

# Cell migration in the immune system

Rob J de Boer, Utrecht University

## Theoreticians:

Joost Beltman (UU, LU), Ioana Niculescu (UU),  
Johannes Textor (UU) & Stan Marée (Norwich).

## Experimental collaborators:

Jennifer Lynch & Mark Miller (St Louis)  
Sarah Henrickson & Ulrich Von Andrian (Harvard)  
Silvia Ariotti & Ton Schumacher (NKI, Amsterdam)

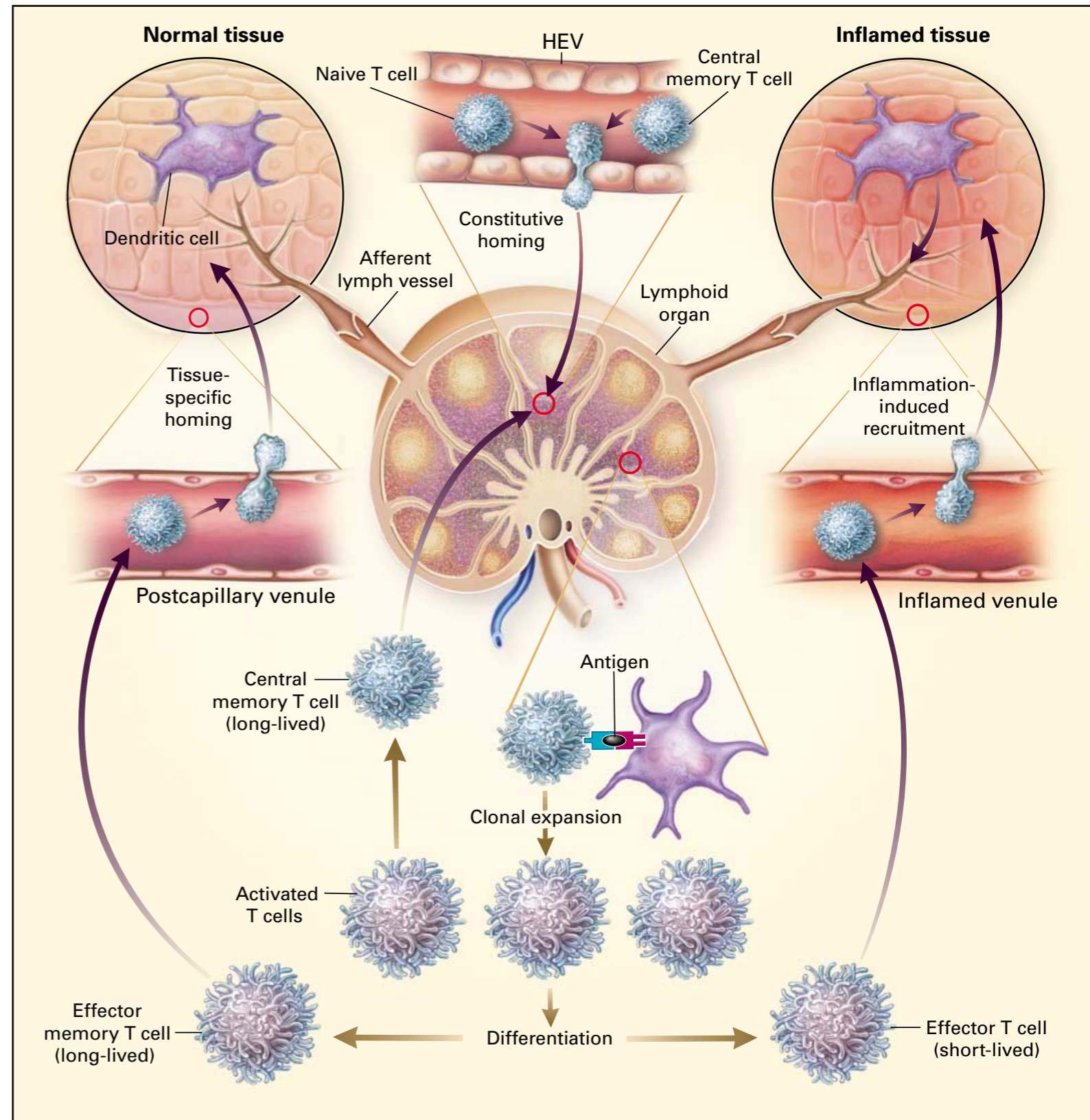
# Immune responses develop in draining lymph nodes

Dendritic cells (DC) scan peripheral tissues, and migrate to draining lymph nodes to present their antigens.

Millions of different naive T cells migrate through lymph nodes, and bind these DC.

Only 1:100000 T cells will become activated, expand, and emigrate as effector cells that move back to the inflamed tissues.

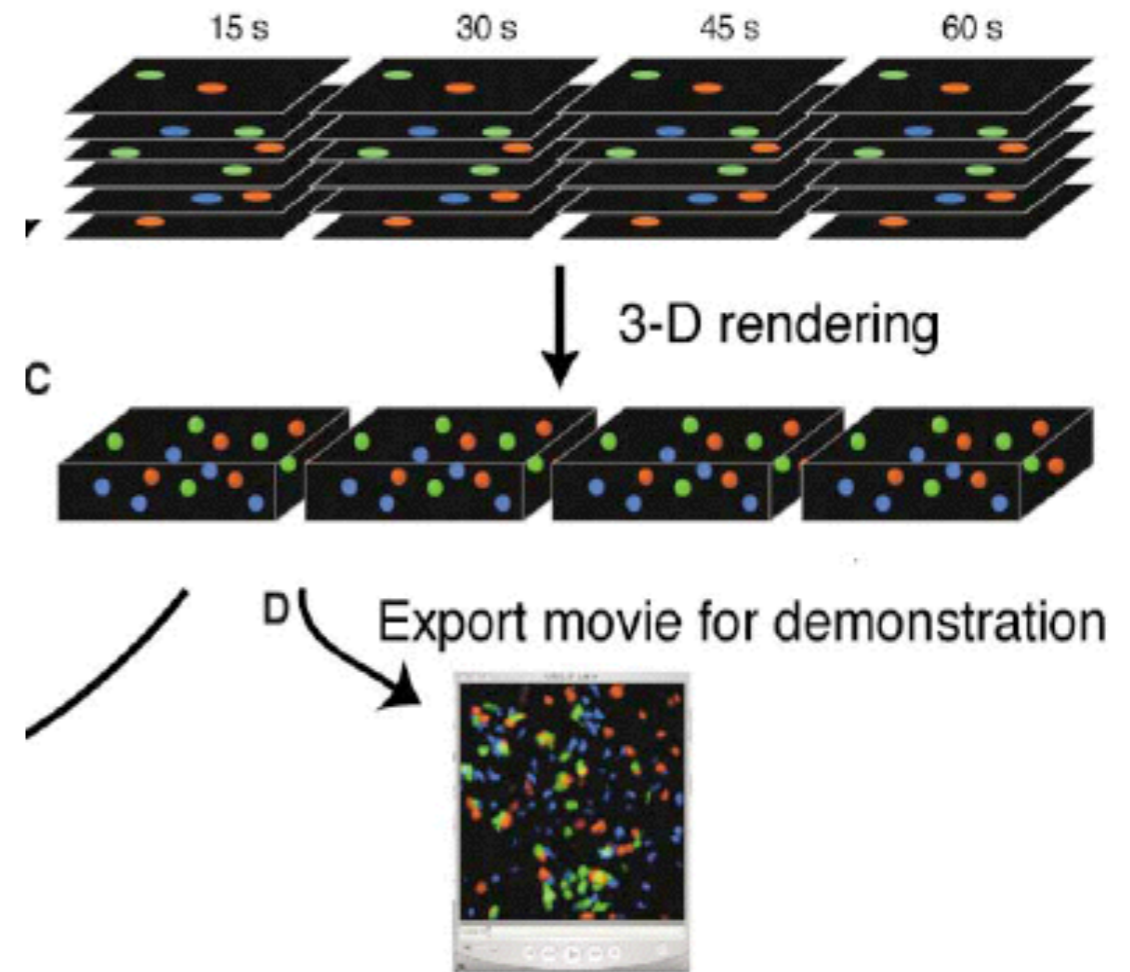
**Needle in a haystack problem:  
how long would it take to  
initiate an immune response?**



# Two photon microscopy: 2PM



Cahalan et al. Curr Op Immunol (2003)



Sumen et al. Immunity (2003)

Label cells with fluorescent marker, inject, wait until they arrive in lymph node

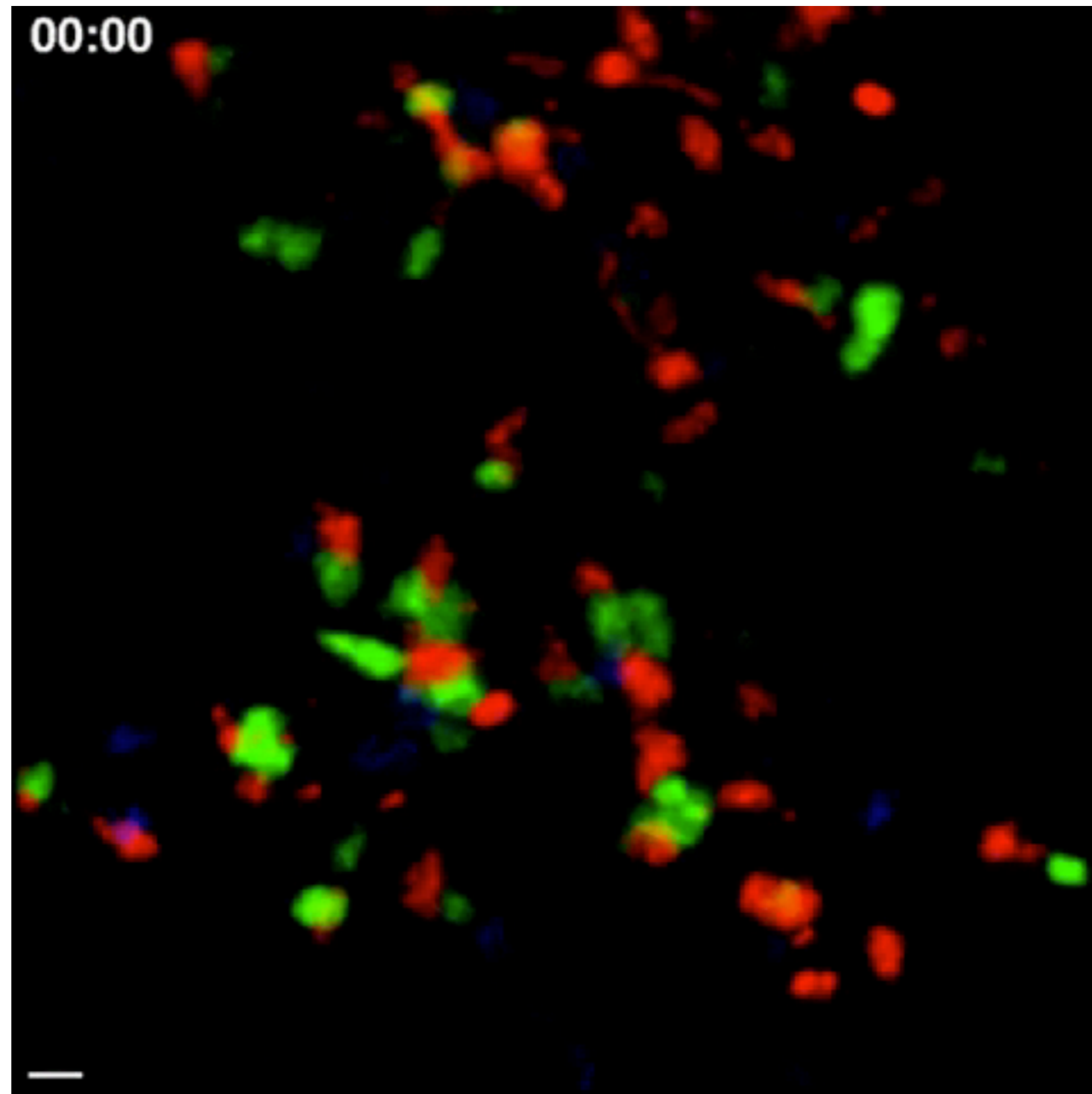
Use different colors for T cells and dendritic cells

Use tracking software to translate videos into cellular trajectories

**Delivers rich data sets that are difficult to quantify**



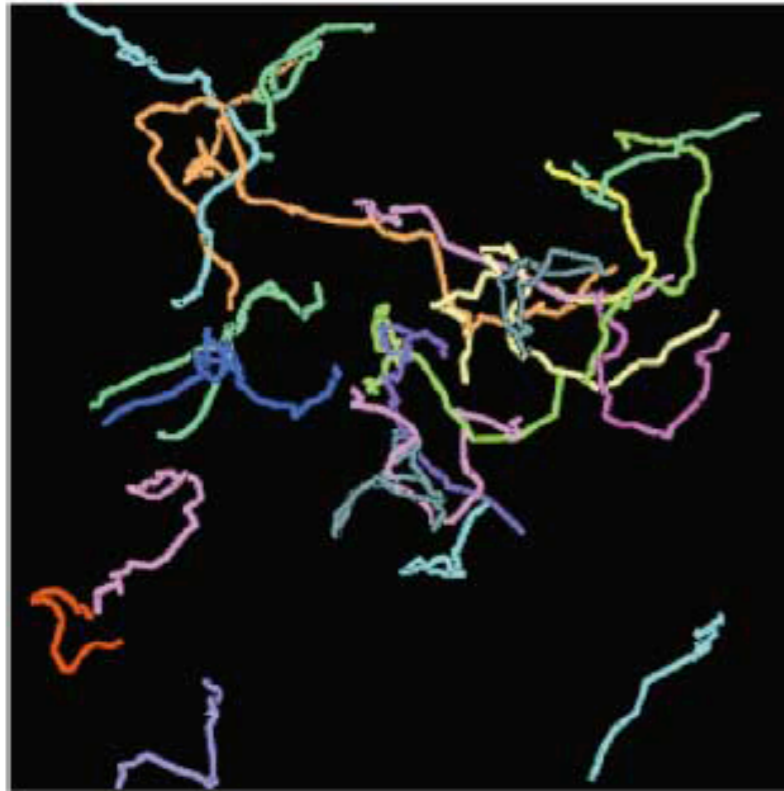
# Vivid movies of migrating cells in LT



Henrickson et al.  
Nat. Imm (2008)

**Green:** Ag specific CD8 T cells, **Blue** control cells, and **Red** DC  
Small volume and short time period: tracks are biased samples

# Software tracks the cells “automatically”

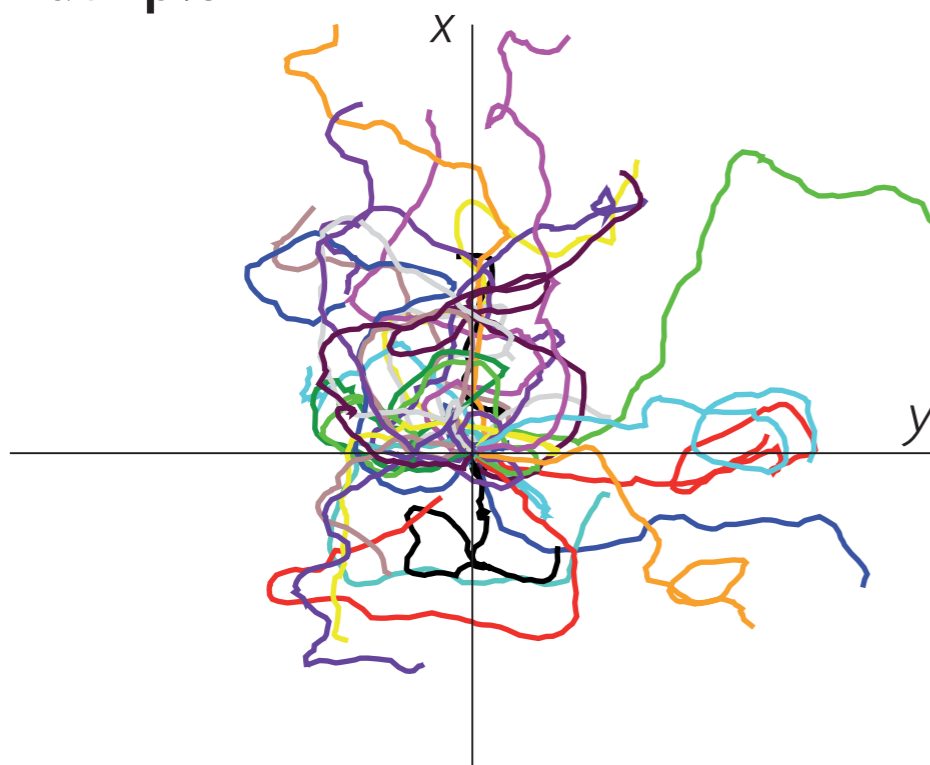


Export  
tracks →

Track	Time-point	Coordinate		
		X	Y	Z
1	1	127.1	62.8	4.4
1	2	124.2	59.3	3.8
1	3	122.2	60.7	3.1
1	4	119.2	63.3	3.6
1	5	116.8	63.2	4.4
1	6	114.1	63.1	3.1
1	7	113.7	60.5	3.4
1	8	114.9	60.4	2.1
1	9	115.1	62.5	1.5
2	5	112.3	95.4	2.4
2	6	112.5	93.5	1.4
		⋮		

