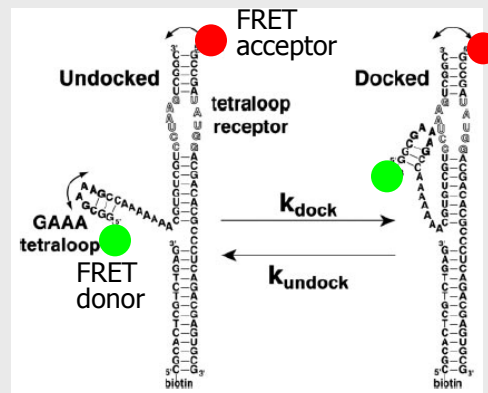


# Single particle tracking: principles and applications

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Facultad de Ciencias Exactas y Naturales  
Universidad de Buenos Aires  
vlevi12@gmail.com

## Why single molecule experiments?: An example

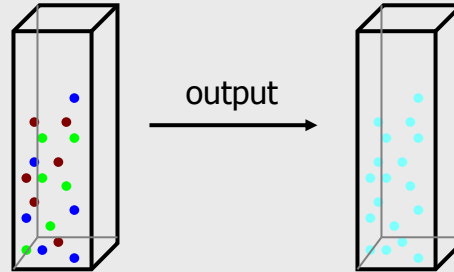
Studying folding of individual structural elements of RNA



- 1) Main 3D-conformation(s) of the molecule in different conditions
- 2) Quantification of the docking/undocking dynamics

Hodak J. et al. PNAS (2005)

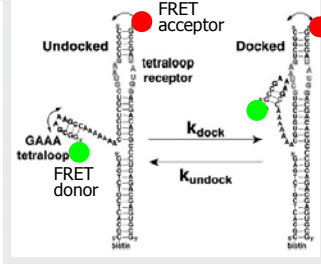
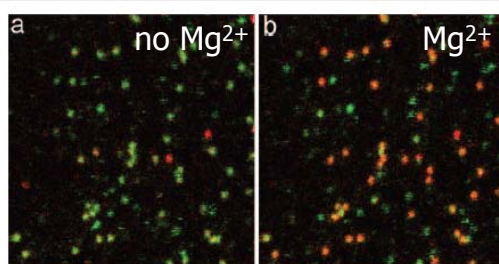
## Why single molecule experiments?



solution  $1 \mu\text{M} \rightarrow 10^{15}$  molecules

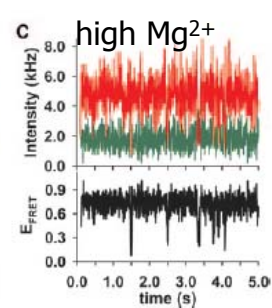
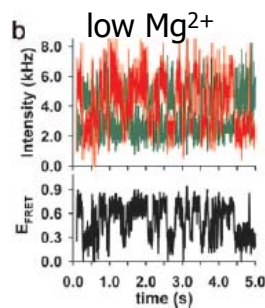
What information are we missing in "cuvette" assays?

## Studying RNA structure and dynamics



FRET trajectories

donor  
acceptor



Hodak et al. PNAS (2005)

## Bulk vs. single molecule measurements

### Limitations of bulk measurements

- ✚ molecules are not synchronized
- ✚ average properties

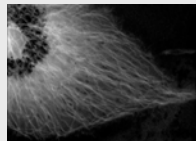
### Single molecule/particle assays

- ✚ Temporal evolution of each molecule/particle
- ✚ No need to synchronize processes
- ✚ Detection of different populations

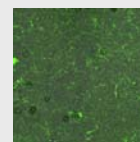
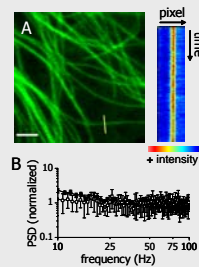
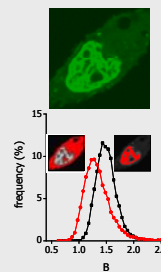
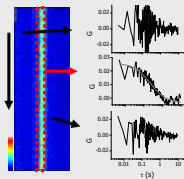
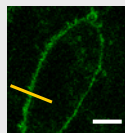
### Disadvantages

- ✚ More expensive equipments
- ✚ Statistics!

## Dynamics of intracellular processes: Tracking

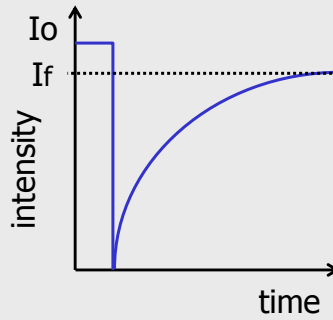
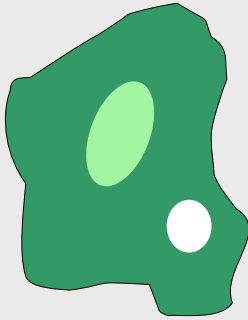


Protein function in the cellular context



## 1. Measuring motion in cells: FRAP

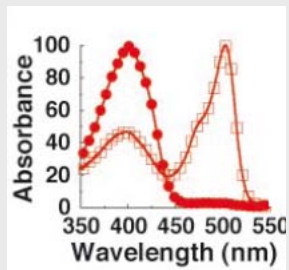
FRAP (fluorescence recovery after photobleaching) (Axelrod, 1976) and related techniques (FLIP, etc)



