# Embryonics: A Path to Artificial Life?

**Abstract** Electronic systems, no matter how clever and intelligent they are, cannot yet demonstrate the reliability that biological systems can. Perhaps we can learn from these processes, which have developed through millions of years of evolution, in our pursuit of highly reliable systems. This article discusses how such systems, inspired by biological principles, might be built using simple embryonic cells. We illustrate how they can monitor their own functional integrity in order to protect themselves from internal failure or from hostile environmental effects and how faults caused by DNA mutation or cell death can be repaired and thus full system functionality restored.

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# I Introduction

Living beings are extremely complex systems that evolved from relatively simple single-cell creatures. They display intriguing characteristics, such as evolution, adaptation, and fault tolerance. These are clearly very desirable features, but are extremely difficult to realize using conventional engineering methodologies. Since the beginning of our civilization, humans have always been curious, trying to understand the secret of life. Aristotle (384-322 B.C.), the first great biologist, believed that all living things could be arranged in a hierarchical order. In the nineteenth century, Charles Darwin devoted his life and work [9] to changing our views on life and on our place in the living world. In the last century, molecular cell biology from different areas, such as energetics, genetics, embryology, and immunology [8, 20, 1, 2] has provided us with clearer understanding of how living systems grow and develop. Ever larger numbers of scientists, researchers, and engineers are turning to nature and trying to adapt biological principles to build and maintain increasingly complex artificial systems. Applications of such natural processes [21] are far ranging: from artificial neural networks, through genetic algorithms, to embryonics (*embryological electronics*) [12]. Embryonics, the main topic of this article, is based on the natural mechanisms found in the development of the living embryo. Life starts from the zygote, a single fertilized egg, which contains all the genetic information of the organism in its DNA. The zygote then multiplies and develops into a living being. In a hardware of an equivalent embryonic electronic system its life also starts from a single mother cell. The final organism (system) then, similarly to nature, is also developed through the processes of cell division and cell differentiation by forming a two-dimensional cellular array. This article will discuss how an embryonic-array-based system can be created and will also demonstrate its reaction to faulty operation of the system and the consequent repair mechanisms involved.

## 2 Embryonic Development and Cell Repair

A clearer picture of how a nature-inspired embryonic system develops, its implementation in hardware, and how in the presence of a fault it could repair itself may be obtained if we try to understand the biological mechanisms involved. In biology, the cell is the basic structure and the beginning of life [3]. With the exception of unicellular creatures, such as bacteria, a multicellular embryo [36] is formed from a fertilized egg, a single cell, by repeated cell division, cell growth, and cell differentiation. This process is called embryonic development.

## 2.1 The Basic Cell

Under the light microscope, a cell is no more than a tiny mass of inanimate material. Examined with an electron microscope, it displays a wealth of intricate detail. It is then possible to identify innumerable chemical substances located in specific regions [28]. The concept of a "basic" or "typical" cell is probably only theoretical, as it is doubtful if such a cell really exists. It lacks the modification of the specialized or differentiated cells found in biological systems, but it can help us to understand the basic features common to every cell. Such an assumption can simplify the complexity of real cells, and thus help in identifying equivalent hardware architectures, components, and processes.

A typical cell contains a nucleus, without which it would soon perish. Inside the nucleus are the chromosomes, long, thin threads consisting mostly of deoxyribonucleic acid (DNA), so thin that they are invisible under the light microscope except when the cell divides.

The DNA is the repository of much of the genetic information within the cell. The transcription of this information from DNA to ribonucleic acid (RNA), and the RNA's subsequent translation into various proteins through protein synthesis, is the most important processing mechanism inside the cell [7]. The resulting protein can then support all activities of the cell. It can either be further processed or be ready to be used as enzymes, structural elements, antibodies, or hormones—internally or externally.

### 2.2 Embryonic Development

No cell can live indefinitely. It either dies or divides. Cell division is one of the fundamental properties of living systems. The division of cells is the method that enables growth, replacement, and repair of organisms. An increase in the number of cells is an obvious consequence of cell division. This is one of the basic mechanisms underlying growth. There are two types of cell division: mitosis and meiosis. One important difference between them is that after mitosis the two daughter cells have exactly the same number of chromosomes as their mother cell has. After meiosis however, the two daughter cells will only have half the number of chromosomes found in their mother cell. During embryonic development, only mitosis takes place, guaranteeing that all newborn cells will have the entire DNA, so that new tissues and organs can develop. Since meiotic cell division will only take place in postembryonic development and in the mature body, it will not be discussed in this article.

