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Collision-Based Computing



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Preface

This book is about how to do computation in a structureless medium populated with mobile objects. No wires, no valves, nothing is there: just compact patterns wandering in space, smashing one to another and calculating.

- What do I need to build a collision-based computer?
- A couple of balls will do! ... Do you enjoy snooker?
- You're kidding me?
- OK, solitons in optical media, breathers in polymers ...
- You know, I'm not a bench scientist ...
- Then, how about gliders in cellular spaces?
- Hmm, I'll think it over ...

A computing device may be either generally purposive, universal, or specialized. A universal processor can do almost anything; specialized — almost nothing. Personal computers are universal, microwave oven controllers are specialized. One may study two types of universality — logical, or computational, and simulational. Abstract machine as well as real physical, chemical or biological system, is called computationally universal if it implements a functionally complete, or universal, set of Boolean functions in its spatiotemporal dynamic. Most constructions studied in the book are computationally universal, because they realize universal systems of logical gates in hierarchical collisions of mobile objects. If a system simulates behavior of a universal machine, which universality has been already proved, it is called simulationally universal. Somewhere in this book you can find collision-based implementations of simulational universality, related usually to embedding of a Turing machine, a register machine, or a counter machine in a medium with colliding particles, balls or gliders.

A universal processing device can be either structured, heterogeneous, compartmentalized and stationary or structureless, homogeneous, architectureless and dynamic. Structured devices have wires to transmit information, valves to process it; structureless devices have nothing of it. Quanta of information are represented by mobile objects (either by their presence/absence or particular types, colors) that travel in the space. Trajectories of the objects can be seen as wires. The objects change their trajectories or states when smashed to other objects. Thus, information is transformed and computation is implemented.

There are several sources of collision-based computing. Studies dealing with collisions of signals, traveling along discrete chains, one-dimensional cellular automata, lie in the very beginning of the field. The ideas of colliding signals, existing from the nineteenth century in physics and physiology, have been put in automata framework just recently, around 1965, when papers by A. J. Atrubin [3], P. Fisher [13], and A. Waksman [28] were published. Namely, Atrubin studied multiplication in one-dimensional cellular automata; Waksman gave an eight-state solution for a firing squad synchronization problem; and, Fisher showed how to generate prime numbers in cellular automata. The Atrubin-Fisher-Waksman approach triggered development of various imaginable constructs aimed to boost computation-potential of homogeneous automata networks.

In 1971 E.R. Banks [5] showed how to build wires and simple gates in configurations of a two-dimensional binary-state cellular automaton. This was the architecture-based construct. Thus, a wire was represented by a particular stationary configuration of cell states; this was rather a simulation of a "conventional" electrical, or logical, circuit. Banks's design was relieved of its heterogeneity ten years later, when Game of Life made our world "wireless".

In 1982 Elwyn Berlekamp, John Conway and Richard Gay proved that Game of Life "can imitate computers" [6]. They mimicked electric wires by lines "along which gliders travel" and demonstrated how to do a logical gate by crashing gliders one to another. Chapter 25 of their "Winning Ways" [6] brought to us admirable computing designs that do not simply look fresh twenty years later but are still re-discovered again and again by Game of Life enthusiasts all over the Net. Berlekamp, Conway and Gay employed a vanishing reaction of gliders — two crashing gliders annihilate themselves — to build a NOT gate. They adopted Gosper's eater to collect garbage and to destroy glider streams. They used combinations of glider guns and eaters to implement AND and OR gates, and the shifting of a stationary pattern (block) by a mobile pattern (glider) when designing auxiliary storage of information.

"There is even the possibility that space-time itself is granular, composed of discrete units, and that the universe, as Edward Fredkin of M.I.T. and others have suggested, is a cellular automaton run by an enormous computer. If so, what we call motion may be only simulated motion. A moving particle in the ultimate microlevel may be essentially the same as one of our gliders, appearing to move on the macrolevel, whereas actually there is only an alteration of states of basic space-time cells in obedience to transition rules that have yet to be discovered." — finishes Berlekamp-Conway-Gay's book [6]. Their last words were about Fredkin.

