

# Evolutionary Recovery from Radiation Induced Faults on Reconfigurable Devices

Adrian Stoica, Tughrul Arslan\*, Didier Keymeulen, Vu Duong, Ricardo Zebulum, Ian Ferguson and Taher Daud

Jet Propulsion Laboratory  
4800 Oak Grove Drive,  
Pasadena, CA 91109, USA  
adrian.stoica@jpl.nasa.gov

\*Edinburgh University  
School of Engineering and Electronics  
Edinburgh EH9 3JL, UK  
Tughrul.Arslan@ee.ed.ac.uk

*Abstract*—Radiation Hard technologies for electronics are the conventional approach for survivability in high radiation environments. This paper presents a novel approach based on Evolvable Hardware. The key idea is to reconfigure a programmable device, in-situ, to compensate, or bypass its degraded or damaged components. The paper demonstrates the approach using a JPL-developed reconfigurable device, a Field Programmable Transistor Array (FPTA), which shows recovery from radiation damage when reconfigured under the control of Evolutionary Algorithms. Experiments with total radiation dose up to 350kRad show that while the functionality of a variety of circuits, including a rectifier and a Digital to Analog Converter implemented on a FPTA-2 chip is degraded/lost at levels before 100kRad, the correct functionality can be recovered through the proposed evolutionary approach. The Evolutionary Algorithm controls the state of about 1,500 switches that determine configurations on the FPTA-2 programmable device. Evolution is able to use the resources of the reconfigurable cells, even radiation damaged components, to synthesize a new solution.

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## 1. INTRODUCTION

Long-life space missions and extreme environments have characteristics such as high radiation level (Europa Surface and Subsurface mission, 5 MRad), high temperature (Venus Surface Exploration and Sample Return mission, 460°C) and low temperature (Titan in-situ mission, -180°C). Such missions and environments have dictated the need for new electronics technologies.

Electrons and protons in space can cause permanent damage in electronic devices that can lead to operational failure. Particularly, Single Event Effects (SEE) are radiation induced errors in microelectronic circuits caused when charged particles lose energy by ionizing the medium through which they pass, leaving behind a wake of electron-hole pairs. These events can be either transient and non-destructive (Single Event Upset) or hard and potentially destructive events (Single Event Latchup).

One technique for environments with high levels of radiation is the use of Radiation Hard technologies such as Silicon on Insulator (SOI), which allows compensating for the effect of radiation. However, the fabrication cost associated with extreme environment electronics is high. In this paper we will present another technique, based on Evolvable Hardware, for electronic survivability in high radiation environments.

A reconfigurable chip developed at JPL, the FPTA-2 chip, is used in the experiment described in this paper [20]. We submitted this chip to radiation using JPL facilities, applying a total dose ranging up from 10kRads up to 75kRads at a time and a cumulative dose up to 350kRads. These parts are not radiation hardened. When the chip was back from the radiation chamber, the permanent radiation induced faults (single event latch-up) caused a deterioration in the behavior of some circuits (D/As, filters, rectifiers) previously downloaded/programmed onto the chip. We show that the correct functionality of these circuits can be recovered using Evolutionary Algorithms. The Evolutionary Algorithms control the state of about 1,500 switches. Using

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a population of about 500 candidates and after running the Evolutionary process for about 200 generations, the correct functionality is recovered. Evolution is able to use the resources of the reconfigurable cells, even the radiation damaged components, to synthesize a new solution.

The results indicate that using Evolvable Hardware technology we can design and develop electronic components and systems that are inherently insensitive to radiation induced faults by using on-board evolution in hardware to achieve fault-tolerant and highly reliable systems. The long term results of the proposed research would allow electronics to adapt to an extreme environment and long mission duration.

A number of researchers in the literature have examined the effect of radiation on CMOS devices [1,2]. These could be classified into those researchers who studied the effect of radiation on various cells and macro-blocks fabricated in silicon [3-9] or those who considered the design of radiation hardened components and cell libraries [10-14]. Works on studying the impact of radiation have considered custom implementation and conventional digital FPGA platforms such as Xilinx [15-19]. These works have been focusing on studying both total dose radiation effects, where the effect is permanent, and Single Event Upsets (SEU)s, where individual bits in memory elements flip when exposed to certain quantity of radiation.

