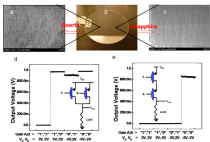


# The BioRC Biomimetic Real-Time Cortex Project

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## Introduction

- Central objective: design, simulation and construction of nanocircuits that model portions of the human cortex
- Exploit the analog computational power of transistor circuits to meet complexity challenges
- Use carbon nanotubes and nanowires as the candidate nanotechnology to meet scale challenges as well as prosthetic advantages

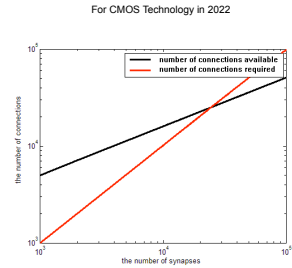


Carbon nanotube fabrication by Chongwu Zhou  
Aligned nanotubes and resulting logic gates

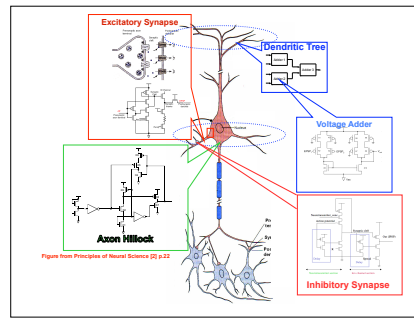
## Engineering Challenges for a Synthetic Cortex

- Complexity:** Synaptic mechanisms - excitatory and inhibitory synapses  
Dendritic computations and dendritic spikes
- Scale:**  $100 \times 10^9$  neurons and  $10^4$  to  $10^5$  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  $10^4$  to  $10^5$  distinct connections; Fan-out  $10^4$   
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

## Connectivity as a function of Neuron Size



## The Biomimetic Neural Circuits



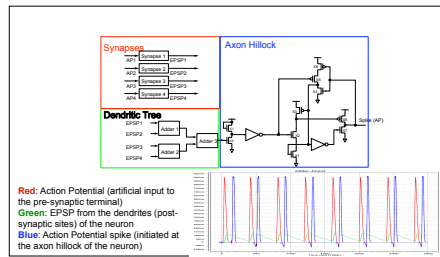
## The Basic Central Neuron Architecture

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)



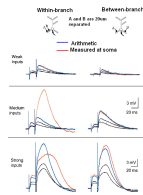
## A Simplified Central Neuron Circuit



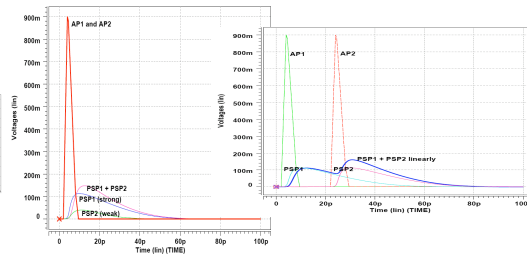
Red: Action Potential (artificial input to the pre-synaptic terminal)  
Green: EPSP from the dendrites (post-synaptic sites) of the neuron  
Blue: Action Potential spike (initiated at the axon hillock of the neuron)

## Dendritic Computations

- Mel, Schiller *et al.*: results of EPSP summation at soma of layer-5 pyramidal neuron with respect to within-branch and between-branch stimulations
- Between-branch EPSP summation linear for weak and medium stimuli and slightly superlinear for strong stimuli.
- Within-branch EPSP summation shows both linearity and non-linearity depending on the strength of EPSP.



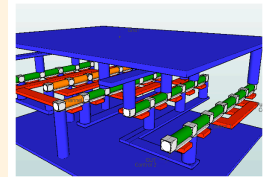
## Addition of EPSP's



## Neural Circuit Designs Completed

- The **excitatory and inhibitory synapse circuits** model
  - an action potential applied to a biological synapse neurotransmitter action, including
    - programmable transmitter availability
    - programmable ion channel receptors
    - Programmable reuptake delay
  - membrane potentials
    - ion pumps
  - Dendrodendritic connections
  - Shunting and hyperpolarizing inhibition
- The voltage adders model **sublinear, linear, and superlinear dendritic computations** involving EPSPs and IPSPs in the dendritic arbor
- Axon hillock circuits** model action potential generation
  - Single spike
  - Burst of spikes
- Circuit designs favor economy of size over exact replication of waveforms, to facilitate scaling to cortical-sized neural networks, with approximate waveform shaping

## A Future Carbon Nanotube Synapse



## 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
  - Ko-Chung Tseng - Mathematical models of interconnectivity
  - Chuan Wang - Carbon nanotube fabrication
  - Adj Azar - Neural architecture
  - Khushnood Irani - 3-D circuit visualization
  - Jason Mahvash - analog circuits
  - Matthew Walker - Nano-interconnections/assembly
- Numerous directed research students

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