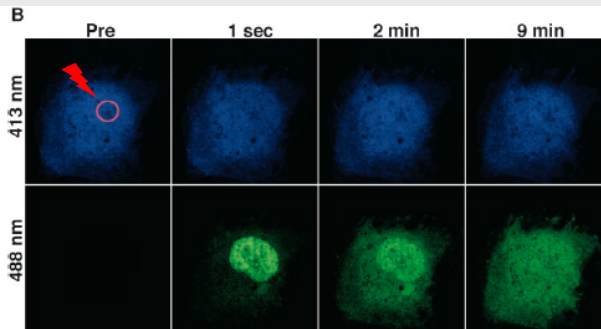
- Photodamage
- Photobleaching is not always irreversible

## 2. Measuring motion in cells: photoactivation

PA-GFP (photoactivatable GFP) photoconverts to a fluorescent specie after irradiation at  $\lambda = 400$  nm



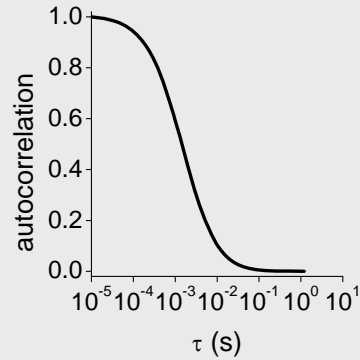
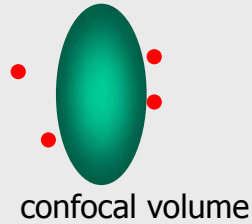
- before photoconversion
- after photoconversion



Patterson and Lippincott-Schwartz, Science 2002

### 3. Measuring motion in cells: FCS

FCS (fluorescence correlation spectroscopy)



- Low laser power
- Low concentration of fluorescent molecules
- Equilibrium

### Why single particle tracking experiments?



It is hard to study complex processes by “averaging”  
de behavior of multiple molecules

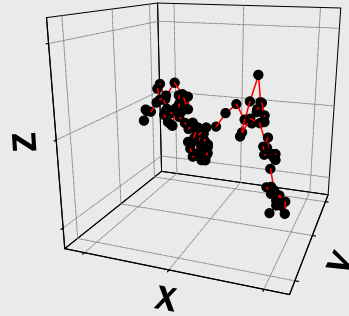
## Single particle tracking (SPT)

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Position of the particle as a function of time

mechanism of motion

- interactions
- populations
- switches (no synchronization)

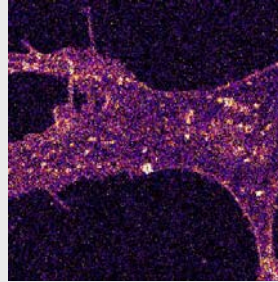
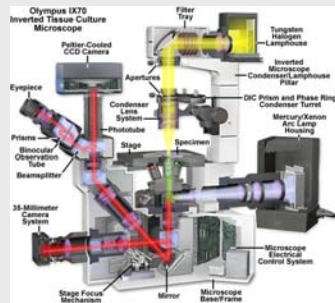


## Single particle tracking

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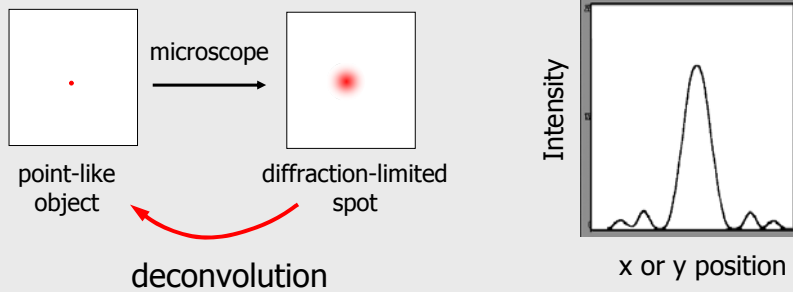
1. Acquisition of single particle trajectories
2. Quantitative analysis of single particle trajectories
3. Applications to intracellular transport
4. 3D particle tracking

## Image-based tracking techniques



- How can we obtain the trajectory of the particle from the movie?
- What is the accuracy on the position determination?

## Locating a particle with nanometer precision



$$r \cong \lambda/2NA$$

$r$  = resolution

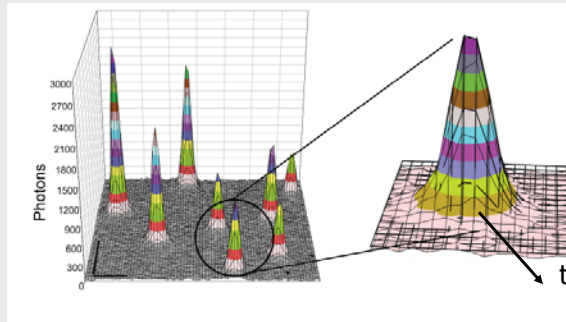
$\lambda$  = wavelength

NA = numerical aperture of the objective

$r \sim 250$  nm, visible light

## An example of a simple SPT method: FIONA (fluorescence imaging with nanometer accuracy)

Imaging single fluorophore



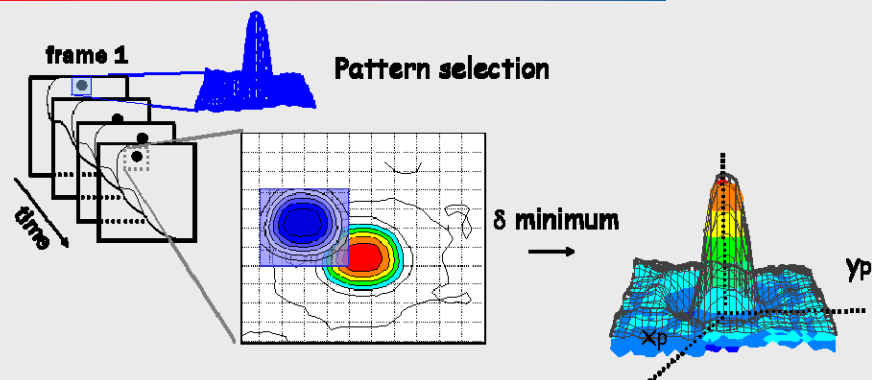
We have to be sure that there is a single molecule/particle !!