However, most of these researchers seem to have focused on technologies which are above 0.5 micron and hence the effects could not be generalized to devices implemented in the latest Deep Sub Micron (DSM) technologies, where leakage currents dominate. In addition, no research has been carried out on the development of custom reconfigurable architectures implemented at transistor level hence enabling the implementation of both analogue and digital circuits.

This paper presents a framework for the development of radiation tolerant mixed analogue and digital circuits on a DSM reconfigurable CMOS device. Experiments are carried out in which the device is subjected to various radiation dosages, using an X-ray based radiation source, and the performance of the device is tested by mapping a number of

functional circuits. When the device fails any of the tests, an evolutionary algorithm is used to recover the functionality of the device where possible.

The rest of this paper is structured as follows: Section 2 describes the Field Programmable Transistor Array (FPTA) device architecture. Section 3 describes the procedure followed during radiation tests. Section 4 describes the overall system architecture which includes the data acquisition system. Section 5 provides an analysis of results obtained. Finally, the main conclusions of the work are listed in section 6.

## 2. FPTA ARCHITECTURE

The FPTA is an evolution-oriented reconfigurable architecture (EORA). Important characteristics needed by evolution-oriented devices are *total accessibility*, needed in order to provide evolutionary algorithms the flexibility of testing in hardware any chromosomal arrangements, some of which may be dangerous for existing commercial devices (may lead to internal bus allocation conflicts and burn the chip) and thus forbidden, *granularity at low level* (here transistor) allowing evolution to choose/construct the most suitable building block for certain system, and *transparency*, which enables users to have access to internal device information, etc.

The FPTA has a configurable granularity at the transistor level. It can map analog, digital and mixed signal circuits. The architecture is cellular, with each cell having a set of transistors, which can be interconnected by other "configuration transistors". For brevity, the "configuration transistors" are called switches. However, unlike conventional switches, these can be controlled for partial opening, with appropriate voltage control on the gates, thus allowing for transistor-resistor type topologies.

The architecture of the FPTA consists of an 8x8 array of reconfigurable cells. Each cell has a transistor array as well as a set of programmable resources, including programmable resistors and static capacitors. Figure 1 provides a broad view of the chip architecture together with a detailed view

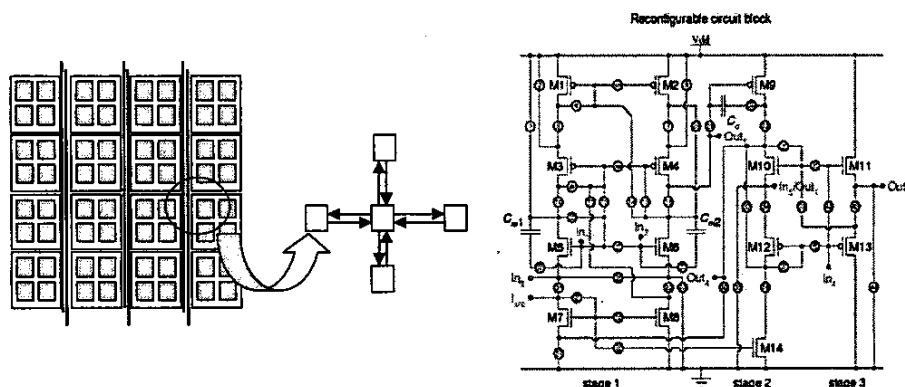


Figure 1: FPTA 2 architecture (left) and schematic of cell transistor array (right). The cell contains additional capacitors and programmable resistors (not shown).

of the reconfigurable transistor array cell. The reconfigurable circuitry consists of 14 transistors connected through 44 switches. The re-configurable circuitry is able to implement different building blocks for analog processing, such as two and three stages OpAmps, logarithmic photo detectors, or Gaussian computational circuits. It includes three capacitors, Cm1, Cm2 and Cc, of 100fF, 100fF and 5pF respectively. Control signals come on the 9-bit address bus and 16-bit data bus, and access each individual cell providing the addressing mechanism for downloading the bit-string configuration of each cell. A total of ~5000 bits is used to program the whole chip. The pattern of interconnection between cells is similar to the one used in commercial FPGAs: each cell interconnects with its north, south, east and west neighbors. This is the first mixed-signal programmable array, FPMA, in the sense that its cells can be configured as both analog and digital circuitry; with its 64 cells it can configure more Operational Amplifiers (OpAmps) than the largest commercial Field Programmable Analog Array (FPAA) chip (which contains only 20 OpAmps) [21].

