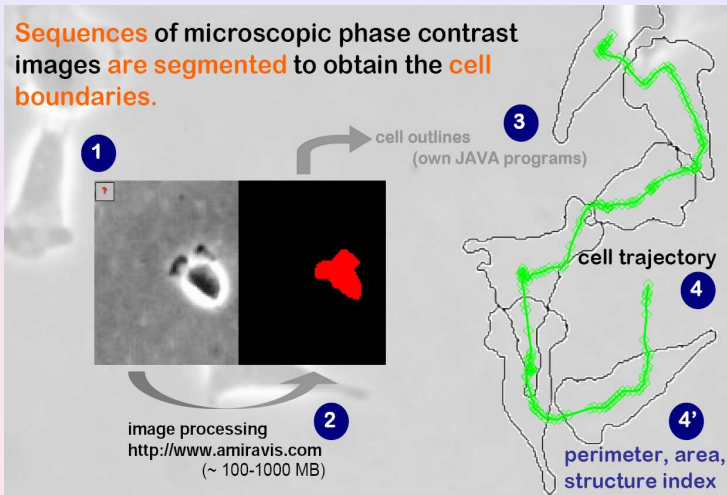
MDCK-F (Madin-Darby canine kidney) cells

**two types:** wildtype ( $NHE^+$ ) and NHE-deficient ( $NHE^-$ )

**movie:**  $NHE^+$ :  $t=210\text{min}$ ,  $dt=3\text{min}$



# Measuring cell migration



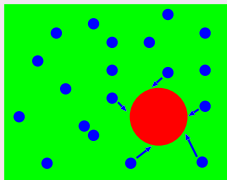
# Theoretical modeling of Brownian motion

‘Newton’s law of stochastic physics’:

$$\dot{\mathbf{v}} = -\kappa\mathbf{v} + \sqrt{\zeta}\xi(t) \quad \text{Langevin equation (1908)}$$

for a **tracer particle of velocity  $\mathbf{v}$**  immersed in a fluid

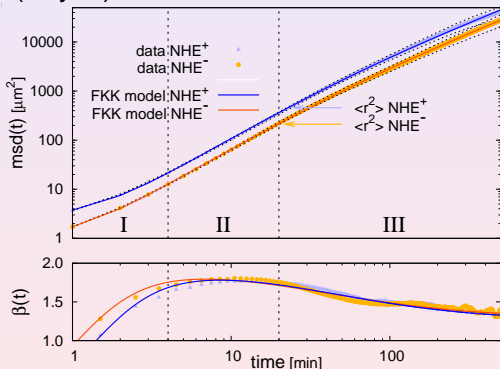
force decomposed into **viscous damping** and **random kicks of surrounding particles**



**Application to cell migration?**

# Mean square displacement

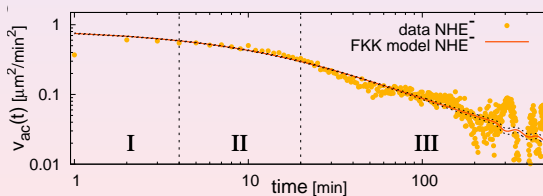
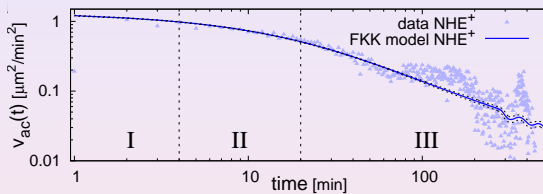
- $msd(t) := \langle [\mathbf{x}(t) - \mathbf{x}(0)]^2 \rangle \sim t^\beta$  with  $\beta \rightarrow 2$  ( $t \rightarrow 0$ ) and  $\beta \rightarrow 1$  ( $t \rightarrow \infty$ ) for Brownian motion;  $\beta(t) = d \ln msd(t) / d \ln t$
- *solid lines*: (Bayes) fits from our model



anomalous diffusion if  $\beta \neq 1$  ( $t \rightarrow \infty$ ); here: **superdiffusion**

# Velocity autocorrelation function

- $v_{ac}(t) := \langle \mathbf{v}(t) \cdot \mathbf{v}(0) \rangle \sim \exp(-\kappa t)$  for Brownian motion
- solid lines: fits from our model; same parameter values as  $msd(t)$



crossover from **stretched exponential to power law**

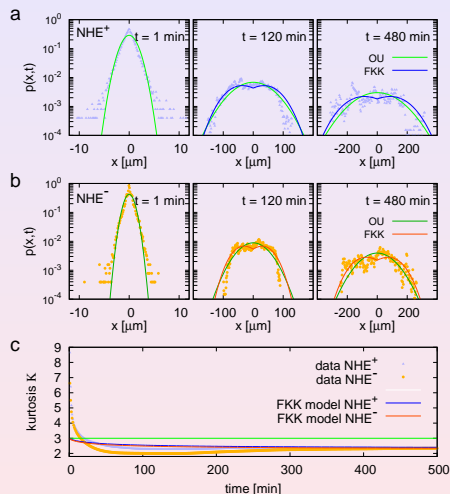
# Position distribution function

- $P(x, t) \rightarrow$  Gaussian ( $t \rightarrow \infty$ ) and kurtosis

$$\kappa(t) := \frac{\langle x^4(t) \rangle}{\langle x^2(t) \rangle^2} \rightarrow 3 \quad (t \rightarrow \infty)$$

for Brownian motion (green lines, in 1d)