A fertilized egg, during the process of cell division, will develop into a multicellular embryo. However, we do not know how cells that originate from the same progenitor cell can produce different tissues and organs. The theoretical concept of a general cell derived from various cell samples is insufficient. The cell, like a human being, is a unit of living matter. But cells also differ from other cells in their structure and in their function within their "society," just as people differ in their size, shape, and contribution to human society. The answer to the above question lies in the fundamental processes of developmental biology: cell differentiation, or cell specialization [19].

With every embryonic cell having the potential through its genome to become any type of adult cell, the reasons for cell differentiation and its mechanisms must lie in the immediate environment of the cell. It is not difficult to visualize how different effects on a cell could arise through the differences in its location within the embryo. In the embryo of a chicken, for example, the location of cells will decide the availability of food (yolk) and oxygen to each cell. Such differences must then

lead to differences in cell metabolism. Thus, if different substrates and metabolites are presented to similar cells, then not only will the enzymes involved in protein synthesis be different, but the products of their activities will also be different and, most importantly, the genes involved will also be different. Even though, during embryonic development, the differences between cells are relatively slight and few in number, if cell differentiation occurs, the embryo will eventually become a body with fully differentiated tissues and organs.

#### 2.3 Cell Death and Cell Repair

As mentioned earlier, no cell can live forever. Section 2.2 discusses the first phase of the cell's development, where continuous cell division will result in the development of the embryo—its tissues and organs. There is, however, another phase in the development cycle of a cell: its death. Here we can examine the aging of an organism. Aging in a typical multicellular organism entails distinctive changes in both its extracellular and cellular components [4]. Extracellular components include the soluble and insoluble molecules that contribute to the structure and function of tissues. Cellular components are the units inside the cells that allow expression of the genome, which in turn defines the characteristics of the organism. A simplified view (Figure 1) of the aging process considers that both cellular and extracellular components undergo age-dependent changes. Cells may also be viewed as belonging to one of two classes: postmitotic cells, which cannot divide, and mitotic cells, which are competent to divide when the need arises.

Whatever the initiating cause, if the changes from extracellular or cellular components affect the information in the DNA and the consequent processes of protein synthesis, this will eventually lead to cell death or malfunction. Aging results in changes (increase or decrease) in cell proliferation, cell death, and/or cell function. Aging is characterized by a loss of mitotic and postmitotic cells or functions. Mitotic cells can die in response to damaging agents. However, in contrast to the potential effects of cell death in postmitotic tissue, cell death may have a positive effect on the health of mitotic tissue. Because mitotic cells can proliferate, dead cells can be readily replaced. However, there is no way to replace lost or dysfunctional postmitotic cells. Cell death or malfunction can therefore severely compromise tissues. Some tissues contain stem cells that can replace postmitotic cells when they are lost due to damage or trauma. However, if postmitotic tissue proliferation is no longer possible, then there are only three possible outcomes: complete repair, continued survival of a dysfunctional cell, and apoptosis. The last is a suicidal pattern, referred to as programmed cell death. In mitotic cells and postmitotic cells, a damage-responsive checkpoint exists to provide a means for deciding whether to repair and then carry on the functionality, or to undergo apoptosis.

The DNA in living cells is subject to many alterations. Certain wavelengths of radiation, highly reactive oxygen radicals produced by the body, and chemicals in the environment are all agents that can damage the DNA. If such changes are not corrected, the alterations can result in the production of faulty proteins at an unacceptable rate (e.g., in cancer). The evolutionary response to this problem



Figure I. Component aging in higher eukaryotic organisms [4].

has been a mechanism of the body that can repair the faulty DNA. DNA repair [20] is a cell-initiated internal repair mechanism. Figure 2 shows repair alternatives of damaged cells.