### 3. EXPERIMENTAL PROCEDURE

The radiation source used was an electron beams obtained from a dynamitron accelerator. The electrons are accelerated at an energy of 1 MeV in a small vacuum chamber with a beam of 8". The fluxes in the small chamber was  $4.E9 [e/(s.cm^2)]$  which is around 300 rad/sec.

The procedure for exposure to radiation, test, and recovery was as follows; 4 different samples of the FPTA chip were exposed to radiation at a time. Two of the samples were under electronic bias (chip B1 and chip B2), whereas, the other two remained un-biased (chip U1 and chip U2). Due to space limitations in the chamber, only two chips could be radiated at a given time, so the biased and un-biased sets were alternated under the same radiation dose.

Both the biased and un-biased sets were exposed to radiation doses ranging from 0 to 350Krad at 50Krad steps. Figure 2 illustrates the incremental radiation profile to which the chips were subjected to over a period of 7 days.

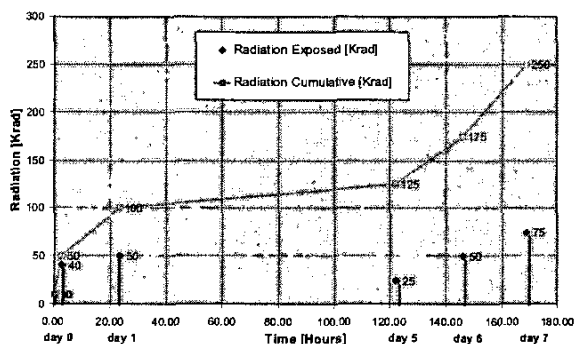


Figure 2: Cumulative radiation and experimental schedule.

After each radiation step both biased and un-biased sets were tested by downloading the configuration for the following tests/circuits respectively: Identity test, rectifier circuit, Tunable filter and 4-bit D/A converter circuit.

The identity test is specially designed to test the switching elements, i.e. transmission gates, within the FPTA. It operates by propagating a sinusoidal signal to the output through exercising the correct set of transmission gates within the FPTA. The rectifier, tunable filter, and the 4-bit D/A converter are examples of relatively large macro blocks of the FPTA which are utilized within sensor interfacing circuitry.

### 4. SYSTEM ARCHITECTURE

A complete stand-alone board-level evolvable system (SABLES) is built by integrating the FPTA and a DSP implementing the Evolutionary recovery algorithm, as shown in Figure 3. The system is connected to the PC only for the purpose of receiving specifications and communicating back the result of evolution for analysis. The system fits in a box 8" x 8" x 3". Communication between DSP and FPTA is very fast with a 32-bit bus operating at 7.5MHz. The FPTA can be attached to a Zif socket attached to a metal electronics board to perform extreme temperature and radiation experiments. The evaluation time depends on the tests performed on the circuit. Many of the tests attempted here require less than two milliseconds per individual, and runs of populations of 100 to 200 generations require only 20 seconds.

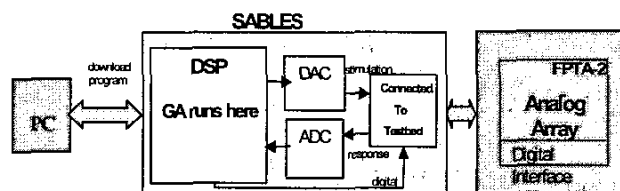


Figure 3: Complete System Architecture.

### 5. RESULTS

Tables 1-4 illustrate results of radiation tests for dosages of 100Krad, 175Krad, 250Krad, and 350Krad respectively. Each table illustrates the experimental results with the various tests described in section 3 using both biased and un-biased test chip samples. The X symbol indicates the failure of the specific test with the corresponding chip, whereas V indicates its success. The elliptical shapes highlight a successful recovery through evolution. On the other hand a triangular shape indicates that the recovery was unable to obtain an acceptable output for the particular test. For each test any noticeable change in the behavior of input/output signals are reported. For example in table 1, U2 sample initially suffers a 50% drop in amplitude after reaching an accumulative dosage of 100krad (Half-wave

rectifier). This is later recovered through evolution in 311 generations.

