

## Invited

# Artificial Quantum Solids that Compute: Quantum-Mechanical Logic Gates and Neuromorphic Networks

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We will describe a novel paradigm for ultrafast, large-scale computing based on quantum-mechanical interactions between electrons confined in arrays of semiconductor or metal quantum dots. Two types of architecture will be described: (i) combinational circuits/sequential memory utilizing Boolean logic, and (ii) associative memory derived from neuromorphic implementation. Initial experimental efforts at fabricating these circuits - which we term "artificial quantum solids" - have yielded promising results.

## 1. QUANTUM MECHANICAL BOOLEAN LOGIC CIRCUITS

Quantum-mechanical Boolean logic circuits utilize a single electron as the basic building block. The *spin* of the electron encodes the binary bit<sup>1</sup>). In a suitable array of quantum dots housing single conduction band electrons, the spin orientation of every electron becomes a bistable quantity. Logic circuits are constructed by arranging the quantum dots in different topologies on a wafer which tailors the spin-spin interactions between their guest electrons. Various topologies give rise to various interactions and thus various logic functions (AND, OR, etc.). These can be further manipulated to yield more complex circuits such as full adders and subtractors, as well as sequential memory such as flips-flops, ripple counters and read only memory (ROM)<sup>1</sup>). An example is shown in Fig. 1.

In this scheme, binary signal (spin state) is communicated from one electron to the next via exchange coupling so that there is no physical wire connecting the various internal elements within a chip<sup>2</sup>). Only the peripheral elements (quantum dots) on the edges of the wafer are connected to the external world and serve as input/output ports<sup>3</sup>). Data is read from and written into these dots with spin-polarized scanning tunneling microscope (SPSTM) tips<sup>4</sup>). The elimination of internal physical interconnects leads to significant improvement in speed and density.

The advantage of using spin to encode binary information is manifold. First, one does not have to *move* charge to switch a device; only the spin has to be toggled. This eliminates transit time limitations on switching speed and also problems associated with charge trapping by material defects. Second, spin cannot be flipped by electric fields resulting in excellent noise immunity. Finally, the power delay product can be  $10^{-20}$  Joules, the switching delay can be 1 ps, the bit density can approach 10 terabits/cm<sup>2</sup>, and most importantly, these circuits can operate at room temperature which is a distinct advantage.

## 2. QUANTUM NEUROMORPHIC NETWORK

In contrast to logic gates, the neuromorphic architecture exploits the collective, semi-classical charging behavior of a large number of resistively or capacitively linked semiconductor or metal quantum dots fabricated on a *non-ohmic* substrate. If the substrate has a non-linear and *non-monotonic* current-voltage characteristic (e.g. a resonant tunneling diode or an Esaki diode), then such a system is globally stable and there are multiple equilibrium points that are necessary for non-trivial computation<sup>5</sup>). We will show that such a simple system realizes the short term additive memory (STM) or the content-addressable memory (CAM) model of neural networks<sup>6</sup>) without requiring amplifiers or massive interconnectivity<sup>5</sup>). We will also show that this simple system possesses rudimentary two-dimensional image processing capability and can solve certain NP-complete optimization problems such as the famous traveling salesman problem<sup>5</sup>). An example of a quantum neuromorphic image processor that performs a "smoothing" operation with edge-enhancement is shown in Fig. 2. Finally, these circuits are also capable of room temperature operation and possess all other attractive features of quantum devices such as high speed, low power, etc.

## 3. CONCLUSION

In addition to describing the above schemes, we will also point out some possible pitfalls that often lead to flawed proposals in this field. We will illustrate this with some previously proposed ideas<sup>7</sup>) that contain one or more serious errors. Finally, we will also describe our initial efforts at experimentally fabricating artificial quantum solids using molecular-level self assembly of nanometer-scale quantum dots. This technique, unlike direct-write nanolithography, is a parallel process amenable to mass production and commercial utilization<sup>8,9</sup>).