# 3 Related Work

In a generic embryonic model, nature's three-dimensional realizations of systems, because of current limitations of available technology, have to be "flattened" to systems built from two-dimensional homogeneous arrays of identical cells, which are interconnected so as to create the required functionality of the organism (Figure 3a). Perhaps if we succeeded in applying some fundamental biological processes of nature to the world of electronics, namely multicellular organization, cellular division, and cellular differentiation [21], then we could build nature-like systems that could grow, develop, evolve, and learn.

In embryonics, as in nature, the basic building block of any system is a cell. It is clear that the design of an embryonic cell architecture and associated system requires rigorous examination of the constraints imposed by environmental differences (e.g., the three-dimensional human body versus the two-dimensional silicon) and by process differences (e.g., protein synthesis versus gate synthesis), under which a biological cell and its proposed electronic counterpart has to function. Quite clearly the creation of an embryonic cell and system that is a pure generic equivalent of a biological cell and organism is not possible. However, a great deal can still be learned from nature, and from the way biological and physiological structures and processes have evolved. We may hope that by adapting this knowledge we can solve engineering problems that have hitherto frustrated us.

Hugo de Garis in 1991 was the first scientist who defined and discussed embryonics [12]. He also implemented an artificial embryo [12, 11, 13] on a Darwin machine [10, 16]. Inspired by nature, this was the first ever attempt to "grow" an embryo on a two-dimensional cellular system using an artificial embryonic development mechanism to form some desired functionality. Later, he also demonstrated the feasibility of cellular differentiation [14] and self-reproduction in cellular automata [15, 18, 17]. In 1993 Mange and Stauffer [21] discussed the concept of embryonics, which they and others further developed [26] in greater detail. They identified the three fundamental properties of living things that an electronic system, if inspired by nature, must also satisfy: multicellular organization, cellular differentiation, and cellular division. Using MUXTREE cells [24], they illustrated the mechanism of self-repair [27, 22, 25] and proposed four levels of



Figure 2. Alternatives for dealing with damaged postmitotic cells [4].



Figure 3. (a) Multicellular organization. (b) Embryonic cell.

organization for an embryonic system [23]: the molecular level, cellular level, organism level, and population level. In 1998, based on the MUXTREE principle of hardware realization, Ortega and Tyrell recommended a different embryonic model [29] that only applied a two-level structure, with a cellular level and an organism level. Both approaches meet and fulfil all three fundamental properties of their biological counterparts.

In any living being each and every one of its cells carries the same DNA that describes the entire characteristic of the organism. Therefore the DNA of a generic hardware equivalent of a biological cell should also contain the entire behavior of the system. However, to meet this requirement in hardware is hugely impractical. It would simply mean that every single cell should contain the desired behavior—the genome—of the entire system. For example, let us consider a hypothetical implementation, requiring one million embryonic cells, where every cell's gene is transcribed onto one byte of binary behavior (configuration data). Under these circumstances, each cell would also be expected to hold the one million bytes of DNA behavior of the complete system. In practice, however, a cell would never need to hold more information than the gene it synthesizes and genes of adjacent cells that it might be required to synthesize, in a system self-repair process, if an error in its functional operation was detected.

The limitations of this strategy are obvious, and there are two clear alternatives to it. First, we could restrict the size of the system or subsystem, namely, the number of cells it uses. In fact, applications to date have only considered small systems that use a rather limited number of embryonic cells. For example, the BioWatch [34, 32] on the BioWall [33] has only eight cells (six system cells and two spare cells); the Khepera robot controller [6] is implemented with six cells (one system cell, one immune cell, and four spare cells). In all these cases, the number of genes that each cell can carry imposes a natural constraint on the size of the system. An alternative approach [42] is to restrict the information content held by each embryonic cell, so that it no longer exactly mimics the structure and behavior of the biological cell, but will still maintain most of its system-building characteristics. This is the approach proposed in this article and by the others [37–40, 42].