After a total dose of 100Krad a number of sample chips suffered from some distortion in the shape of the output waveform. This is mainly observed as a drop in amplitude of the signal. When evolutionary recovery is triggered most of these distortions are overcome and the true functionality is obtained. However, it must be noted in some cases that the fitness threshold in the evolutionary algorithm may require adjustment. This can be clearly seen when performing identity checks on the sample chip B2, where the fitness is adjusted from 4500 to 6000 (Table 1). Although the resulting sine wave has a slight clip on the rising edge, this is small enough not to distort the output waveform which is very similar to that applied on the input.

It could be noted from the table 1 that the un-biased chip U1 starts to malfunction at 100Krad with most tests failing drastically such that recovery is not possible.

**Table 1:** Experimental results at 100kRads on chip samples un-bias U1, U2 and bias B1 and B2.

	U1		U2		B1		B2	
	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution
<b>IDENTITY</b>	human		human		human		human	
test on cell0; cell15; cell17; cell5 switches: S2-S31-S24-S29-S30-S57-S71	X response flat	X response flat for all chromosomes	V		V		X short output restarted	V recovered - raise fitness threshold to 6K from 4.5k - sine wave slightly clipped on the rising edge
test on cell0; cell15; cell17; cell5 switch: S2	X response flat	X response flat for all chromosomes	V		V		V	
<b>ANALOG</b>	human		human		human		human	
<b>HALF-WAY RECTIFIER</b> 4 cells: cell0, cell1, cell2, cell3	X response flat	X response flat for all chromosomes	X amplitude drop 50%	V recovered generation=311 fitness=4500	X amplitude drops 50%	V recovered generation=300 fitness=4500	X low amplitude sine wave	V recovered generation=242 fitness=4896
<b>TUNABLE FILTER</b> 10 cells: cell0 to cell9 frequency: amplify 1kHz and attenuate 10kHz input			V INPUT: for input 1kHz=10dB 10kHz=-31.26dB 100kHz=-49.81dB OUTPUT: 1kHz=-42.36dB 10kHz=-31.27dB		V INPUT: for input 1kHz=10dB 10kHz=-31.26dB 100kHz=-49.81dB OUTPUT: 1kHz=-42.36dB 10kHz=-31.27dB			V recovered but distorted with harmonics around 10kHz INPUT: for input 1kHz=10dB 10kHz=-31.31dB 100kHz=-49.85dB OUTPUT: 1kHz=-39.41dB 10kHz=-33.67dB
<b>4bits DAC</b> 20 cells: cell0 to cell19	X 04= signal bits	X fitness=13 generation=200 not achieving bit2, bit3 and bit4	V		V		X bit 1 is working bit 4: modification of bit 1 in output value	V recovered fitness=4.0 generation=200 amplitude drops by 20%