Compute  
→  
motility  
parameters

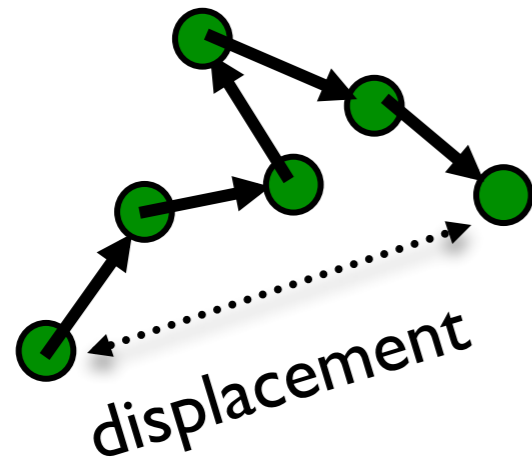
Track plot



Quantify cell migration by:

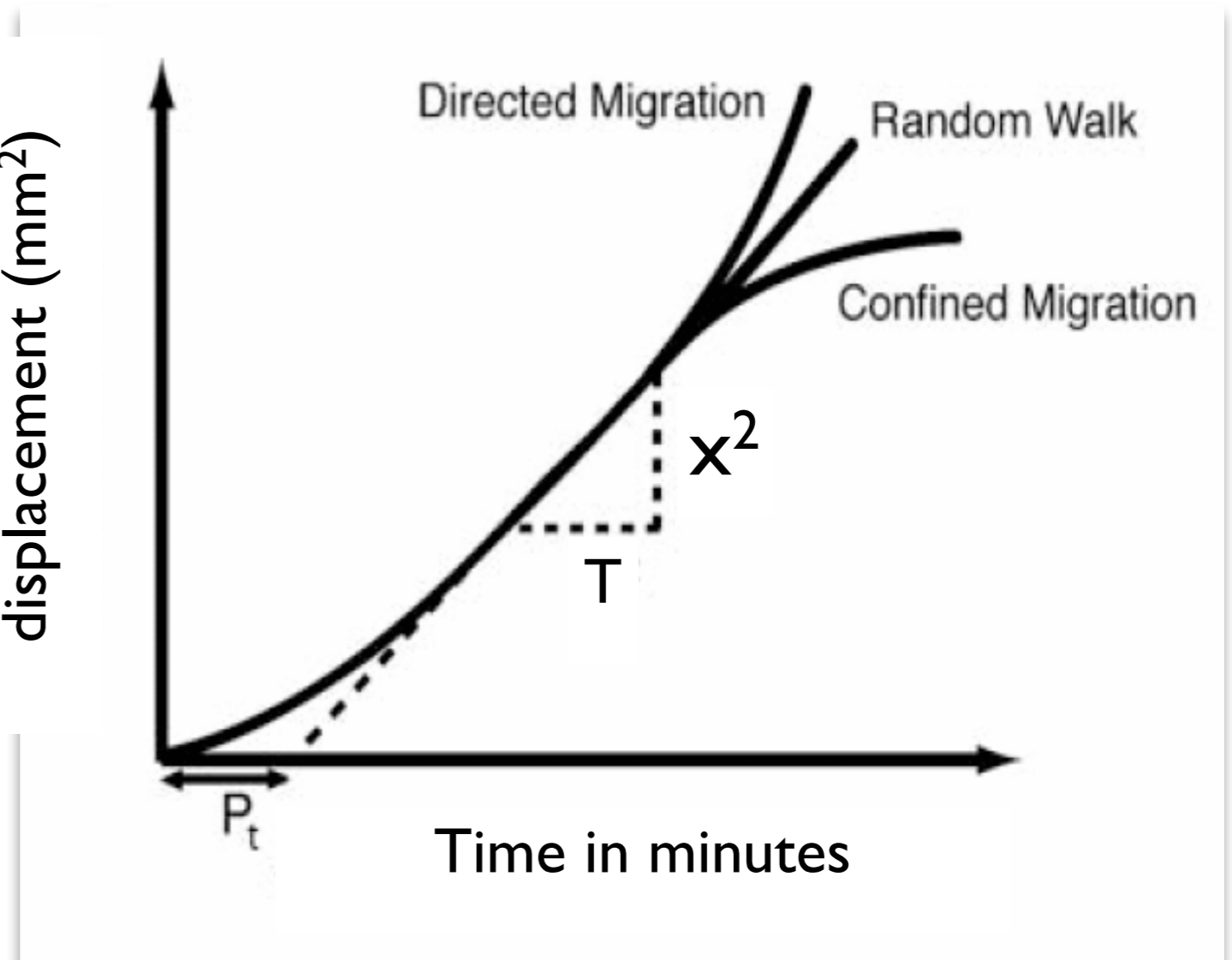
- plot tracks
- record speeds
- angles of migration
- mean square displacement plot

# Mean square displacement suggests a random walk



Mean square

displacement ( $\text{mm}^2$ )

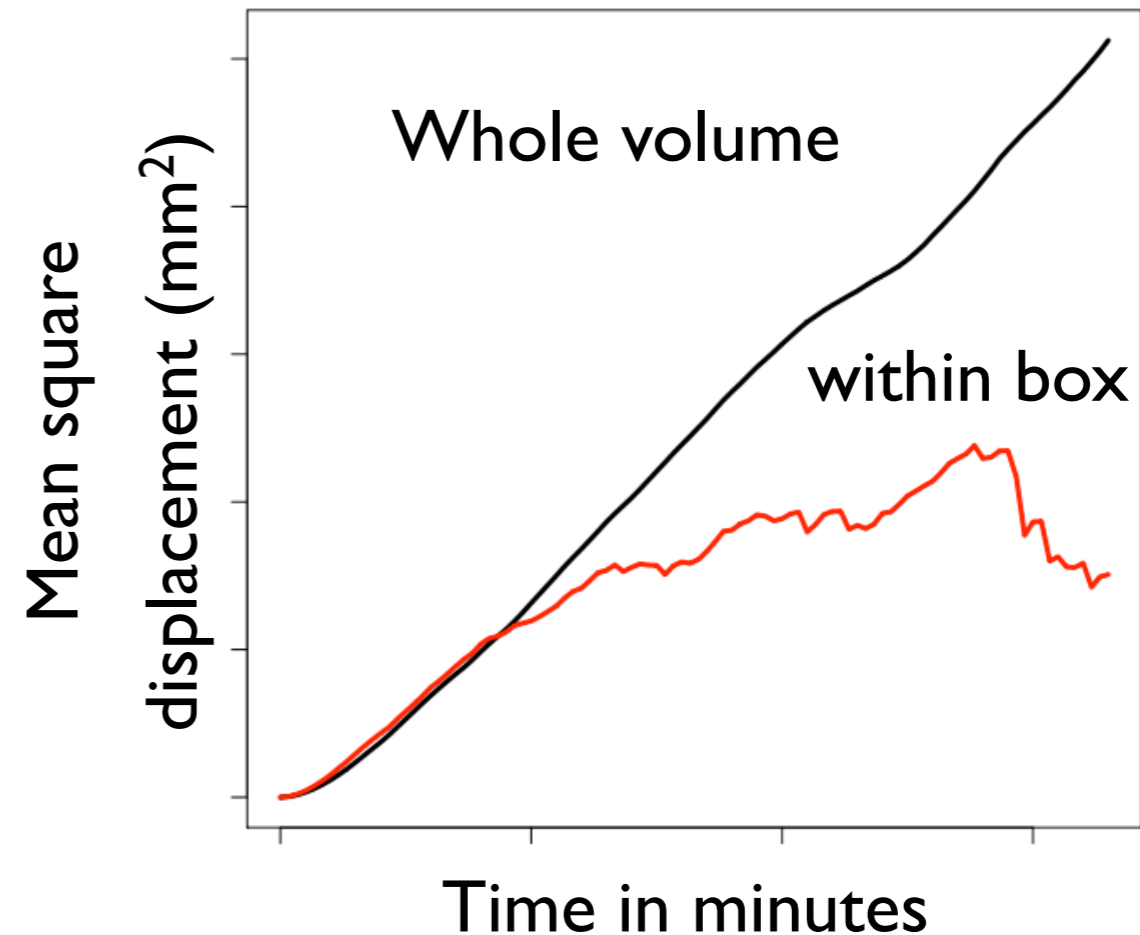
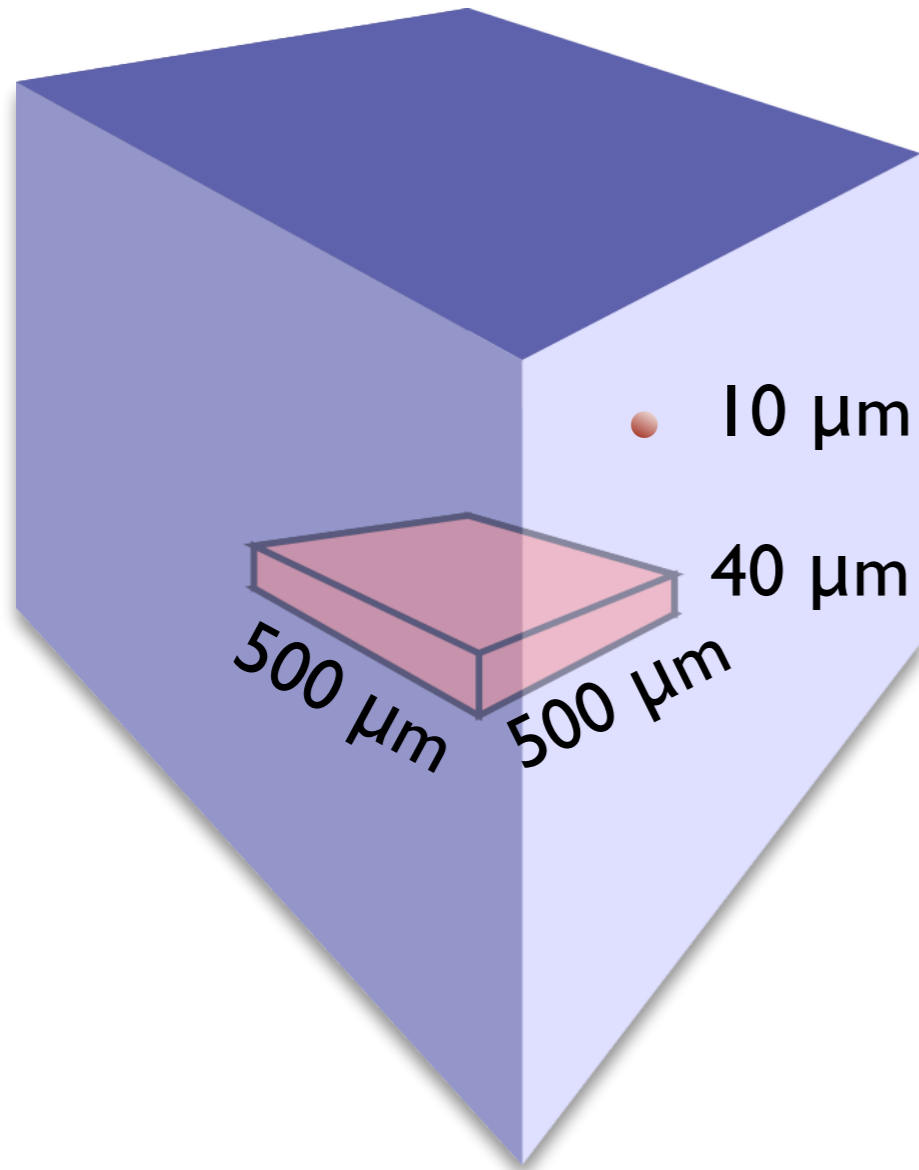


Motility (diffusion)  
coefficient:

$$M = \frac{\overline{x^2}}{2dt}$$

$d$ : dimension,  
 $x$ : displacement,  
 $t$ : time

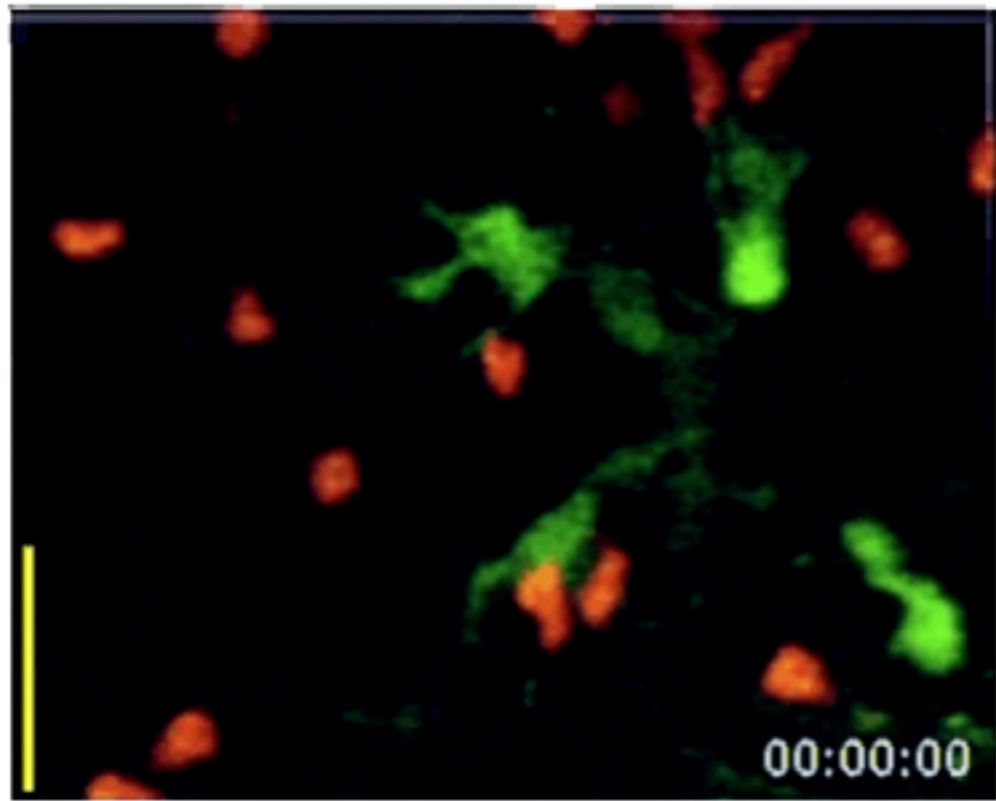
# Mere imaging in a small volume gives a bias