#### 4 Embryonics

#### 4.1 The Embryonic Cell

Figure 3b illustrates the internal structure of one cell. The multicellular organization of cells when a system is being realized is shown in Figure 3a. Cell-to-cell communication and detailed

system interconnection are discussed in [37]. Internally every cell contains eight functional modules: a DNA segment memory, a DNA-repair unit, a function unit, diagnostic logic, an I/O router, a coordinate generator, a reconfiguration unit, and a core register. The coordinate generator calculates both the DNA segment memory's pointer address and the cell's own address in the array. The latter is dependent on its relative position with respect to its neighboring cells. The memory pointer is used to select one set of configuration data (gene) from a segment of the system's DNA. The I/O router forwards to the function unit three input signals from the four neighboring cells and will connect its output to one of those cells. The function unit contains a 2 : 1 multiplexer-based universal logic element and a D-type flip-flop. Any error in the function unit is detected by the diagnostic logic. The DNA-repair unit detects and repairs any transient error in the DNA segment memory. Finally, depending on the status of the core register, the reconfiguration unit may kill the cell and reconfigure the array so that the faulty cell is replaced by a fully functional one.

The task of the function unit is similar to the protein synthesis found in a biological cell. It will decode and transcribe the information of a segment of the DNA to an expected logic function. In a previous implementation [39, 38, 37] the function unit simply consisted of two 2 : 1 multiplexers and one D-type flip-flop. It was found, however, that cell functionality could be greatly improved if the number of multiplexers was increased to seven (Figure 4). Instead of the multiplexers an appropriate lookup table (LUT) could also be employed. The core of the function unit (i.e., the 2 : 1 multiplexer for combinational logic and the D-type flip-flop for sequential function realisation [39]) will remain, but, with read/write control, the D type could also serve as a one-bit memory element. This change will not affect the size of the DNA and its genes, that is, the cell's configuration data.

In addition to the A, B, X, Clock, and SEQ (the last is a bit in the gene that defines whether sequential functionality is required) inputs and a single output E, there are three further inputs: N, Pulse, and SET0. The signal N is an output from the function unit of a neighboring cell. Should the neighboring cell die, then this cell, during reconfiguration, will take over its functionality. The Pulse signal is equal to 1 for one clock cycle of the reconfiguration period, and 0 at all other times. If sequential mode of operation is required then, through the second bit of the gene, the SET0 signal will instruct the function unit to operate either as a synchronous element (SET0 = 1, and the flip-flop is controlled by the system Clock) or as an asynchronous element (SET0 = 0, and flip-flop is controlled by signal A). The selection is controlled by multiplexer MUX\_3 in Figure 4. This means that, in order to meet both functional requirements of the cell, the gene definition will need to be slightly modified. The cell's functionality is not affected, and it will continue to operate, as before, either in a functional mode or in a bypass mode. In the latter case, the function unit is inoperative and the cell only provides signal routing to and from other cells. The two modes of operation are illustrated in Tables 1 and 2 [39].

#### 4.2 Cellular Division and Cellular Differentiation

Cell division is the initial step of populating an embryonic array with functionally configured cells. A mother cell, or zygote, will download the genome and distribute it to its adjacent cells, which, in turn, will pass this information to their neighboring cells. The process will continue until the whole array is populated. In the natural world, a biological cell needs time to gather enough nutrition to breed daughter cells. In the meantime, the hereditary material (i.e., the genome in the mother cell) will pass, during cell division, to the daughters. In the electronic world of embryonic arrays the mother cell will not breed new cells; these cells are fabricated during silicon processing. However, as in the natural world, the mother cell will pass the genetic information on to its daughter cells. This procedure is called cellular division.

As illustrated in Tables 1 and 2, if intercell communication is conducted via 13-bit-wide data buses and signal transmission is controlled by a global system clock, then a 13-bit gene can be downloaded into the mother cell during one clock cycle. Fundamentally, irrespective of whether

Е



Note:

The Function Unit of an embryonic cell has three basic functionalities:



\*: Signal N is an output of a neighboring cell function unit.

Figure 4. Improved function unit.

multiplexers or LUTs are used for data transmission, they behave as combinational logic elements. The consequence of this is that as soon as the mother cell receives a gene, it will immediately broadcast it to all its daughter cells. These will, in turn, pass on the genetic information to all their associated cells, and the process continues until the entire array is populated.

The time taken for this is the sum of all propagation delays in the longest chain of combinational elements. This must, in the worst case, be less than one clock cycle. In large and complex systems the time taken to populate the array may still become quite long. For such eventualities new population algorithms are currently under investigation.