**Table 2: Experimental results at 175 kRads.**

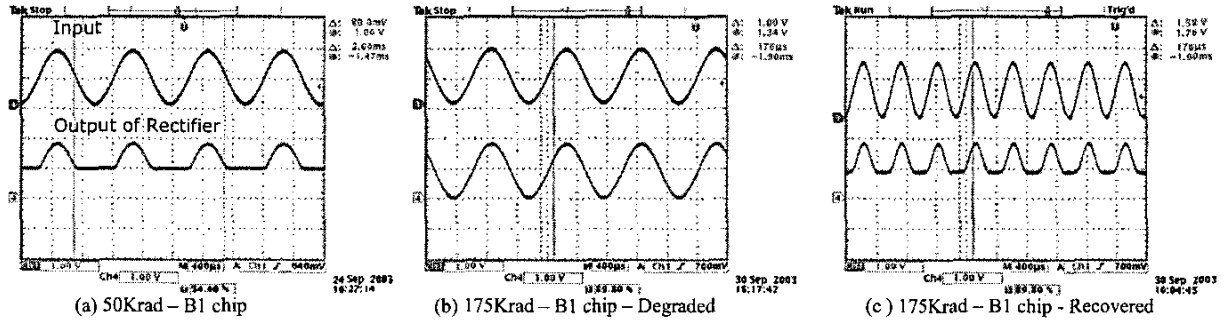
	U1		U2		B1		B2		REFERENCE CHIP
	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human
<b>ADDRESS DECODER &amp; FLIP-FLOP</b>									
<b>IDENTITY</b>	human		human		human		human		
Test on ca00, ca01, ca02, ca03 switches: 52-531-524-529-533-537-571	V		V		V		V		
<b>ANALOG</b>									
<b>HALF-WAY RECTIFIER</b>	human		human		human		human		
Acade: ca00, ca01, ca02, ca03	V		V		V		V		
The slope has been changed. No rectification.	301 generations fitness 4272				The input is observed at the output.	677 generations fitness 7906	The input waveform is observed at the output.	200 generations fitness 16217	
<b>TUNABLE FILTER</b>									
10 cells: ca00 to ca09 Frequency: amplify 10kHz and attenuate 100kHz input.	V		V		V		X		V
FREQUENCY ANALYSIS: result of sweep ok: no harmonics INPUT: for input 1kHz = -12.64 dB 10kHz = -19.76 dB OUTPUT: 1kHz = 14.51 dB 10kHz = 36.99 dB			FREQUENCY ANALYSIS: result of sweep ok: no harmonics INPUT: for input 1kHz = -12.63 dB 10kHz = -19.94 dB OUTPUT: 1kHz = 15.61 dB 10kHz = 37.77 dB		INPUT: for input 1kHz = 10kHz 1kHz = -12.62 dB 10kHz = -20.81 dB OUTPUT: 1kHz = -14.46 dB 10kHz = -25.34 dB Time response distorted slightly harmonics exist around 1K and 10K		INPUT: for input 1kHz = 10kHz 1kHz = -12.64 dB 10kHz = -20.00 dB OUTPUT: 1kHz = -21.87 dB 10kHz = -13.74 dB low amplitude at output		Reference Chip INPUT: for input 1kHz = 10kHz 1kHz = -11.33 dB 10kHz = -19.05 dB OUTPUT: 1kHz = -12.21 dB 10kHz = -30.89 dB
<b>4bits DAC</b>									
20 cells: ca00 to ca19	X	X	V		V		V		V
big bit four jump and slight bit three jump (discontinuity).		recovered a 3bits DAC			similar to U1, with more jump on B1	low voltage range - small glitch for bit stress=6.0	bit 4 same as U1 bit 1 has a slight jump.	low voltage range stress=5.5	Reference Chip stress=4.1

As the radiation dosage is increased to 175 Krad, the distortion on the output increases. For example, the rectifier for both B1 and B2 passes the input unchanged. However, in almost all cases the evolutionary recovery system is able to correct the output to the required shape. Figure 4(a) illustrates the response of the rectifier at 50krad on the sample B1 chip. After exposure to radiation of up to 175Krad the rectifier malfunctions as the output response is identical to that of the input shown on Figure 4(b). When the evolutionary mechanism is activated, the correct output response is retained as shown in Figure 4(c).

is clearly distorted due to radiation. However, the correct output response is recovered once the evolutionary mechanism takes over, even though the final circuit suffers from some non-ideal behavior when the output is low.

As the dosage reaches 350 Krad (Table 4), there is a clear failure pattern with all tests, with the evolutionary algorithm unable to recover any of the required functionality.

As the dosage is increased to 250Krad (Table 3), cases appear where the evolutionary algorithm is unable to recover the correct functionality on the output (discarding U1 due to its inconsistent behavior). However, in most cases recovery is achieved. Again considering the rectifier circuit at 250krad as illustrated in Figure 5(a), the output response



**Figure 4: Response of the Rectifier circuit at (a) 50kRads, (b) after being radiated to 175kRads resulting in deterioration through loss of rectification, followed by (c) recovery through Evolution.**

