#### Chapter 2 If It's Pinched It's a Memristor

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This chapter consists of two parts. Part I gives a circuit-theoretic foundation for the first four elementary nonlinear 2-terminal circuit elements, namely, the resistor, the capacitor, the inductor, and the memristor. Part II consists of a collection of colorful "Vignettes" with carefully articulated text and colorful illustrations of the rudiments of the memristor and its characteristic fingerprints and signatures. It is intended as a self-contained pedagogical primer for beginners who have not heard of memristors before.

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## Part I

#### 2.1 Abstract

This tutorial clarifies the axiomatic definition of  $(v^{(\alpha)}, i^{(\beta)})$  circuit elements via a look-up-table dubbed an *A-pad*, of admissible (v, i) signals measured via Gedanken Probing Circuits. The  $(v^{(\alpha)}, i^{(\beta)})$  elements are ordered via a complexity metric. Under this metric, the *memristor* emerges naturally as the *fourth element* [1], characterized by a state-dependent Ohm's law. A logical generalization to memristive devices reveals a common *fingerprint* consisting of a dense continuum of *pinched hysteresis loops* whose area decreases with the frequency  $\omega$  and tends to a straight line as  $\omega \to \infty$ , for all bipolar periodic signals and for all initial conditions. This common fingerprint suggests that the term memristor be used henceforth as a moniker for memristive devices.

#### 2.1.1 Axiomatic Definition of Circuits Elements

How do you *characterize* a 2-terminal "black box" B such that its response to any electrical signal can be predicted? Since you are not allowed to peek inside B your only recourse is to carry out measurements by probing B with *all possible* electrical circuits, containing arbitrary interconnections of circuit elements, such as resistors, capacitors, inductors, diodes, transistors, op amps, batteries, voltage and current sources with arbitrary time functions, etc. We will henceforth call such circuits "*Gedanken Probing Circuits*," as depicted in the *Gedanken* experimental setup shown in Fig. 2.1. Let us insert an instrument called an ammeter in series with the top wire to record a time function i(t) called the *current* in Amperes entering the top terminal (labeled by a plus (+) sign). Next let us connect an instrument called a *voltmeter* across B to record a time function v(t) called the *voltage* in Volts across the *plus-minus* terminals of B.<sup>1</sup> Let us call (v(t), i(t)) an *admissible* (v, i) signal of B. The recorded list

$$B(v,i) \triangleq \{(v_1(t), i_1(t)), (v_2(t), i_2(t)), \dots, (v_n(t), i_n(t)), \dots\}$$
(2.1)

of *admissible* (v,i) *signals* (*AVIS*) from *all possible Gedanken Probing Circuits* constitutes the *complete* characterization of the 2-terminal black box B in the sense that given any voltage signal or current signal, one can search the *AVIS* "memory bank," henceforth called the *AVIS-pad* of B or just *A-pad*, and identify the unique admissible signals  $(\tilde{v}(t), \tilde{i}(t))$  being sought. The *A-pad must* contain this entry in its memory bank because the signal is associated with *some* circuit connected to B, and

<sup>&</sup>lt;sup>1</sup>Observe that the voltage v and the current *i* are defined axiomatically via two instruments called voltmeter and ammeter, without invoking any physical concepts such as electric field, magnetic field, charge, flux linkages, etc. One does not even have to know how a voltmeter, or an ammeter, works. They are just names assigned to the instruments.



Fig. 2.1 Axiomatic definition of a 2-terminal circuit element

this circuit is a Gedanken probing circuit, by definition. The *A*-pad is just a lookup-table containing all admissible (v, i) signals of B. Observe that the *A*-pad is in general an infinitely long pad containing infinitely many pairs of admissible signal waveforms (v(t), i(t)) of B, as depicted in Fig. 2.1.

The above Gedanken experiment is only a thought experiment. However, for a large number of real-world 2-terminal devices, the *A-pad* for B can be generated via equations.