the center of this distribution can be found with 1.5 nm precision!

from <http://physics.berkeley.edu/research/yildiz/technology.html>

The trajectory of the particle is then recovered after locating the particle in every frame of the movie

## Pattern-recognition tracking method



$$\delta = \sum_{i,j} \sqrt{(I_{\text{image}}(i,j) - I_{\text{pattern}}(i,j) - B)^2 \cdot w(i,j)}$$

$B$  = background difference

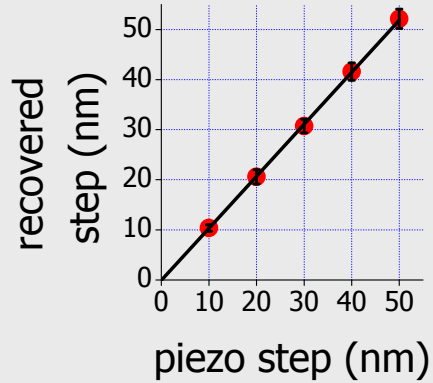
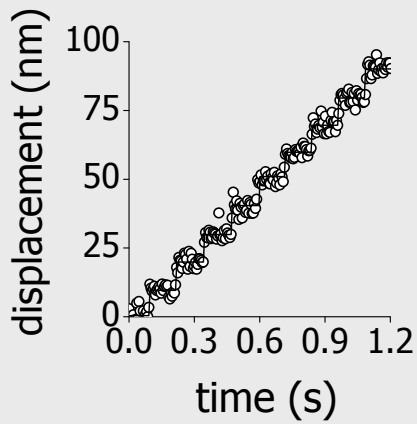
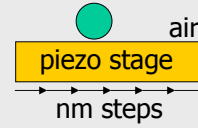
$w(i,j)$  = weight factor =  $\sqrt{(I_{\text{pattern}}(i,j) - I_{\text{border}})^2}$

Levi et al. Biophys J (2006)



## Tracking performance

500 nm fluorescent bead



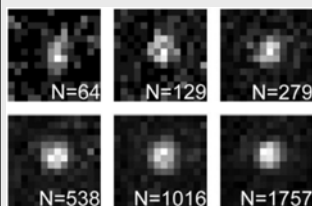
Levi et al. Biophys J (2006)

## Improving SPT: Error in the particle position

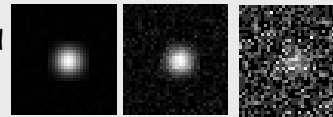
$$\langle (\Delta x)^2 \rangle = \frac{s^2}{N} + \frac{a^2/12}{N} + \frac{8\pi s^4 B^2}{a^2 N^2}$$

$\Delta x$  = error in the particle position  
 $s$  = standard deviation of the PSF  
 $N$  = number of photons detected  
 $a$  = pixel size  
 $B$  = background noise

photon noise



background noise



B increases

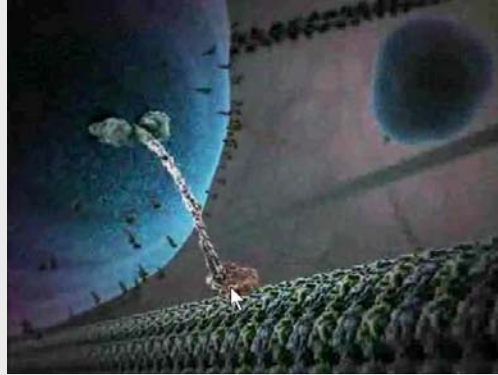
pixelization noise



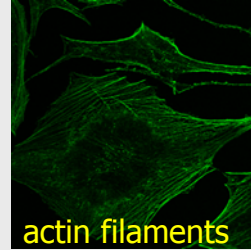
a increases

Thompson et al. Biophys J (2002)

## Application: molecular motors



How the motor moves along the filament?

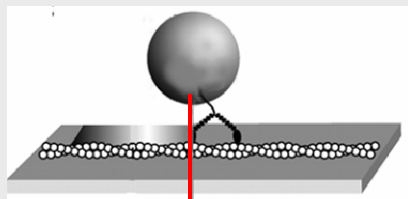


actin filaments

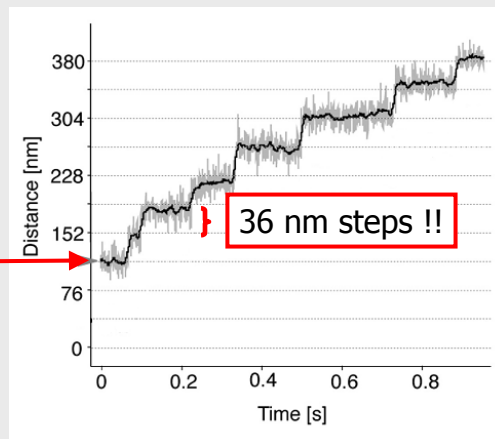


microtubules

## A simple answer from SPT experiments



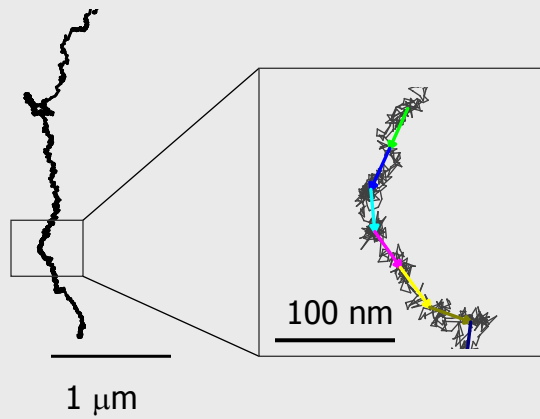
explicar con flechitas



Adapted from Rief et al., PNAS (2000)