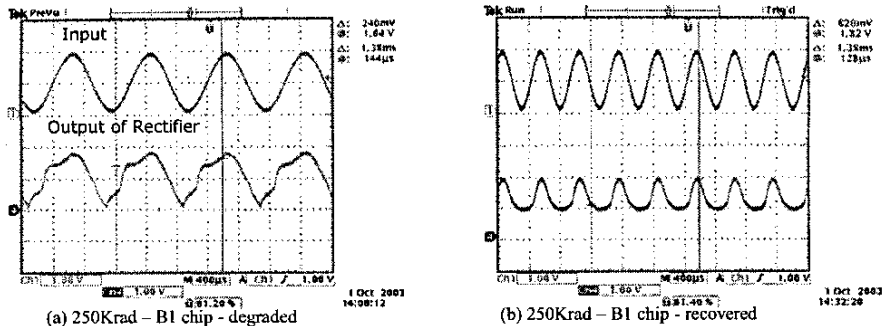


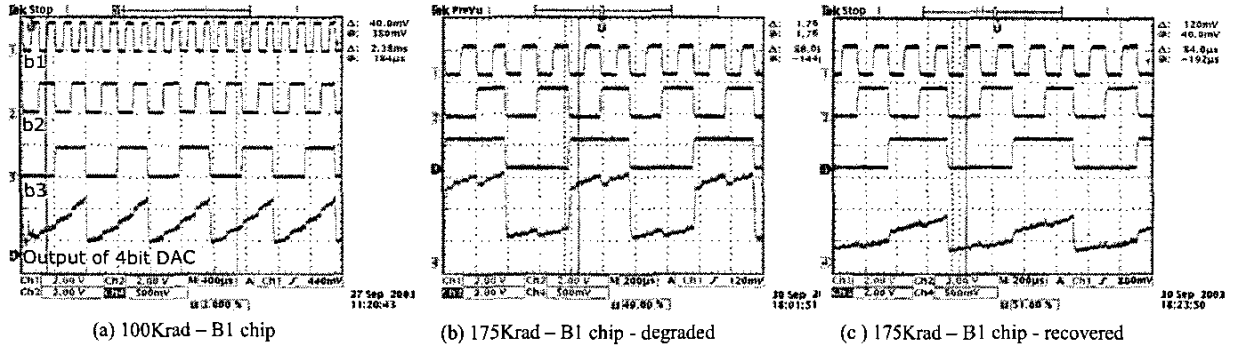
Figure 5: Response of the Rectifier circuit at (a) 250kRads resulting in distortion, followed by (b) recovery through Evolution

Table 3: Results with 250kRads

	U1	U2	B1	B2	REFERENCE CHIP
	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human
ADDRESS DECODER & FLIP-FLOP					
<b>IDENTITY</b>	human	human	human	human	human
test on cell0; cell1; cell2; cell3 switches: S2-S31-S24-S29-S30-S57-S71	X -output 0 -this is true for cells 4,7,48,89,32 also true with s2 closed while input on	X -nearly a flat input. However, there is the trace of input following the peak of s2 closed	X -slight deterioration in output. Signals are slightly dented on both sides. This is true for cells 16 (also true with s2 closed while input on in2 and output in1)	X -slight decrease in voltage level. sine wave clipped on left and right hand sides.	V -perfect waveform obtained -this is true for cells 4,5,16,17 also true with s2 closed while input on in2 and output in1
ANALOG					
<b>HALF-WAY RECTIFIER</b>	human	human	human	human	human
10 cells: cell0, cell1, cell2, cell3	X -output flat	V -Evolution is not even close to the solution.	X -output follows the input as a sine wave, with large distortion on the right hand side	V -The bottom is not perfectly flat -fitness is 7306. after 1337 generations.	V -perfect recovery. Fitness:4279 after 79 generations. In a number of runs the GA was not able to spot perfect solutions even though these were spotted on the scope. Either the fitness function is not sound or the sampling may be causing errors.
<b>TUNABLE FILTER</b>	human	human	human	human	human
10 cells: cell50 to cell59 frequency: amplify 1kHz and attenuate 10kHz input:	X -output flat INPUT: for input 1kHz=10kHz 1kHz = -12.59 dB 10kHz = -28.00 dB OUTPUT: 1kHz = -37.02 dB 10kHz = -44.37 dB	X -no response to evolution.	V -FREQUENCY ANALYSIS: result of sweep: no harmonics INPUT: for input 1kHz=10kHz 1kHz = -12.59 dB 10kHz = -19.98 dB OUTPUT: 1kHz = -15.54 dB 10kHz = -37.48 dB	X -best response similar to input with loss of sine shape and lowering of level.	V -output has v. low amplitude. INPUT: for input 1kHz=10kHz harmonics around 10K 1kHz = -12.57 dB 10kHz = -19.94 dB OUTPUT: 1kHz = -16.54 dB 10kHz = -37.76 dB -a number of runs failed producing: -best response similar to input, with loss of
<b>4bits DAC</b>	human	human	human	human	human
20 cells: cell0 to cell19	X -output follows bit4	V -Sometimes the output is the same as number 4 (with a small error wave on high levels) and sometimes output flat.	X -output follows bit 4, with some sort of DAC behaviour at low and high levels	V -monotonic wave was obtained similar to the DAC, however the amplitude is dropped by half and levels are not clear. Fitness 9.5.	X -The output looks like a dac but the shape is not monotonic, has ups and downs, and some sudden jumps. Better than u1 and b1 though.

