# A Carbon Nanotube Implementation of Temporal and Spatial Dendritic Computations

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## Project Motivation: Challenges for a Synthetic Cortex

- Complexity:
  - Synaptic mechanisms excitatory and inhibitory synapses

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- Dendritic computations and dendritic spikes
- Scale:
  - 100 x 10<sup>9</sup> neurons
  - 10<sup>4</sup> to 10<sup>5</sup> synapses/neuron
  - ~100 transistors/synapse including dendritic computations
  - CMOS neurons for a cortex, absent interconnection area, could occupy an entire room, even in 2021
- Connectivity:
  - Fan-in/neuron 10<sup>4</sup> to 10<sup>5</sup> distinct connections
  - Fan-out 10<sup>4</sup>
  - Address space 37 bits (assuming synaptic inputs are distinct)
- Plasticity:
  - New neural connections form within hours
  - Presynaptic depression/facilitation occur
  - Postsynaptic depression and potentiation occur



Meeting the Challenges for a Synthetic Cortex



- Complexity:
- Exploit the analog computational power of transistor circuits
- Scale:
- Consider nanotechnological solutions nanotubes, nanowires, graphene, quantum dots

We are very far from a synthetic human cortex, but it may be possible in the coming decades



## Results to Date

- Carbon nanotube fabrication (Chongwu Zhou)
  - Aligned nanotubes, logic gates





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Biomimetic Neural Circuits



The whole neuron can be divided into these sub-circuits:

- Synapse
  - Excitatory/Inhibitory synapse circuit (Action Potential as inputs and EPSP/IPSP as outputs)
- Dendritic Tree
  - A pool of voltage adders (which can add two input stimuli in both linear or non-linear ways)
- Axon Hillock
  - Amplifier (in order to reach the threshold of carbon nanotube FET)
  - Spike-initiator (Action Potentials are all-or-none)





## A Carbon Nanotube Synapse







## Artist's Conception of 3-D Carbon Nanotube Synapse







## Carbon Nanotube Synapse Waveforms

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## **Dendritic Computations**

#### Linear or Non-linear summation

- Mel, Schiller et al. compared the measured and arithmetic results of EPSP summation at soma of layer-5 pyramidal neuron with respect to within-branch and between-branch stimulations
  Within-branch
- It appears that between-branch EPSP summation is linear for weak and medium stimuli and slightly superlinear for strong stimuli.
- On the other hand, within-branch EPSP summation shows both linearity and nonlinearity depending on the strength of EPSP. It was linear – weak EPSP (~<1mV), superlinear – medium EPSP (1~3mV), sublinear – strong EPSP (3~10mV)

adder cnt2

#### Adder structure

AP1 and AP2

900m

800m

• Adding two inputs linearly, sublinearly, and superlinearly

AP1 and AP2

900m

800m



A and B are 20um

Arithmetic

separated

Between-branch

20 ms





## The Dendritic Voltage Adder







## Linear Summation of 4 PSP's











## Simplified Central Neuron Circuit



**Red: Action Potential** (artificial input to the presynaptic terminal)

Green: EPSP from the dendrites (post-synaptic sites) of the neuron

Blue: Action Potential spike (initiated at the axon hillock of the neuron)

## Conclusions



- Dendritic computations have been implemented
- A biomimetic neuron has been designed
- Carbon nanotubes pose unique challenges for analog/pulse and timing circuits
  - Adjusting R for biasing and timing is tricky due to ballistic current flow and quantum resistance
  - Nanotube circuit fabrication is in its infancy



# BioRC

## The BioRC Project Team and Support

- Alice Parker, PI and Chongwu Zhou, Co-PI
- Graduate Assistants
  - Chih-Chieh Hsu CNT circuits and simulation
  - Jonathan Joshi CMOS circuits and simulation

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- Ko-Chung Tseng Mathematical models of interconnectivity
- Chuan Wang Carbon nanotube fabrication
- Affiliated Students
  - Adi Azar Neural architecture
  - Khushnood Irani 3-D circuit visualization
  - Jason Mahvash analog circuits
  - Numerous directed research students
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The End





# http://ceng.usc.edu/~parker/BioRC\_research.html