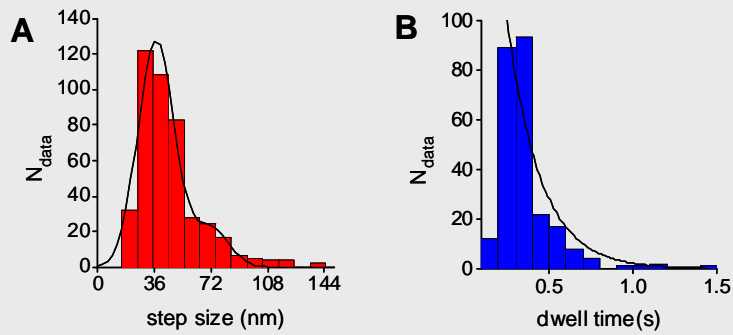
## We can observe steps of motors in living cells!

Transport of melanosomes by myosin V



Levi et al, Biophys J (2006b)  
Bruno et al, submitted

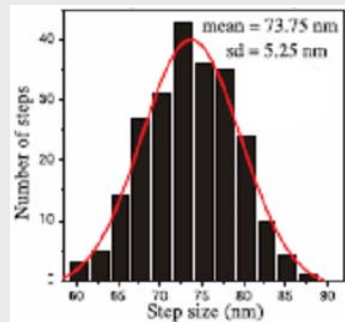
## Myosin-V in living cells



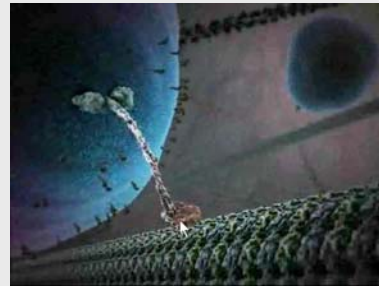
	in vitro	in cells
step size (nm)	37	37.1 ± 0.6
dwell time (ms)	70	200 ± 40

Levi et al, Biophys J (2006b)  
Bruno et al, submitted

## Understanding the stepping mechanism



Yildiz et al. Science, 2003



www.studiodaily.com

## Probes for SPT experiments

In SPT experiments, probes may:

- 1) delay the motion of the particle
- 2) change the properties of the tracked molecule

Probe	Size (nm)	Advantage	Disadvantage
fluorescent beads	5-1000	brighness	size
quantum dots	10-20	brighness, spectra	blinking
fluorescent proteins	10-20	endogenously expressed	low brighness, high concentration, bleaching
single dye molecules	0.5-10	size	low brighness, bleaching (<10s)
nanoparticles	20-50	last forever	low signal/noise

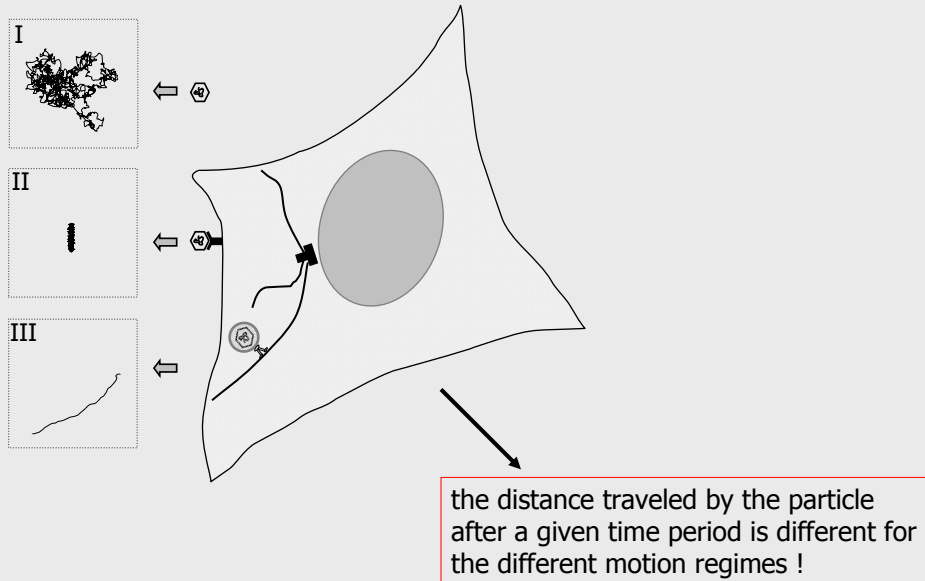
## Single particle tracking

Motor stepping dynamics is just a very specific case..

How can we obtain information of complex intracellular processes?