Figure 6 demonstrates another example of recovery through evolution using the example of the 4-bit DAC circuit. Figure 6(a) illustrates a correct functioning DAC at 100Krad. When radiation dosage is increased to 175Krad, the circuit malfunctions with clear loss in discrimination between

various input values. This is associated with a loss in the monotonic nature of the response, see Figure 6(b). When evolution is activated the response is recovered, however, as could be seen from Figure 6(c) there is some deterioration in the signal level.



**Figure 6:** Response of a 4bit DAC circuit (least significant bit  $b_0$  is not shown) at (a) 100kRads, (b) after being radiated to 175kRads resulting in deterioration through loss of “monotonicity”, followed by (c) recovery through Evolution at 175kRads.

**Table 4:** Results with 350kRads.

	U1		U2		U3		B1		B2		REFERENCE CHIP
	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	Reference Circuit obtained by Evolution or by Human	Recovering Circuit by Evolution	
<b>ADDRESS DECODER &amp; FLIP-FLOP</b>											
<b>IDENTITY</b> test on cell0: cell1, cell2, cell3 switches: S2-S31-S24-S29-S30-S57-S71	human		human	Recovered using cell 0.1	OK		human		human		
S2: test on cell 0,1,4,5,16,17,20,21			OK		OK		X cell0: flat at 0, cell1: flat at 1v, cell 2: flat at 1v, cell 23: flat at 0, cell 24: flat at 0, cell 26: flat at 0, cell 28: a rectifier like signal with .6V amplitude		X cell0: flat at 0, cell1: flat at 0v, cell 23: flat at 0, cell 24: flat at 0, cell 44: 0		
<b>CONTROL CELL TEST</b>	human		human				human		human		
Cell Test C20 (output of a flip-flop of test cell) [pin 18B] output pin S41_00_test (select of the flip-flop of the test cell - same as address decoder) [pin 18C] D0 [pin 68]: input of flip-flop input pin S41_wr_test [pin153] input pin C17_test [pin 154]							X		V		
<b>HALF-WAVE RECTIFIER</b>	human		human				human		human		
Acids: cell0, cell1, cell2, cell3			X input follows the input with less than amplitude	Recovered after 148 generations with the stress score of 4104							
<b>TUNABLE FILTER</b>			OK								
10 cells: cell50 to cell59 frequency: amplify 1kHz and attenuate 10kHz input:											
4bits DAC											
20cells: cell0 to cell19											

## 6. CONCLUSIONS

The paper has presented a mechanism for adapting a mixed analogue reconfigurable platform under total dose radiation

faults. Experiments were carried out which exercised the reconfigurable device up to 350Krad radiation dosages demonstrating that the technique is able to recover

functionality of blocks such as analogue to digital converters up to 250Krad radiation dosage.

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## BIOGRAPHY

### Dr. Adrian Stoica



Jet Propulsion Laboratory, M/S 303-300, California Institute of Technology, Pasadena, California, 91109 USA.