#### 4. REFERENCES

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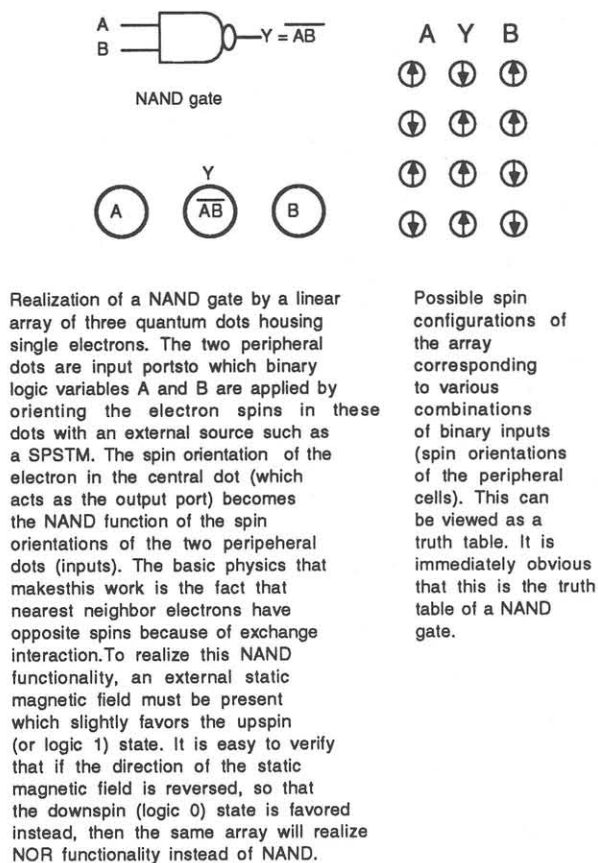


Fig. 1 (a): Realization of a NAND gate

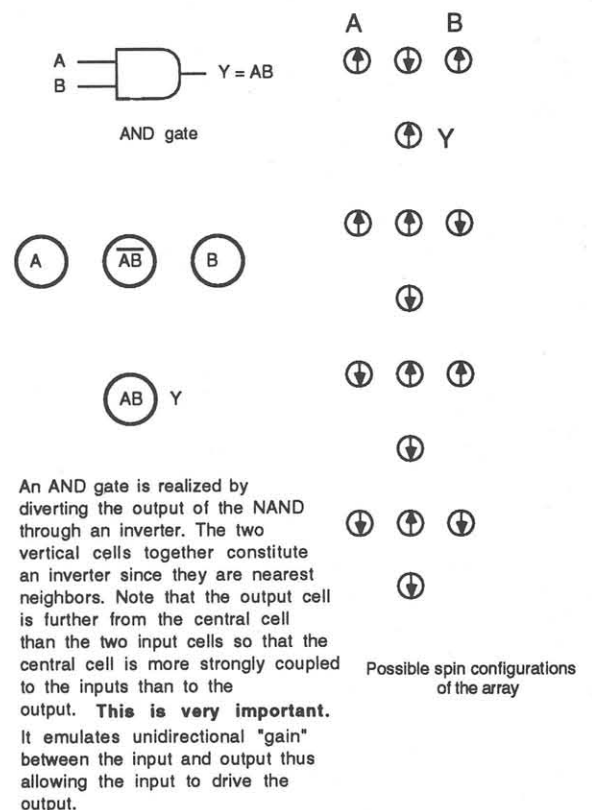


Fig. 1 (b): Realization of an AND gate

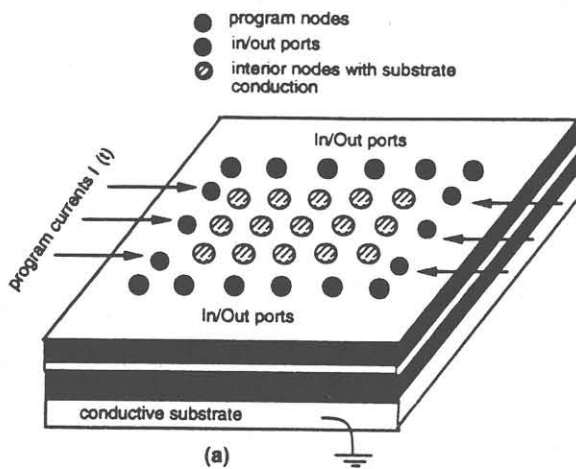


Fig. 2(a): A basic neuromorphic network consists of quantum dots arranged on a non-ohmic substrate and linked by molecular wires.