Meantime, in 1978 Edward Fredkin and Tommaso Toffoli submitted a one-year project proposal to DARPA, which got funding, and thus started unfolding a chain of remarkable events. Originally, Fredkin and Toffoli aimed to "drastically reduce the fraction of" energy "that is dissipated at each computing step" (see Chapter 2). To design a non-dissipative computer they constructed a new type of a digital logic — conservative logic — that conserves both "the physical quantities in which the digital signals are encoded" and "the information present at any moment in a digital system" (see Chapter 2). They further developed these ideas in the seminal paper "Conservative Logic", published in 1982 ("a second edition" of the paper is included in book as Chapter 3). Thus, a concept of ballistic computers emerged. The Fredkin-Toffoli model of conservative computation — the billiard ball model — explores "elastic collisions involving balls and fixed reflectors". Generally, they proved that given a container with balls we can do any kind of computation.

The billiard ball model got yet further push when Norman Margolus invented a cellular-automaton implementation of the model. He published this result in 1984. "Margolus neighbourhood" and "billiard ball model cellular automata" are exploited widely nowadays. We have reprinted his "Physics-Like Models of Computation" as a chapter in our present book.

The story we told you is just one of many possible explanations of how the field of collision-based computing arose.¹

It is a painful experience to give the book a structure. All problems are equally interesting. All results are equally significant. All authors are equally prominent. Anyway, a linear order must be obeyed. Roughly third of the chapters deal with derivatives of the billiard ball model, other chapters study physical aspects of collision-based computing and the rest discuss particulars of traveling patterns in cellular automata.²

A cellular automaton is an all discrete universe, with discrete time, discrete space and discrete states. "Atoms", or cells, of the universe are arranged in regular structures, called lattices or arrays. Each cell takes discrete states and updates its states in a discrete time, depending on the states of its neighbors. All cells update their states in parallel.

Stanisław Ulam was the first who, in the late 1930s, suggested updating matrix elements in parallel and locally, depending on the states of each element's local neighborhood [26]. The idea was taken by John von Neuman and developed to a theory of self-reproducible machines [18,10]. Zuse's "structured cellular space" [33] is yet another good historical introduction to the field, particularly because it is written by a father of modern computing. Further readings may include Toffoli's and Margolus's "cellular machines" [25], which really turned thousands of amateurs to the field of automata structures, cellular automata simulations and a concept of discrete universe. Wolfram's collection of papers [31] could be a good starting point as well. The cellular-automaton approach to the physical world, outlined in [25], is developed further by Weimar [29]. A series of rigorous results

¹ To get to the Margolus neighborhood you've got to pass the Fredkin gate, walk across the Bunimovich stadium and get out of the Toffoli gate.

² While localization in nonlinear media are familiar to almost anyone, educated to a basic science level, a concept of cellular automata, which are tackled in almost every chapter of the book, still puzzles an average student or an academician. In a majority of "theoretical" works cellular automata play a role of a discrete substrate where all scenarios of collision-based computing unfold.

We start the volume with an arousable piece of text – "Symbol Super Colliders" — authored by Tommaso Toffoli. This is about physics and computation, importance of collision in physical and *other* worlds, and "spacetime tapestry" of an artificial computation. Chapter 1 will turn readers' minds in the right direction.