Email: [adrian.stoica@jpl.nasa.gov](mailto:adrian.stoica@jpl.nasa.gov)

Adrian Stoica is a Principal in the Bio-Inspired Technologies and Systems group at NASA's Jet Propulsion Laboratory (JPL), Pasadena, CA. He is leading the

JPL research in Evolvable Hardware. Dr. Stoica's research is directed along two themes: adaptive hardware for autonomous space systems, and next-generation robots. Dr. Stoica received a M.S. degree in Electrical Engineering from the Technical University of Iasi, Romania, in 1986, and a Ph.D. in Electrical Engineering and Computer Science from Victoria University of Technology in Melbourne, Australia, in 1996. In 1999 he organized the First NASA/DOD Workshop on Evolvable Hardware, initiating a series of U.S. meetings dedicated to this field.

**Dr. Tughrul Arslan**



Dr Tughrul Arslan is a Reader in the School of Electronics and Engineering at the University of Edinburgh. He is a member of the Integrated Micro and Nano Systems (IMNS) Institute and Leads the System Level Integration group (SLIg) in the University. He joined The University of Edinburgh from The Cardiff School of Engineering, where he directed the Advanced IC Design Prototyping Centre, and the Intelligent Test Systems Group. He received his BEng and PhD degrees from the University of Hull in 1989 and 1993 respectively. His research interests include: Low Power Design, DSP Hardware Design, System-On-Chip (SoC) Architectures, Evolvable Hardware, Multi-objective optimisation and the use of Genetic algorithms in Hardware design issues. Dr. Arslan is an associate editor of the IEEE transactions on circuits and Systems - I and is a member of the technical committee for a number of international conferences on system on chip and evolvable hardware.

**Dr. Didier Keymeulen**



Jet Propulsion Laboratory, M/S 303-300, California Institute of Technology, Pasadena, California, 91109 USA.  
Email: [didier.keymeulen@jpl.nasa.gov](mailto:didier.keymeulen@jpl.nasa.gov)  
Didier Keymeulen received his PhD in Electrical Engineering and Computer Science from the Free University of Brussels. Before joining JPL in 1998, he worked at the National

Electrotechnical Laboratory in Japan on the applications of evolvable hardware for robotics. At JPL, he is responsible for the applications of evolvable hardware to fault-tolerant electronics and adaptive sensor technology. His interests include adaptive hardware for embedded systems.

**Vu Duong**



Vu Duong is a PhD Student in Electrical and Computer Engineering at University of California, Irvine. He received his BS in Computer Engineering from University of California, San Diego in 1998 and MS in Electrical and Computer Engineering from University of California, Irvine in 2000. His research interests are Evolvable Hardware, Neural Networks and their applications to signal/image processing and control systems.

**Dr. Ricardo S. Zebulum**



Jet Propulsion Laboratory, M/S 303-300, California Institute of Technology, Pasadena, California, 91109 USA.

Email: [ricardo.zebulum@jpl.nasa.gov](mailto:ricardo.zebulum@jpl.nasa.gov)

Ricardo S. Zebulum is a member of the Technical Staff at the Jet Propulsion Laboratory, California Institute of Technology. He received his Bachelor degree in Electronic Engineering in 1992, his Msc. in Electrical Engineering in 1995, and his PhD in Electrical Engineering in 1999, all of them at the Catholic University of Rio, Brazil. He stayed two years at Sussex University, from 1997 to 1999, as a visiting PhD student. He has been involved with research in Evolvable Hardware since 1996. His research interests also include artificial vision systems, fault-tolerant and low power electronics, MEMs, electronics for extreme environments and analog VLSI design.

**M. Ian Ferguson**

Email:

[michael.ferguson@jpl.nasa.gov](mailto:michael.ferguson@jpl.nasa.gov). Ian

received his B.S. in Engineering

Physics from the University of Arizona

in 1992 and a M.S. from University of

California at Los Angeles in 1998. He

is currently a Research Engineer in the

Bio-Inspired Technologies and Systems group at the Caltech Jet Propulsion Laboratory (JPL). His research interests include autonomous fault-tolerant design and evolutionary algorithm applications to hardware design.

**Dr. Taher Daud**



TAHER DAUD received his Ph.D.

in Solid-state Electronics in 1979

from the University of California,

Los Angeles. He joined the Jet

Propulsion Laboratory and worked

on a variety of research programs

involving solid-state physics and

VLSI, which included solar energy,

imaging sensors, neural networks, and fuzzy logic. During

the past several years he is involved with the evolvable

hardware technology at JPL. He has published/presented

over 80 papers, and has authored several patents.