*Example 2.1 (Ohm's Law).* A very small subset of all 2-terminal black boxes are characterized by an *A-pad* that satisfies Ohm's Law; namely,

$$v = Ri$$
 or  $i = Gv$  (2.2)

where *R* is called the *resistance* in Ohms ( $\Omega$ ) of B and *G* is called the *conductance* in Siemens (*S*) of *B*. In this case

$$AVIS = \{ (Ri_1(t), i_1(t)), (Ri_2(t), i_2(t)) \dots (Ri_n(t), i_n(t)), \dots \}$$
(2.3)

can be reconstructed by (2.2). When Ohm's law is written with *i* as the independent variable, namely; v = Ri, it is called *current controlled*. If it is written in the form i = Gv, it is called *voltage controlled*. Often it is more convenient to recast (2.2) in the *implicit form* 

$$f_R(v,i) = v - Ri = 0 (2.4)$$

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Since (2.4) is neither a function of v, nor of i, it is called a *relation* in mathematics. In *nonlinear circuit theory*, it is called a *constitutive relation* [2–4]. Observe that the constitutive relation is just a compact formula, or algorithm, for generating the *A*-pad of B.

*Example 2.2.* Suppose the *A-pad* of the 2-terminal black box B in Fig. 2.1 can be written in the form

$$AVIS = \left\{ \left( v_1, v_1 + \frac{1}{3}v_1^3 \right), \left( v_2, v_2 + \frac{1}{3}v_2^3 \right), \dots, \left( v_n, v_n + \frac{1}{3}v_n^3 \right) \dots \right\}$$
(2.5)

for all possible voltage signals

$$v(t) = v_1(t), v(t) = v_2(t), \dots v(t) = v_n(t) \dots$$

then the *A-pad* of B can be generated by the much more compact constitutive relation

$$f_R(v,i) = v + \frac{1}{3}v^3 - i = 0$$
(2.6)

Since both (2.4) of Example 2.1 and (2.6) of Example 2.2 involve the same pair of circuit variables (voltage, current), and since all 2-terminal devices that can be characterized by a constitutive relation

$$f_R(v,i) = 0 \tag{2.7}$$

between the variable pair (v, i) can be proved to be dissipative (or passive) if  $v \times i > 0$  for all (v, i) listed in the *A*-pad, this class of 2-terminal elements are called *resistors* [2–4].

*Example 2.3.* Most 2-terminal black boxes can *not* be described by a constitutive relation between the variable pair (v, i). However, another important subclass can be expressed by a relationship between the variable pair (v,q), where

$$q(t) = \int_{-\infty}^{t} i(\tau) d\tau = q_0 + \int_{t_0}^{t} i(\tau) d\tau$$
 (2.8)

and

$$q_0 \triangleq \int_{-\infty}^{t_0} i(\tau) d\tau \tag{2.9}$$

is called the initial state<sup>2</sup> of q(t) at the initial time  $t = t_0$ . This subclass of 2-terminal black boxes can be characterized by a collection of admissible signals between the variable pair (v, q), namely,

$$B(v,q) = \{(v_1(t),q_1(t)), (v_2(t),q_2(t)), \dots, (v_n(t),q_n(t)), \dots\}$$
(2.10)

where

$$q = Cv \tag{2.11}$$

and *C* is a constant called the *Capacitance* of B. Equation (2.11) is the constitutive relation of B because we can generate the corresponding *AVIS* (v(t), i(t)) via (2.8); namely

$$i(t) = \frac{dq(t)}{dt} \tag{2.12}$$

Indeed, any relationship

$$q = f_C(v) \tag{2.13}$$

is a valid constitutive relation and this class of 2-terminal devices are called *capacitors*.