- *other solid lines*: fits from our model; parameter values as before



crossover from peaked to broad **non-Gaussian distributions**



# The model

- **Fractional Klein-Kramers equation** (Barkai, Silbey, 2000):

$$\frac{\partial P}{\partial t} = -\frac{\partial}{\partial x} [vP] + \frac{\partial^{1-\alpha}}{\partial t^{1-\alpha}} \kappa \left[ \frac{\partial}{\partial v} v + v_{th}^2 \frac{\partial^2}{\partial v^2} \right] P$$

with probability distribution  $P = P(x, v, t)$ , damping term  $\kappa$ , thermal velocity  $v_{th}^2 = kT/m$  and **Riemann-Liouville fractional** (generalized ordinary) **derivative of order  $1 - \alpha$**  for  $\alpha = 1$  Langevin's theory of Brownian motion recovered

- **analytical solutions** for  $msd(t)$  and  $P(x, t)$  can be obtained in terms of special functions (Barkai, Silbey, 2000; Schneider, Wyss, 1989)
- **4 fit parameters**  $v_{th}, \alpha, \kappa$  (plus another one for short-time dynamics)

# Possible physical interpretation

## Physical meaning of the fractional derivative?

fractional Klein-Kramers equation is *approximately* related to the generalized Langevin equation

$$\dot{v} + \int_0^t dt' \kappa(t-t')v(t') = \sqrt{\zeta} \xi(t)$$

e.g., Mori, Kubo (1965/66)

with **time-dependent friction coefficient**  $\kappa(t) \sim t^{-\alpha}$

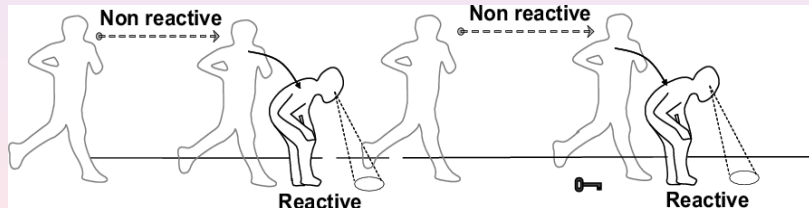
cell anomalies might originate from **glassy behavior** of the cytoskeleton gel, where power law exponents are conjectured to be universal (Fabry et al., 2003; Kroy et al., 2008)

# Possible biological interpretation

## Biological meaning of the anomalous cell migration?

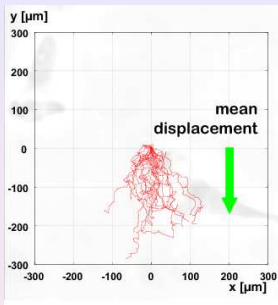
experimental data and theoretical modeling suggest *slower diffusion for small times* while *long-time motion is faster*

compare with **intermittent optimal search strategies** of foraging animals (Bénichou et al., 2006)



**note:** controversy about **modeling the migration of foraging animals** (albatros, bumblebees, fruitflies,...)

# Outlook: cell migration under chemical gradients



new experiments on **murine neutrophils** under **chemotaxis**:

- **linear drift** in the direction of the gradient,  $\langle y(t) \rangle \sim t$
  - $msd(t) - \langle y(t) \rangle^2 \sim t^\beta$  with same exponent  $\beta$  as in equilibrium
- $\Rightarrow$  **fluctuation dissipation relation**

modeled by the **fractional Klein-Kramers equation** with external force  $F(x)$

$$\frac{\partial P}{\partial t} = -\frac{\partial}{\partial x} [vP] + \frac{\partial^{1-\alpha}}{\partial t^{1-\alpha}} \kappa \left[ \frac{\partial}{\partial v} v - \frac{F}{\kappa m} \frac{\partial}{\partial v} + v_{th}^2 \frac{\partial^2}{\partial v^2} \right] P$$

Metzler, Sokolov (2002)

# Thanks and literature

- **thanks** to A.V.Checkkin and E.Lutz for helpful discussions.
- **reference to this talk:**

P.Dieterich, R.K., R.Preuss, A.Schwab, *Anomalous Dynamics of Cell Migration*, PNAS **105**, 459 (2008)

- **as a general reference:**

R.K., G.Radons, I.M.Sokolov (Eds.)  
*Anomalous transport*  
(Wiley-VCH, 2008)