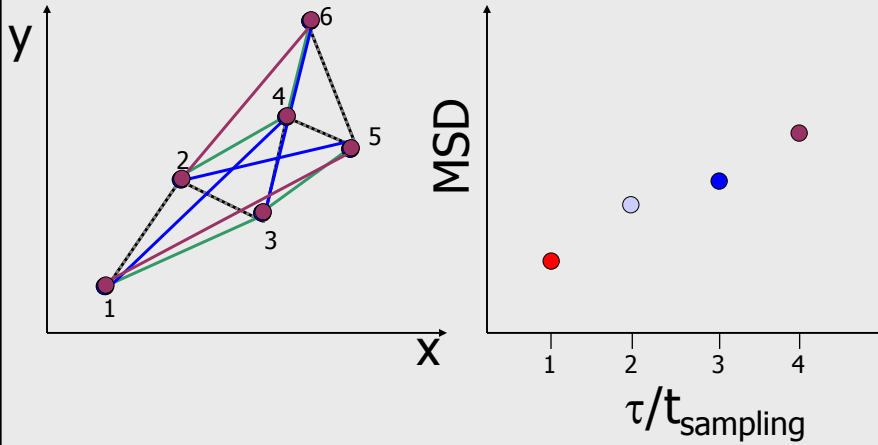


## Obtaining quantitative information from trajectories

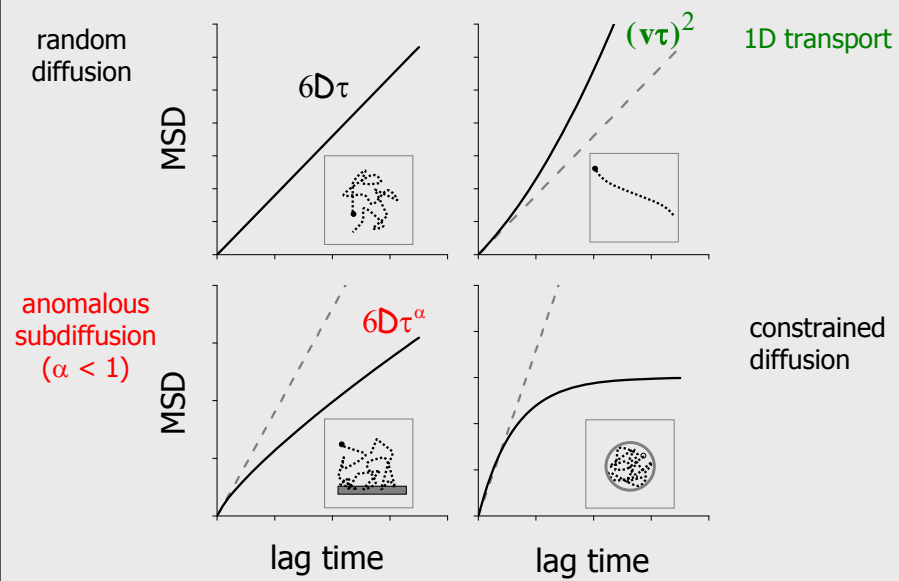


## Calculation of the mean square displacement (MSD)

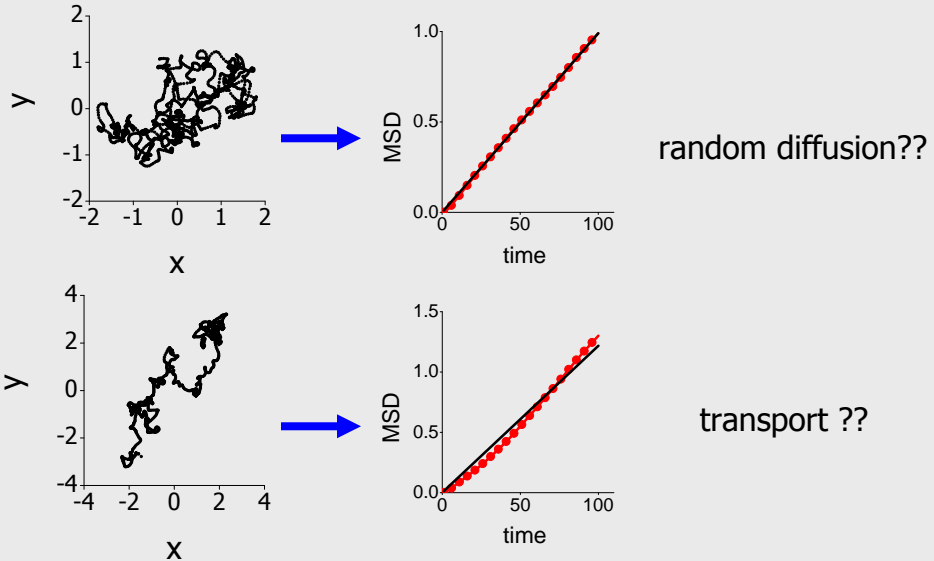
$$\text{MSD}(\tau) = \langle (x(t) - x(t + \tau))^2 + (y(t) - y(t + \tau))^2 \rangle$$



## What information can we obtain from MSD analysis?

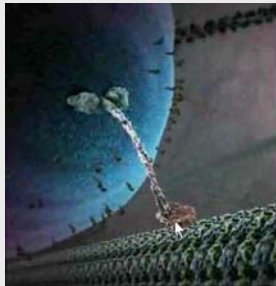


“Single things” analysis means that we have to be extremely careful with the statistics



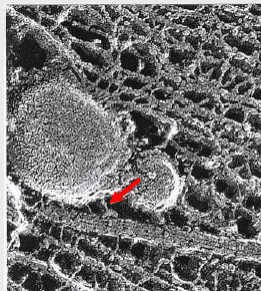
Applications: MSD analysis helps us to understand the mechanisms involved in organelle transport

in vitro



vs.