By the same reasoning, the constitutive relation

$$\varphi = f_L(i) \tag{2.14}$$

involving the variable pair  $(i, \varphi)$  defines a third subclass of 2-terminal devices called *inductors*, where

$$\varphi(t) = \int_{-\infty}^{t} v(\tau) d\tau = \varphi_0 + \int_{t_0}^{t} v(\tau) d\tau \qquad (2.15)$$

Observe that the above three classes of basic circuit elements, called resistors, capacitors, and inductors, are defined *axiomatically*, via a constitutive relation between a pair of variables chosen from  $\{v, i, q, \varphi\}$ . There are six different pairs that can be formed from these four variables; namely

$$\{(v, \varphi), (i, q), (v, i), (v, q), (i, \varphi), (\varphi, q)\}$$
(2.16)

<sup>&</sup>lt;sup>2</sup>In practice one can never know the precise signal i(t) over the infinite past. Rather we can only set up our measurements to begin at some initial time  $t = t_0$ . Consequently, the initial condition  $q_0$  in Eq. (2.8) represents a summary of the past memory of q(t) measured at  $t = t_0$ .





The first two pairs  $(v, \varphi)$  and (i, q) are already related via (2.15) and (2.8), respectively, and are *not* constitutive relations because they cannot predict the corresponding current i(t) and voltage v(t). However, the last pair  $(\varphi, q)$  defines yet another constitutive relation since given any *admissible* signals  $(\varphi(t), q(t))$ , one can recover the corresponding (v(t), i(t)) via (2.15) and (2.8). For logical consistency, and symmetry considerations, it is necessary to define a 4*th circuit element* [1] via the constitutive relation

$$f_M(\varphi, q) = 0 \tag{2.17}$$

between the variables  $\varphi$  and q. This element was postulated and named the *memristor* (acronym for *memory resistor* in [5]). A physical approximation of such an element has been fabricated in 2008 as a TiO<sub>2</sub> nano device by Dr. Stanley Williams group at hp [6]. The above axiomatic definition of the four basic circuit elements is summarized in Fig. 2.2, along with their respective symbols [7]. Note that the standard symbols for resistor, capacitor, and inductor are enclosed by a thin rectangle with a dark band at the bottom because it is essential to distinguish the reference polarity of each nonlinear element if its constitutive relation is *not* odd-symmetric.

We wish to stress that although the symbols of q and  $\varphi$  in Fig. 2.2 are given the names *charge* and *flux*, respectively, *they need not* be associated with a real physical *charge* as in the case of a classical *capacitor* built by sandwiching a pair of parallel metal plates between an insulator, or a real physical *flux* as in the case of a classical *inductor* built by winding a copper wire around an iron core.

#### 2.1.2 $(\mathbf{v}^{(\alpha)} - \mathbf{i}^{(\beta)})$ Circuit Elements

Let us introduce the notations [4]

$$v^{(\alpha)}(t) \triangleq \begin{cases} \frac{d^{\alpha}v(t)}{dt^{\alpha}}, & \text{if } \alpha = 1, 2, \dots, \infty \\ v(t), & \text{if } \alpha = 0 \\ \int_{-\infty}^{t} v(\tau) d\tau, & \text{if } \alpha = -1 \\ \int_{-\infty}^{t} \int_{-\infty}^{\tau_{|\alpha|}} \cdots \int_{-\infty}^{\tau_{2}} v(\tau_{1}) d\tau_{1} d\tau_{2} \cdots d\tau_{|\alpha|}, & \text{if } \alpha = -2, -3, \dots, \infty \end{cases}$$
(2.18)

and

$$i^{(\beta)}(t) \triangleq \begin{cases} \frac{d^{\beta}i(t)}{dt^{\beta}}, & \text{if } \beta = 1, 2, \dots, \infty \\ i(t), & \text{if } \beta = 0 \\ \int_{-\infty}^{t} i(\tau) d\tau, & \text{if } \beta = -1 \\ \int_{-\infty}^{t} \int_{-\infty}^{\tau_{|\beta|}} \cdots \int_{-\infty}^{\tau_{2}} i(\tau_{1}) d\tau_{1} d\tau_{2} \cdots d\tau_{|\beta|}, & \text{if } \beta = -2, -3, \dots, \infty \end{cases}$$
(2.19)