The process of cell division is shown in Figure 5. The DNA segment memory of each cell contains a counter. The cell's own address and the position of the counter will determine which genes of the overall DNA structure each cell will hold in its segment memory. On completion of the

Bits	Field		Description	
0	BP	0	Cell in functional mode	
I – 3	IN I, IN0, SET0	First gi	roup of input signals (A):	
		0X1	A = IN0 (SEQ = 0)	
		0XI	Flip-flop uses default clock signal (SEQ = 1)	
		IXI	A = Z ****	
		000	A = E0 *	
		010	A = S0 *	
		100	A = W0 *	
		110	A = N0 *	
4-6	IN3,IN2,SET I	Second	Second group of input signals (B):	
		0X1	B = IN2	
		IXI	B = Z ****	
		000	B = E0 *	
		010	B = S0 *	
		100	B = W0 *	
		110	B = N0 *	
7-9	IN5,IN4,SET2	Third g	group of input signals (x):	
		0X1	x = IN4	
		IXI	x = Z ****	
		000	× = E0 *	
		010	× = \$0 *	
		100	x = W0 *	
		110	x = N0 *	

#### Table I. (continued)

Bits	Field		Description		
10-11	OUTI,OUT0	Output	Output signal group (E):		
		00	EI = E **		
		01	SI = E **		
		10	WI = E **		
		П	NI = E **		
12	SEQ	Flip-flop	control bit:		
		0	Flip-flop is not used		
		I	Flip-flop is used		

cellular division process, a default memory pointer address will be computed by the coordinate generator. The gene that is currently executed by each cell will be selected as the right uppermost entry in DNA-segment memory, as shown in Figure 7 discussed within Section 4.3.2).

#### 4.3 Cell Repair Strategies

There are two different types of repair mechanisms dealing with damaged cells in a biological system (Figure 2): DNA repair, which is internal to a cell, and repair via complete cell replacement. These mechanisms are the result of changed internal or external environmental conditions that adversely affect either the DNA information or the protein synthesis of the cell. Embryonics applies both of these processes in systems that it implements, when erroneous operation is detected.

#### 4.3.1 DNA Repair

In living things many cells that possess a slow rate of reproduction, or for which cell division is not possible (postmitotic cells), will have to use their DNA information for weeks, months, or perhaps years (e.g., liver and brain cells). However, the DNA in living cells is subject to many alterations. Certain wavelengths of radiation, highly reactive oxygen radicals produced by the body, and chemicals in the environment are all agents that can damage the DNA. If the genetic information in the DNA is to remain uncorrupted, then such changes must be corrected. Uncorrected base changes in the DNA could result in the production of faulty proteins at an unacceptable rate (e.g., as in cancer). The evolutionary response to this problem has been the creation of a mechanism of the body that can repair the faulty DNA.

DNA-repair mechanisms [34] have been studied most extensively in *E. coli* (a bacterium) using a combination of genetic and biochemical approaches. Repair mechanisms can be divided into two broad categories: direct-repair and excision-repair. In the first category, the body's enzymes directly repair the damaged DNA. In the second category, the damaged region is excised (removed) by specialized nuclease systems and then the gap is filled by DNA synthesis.

There is one major area where the DNA-repair mechanism of a hardware implemented cellular system must differ from its biological counterpart. Our bodies, for example, are made up of approximately  $6 \times 10^{13}$  (sixty trillion) cells. Each cell stores the entire DNA that characterizes a human being. In the case of an electronic system, however, composed perhaps of millions of embryonic cells, it would not only be impractical, but highly inefficient, for each cell to contain the entire genetic behavior (DNA) of the organism. Each cell only acts upon and executes one, or at most a few,