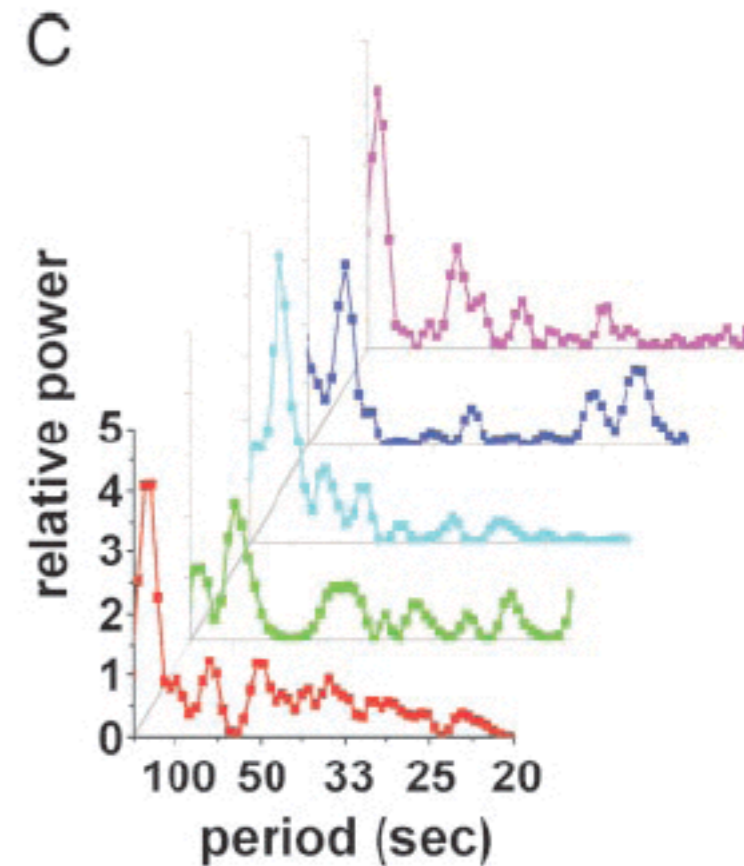
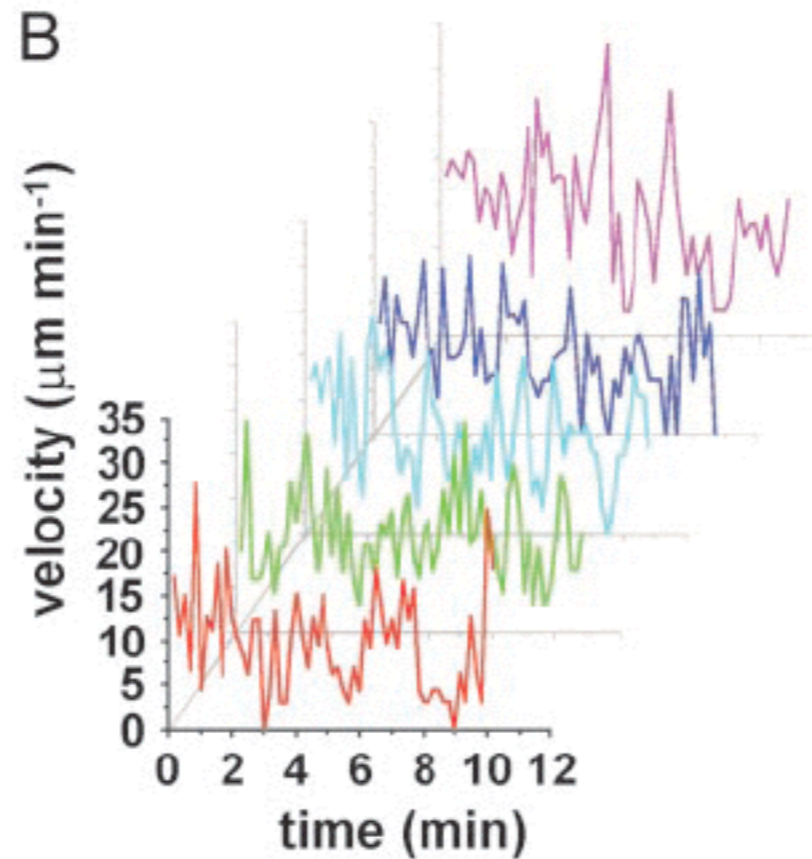
At large time intervals the displacement plot will be biased towards slow cells that tend to stay in the box.

This looks like confined migration

# T cells migrate randomly in the absence of antigen



Red: T cells, Green: Dendritic cells (DC)



Maximum intensity projection giving a top-view

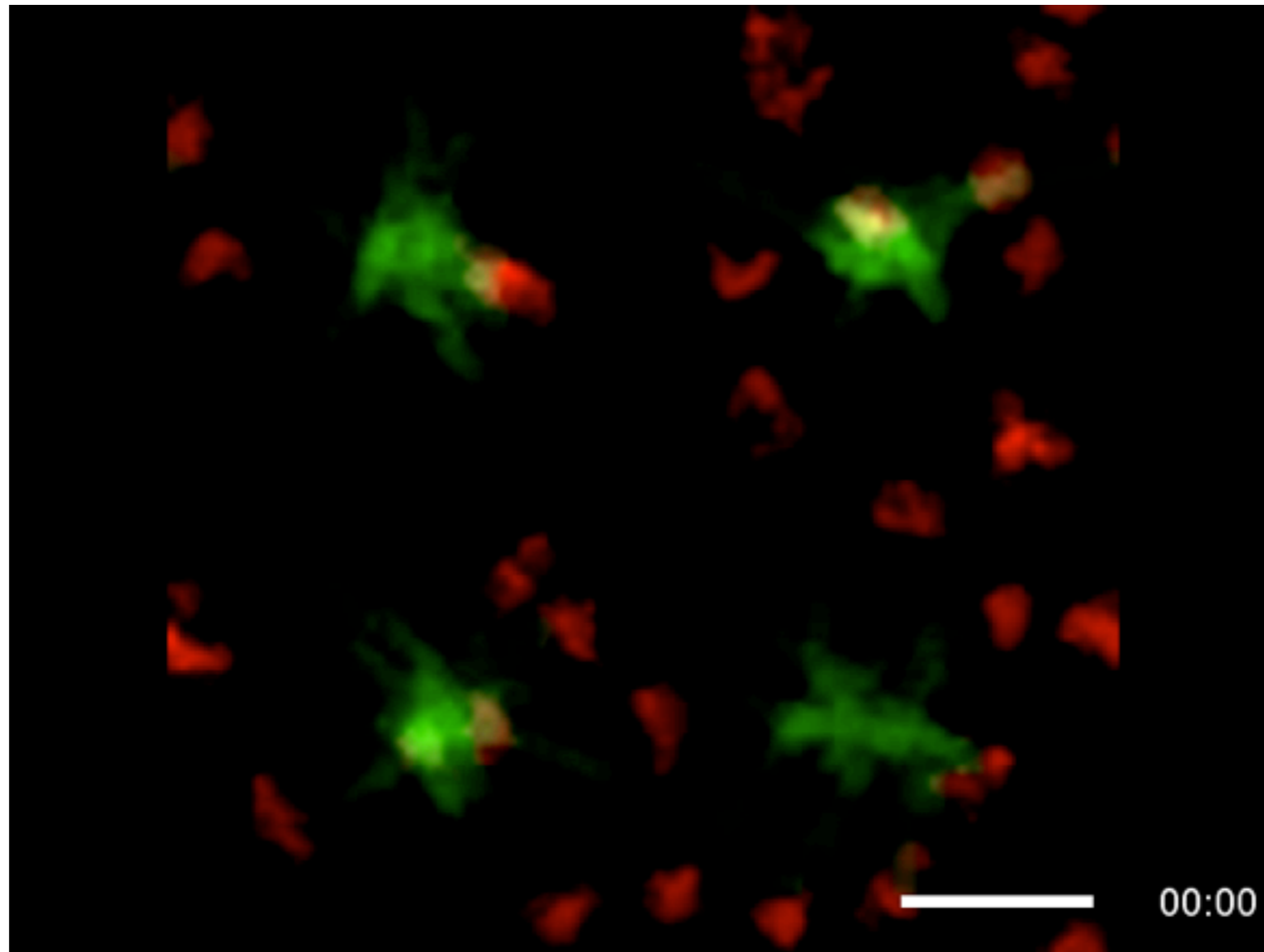
Random walk, irregular velocities, speed one cell diameter  $\text{min}^{-1}$

no overall directionality, no collective motion

stop-and-go movement: peak in Fourier spectrum at  $\sim 1$  min



# Cellular Potts Model: in silico movie where we “labeled” a small subset of the cells

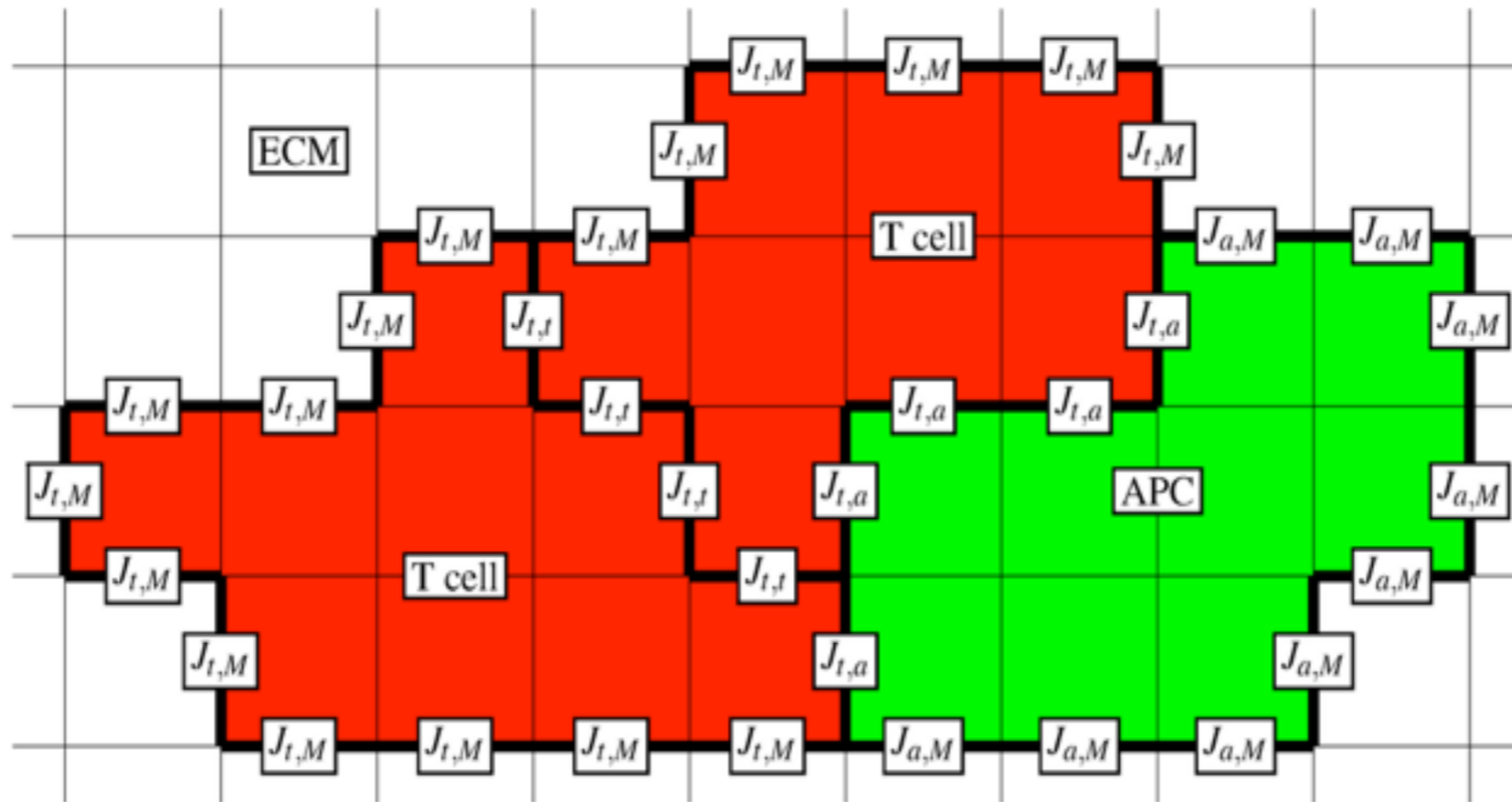


**Red:** T cells      **Green:** Dendritic cells (DC)

Similar maximum intensity projection

Beltman et al. J Exp Med (2007)

# Cellular Potts Model: grid based



$$H = \sum J + \lambda(v - V_T)^2$$

Surface energies: Hamiltonian

System minimizes its energy

$\Delta H$  determines probability of copying (Boltzmann distribution)

# Cellular Potts Model

0	0	3	3	3	3	3
0	0	0	3	3	3	3
0	0	0	5	3	3	3
0	5	5	5	5	5	3
5	5	5	5	5	5	5

# Cellular Potts Model

0	0	3	3	3	3	3
0	0	0	3	3	3	3
0	0	0	5	3	3	3
0	5	5	5	5	5	3
5	5	5	5	5	5	5



# Cellular Potts Model

0	0	3	3	3	3	3
0	0	0	3	3	3	3
0	0	0	5	3	3	3
0	5	5	5	5	5	3
5	5	5	5	5	5	5

# Cellular Potts Model

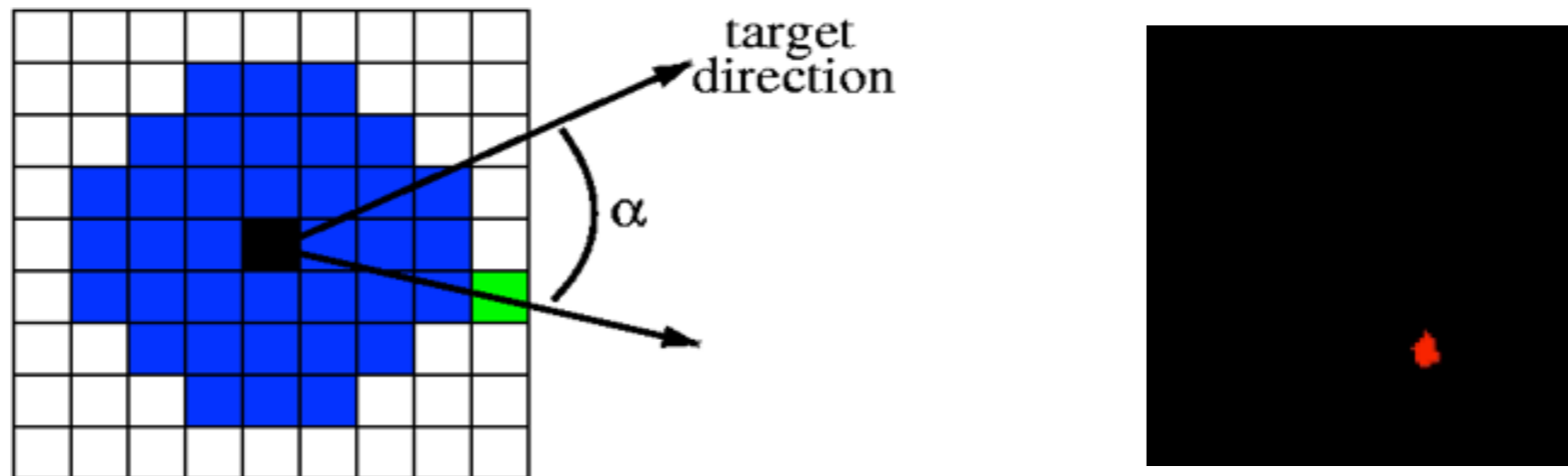
0	0	3	3	3	3	3
0	0	0	3	3	3	3
0	0	0	3	3	3	3
0	5	5	5	5	5	3
5	5	5	5	5	5	5

# Cellular Potts Model

0	0	3	3	3	3	3
0	0	0	3	3	3	3
0	0	0	3	3	3	3
0	5	5	5	5	5	3
5	5	5	5	5	5	5

To move T cells have a target direction

$$\Delta H = -\mu \cos(\alpha)$$



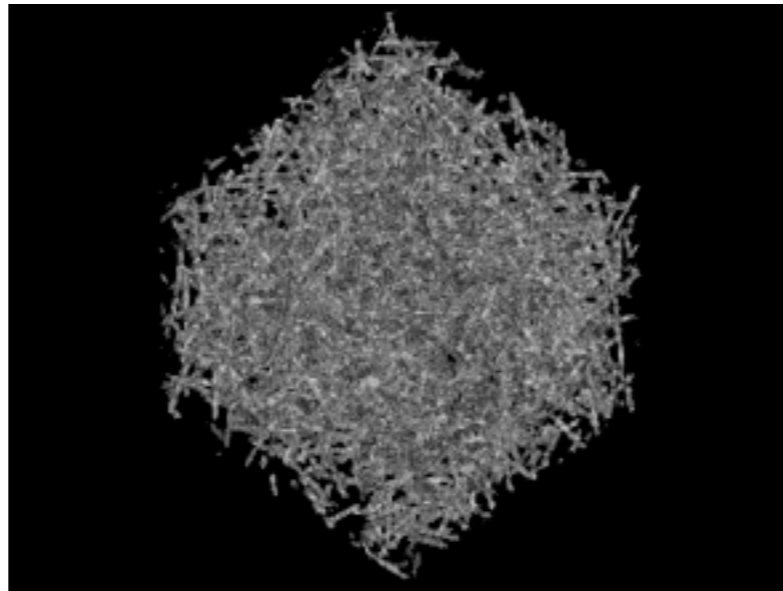
Target direction is adjusted according to recent displacement  
(directional persistence)

New “actin inspired” model:

<http://tbb.bio.uu.nl/ioana/cpm/>



T cell area in lymph nodes has a static reticular network



1 pixel =  $1 \mu\text{m}^3$

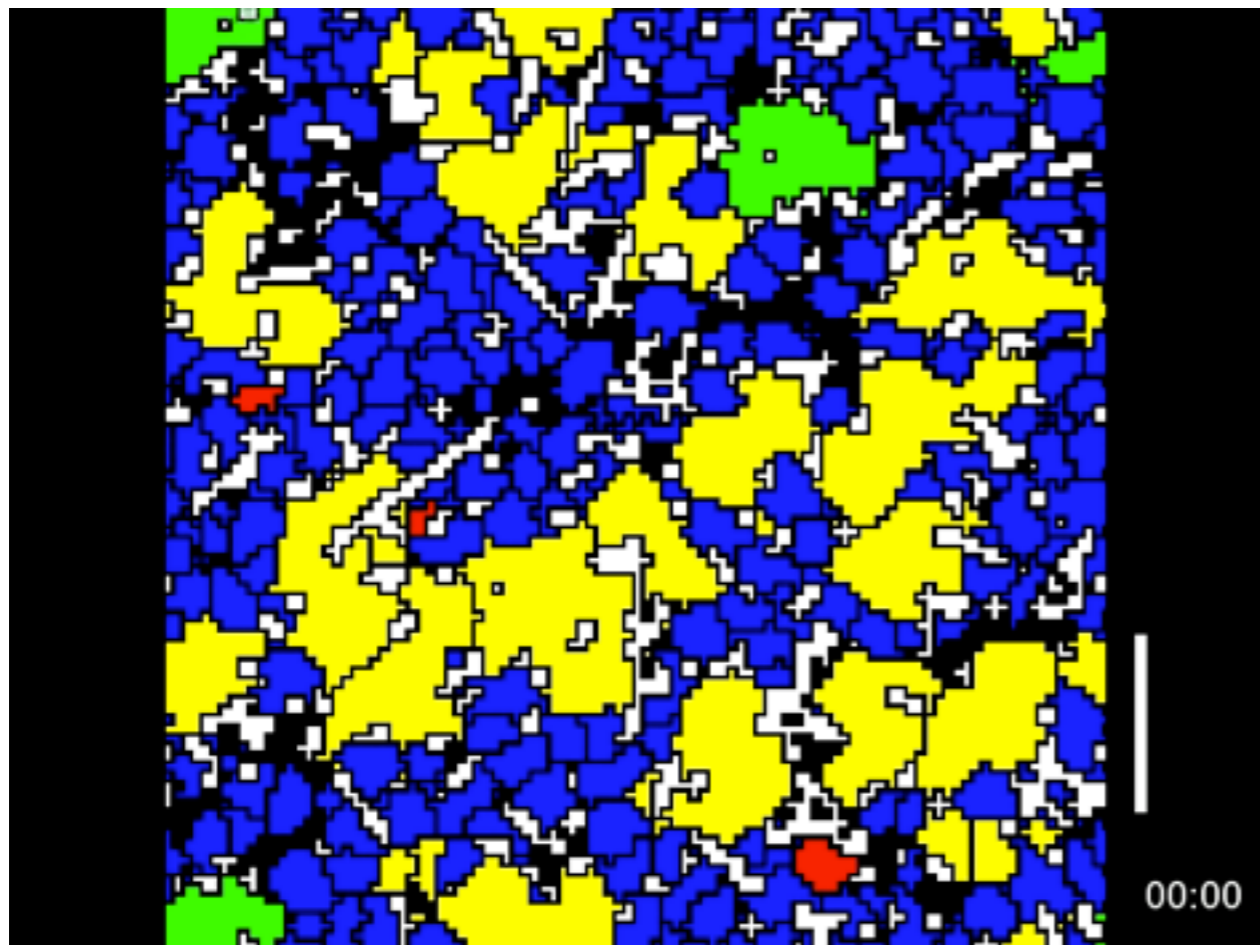
T cell:  $150 \mu\text{m}^3$ , DC:  $2200 \mu\text{m}^3$

torus:  $100 \mu\text{m} \times 100 \mu\text{m} \times 100 \mu\text{m}$

reticular network: randomly oriented rods

# Cell populations in the CPM

cross-section:



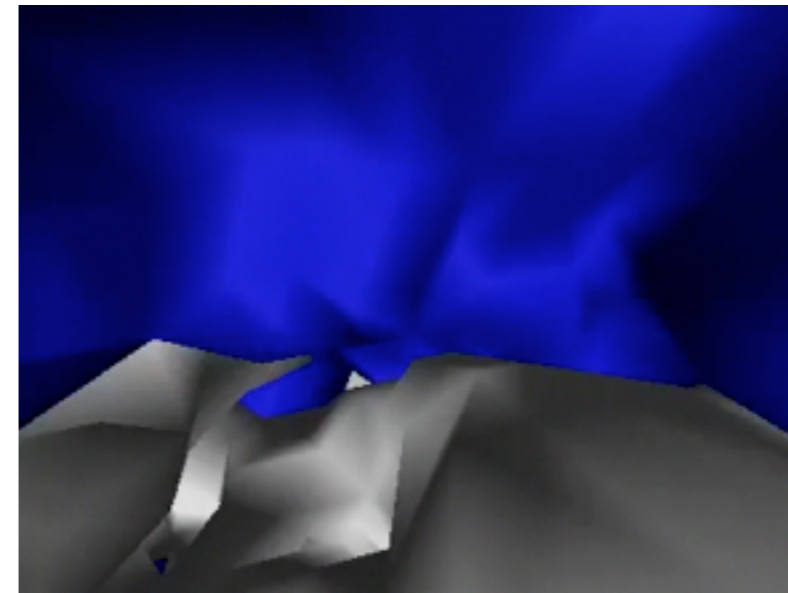
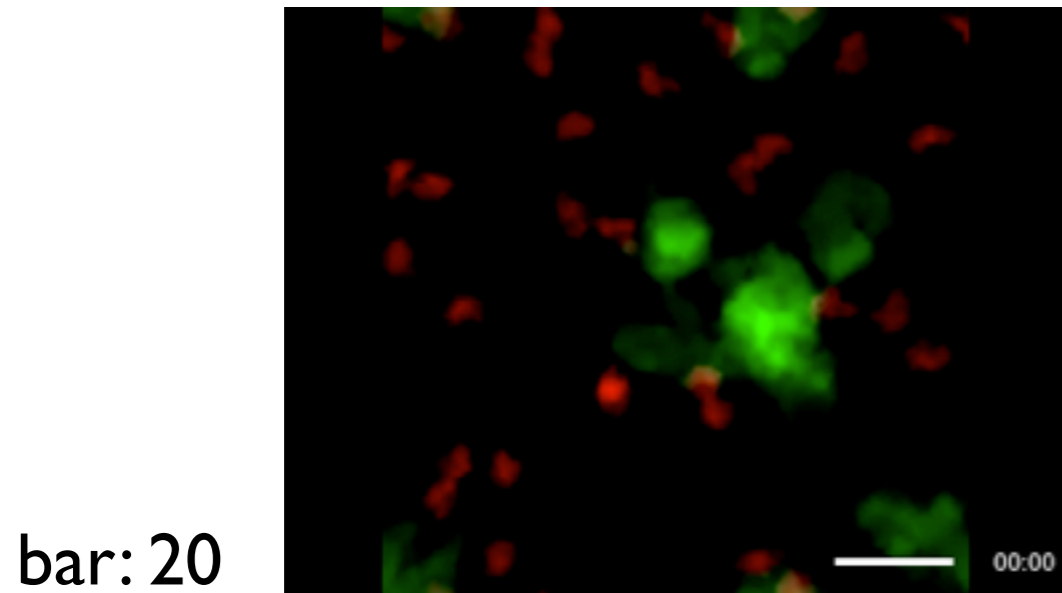
- rods (reticular network)
- extracellular matrix
- non-labeled DCs
- labeled DCs
- non-labeled T cells
- labeled T cells

These were all the rules of the game (all assumptions)

We have tuned the adhesion parameters

model is phenomenological!

# normal X-ray view and true 3D view



bar: 20  
 $\mu\text{m}$



labeled DCs



labeled T cells



reticular network



non-labeled T cells

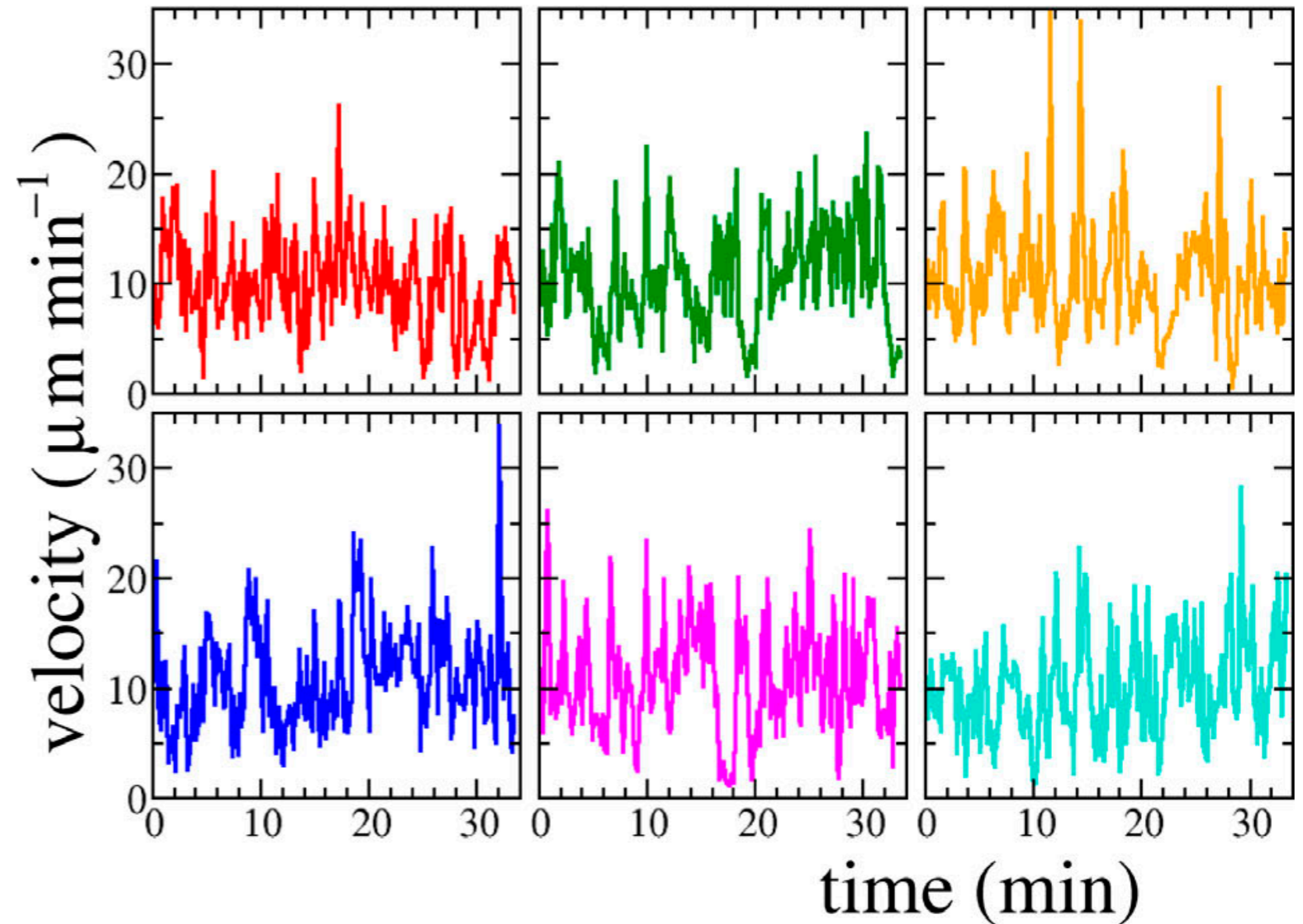
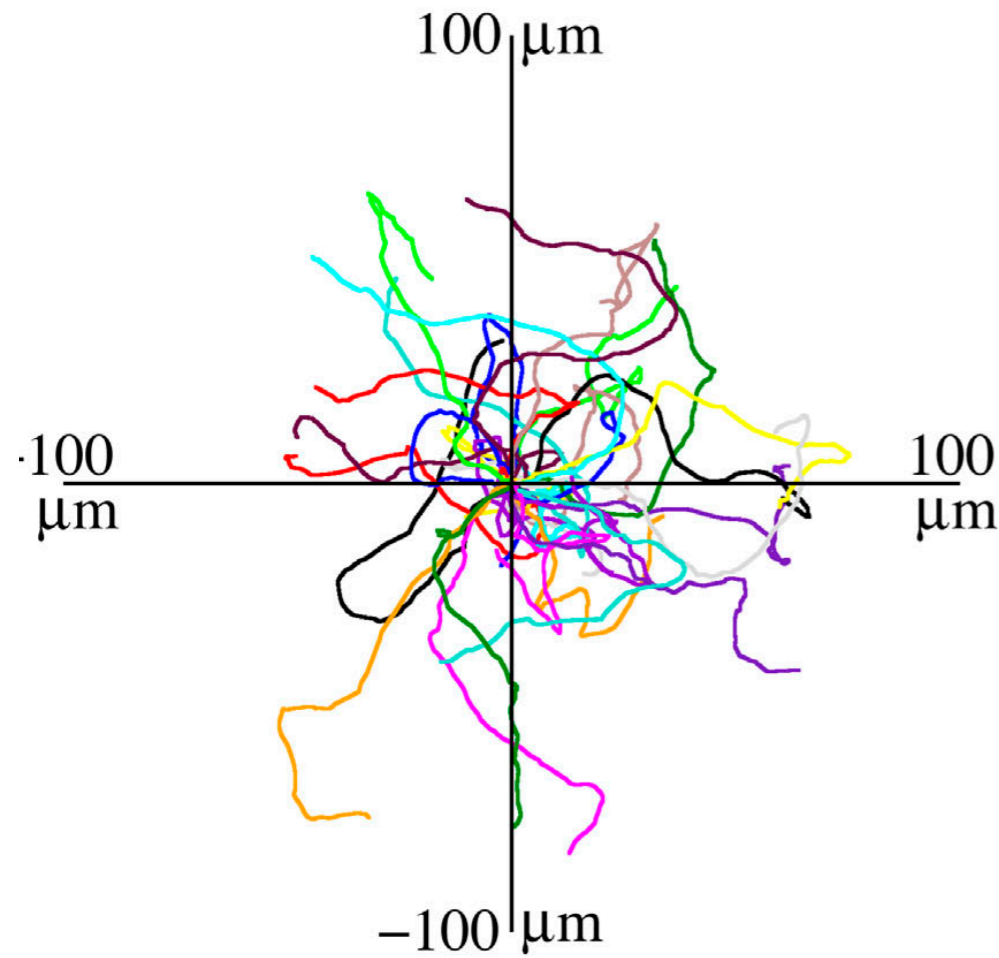


non-labeled DCs

Grey: reticular net, Blue:T cells, Green/Yellow: DCs

Because we now see all the cells we appreciate much better that  
this is a densely packed environment!