where  $|\alpha|$  and  $|\beta|$  are integers. Let us identify a  $(v^{(0)}, i^{(0)})$  element as a *resistor*, a  $(v^{(0)}, i^{(-1)})$  element as a *capacitor*, a  $(v^{(-1)}, i^{(0)})$  element as an *inductor*, and a  $(v^{(-1)}, i^{(-1)})$  element as a *memristor*. Using this notation, we can define an infinite family of circuit elements, each one identified by its element code  $(v^{(\alpha)} - i^{(\beta)})$  and referred to simply as an  $(\alpha, \beta)$  element.

The first 25  $(\alpha, \beta)$  elements are listed in Fig. 2.3, each coded by an integer pair  $(\alpha, \beta)$ , and identified by a rectangular box where " $\alpha$ " and " $\beta$ " are printed on the "top," and at the "bottom," respectively. Each  $(\alpha, \beta)$  element is located at the intersection between a vertical line through  $\alpha$ , and a horizontal line through  $\beta$ . The four circuit element symbols shown in Fig. 2.2 are printed in their corresponding locations in Fig. 2.3. The two elements  $(\alpha, \beta) = (-1, -2)$  and  $(\alpha, \beta) = (-2, -1)$  are called *memcapacitor* and *meminductor*, respectively [8], and are identified by their corresponding symbols.

The above infinite family of circuit elements are defined *not* for the sake of generality. Rather, they are *essential* for developing a rigorous mathematical theory of nonlinear circuits in the sense that if one excludes all elements with  $|\alpha| > k$  and  $|\beta| > k$ , for any finite integer k, then one can construct hypothetical circuits whose solutions do *not* exist after certain finite times  $t \ge T_k$  due to the presence of a "singularity" called an *impasse point* [2, 3, 9]. It is unlikely, however, that  $(\alpha, \beta)$  elements with  $|\alpha| > 2$  and  $|\beta| > 2$  will be needed in modeling most real-world devices.

It can be proved that any  $(\alpha, \beta)$  element with  $|\alpha| + |\beta| > 2$  is *active* in the sense that it can be built only with active components, such as transistors and op amps, which requires a power supply. Finally, we remark that every  $(\alpha, \beta)$  element can be built by the same procedure illustrated in [2, 5, 10] using a family of linear active





2-ports called *mutators*. They can also be *emulated* via various off-the-shelf digital components [11], or by programmable softwares interfaced with analog-to-digital (A/D) and digital-to-analog (D/A) converters.

#### 2.1.3 Complexity Metric of Circuit Elements

For each  $(\alpha, \beta)$  element, let

$$\chi \triangleq |\alpha| + |\beta| \tag{2.20}$$

be its associated *complexity metric* [12]. For example,  $\chi(0,0) = 0$  for a *resistor*,  $\chi(0,-1) = 1$  for a *capacitor*,  $\chi(-1,0) = 1$  for an *inductor*,  $\chi(-1,-1) = 2$  for a *memristor*,  $\chi(-1,-2) = 3$  for a *memcapacitor*, and  $\chi(-2,-1) = 3$  for a *meminductor*. If one associates the vertical and horizontal lines passing through the elements in Fig. 2.3 as streets of Manhattan, New York city, then the complexity metric  $\chi$  of an  $(\alpha,\beta)$  element gives a measure of its distance from the resistor  $(\alpha,\beta) = (0,0)$ . The larger the metric  $\chi(\alpha,\beta)$ , the farther it is from the resistor.

The complexity metric measures not just only the distance of  $(\alpha, \beta)$  element from the resistor but also the *minimum number* of capacitors (or inductors) needed to build an  $(\alpha, \beta)$  element using off-the-shelf components. For example, a minimum of one capacitor along with active elements such as transistors and op amps is needed to build a *memristor* while a minimum of two capacitors are needed to build a meminductor. From a mathematical perspective, the larger the complexity metric, the higher the dimension of the *state space* and the larger the number of nonlinear differential equations and exotic dynamical phenomena that can emerge.