# Table 2. Bypass mode definition.

Bits	Field		Description		
0	BP	I	Cell in bypass mode		
I – 3	IN1,IN0,SET0	First by	First bypass input signal group:		
		X00	No signal selected at all		
		X10	Fat cell (SP must be set to 1)		
		001	Select E0 * as input signal		
		011	Select S0 $*$ as input signal		
		101	Select W0 * as input signal		
		111	Select N0 * as input signal		
4-6	IN3,IN2,SET I	Second	Second bypass input signal group:		
		XX0	No second signal selected		
		001	Select E0 * as input signal		
		011	Select SO $*$ as input signal		
		101	Select W0 * as input signal		
		111	Select N0 * as input signal		
7-9	OUT3,OUT2,SET2	Second	Second output bypass signal group:		
		XX0	No signal selected		
		001	Select EI ** as output signal		
		011	Select SI ** as output signal		
		101	Select WI ** as output signal		
		111	Select NI ** as output signal		
10-11	OUTI,OUT0	First output bypass signal group:			
		00	Select EI ** as output signal		
		01	Select SI ** as output signal		
		10	Select WI ** as output signal		
		П	Select NI ** as output signal		

#### Table 2. (continued)

Bits		Field		Description		
12	SP		Spare	Spare cell flag		
			0	Normal cell		
			Ι	Spare cell		

genes of the genome that are associated with it as a result of system self-repair. Consequently, the cell does not need to detect errors in other parts of the genome and only needs to recognize them in the genes it may have to execute. This will reduce the complexity of the DNA-repair unit.

The direct DNA repair that living things are capable of cannot be easily implemented by electronic hardware. Excision repair, however, offers us an alternative way both to detect and to repair DNA errors in hardware-implemented embryonic cells [40]. This is also the first time that such DNA repair in an embryonic cell has been implemented. The process steps involved are similar to those found in biological systems:

- First a DNA double helix is created (the cell's gene is copied into the DNA-repair unit).
- The error in the gene used by the cell is detected, and the entire mutated gene is cleaved.
- The DNA-repair unit removes the gene from the cell's DNA memory.
- Finally, the memory content is replaced by an undamaged copy of the strand, and the gene is recovered.

The functional behavior of the unit is shown in Figure 6.

The DNA-repair unit can repair any type of transient error in the gene that was to be executed by the embryonic cell. If the error it finds is a result of memory gene mutation, then a backup gene is used for the repair. Of course, no permanent faults found in the hardware could ever be repaired by this mechanism, and the unit is not capable of distinguishing between different types of transient and



: A spare cell

Figure 5. Process of cellular division.



Figure 6. DNA-repair mechanism.

permanent faults. Therefore, in order to avoid the attempted repair of a permanent fault that will create an endless loop in the DNA-repair process, only a fixed number of DNA-repair iterations will be allowed to take place. Any further repair attempts are likely to be caused by faults that are permanent and therefore unrepairable. If the number of repairs exceeds a preset value, then an error flag and a cell "kill" signal will be set in the cell. Control of the cell, in this case, is handed over to the reconfiguration unit, which, via cell elimination [37], will restore the fault-free functionality of the embryonic array.

# 4.3.2 Cell Replacement Repair

When either the diagnostic logic above, or the DNA-repair logic, detects a fatal fault in any one of the cells, a reconfiguration mechanism is triggered. The integrity of the system, however, is not affected, so it can carry on functioning correctly while the error is corrected. This is because for error detection and repair, run-time algorithms are employed that use only combinational-elements and require less than a clock cycle. To achieve this, various cell replacement repair methodologies have been studied and implemented. Currently three types of cell replacement methods are employed: row elimination, row and column elimination, and cell elimination.

- Row elimination: In a two-dimensional array of logic elements, the failure of one cell provokes the elimination of the corresponding row, which is replaced by the row to the north (above). Cells are then logically shifted upward until a spare row is reached and a new functional array is configured. Column elimination and row elimination in a 2D array are equivalent strategies.
- Row-and-column elimination: First row elimination (or column elimination) will be triggered by the failure of a cell. If the cell does not configure correctly, then the column (or row) containing this cell will also be eliminated and it becomes transparent.
- *Cell elimination:* In the first instance spare cells on the right side of the array will replace faulty cells in the same row. Then, when the number of faulty cells in a row exceeds the number of spare cells assigned to that row, the whole row is eliminated.