in cells

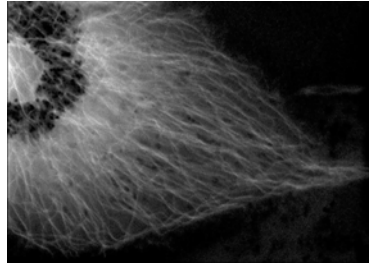


Electron micrograph of mouse axon

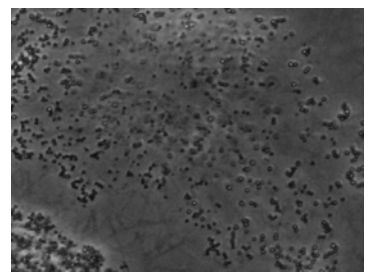
Hirokawa, Science 1998

The conditions in which transport develops in cells are completely different from those of in vitro assays

## Melanophores: a beautiful system to study transport



MSH  
dispersion

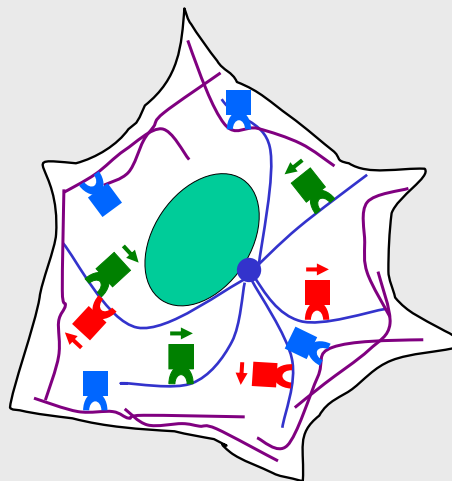


melatonin  
aggregation






Gelfand's lab - Wallin, bioscience-explained.org



## Organelle transport in living cells



3 families of motors

-  kinesin
-  dynein
-  myosin

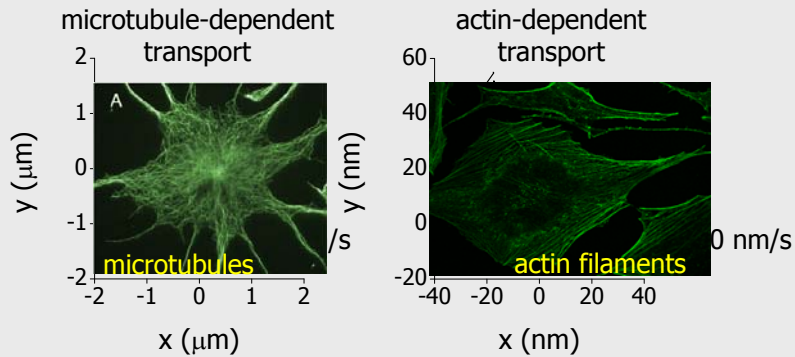
2 different tracks

-  microtubules
-  actin filaments

How do these transport systems work together to target organelles to their final destination?

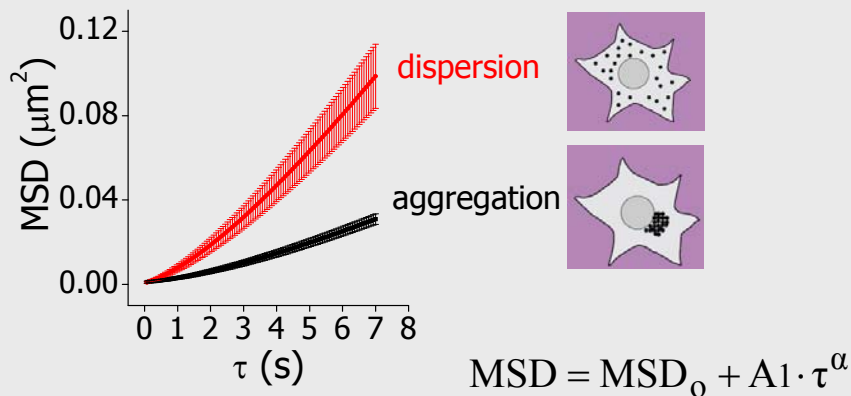


## Properties of myosin-V dependent transport



Why trajectories along actin filaments are not curvilinear?

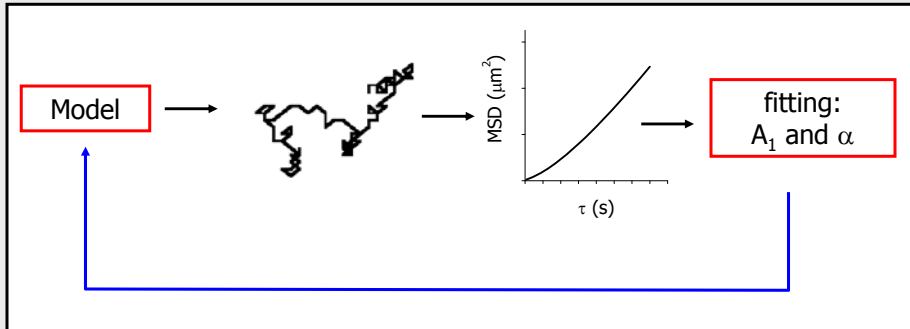
## Properties of transport driven by myosin-V