Based on any of the above measures of complexity, the four elements depicted in Fig. 2.3 are indeed the simplest circuit elements, with the memristor ranked as the 4th element in increasing complexity.

#### 2.1.4 Fingerprint of Memristors

The formal mathematical definition of the memristor is given in [5], along with its circuit-theoretic properties. Here we recall that the memristor is defined by a collection of all admissible signals, namely, an A-pad listing all signals measured from all admissible "Gedanken Probing Circuits" (Fig. 2.1) and which can be completely reproduced by the constitutive relation (2.17).

For example, a charge-controlled memristor can be defined by

$$\varphi = f_M(q) \tag{2.21}$$

where  $f_M$  is a *piecewise-differentiable* function [12]. In this case, we can generate all (v(t), i(t)) from the A-pad via the following q-dependent Ohm's law:

$$v = R(q)i \tag{2.22a}$$

$$v = R(q)i$$

$$R(q) \triangleq \frac{df_M(q)}{dq}$$
(2.22a)
(2.22b)

The function R(q) is called the memristance (acronym for Memory Resistance) where

$$R(q) \ge 0 \tag{2.23}$$

for all passive *memristors* [2].

Now observe from (2.8) that since

$$\frac{dq}{dt} = 0 \quad \text{when} \quad i = 0 \tag{2.24}$$

[1

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the memristor can assume a continuous range of distinct equilibrium states

$$q = q(t_0), \quad t \ge t_0$$
 (2.25)

when the power is switched off at any time  $t = t_0$ . It follows that the *memristor* can be used as a *nonvolatile analog memory*. In particular, it can be used as a nonvolatile binary memory where two sufficiently different values of resistance are chosen to code the binary states "0" and "1," respectively. Because the hp memristor reported in [6] as well as in many other nano devices [13] can be scaled down to atomic dimensions, the *memristor* offers immense potentials for an ultra low-power and ultra dense nonvolatile memory technology that could replace flash memories and DRAMS.

An incisive analysis of (2.22) reveals that the *nonvolatile* memory property possessed by the memristor is a direct consequence of its *state-dependent* Ohm's law. Moreover, all circuit-theoretic properties possessed by the *memristor* are preserved if we generalize (2.22) to the form [14].

$$v = R(x,i)i$$

$$dx/dt = \mathbf{f}(x,i)$$
(2.26a)
(2.26b)

The generalized *memristor* defined in (2.26) is dubbed a memristive *device* in [14] where 
$$x = (x_1, x_2, ..., x_n)$$
 denotes *n* states variables, which do not depend on any external voltages or currents. However, since both (2.22) and (2.26) are endowed with the same circuit-theoretic properties, it is more convenient and logical to refer to both equations as defining a *memristor*. In the rare events where a distinction may

be desirable, one can refer to (2.22) as defining an "ideal memristor."

The most important common property of (2.22) and (2.26) is that the loci (i.e., Lissajous figure) of (v(t), i(t)) due to any periodic current source, or periodic voltage source, which assumes both positive and negative values, must always be pinched at the origin in the sense that (v,i) = (0,0) must always lie on the (v,i)-loci, called a *pinched hysteresis loop* in the literature [13]. We wish to stress that (2.22) and (2.26) imply that the pinched hysteresis loop phenomenon of the memristor must hold for any periodic signal, v(t) or i(t), that assumes both positive and negative values, as well as for any intial condition used to integrate the differential equations to obtain the corresponding steady state i(t) and v(t), respectively.

Another unique property shared by all memristor hysteresis loops is that for every given periodic function i = f(t) (where  $f(\bullet)$  assumes both positive and negative values), and for any initial state  $\mathbf{x}(0)$  the area enclosed within the part of the pinched hysteresis loop in the first quadrant, and the third quadrant, of the v - i plane shrinks continuously as the frequency  $\omega$  increases, and the hysteresis loop tends to a *single*valued function through the origin as  $\omega$  tends to  $\infty$ .

