

# Shaping connectivity and dynamics of neuronal networks with physical constraints



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## **Simulations of neuronal growth in 2D**

• **Simulations** permit precise modeling of networks' geometry and dynamics.

• Functional networks can be obtained using calcium imaging of 3D cultures.

• Network properties tuned by density or arrays of obstacles.

We study local network properties in simulations of 2500 neurons growing in a disk of diameter 4 mm. The density of neurons is about 200 neurons/mm<sup>2</sup> which corresponds to that seen in experiments on primary cultures.

Figures on the right represent the average values of in-degree (kin) and clustering coefficent (CC) in square regions of side 0.63 mm, containing ~80 neurons.



**Cultures on scaffolds** 

**Simulations with 2D scaffolds** 

The structure of the culture substrate allows to *guide neurite growth* cones and neuronal connectivity pattern *in vitro* [1,2,3].

We employ 3D printed scaffolds within the Mesobrain project to stabilise *fragile* cultures and build 3D cultures *mimicking cortical columns in vitro*. [*mesobrain.eu*]

Left: Bright field image of neurons growing on scaffold. Right: SEM image of two level *box shaped* scaffolds.



Model

The box-like scaffold structure is modeled by a 4x4 array of cross shaped obstacles. Data for simulations of one, two and four scaffolds placed in center of the circle are presented.

In all three cases the in-degree  $(k_{in})$  is reduced and the clustering coefficent (CC) is enhanced in the vicinity of the obstacles.

Distributions of in-degrees (left) and connection lengths (right).



Dynamics for two scaffold geometry (exp. & sim.).

In experiments activity propagates across the field of view (a), and initiation points lie within and outside of scaffolds (b).





0.20

0.20

0.15

low





### Network growth

Randomly position neurons on in a defined area. Osbtacles are modeled as excluded areas. Dendritic trees are modeled as circular areas with radius ( $\phi_d$ ) drawn from a normal distribution. Axons grow at random angles and follow a biased random walk with  $l_a = 1.1$  mm, as in [4].



### Neuron dynamics

A quadratic integrate and fire model with adaptation was used for the soma dynamics [4,5]. A generated spike is transmitted as a current and the synapse model includes depression [4].

**In simulations** activity propagates also (**c:** spike times and wave fit), and typically originates outside scaffolds (d).



## **Dynamics on scaffolds: Triangles and Towers**

An array (24x24) of triangles disposed in a circle favours connections at small angles.

> Electronmicrograph of triangular scaffolds.



Left: Raster plot for simulation with triangles. Right: Reordered by spike time.

time (s)

Distribution of lengths versus angles

Neurons were grown on tower-like scaffolds.

Activity was measured using Ca-fluorescence and the functional network was inferred with GTE as in [6].



Image of neurons growing on scaffold.

 $C\dot{v} = k(v - v_{\rm r})(v - v_{\rm t}) - u + I + \eta$ 

 $\tau_a \dot{u} = b(v - v_r) - u$ 

if  $v \ge v_p$ , then  $v \leftarrow v_c$ ,  $\leftarrow u + d$ 

where  $v, v_r, v_t$  are the soma membrane, resting & threshold potentials, *u* is an inhibitory current, *I* contains synaptic inputs and  $\eta$  is a noise term.

### References

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Inferred functional network.



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