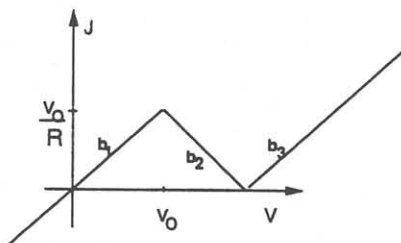


Fig. 2(b): The current voltage characteristic of the substrate has a non-monotonic non-linearity whose piecewise linear approximation is shown. The voltages on branches  $b_1$  and  $b_2$  are stable. This figure defines the quantities  $V_0$  and  $R$  used in later figures.

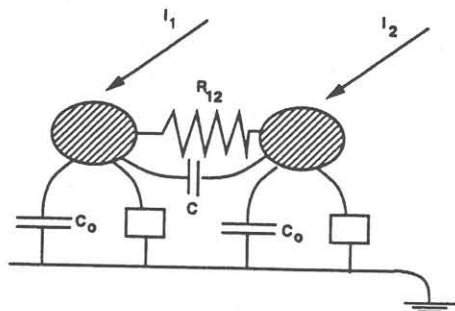


Fig. 2(c): The simplest system of two quantum dots laterally coupled by resistance  $R_{12}$  and capacitance  $C$ . The dots are also coupled to the substrate via a capacitance  $C_0$  and a non-linear resistance characterized by the non-linearity in Fig. 2(b).

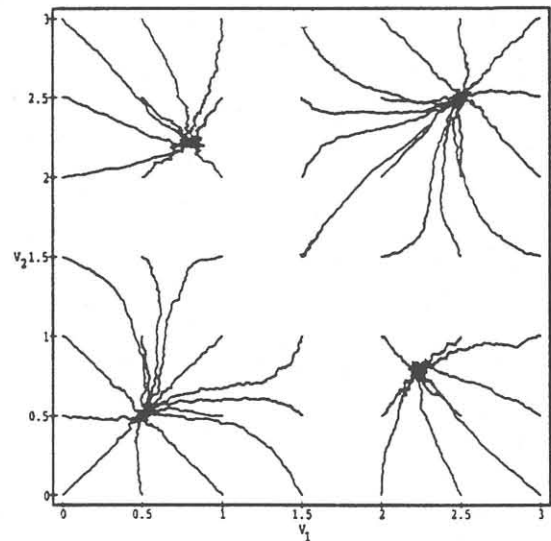


Fig. 2(d): Phase portrait for single electron charging stochastic dynamics (obtained by Monte Carlo simulation) showing the existence of four stable equilibrium points ( $V_1$  and  $V_2$  are the voltages on the two quantum dots in Fig. 2(c)).

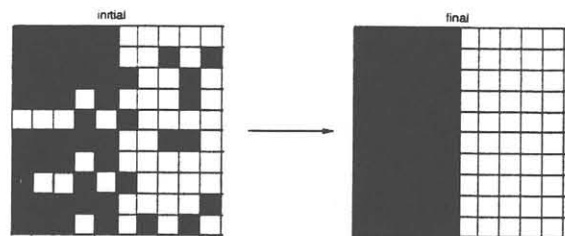


Fig. 2(e): Rudimentary image processing capability in a near-neighbor connected network of  $10 \times 10$  quantum dots which are all pumped by the same current  $I_0 = V_0/2R$ . Current connections are made to the dots by molecular wires. Each dot is colored according to the particular branch  $b$  or  $b$  of the substrate non-linearity in Fig. 2(b) the dot potential lies on. The resistive connection between dots is uniform and has a value  $R_{ij} = 6R$ . The input contains domains that are either predominantly black or white and the output contains domains that are either all black or all white. This smoothing operation does edge-enhancement.