The above dense continuum of pinched hysteresis loops, as well as their *single-valued function* limiting phenomenon as  $\omega \to \infty$  must hold for *all memristors*. Any purported system which may exhibit a pinched hysteresis loop but which violates the above continuum and frequency-dependent limiting *memristor fingerprint* is *not* a memristor, the reader is referred to [15] for several contrived examples which fails the above "*memristor fingerprint* test."

We end this tutorial by pointing out that not all memristors are nonvolatile memories. In fact there is an even *larger class* of *locally active* memristors [2, 4, 9] which exhibit many exotic nonlinear dynamical phenomena. A very interesting and scientifically significant example is the classic Hodgkin–Huxley Axon circuit model of the squid giant axon.<sup>3</sup> Notwithstanding the immense importance of their circuit model, Hodgkin and Huxley had erroneously named two circuit elements in their model associated with the potassium ion, and the sodium ion, respectively, as *time-varying conductances*. This mistaken identity has led to numerous confusions and paradoxes ever since the publications of their classic axon circuit model [16]. Well-known physiologists were puzzled by experimentally observed *rectification phenomenon* as well as *gigantic inductances* that could not exist within the soft tissues of the brain. The following quotation from Cole (see page 78 of [17]), an eminent physiologist and the recipient of the 1967 USA *National Medal of Science*, is a case in point:

"The suggestion of an inductive reactance anywhere in the system was shocking to the point of being unbelievable"

We have solved the above conundrum, and many other hitherto unresolved paradoxes associated with the Hodgkin–Huxley Axon, by showing the Hodgkin–Huxley *time-varying* potassium conductance is in fact a 1st-order memristor, and the Hodgkin–Huxley *time-varying* sodium conductance is in fact a 2nd-order memristor, as defined in Fig. 2.4b, c, respectively [18]. Also depicted in Fig. 2.4 are the pinched hysteresis loops associated with each memristor. Observe that they are all pinched at the origin, and that the lobe area in the first and third quadrants shrinks continuously to a straight line as  $\omega$  increases, both being the fingerprint of memristors.

We conclude this tutorial by stressing that memristors are not inventions. They are *discoveries* and are ubiquitous. Indeed, many devices, including the "*electric arc*" dating back to 1801, have now been identified as memristors [19, 20]. Aside from serving as nonvolatile memories [21], *locally passive* memristors, have been used for switching electromagnetic devices [22], for field programmable logic arrays [23–27], for synaptic memories [28–30], for learning [31–33], etc.

In addition, *locally active* memristors have been found to exhibit many exotic dynamical phenomena, such as *oscillations* [34], *chaos* [35, 36], *Hamiltonian vortices* [37] and *autowaves* [38], etc.

<sup>&</sup>lt;sup>3</sup>Hodgkin and Huxley were awarded the 1965 Nobel Prize in physiology for their derivation of the circuit shown in Fig. 2.4a, where the two memristors were drawn as time-varying resistors in Fig. 1 (page 501) of [16].



**Fig. 2.4** Hodgkin–Huxley Axon. (a) Memristive Hodgkin–Huxley Circuit model of giant axon (*center*) of North Atlantic squid Loligo (*right*). (b) Postassium ion-channel memristor and its pinched hysteresis loops. (c) Sodium ion-channel memristor and its pinched hysteresis loops [18]

#### 2.2 Concluding Remarks

Any 2-terminal device which exhibits a pinched hysteresis loop in the v-i plane when driven by *any* bipolar periodic voltage or current waveform, for *any* initial conditions, is a *memristor*. In the case where the *memristance*  $R(x_1, x_2, ..., x_n)$  does not depend on the current *i*, the loop shrinks to a straight line whose slope depends on the excitation waveform, as the excitation frequency tends to infinity.