Currently implemented systems employ all of the above cell replacement repair strategies. Cell elimination for molecular repair of a cell was first proposed by Mange et al. [25, 31]. In their system molecules represented the bottom-level "primitives" from which cells were built. When the numbers of spare molecules were exhausted and no more faulty molecules could be replaced, the whole cell was eliminated. On the higher, cellular level only one of the cell-elimination steps is used [22, 31]. Row elimination was first proposed by Ortega and Tyrell [29, 30]. Finally, row-and-column elimination is used by Canham and Tyrell [6, 5]. On comparing the three elimination mechanisms, cell elimination appears to be the most efficient. It is for this reason that the authors of this article propose the use of cell elimination during cell replacement repair [37].

Once the type of cell repair strategy to be used has been decided, the required size of a cell's DNA-segment memory can be determined. Figure 7 shows a  $5 \times 4$  embryonic array. The expected system functionality of the organism as configuration data is described by its *Genes* matrix (Figure 7). During cell division, the mother cell (0, 0) will transmit the genetic data to its daughter cells (Figure 5). Cell differentiation is achieved by each cell executing the right uppermost configuration data (gene) in its memory bank. Its address location is calculated and is pointed to by the cell's coordinate generator. Currently executed genes of the cells (Figures 7 and 8) are shown in the top right hand corner of the cell. Spare cells are located on the right and on the top of the array, forming one spare column and one spare row of cells.

Let us consider the case of a fatal fault in cell 10 of Figure 7, the address of which is (2, 2). Cell elimination is undertaken in two steps (Figure 8a and b). First, it will be replaced by cell 11. Its address, which was previously (2, 3), will now change to (2, 2). The address pointer of cell 11 will also be modified so that it will now select the genetic code segment 332, which was previously executed by cell 10. With this final step, cell replacement is complete, the array is repaired, and normal system functionality continues uninterrupted.

In Figure 8b it is assumed that a further fatal error develops, for example, in cell 9 of row 3. Clearly this cell will also need to be killed now. As a consequence, the second step of cell elimination is triggered, and the entire row of the faulty cell is deleted. When a cell or an entire row is eliminated, it becomes "transparent." The cells in question will no longer provide any further functionality to the system, and they will merely be used for signal routing purposes by maintaining inter-cell



Figure 7. Embryonic array after cellular division and cellular differentiation.



Figure 8. (a) First step and (b) second step of cell elimination.

communication [37]. In the unlikely event that a fault in the cell's I/O router module develops and thus it cannot even support inter-cell communication, then signals will be rerouted through the cell's supervisory innate-immune system [41].

The above example also indicates that there is a direct relationship between the size of the memory each cell requires and the cell-elimination strategy employed, namely, the numbers of spare rows and spare columns of the array. For example, besides its own genetic information, cell 14 will also need to store the genes of cells 9, 10, and 13. In case of an error, cell 14 will never be required to replace the functionality of any other cells apart from these, and therefore no other gene and configuration data needs to be stored in its memory. From this observation, if the number of spare columns is c and that of spare rows is d, the required size of memory that each cell should have can easily be calculated [42]:

$$m = (c+1)(d+1)$$
(1)

A fault-tolerant cellular organism can be built if both cell repair mechanisms—DNA repair and cell replacement—are present in the system. Figure 9 summarizes these mechanisms and shows the general relationship between cellular division, cellular differentiation, and cell repair.

## 5 Example: A 32-bit Static RAM

SRAM (static RAM) is read-write random access memory (RAM) that retains data bits in its memory for as long as power is supplied. Unlike a DRAM (dynamic RAM), which stores bits in cells consisting of a capacitor(s) and a transistor(s), SRAM does not have to be periodically refreshed. SRAM provides faster access to data, but it can be more expensive than DRAM.

Figure 10 [35] shows a one-bit memory cell. It has three inputs (IN, SEL\_L, and WR\_L) and one output (OUT). When the memory cell is selected (SEL\_L = 0) and a write command is



Figure 9. Cell repair strategies.

issued ( $WR\_L = 0$ ), any data present on the line (signal IN) will be stored in memory. If a read command is issued ( $WR\_L = 1$ ) and the memory cell is selected, the memory will output the value it has stored on output OUT. The output of each memory, to access a data bus, needs to be tri-state. Figure 11 shows a 32-bit SRAM module organized as a 4-byte system. It includes a 2-to-4 decoder, the inputs of which are connected to an address bus (A1 and A0). The decoder calculates the required addresses and issues a selection signal to the required byte. The system is enabled by a  $CS\_L$  chip select signal. When the memory module is selected ( $CS\_L$  is 0) and a write command is received, data present on DIN7 to DIN0 will be stored in the memory under an address location specified by A1 and A0. When the output is enabled ( $OE\_L$  is 0) and a read command is received, the content of the memory, as specified by A1 and A0, will be placed on the data bus DOUT7 to DOUT0.