# T cell tracks in the model: automatic



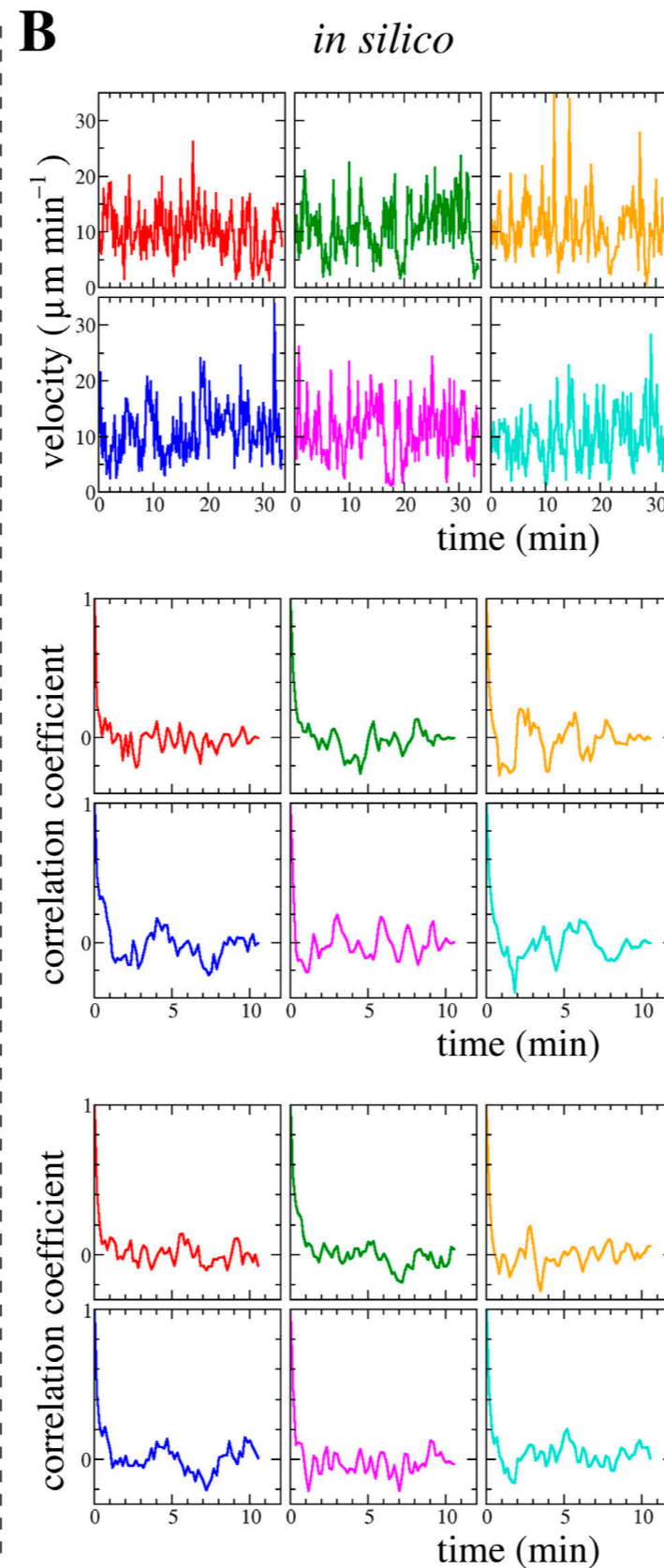
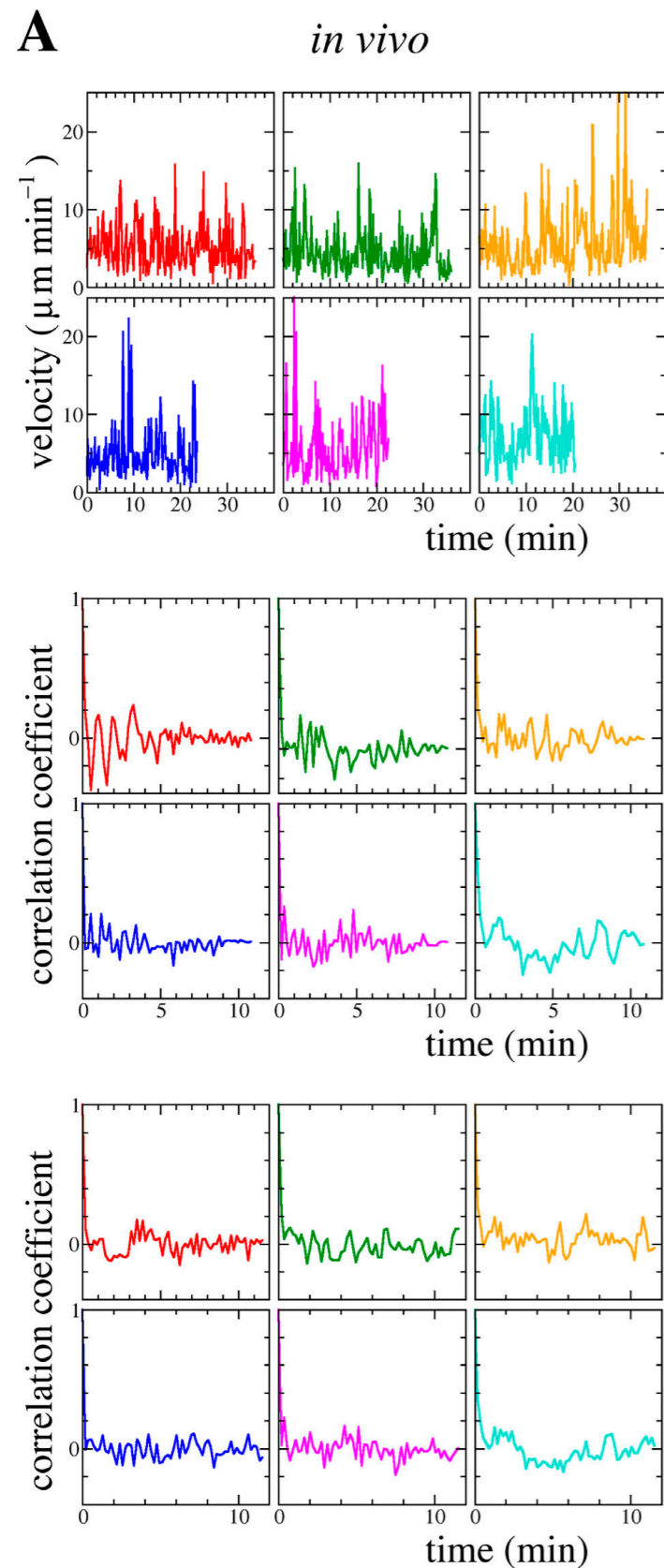
Very similar persistent motion in short term.

Very similar irregular velocities.

But no stop-and-go encoded in the model?



# Stop-and-go just due to collisions

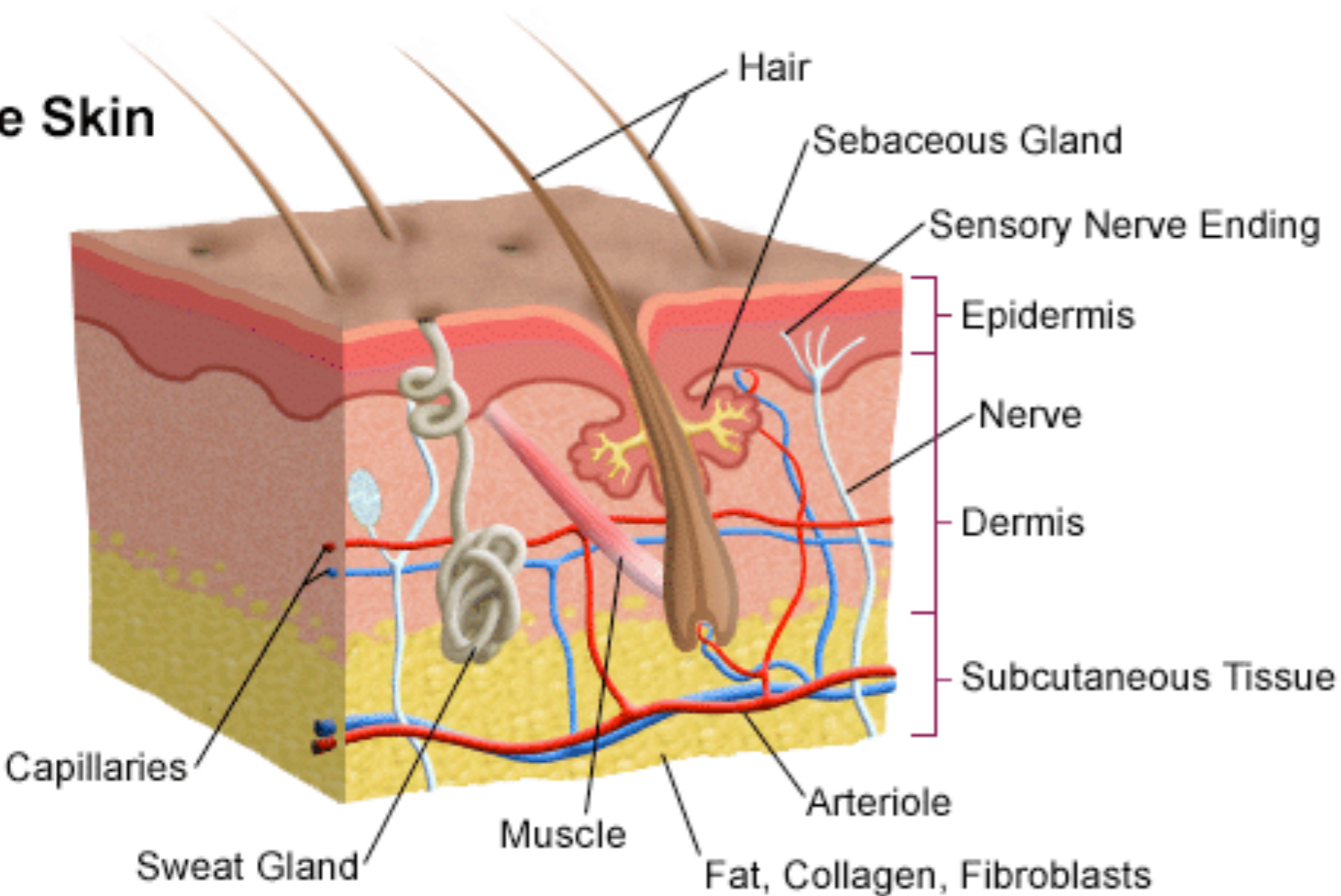


Longer time series

Autocorrelation on first 64 data points

Autocorrelation on all data points

# HSV infection in skin epidermis



Infect epidermis with Herpes Simplex Virus (HSV-1)

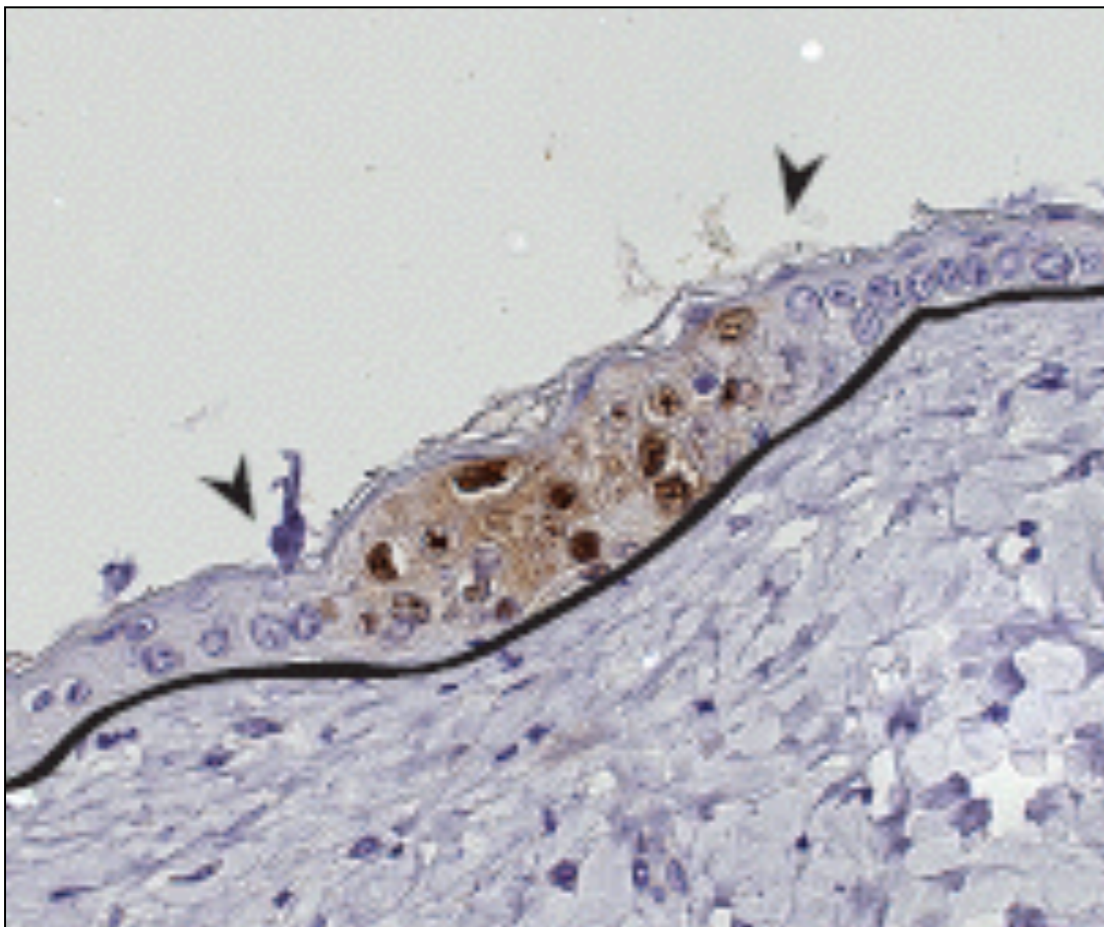
Visualize infected skin + effector T cells

Silvia Ariotti & Ton Schumacher (NKI, Amsterdam)