Except in ideal cases, memristors, memcapacitors, and meminductors do *not* behave like resistors, capacitors, and inductors, respectively. For example, the potassium and sodium ion channel memristors in the Hodgkin–Huxley axon circuit model behave like R-L circuits ([18, 39]). It is conceptually wrong and misleading to identify memristors, memcapacitors, and meminductors with resistors, capacitors, and inductors. Each  $(\alpha, \beta)$  element is a distinct circuit element because it cannot be built from the other elements.

Readers who may have been misled by some erroneous commentary in the popular press which associates an earlier *gadget* called a *memistor* with the *memristor* are referred to a technical clarification in [40].

We end this tutorial with the following succint signature of a *memristor* [13]: *If it's pinched it's a memristor.* 

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### Part II





What is a *resistor, inductor,* and *capacitor*?

## **Shocking Fact !**

Before the publication of my book Introduction to Nonlinear Network Theory in 1969, there was no scientific definition of basic circuit elements.







# Does this calculated *capacitor current* agree with the *laboratory measurement*?

## No !

Reason : Our classical definition of the *capacitor* is wrong.

### The classical definition

 $i(t) = C \ \frac{dv(t)}{dt}$ 

uses an *incorrect pair* of variables i(t) and  $v'(t) \triangleq \frac{dv(t)}{dt}$ 

Let us *integrate* both sides to obtain

q(t) = C v(t)

This equation defines a *relationship* between a *different pair* of variables *q(t)* and *v(t)*, and gives the *correct* answer.



An analogy of a similar mistake from Mechanics



























#### No device model is Perfect

A useful device model must reproduce the input-output behaviors of a physical device to acceptable engineering accuracy.

1		1
	Model	
	must	
	Predict !	














































Our axiomatic definitions of the 4 elementary circuit elements is analogous to Aristotle's definitions of the 4 building blocks of matter.

### Aristotle's Theory of Matter

All matter consisted of four elements:

- 1. EARTH
- 2. WATER
- 3. AIR
- 4. FIRE

Each of these elements exhibited two of *four fundamental properties* :

- Moistness
- Dryness
- Coldness
- Hotness













































Memristor Passivity Condition         The $\varphi$ -q curve of all physical         memristors must be a         monotone-increasing function.	
Examples $ \begin{array}{c}                                     $	



Is it possible to build a passive solid state memristor?

Answer :

Yes, provided the memristor satisfies the memristor passivity condition.







## Memristor Model of an Experimental Nano Device

The following slide shows a nano device, reported from Professor Lieber's Harvard Nano-device Laboratory, whose experimentally measured *v-i characteristic* is a *pinched hysteresis loop*. The conductance of the device can be switched from "0" nS (*off* state), to 800 nS (*on* state), by applying a *square wave*. Professor Lieber had confirmed (private communication) that the loop "shrinks" with increasing frequency. This device can therefore be modeled as a *memristor*.



























## If it's pinched, It's a memristor

# Resistance Switching implies Memristor

# RRAM and Phase Change Memory are Memristors







Breaking News!	
A memristor has been built with only one molecule.	









#### Modeling Quasi-Particle Pair Interference Current in Josephson Junctions

In the quantum-mechanical analysis of the Josephson junction, a small contribution to the device current is derived by Josephson to be given by

 $i = M(\cos \varphi) v$ 

where M is a constant which depends on the device parameters. This equation, which is usually negligible, represents a **memristor** defined by

 $q = M \sin \varphi$ 















**Memristors are not Lossless** 

As *non-volatile* memories, *memristors* do not consume power when idle. It does *dissipate a little heat* whenever it is being *"written"* or *"read"* 












New Scientific ideas do not succeed by converting contemporary scientists, but rather by their opponents' dying off



Max Planck

## Max Planck

New theories have four stages of acceptances:

I. this is worthless nonsense;

II. this is interesting, but perverse;



J. B. S. Haldane

III. this is true, but quite unimportant;

IV. I always said so.

J. B. S. Haldane