A 32-bit memory system organized as 4 bytes was implemented using 1536 embryonic cells. The system occupies an array that consists of 64 rows and 24 columns. It also includes 2 spare rows placed on the top and 1 spare column placed on the right hand side of the array (Figure 13). The size of the DNA-segment memory is given by Eq. (1) as 6 ( $2\times3$ ). It is important to note that the size is independent of the number of cells (1536) in the array. As a consequence, the DNA-segment implemented system achieves a 99.61% and a 93.75% saving in required memory resources with respect to the Mange and Ortega systems, respectively. There is no limitation of or practical constraint on the total number of cells that our proposed embryonic array could have.

Simulation results of the memory module are shown in Figure 12. After cellular division and cellular differentiation the SRAM is loaded with a data stream F3, DE, 4B, and B5 for bytes 0, 1, 2, and 3 under corresponding address locations. At 3088 ns, a simulated error is injected into cell 258 located at row 10, column 18 (Figure 13). As the first step of cell elimination, cells are shifted right and the functionality of cell 258 will be taken over by cell 262. At 3092 ns, a second error is injected, but in this case into cell 253, located at row 10, column 13. Since there are no more spare cells in



Figure 10. Static RAM cell.

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Figure 11. 4-byte static RAM system.

row 10, the row will be eliminated. The functionality of all rows from 10 to 61 will now shift upward by one row, and thus normal error-free operation of the array can continue unhindered.

# 6 Conclusions

Embryonics is inspired by biological embryonic processes, during which a fertilized egg develops into an embryo, a multicellular organism. The birth of an artificial-life-based electronic system takes a similar route. The hardware platform is a "sea of cells" in a two-dimensional silicon array. Embryonic processes of cellular division and differentiation will ultimately result in an organism—an electronic system—which behaves according to some specific requirement. The behavior of the system, similarly to nature, is defined by its DNA. The individual genes are downloaded and distributed over the array by a mother cell. Its daughter cells and their offspring will successively be assigned functional roles, via the encoded genes (Tables 1 and 2), and the collection of these roles



Figure 12. Self-repair results of a 4-byte SRAM, implemented by 1536 (24×64) embryonic cells.



Figure 13. 4-byte SRAM implemented by 1536 ( $24 \times 64$ ) embryonic cells.

will ultimately deliver the expected behavior of the organism. Should an error in the overall operation of the system be detected, then, according to the type of error, the faulty cells may first try to repair their DNA segments internally. If the cells are not repairable, then, through array reconfiguration, normal, error-free operation of the system continues.

Storing only a segment of the DNA in the memory of each cell overcomes complexity and information processing bottleneck problems that previously suggested embryonic systems possess. Furthermore, the size of the array and that of the system will no longer put an adverse constraint on the size of the memory, nor will the DNA memory limit the size of the system to be implemented. At the same time, sufficient information will be held by the DNA-segment memory at all times so that cell elimination can take place without the need of gene transmission between cells while the system is under repair. The overhead in terms of the support and repair logic required to undertake DNA repair and that required to supervise faultless cell operation is at present too high. Future research, using genetic computation, is aiming at reducing this complexity in order to arrive at economically more viable solutions.

The example of a SRAM, implemented by 1536 embryonic cells, illustrates the unique power of embryonics and a possible way forward in building larger and more complex self-repairing fault-tolerant systems based on an artificial life approach. Currently cell elimination can only be triggered in our proposed embryonic-cell-based system by errors detected either in the cell's function unit or in its DNA-segment memory. Erroneous operation in any of the other modules of the embryonic cell cannot at present be reliably detected. To remedy this, work is currently being undertaken [41] by the authors using an enhanced immunoembryonic model.

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