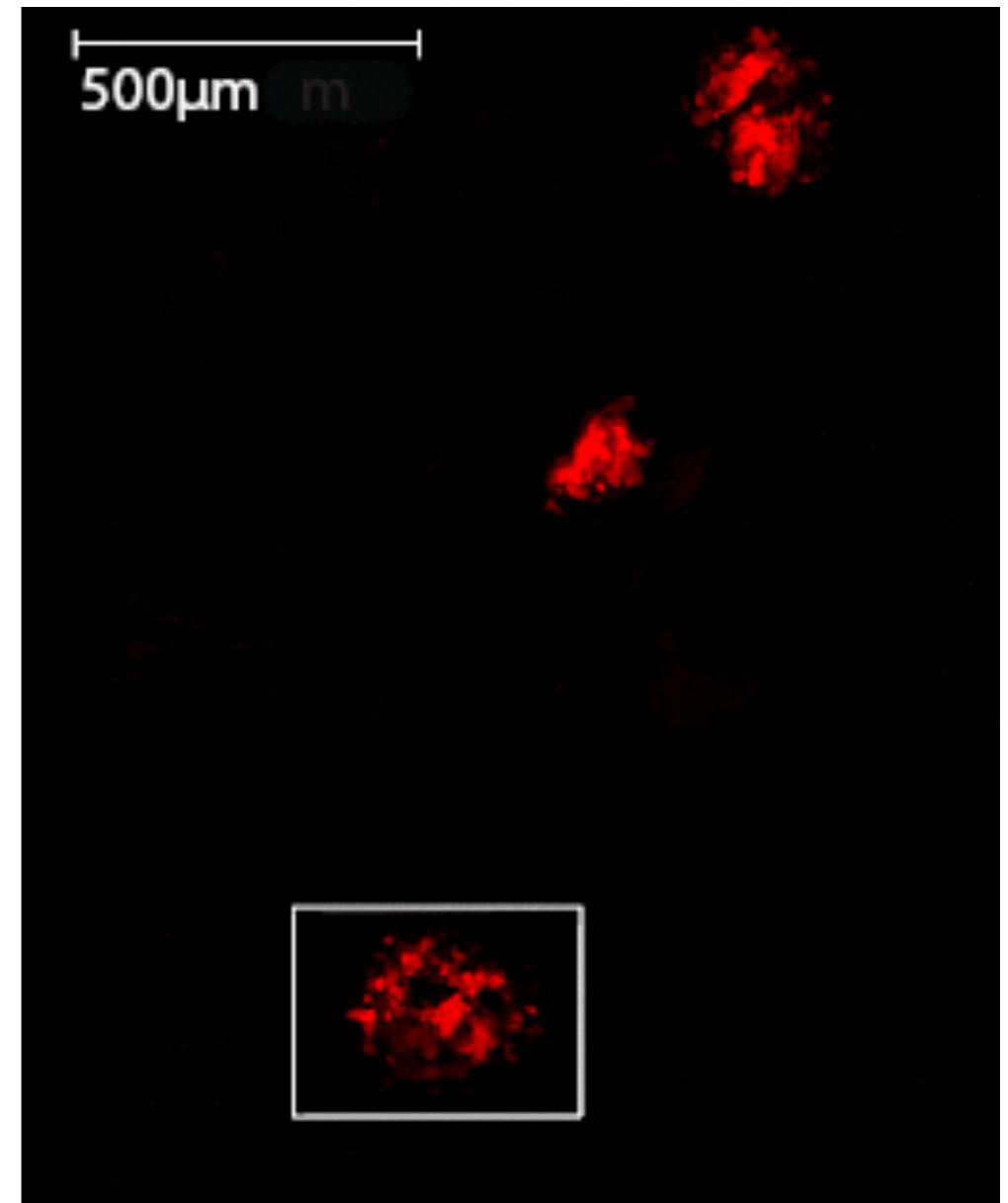
# Patches of HSV infection

Immunohistochemistry staining  
with anti-HSV antibody



Black line: basal membrane

Confocal microscopy

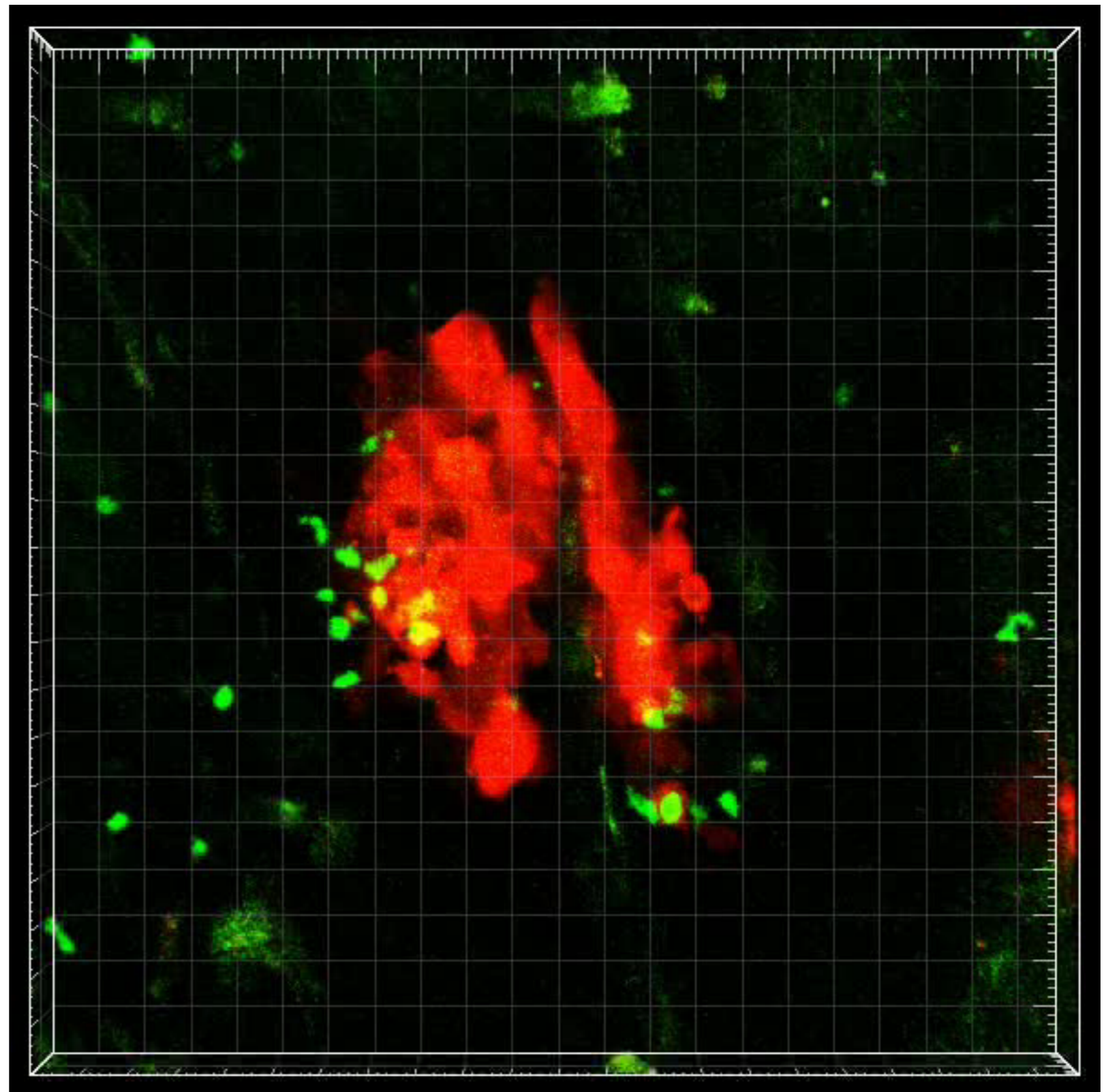


# Silvia Ariotti & Ton Schumacher (NKI, Amsterdam)

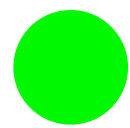
- specific T cell
- HSV (virus)

≈ 100 min

440x440x30μm







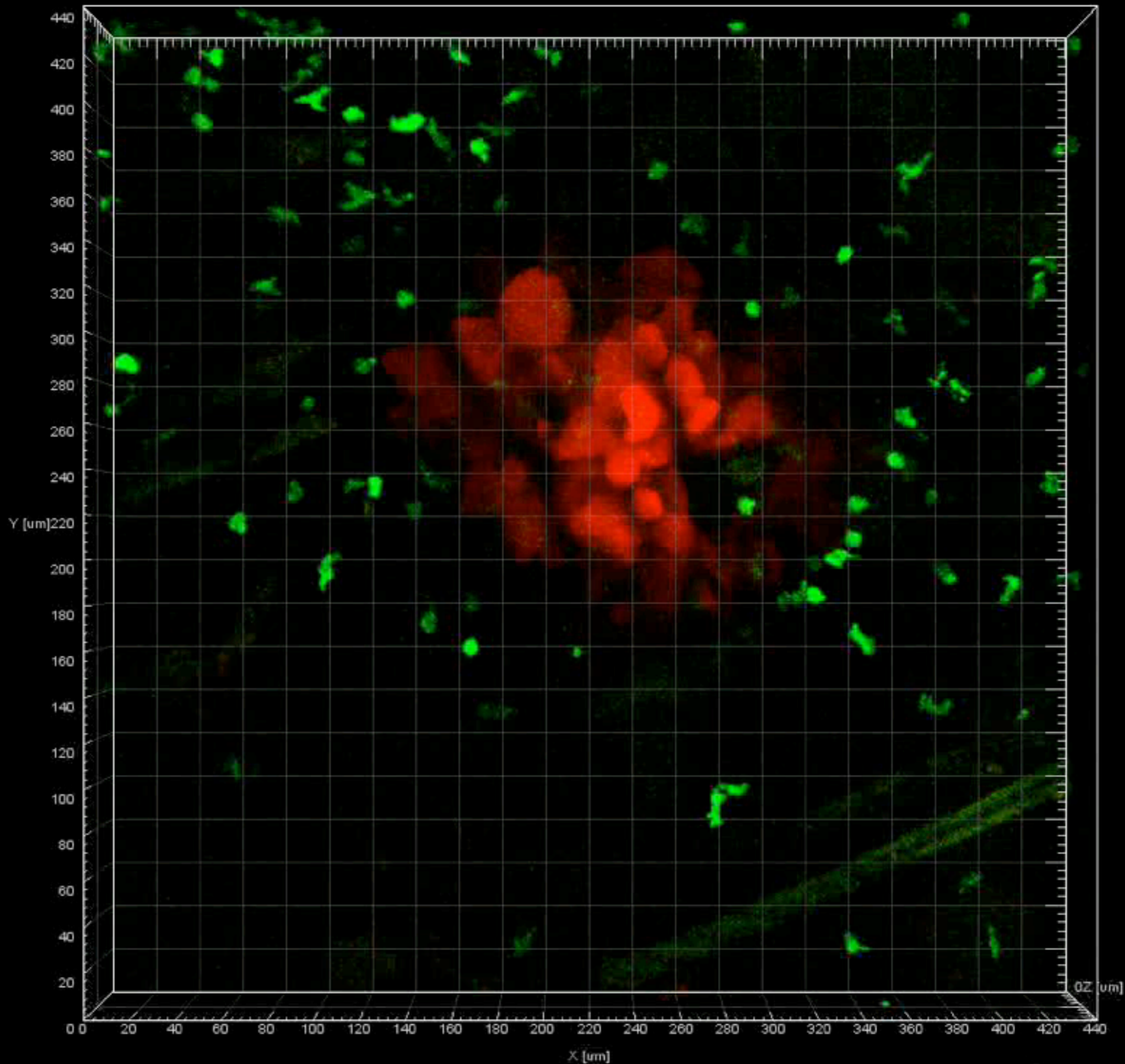
other T cell



HSV

≈60 min

440x440x35μm



0d00:00:00.000

Time

# How do T cells reach microlesions?

By random or directed migration?

Differences close to/far away from infection?

Differences by presence of matching antigen?

Not apparent from visual inspection.

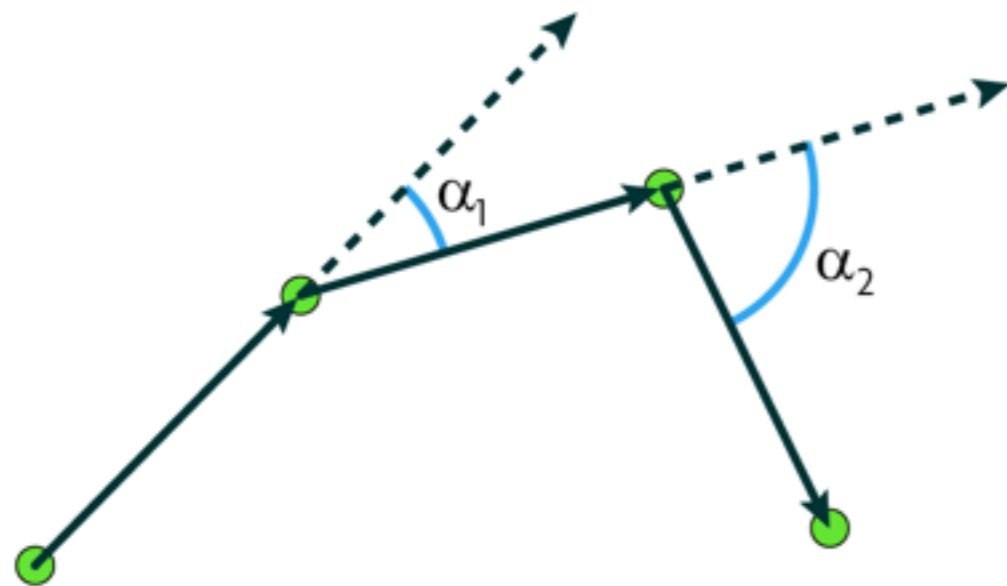
Quantitative analysis on tracked cells is required



# Calculate for each movement step:

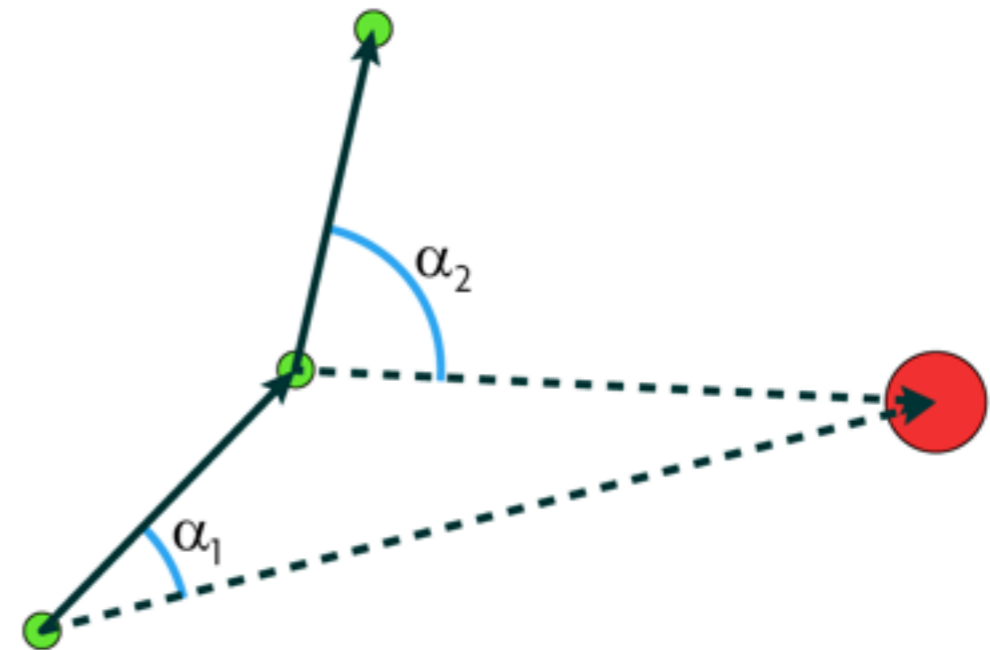
1. speed

2. turning angle



Persistent motion:  
<90 degrees

3. angle to infection



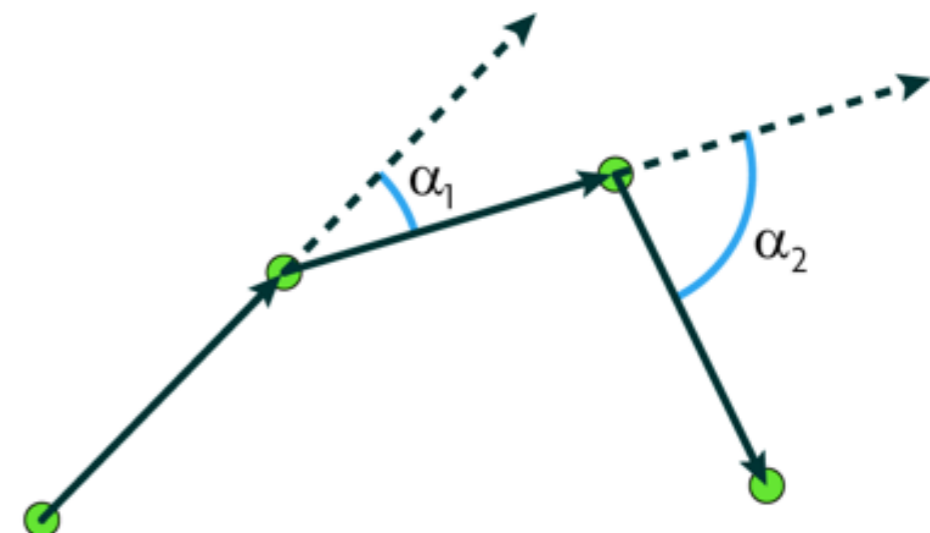
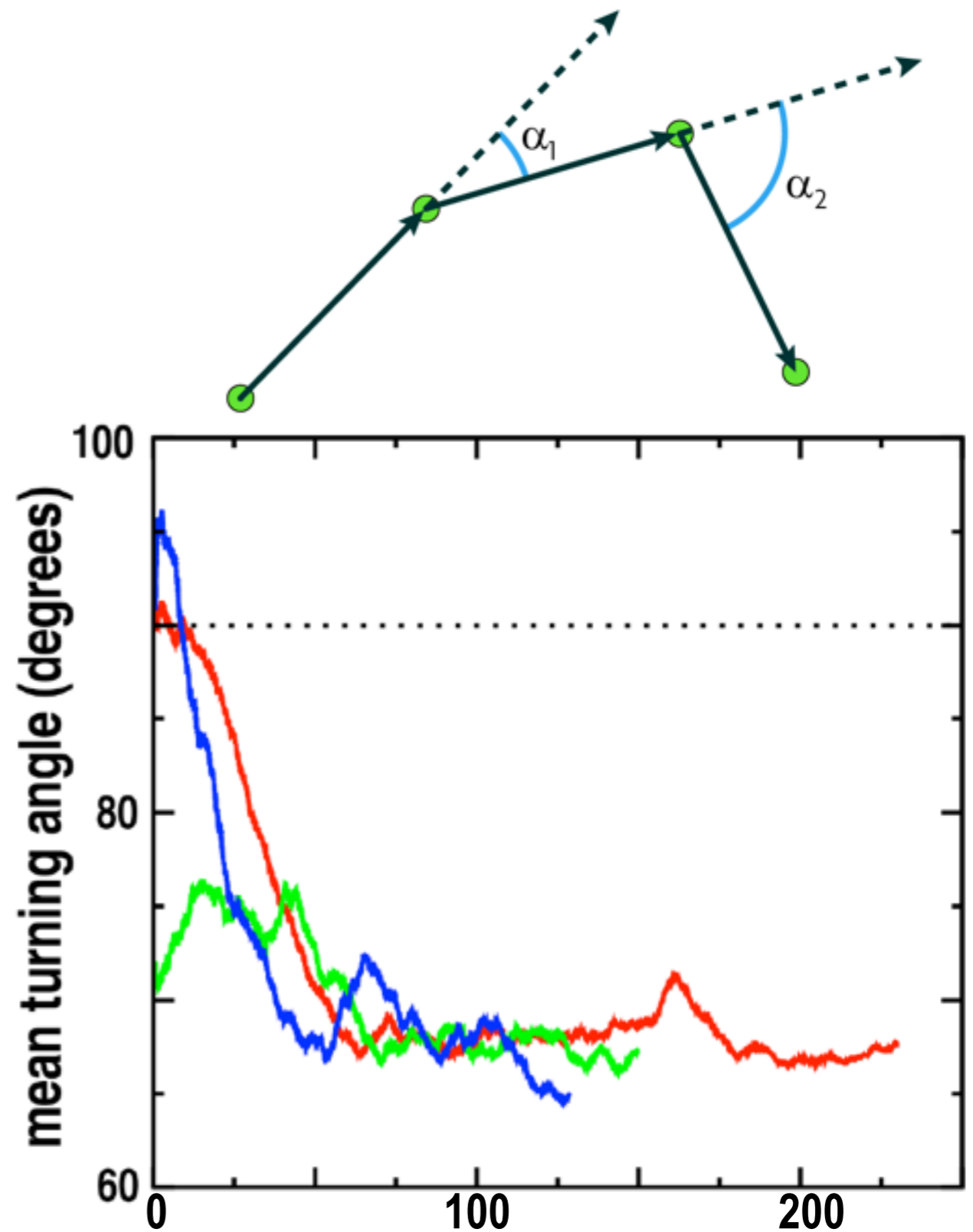
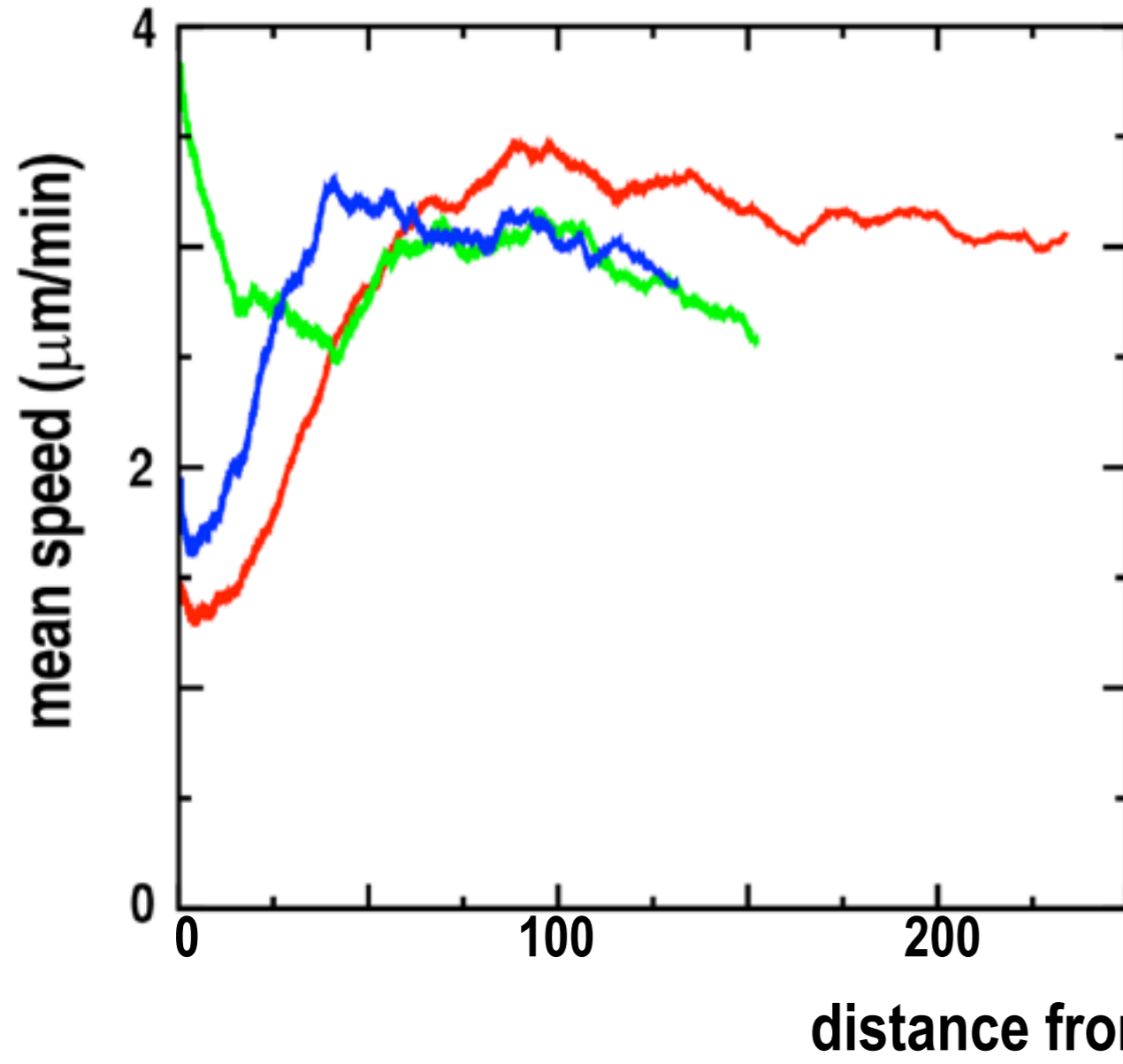
Random migration:  
 $\approx 90$  degrees