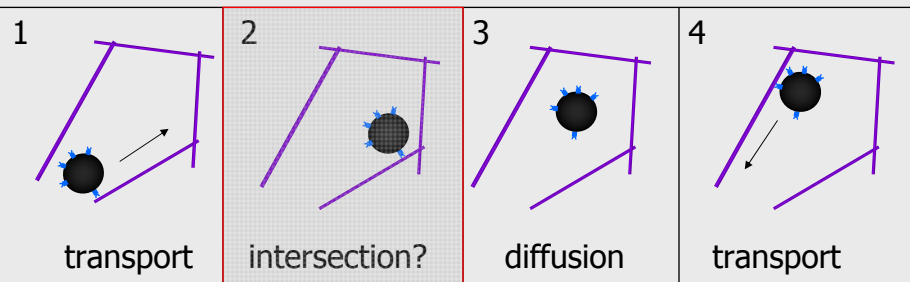
Condition	$MSD_0$ [ $\text{nm}^2$ ]	$A_1$ [ $\text{nm}^2$ ]	$\alpha$
aggregation	$560 \pm 30$	$1500 \pm 50$	$1.37 \pm 0.03$
dispersion	$600 \pm 30$	$4100 \pm 1000$	$1.33 \pm 0.02$

## Numerical simulations

How are these parameters related to the transport mechanism?



## The transport-diffusion model



Intersection: switching and detaching probabilities (Ali et al, PNAS 2007)

Lower number myosin motor/melanosome in aggregation (Gross et al. JCB, 2004)

### Experimental

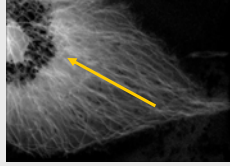
Condition	$A_1$ [ $\text{nm}^2$ ]
aggregation	$1500 \pm 50$
dispersion	$4100 \pm 1000$

### Model

diffusion time (s)	$A_1$ [ $\text{nm}^2$ ]
90	$1700 \pm 300$
30	$4000 \pm 600$

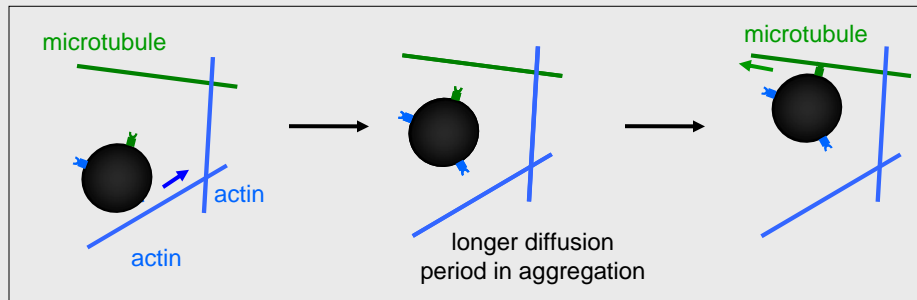
Brunstein et al. Biophys J 2009; Bruno et al. Phys Rev E 2009

## Diffusion increases the probability of switching to the microtubule network during aggregation



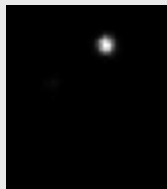
aggregation

During aggregation, organelles need to be transferred from the actin to the microtubule networks



## 3D Particle tracking

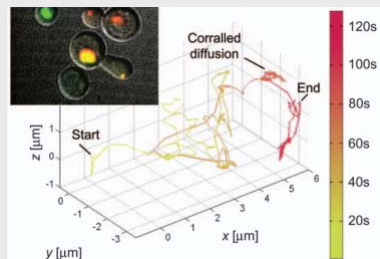
Making use of the z-sectioning capability of confocal and two-photon microscopes



1 z-plane ~ 0.1-1 s

Problems: low temporal resolution  
photobleaching

Alternative: spinning disk confocal microscopy

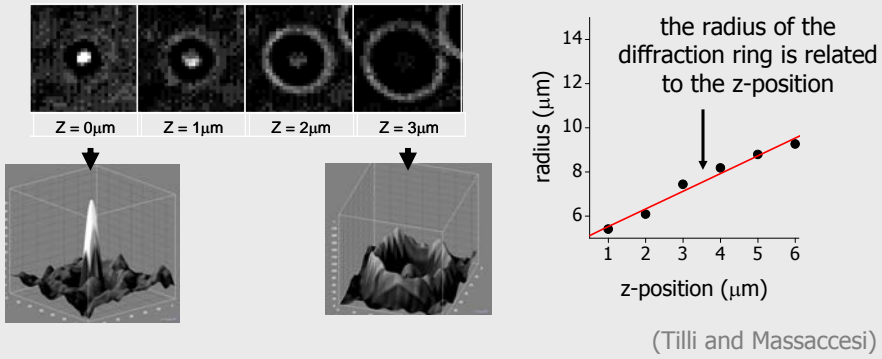


Eg: tracking ribonucleoprotein (RNP)

time resolution: 0.3 s

Lange et al, Traffic, 2008

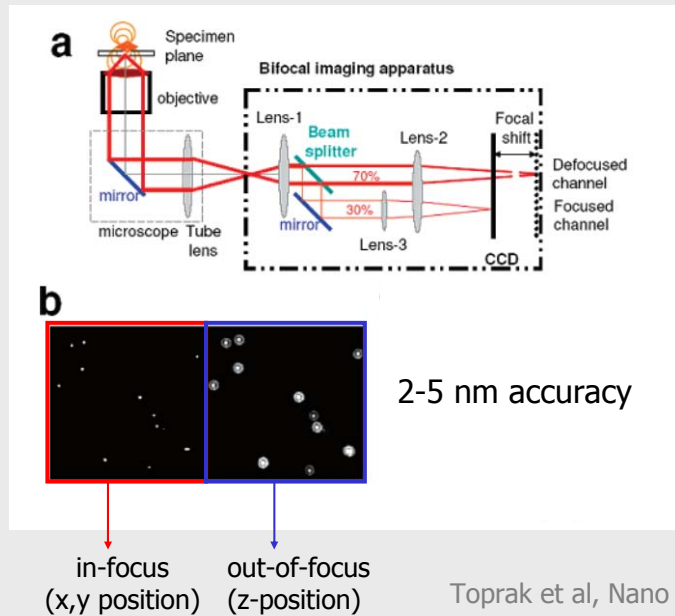
## Image-based 3D methods



Problems:

- limited z range
- error in (x,y) increases when the particle moves far from the focal plane

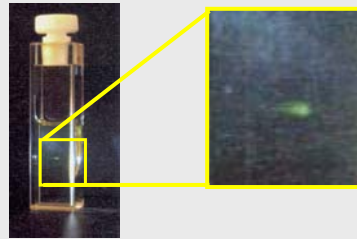
## Image-based 3D methods: Bifocal imaging



## Particle tracking in a 2-photon microscope

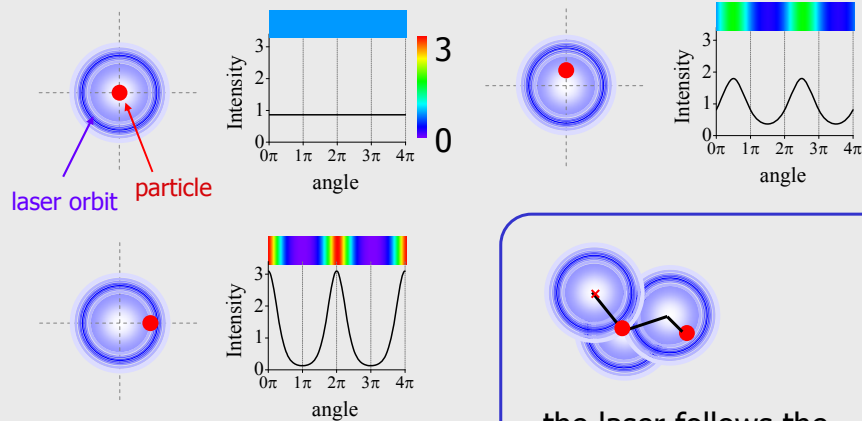
Motivations:

- particles could move far from the field of view
- widefield microscopy involves photobleaching
- Raster imaging is slow



2-photon

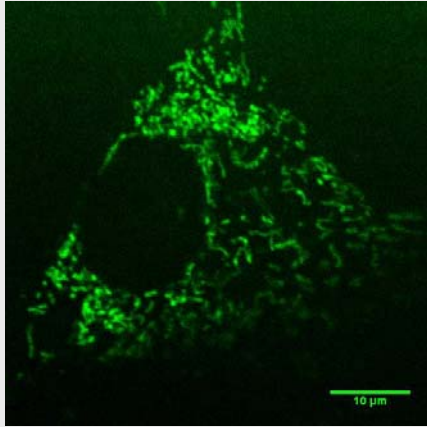
## Particle tracking in a 2-photon microscope



the laser follows the particle in real time

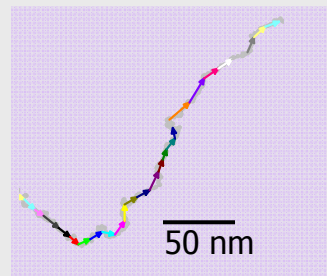
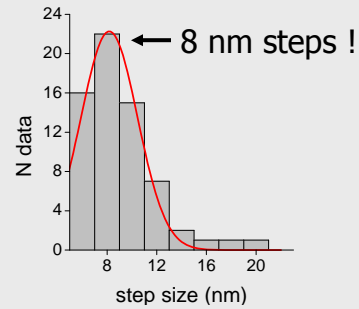
Levi et al Biophys J 2005a, 2005b

## Mitochondria transport in NIH3T3 cells

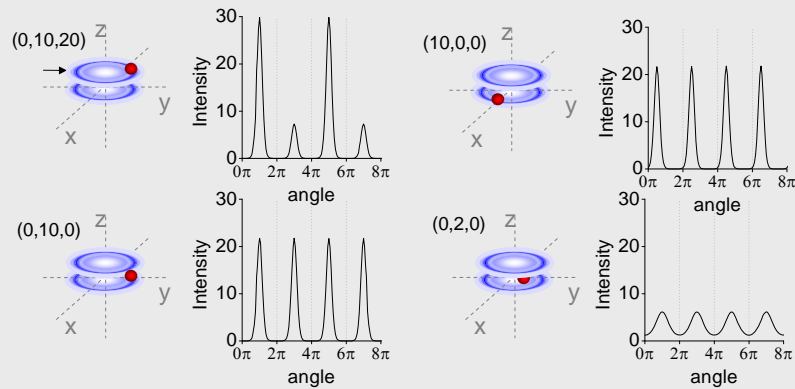


data from Diana Wetzler

time resolution = 4.1 ms  
accuracy = 2 nm



## 3D-Particle tracking in a 2-photon microscope



more on 3D tracking at the Weber Conference

Levi et al Biophys J 2005a

## More SPT talks in the Gregorio Weber Conference

Thursday, December 15

12:00-12:20	S2-1) LUCIANA BRUNO (Universidad de Buenos Aires, Argentina)
12:20-12:40	S2-2) ENRICO GRATTON (LFD, University of California Irvine, USA)
12:40-13:00	S2-3) ANDRE GOMES (Universidade Federal do Rio de Janeiro, Rio de Janeiro, Brazil)