4. displacement towards infection

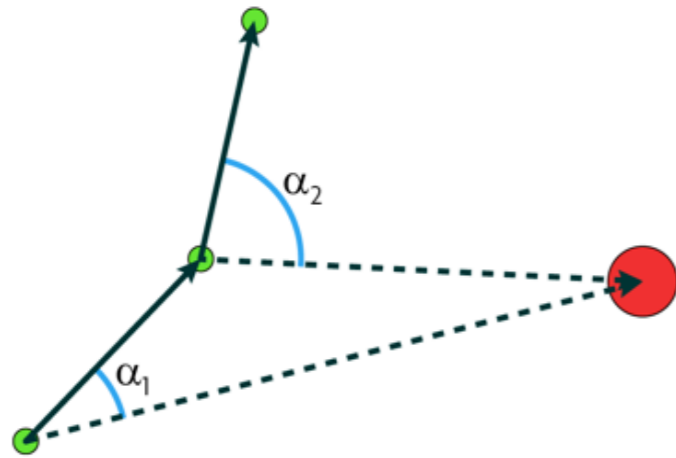
Project movement step onto vector toward infection

# Antigen specific arrest

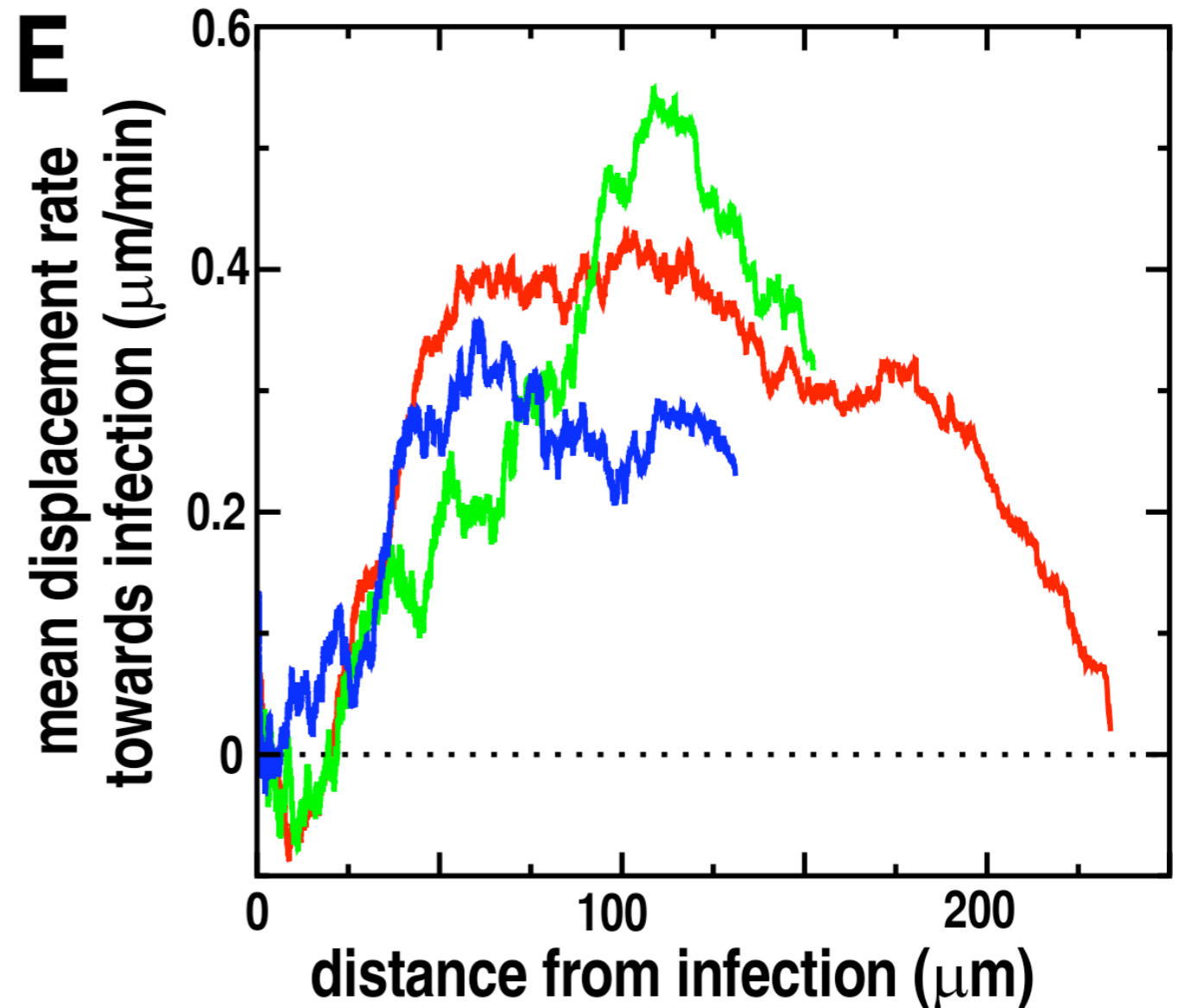
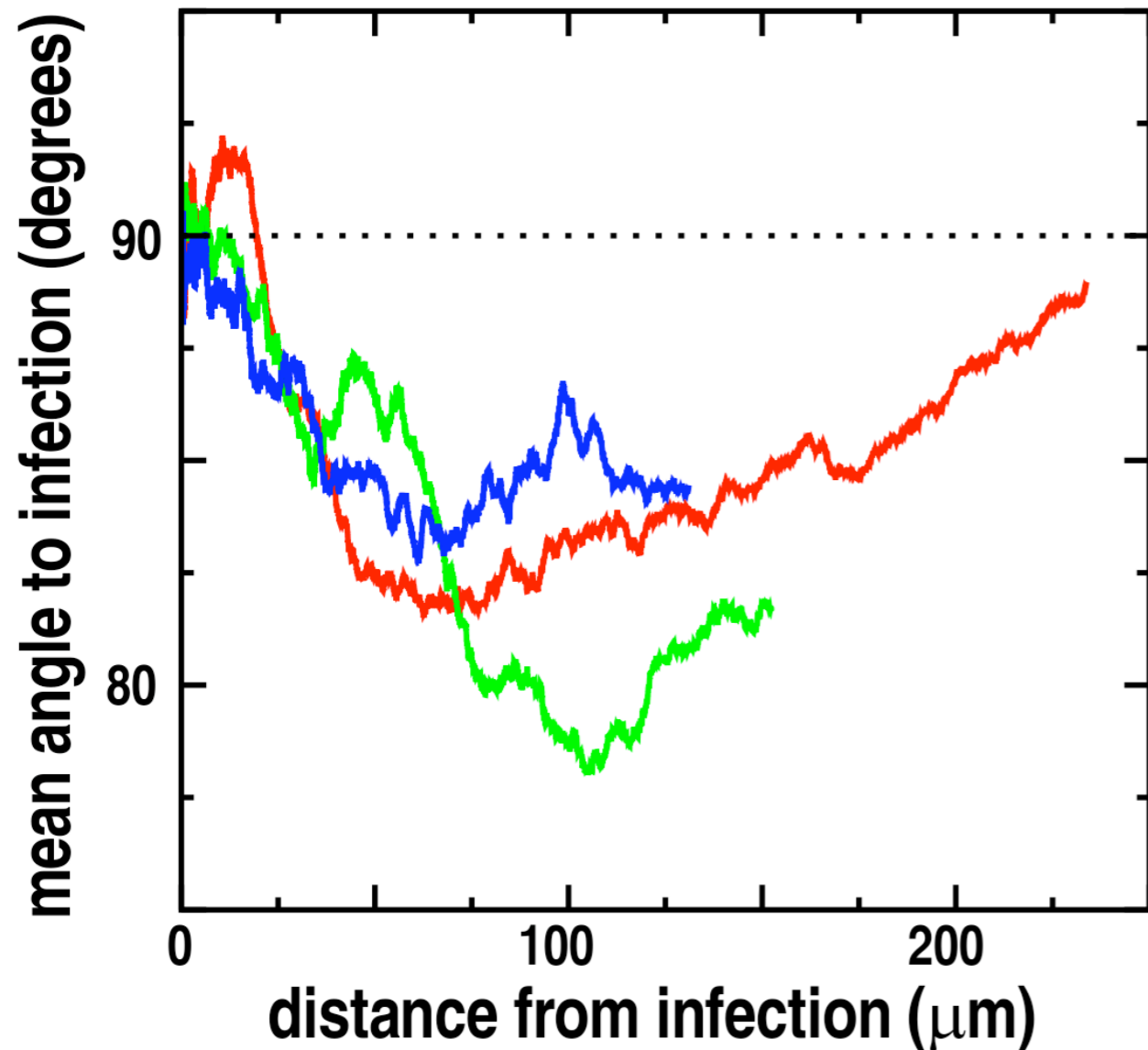
- specific cell
- non specific cell (OTI)
- specific cell (OTI)



There is a small preference for all cells to migrate towards the microlesions



- specific cell
- non specific cell (OTI)
- specific cell (OTI)



There is a small preference to travel towards the  
microlesions

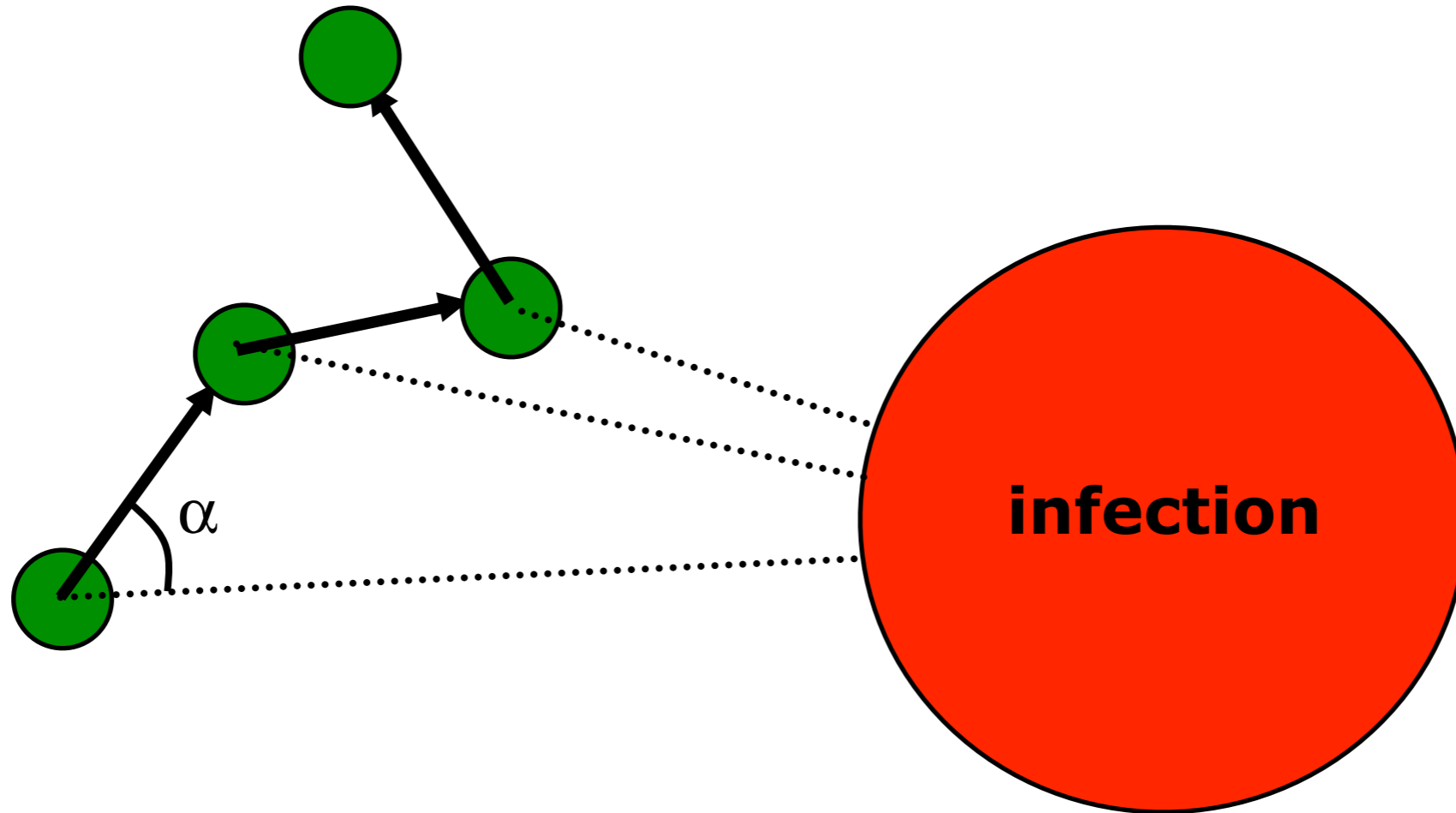
This is not antigen specific.

Difficult to appreciate in videos.

Is such a small preference relevant?

Model of cell migration to construct long tracks and  
estimate impact on arrival

# Bootstrap the experimental data



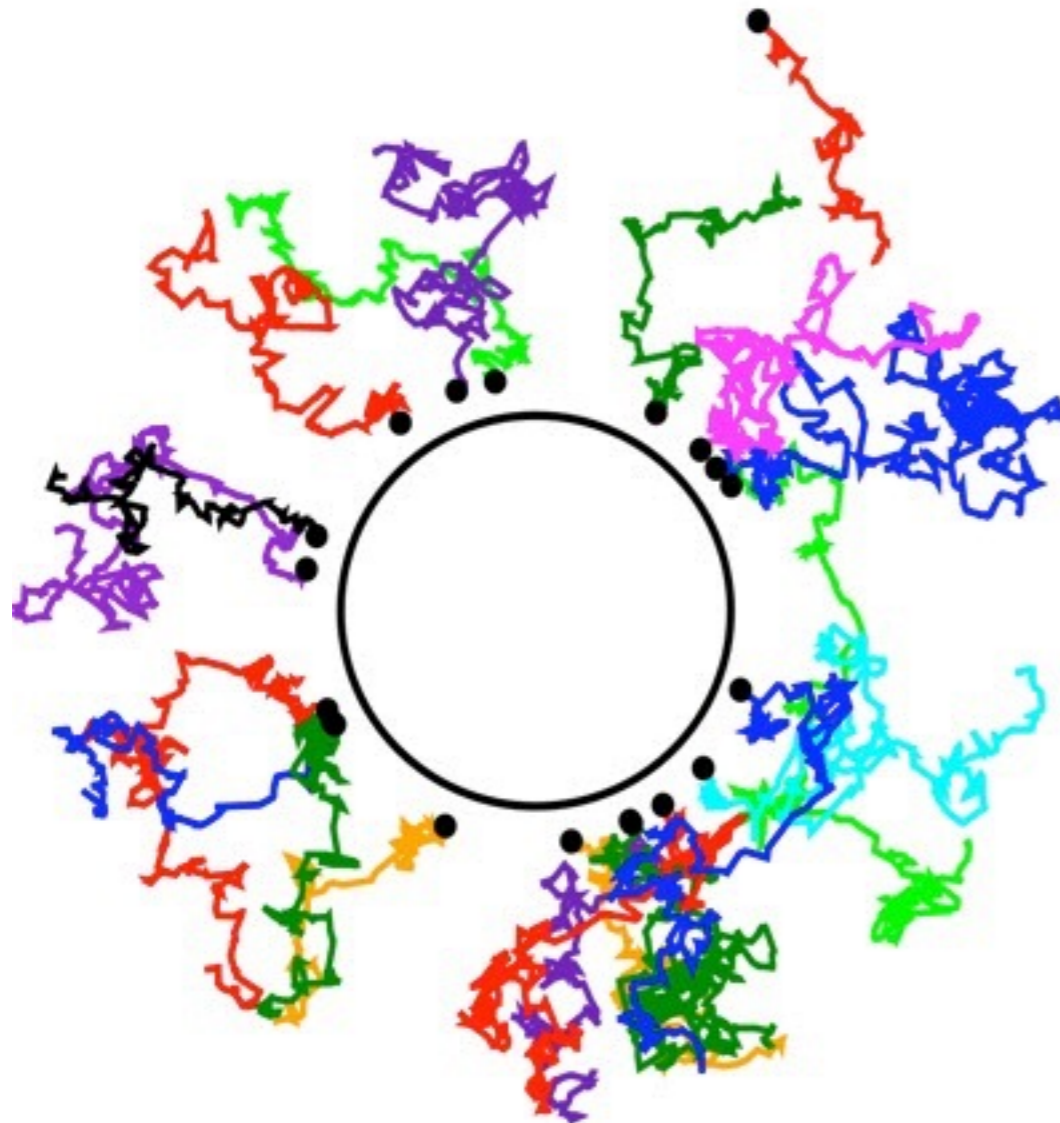
Choose speed + 'angle to infection' combinations

Accept according to turning angle distribution

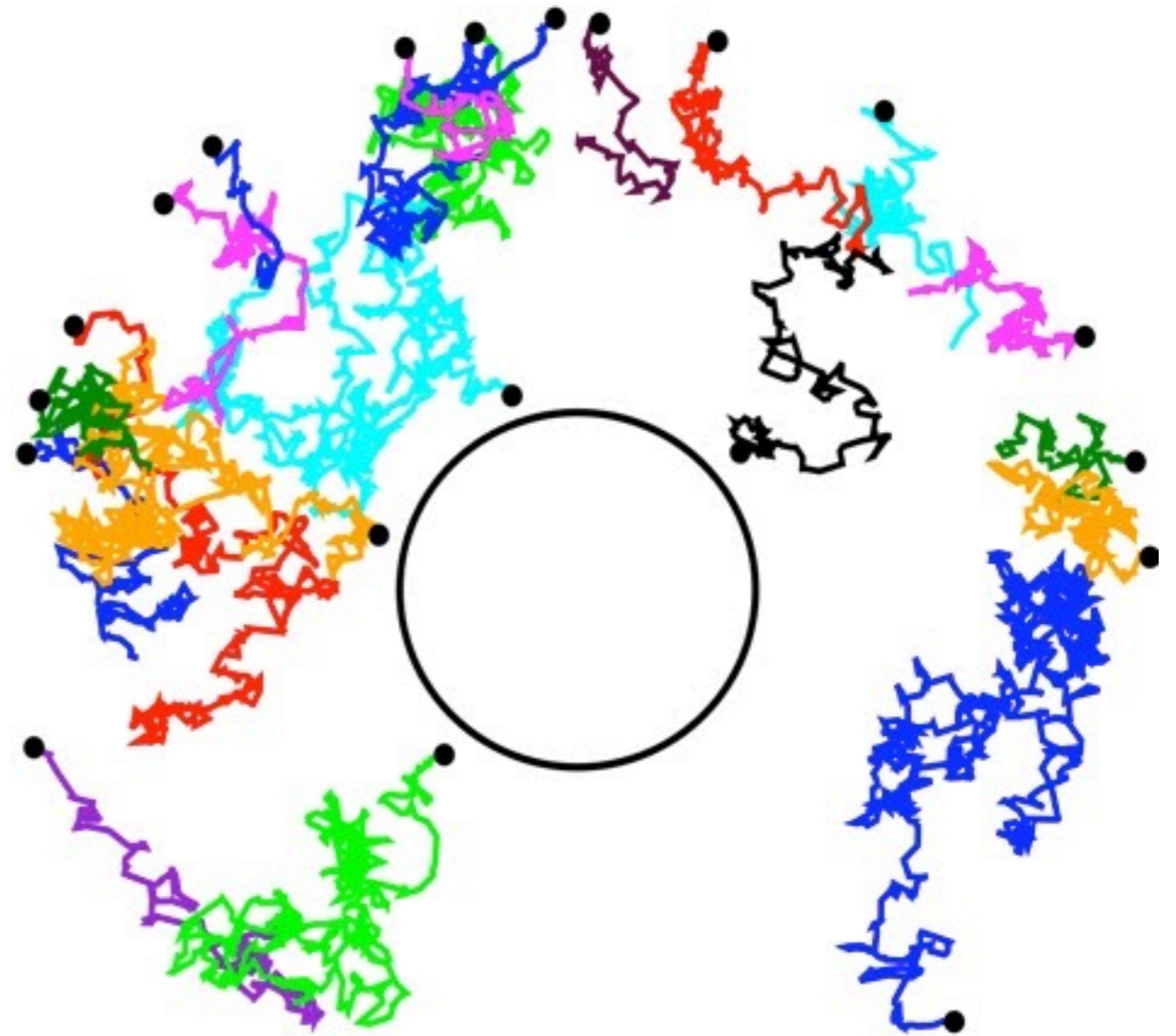
Combination depends on distance to infection

## In silico 2D tracks (also 3D)

directional simulations



random simulations



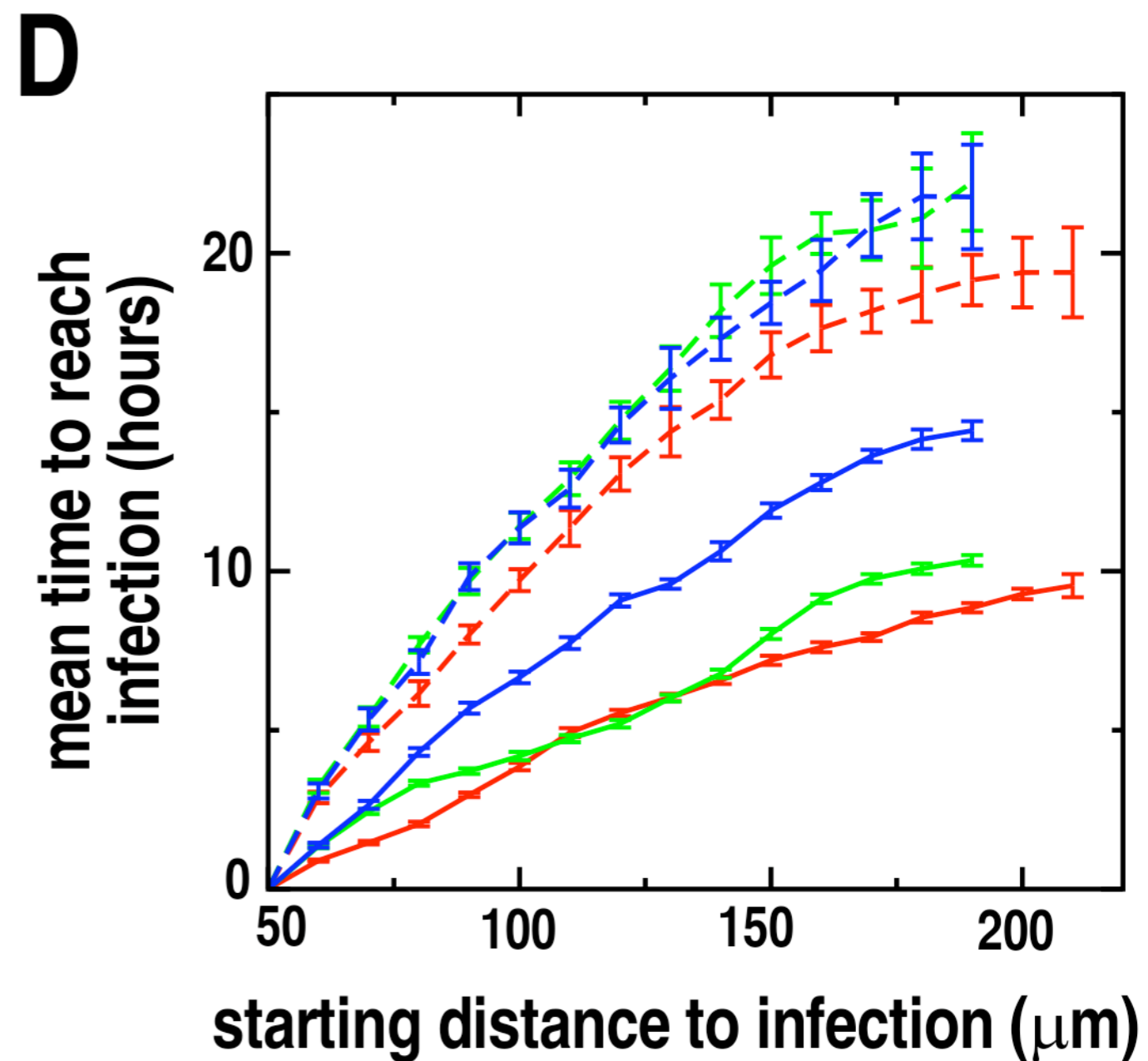
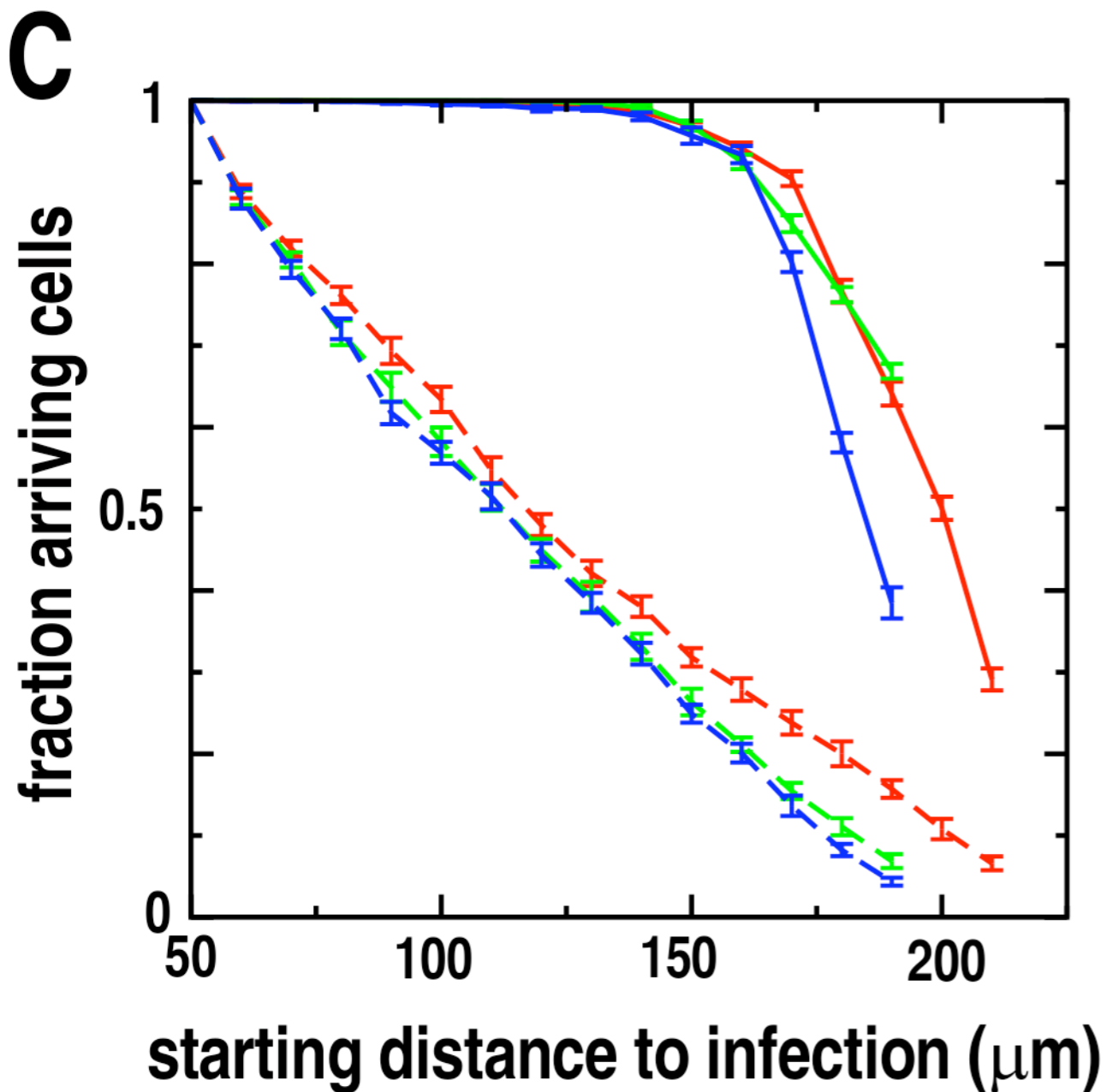
Random tracks: use random 'angles to infection' but maintain speed+persistence



# Directionality strongly contributes to arriving at microlesions

- specific cell
- non specific cell (OTI)
- specific cell (OTI)

- directional simulation
- random simulation



# Conclusions

Stop-and-Go just due to collisions (not encoded)

Effector T cells are attracted towards microlesions independent of antigen specificity.

Small directionality allows a much larger fraction of cells to arrive faster at the site of infection.

# Utrecht Center for Quantitative Immunology

Lymphocyte dynamics (modeling deuterium labeling)  
life spans of naive and memory T cells

Lymphocyte migration (quantifying 2PM videos)  
<http://2ptrack.net/>: open analysis tool

Epitope identification (NetMHCpan)  
predict pMHC complexes of HIV and cancers

T cell repertoire sequencing (diversity)  
RTCR: flexible pipeline with better recall than MiTCR