The following three chapters, Chapters 2, 3 and 4, are classical. They also show what happened over twenty years ago. They are "Design Principles for Achieving High-Performance Submicron Digital Technologies" (written in 1978 and never published before, Chapter 2) and "Conservative Logic" (originally published in *International Journal of Theoretical Physics* in 1982, reprinted here as Chapter 3) by Edward Fredkin and Tommaso Toffoli; and, "Physics of Computation" (originally published in *Physica D* in 1984, reprinted here as Chapter 4).³

Chapter 4 proposes a billiard ball model cellular automaton; this construct is employed in several chapters of the book. An impression of the transition from the past to the present is particularly strong when you are getting to Chapter 5 — "Universal Cellular Automata Based on the Collisions of Soft Spheres" — by Norman Margolus. Essentially, computation with soft spheres is more akin to computation in a lattice gas system. Norman Margolus derives perfect momentum conserving models of ballistic computation by removing mirrors out of the computation space. In this context, he considers reflections without mirrors, crossover and routing of signals, dual-rail logic, and updates his original billiard ball model cellular automaton to incorporate soft spheres. The chapter closes with an intriguing excursion in relativistic cellular automata and semi-classical models of collision dynamics. The next two chapters continue the study of ballistic computing models along the lines drawn by Norman Margolus.

Thus, in Chapter 6 — "Computing Inside the Billiard Ball Model" — Jérome Durand-Lose applies his expertise in reversible computing, automata models of transition phenomena and grain sorting in sand piles to derive intriguing results related to reversible cellular automata models of collision-

on cellular-automata simulation of nonlinear media can be found in Chopard and Droz's book [12].

Other recommended reading may include Aladyev's [4] and Voorhees's [27] "algebraic" treats of cellular automata, and Wuensche's and Lesser's [32] guide to global dynamics of one-dimensional cellular automata. Theoretical aspects of cellular-automaton theory of parallel computing are well presented in Garzon's book [14] and a collective monograph [16] edited by Mazoyer and Delorme. While talking about computing it is also worth looking at Chaudhuri's text [11] on cellular-automata based solutions of various codes and combinatorial logics, and Sipper's [22] and Adamatzky's [2] studies.

³ These three texts are not simply reprinted, they are typeset from scratch, some figures are redrawn, and the chapters are carefully checked and corrected by the authors. So, Chapters 2, 3 and 4 look rather like second editions of the original papers.

based computing. Firstly, Jérome Durand-Lose constructs block cellular automata, aka partitioning cellular automata, as a generalization of billiard ball model cellular automata. Then he shows, via implementation of reversible logic gates, that a two-counter machine is simulated in block cellular automata. Several problems of intrinsic universality and uncomputability in billiard ball model cellular automata are tackled in the chapter as well.

Kenichi Morita and his colleagues have a solid track record in studies of cellular automata, reversible computing, grammar and grammar arrays, and logical systems for knowledge representations. Their first result is dated back to 1986 when Morita constructed a memory unit from Fredkin gate [17]. Other findings include computational universality of one- and twodimensional cellular automata, self-reproduction and solution of firing squad synchronization problem in reversible cellular automata. The title "Universal Computing in Reversible and Number-Conserving Two-Dimensional Cellular Spaces" of Chapter 7, by Kenichi Morita, Yasuyuki Tojima, Katsunobu Imai and Tsuvoshi Ogiro, speaks for itself. There, Fredkin gate, a basic element of conservative logic, is embedded in a bit-conserving reversible partitioning cellular automaton. This embedding is demonstrated via generalization of Margolus's billiard ball model cellular automaton to more complicated grids and advanced state transition functions. Then (reversible) counter machines are compactly (with a use of rotating mirrors) implemented in a space-time dynamic of the reversible automata.

Novel ways of logical formalization of collision-based computing models are suggested in Chapter 8 — "Derivation Schemes in Twin Open Set Logic" — by Michael D. Westmoreland and Joan Krone. The authors offer several alternative derivation schemes and logical systems that may well describe ballistic models of computation in a more realistic way than it was done before. For example, with use of Westmoreland-Krone logical primitives a sensitivity to initial conditions and particulars of final results' measurement can be sensibly assessed.

The authors put the first touches on the picture of their theory in 1993 when Michael Westmoreland and Benjamin Schumacher wrote a paper on non-classical logics for classical systems [30]. In this chapter Michael Westmoreland and Joan Krone fuse their experience in proof rules, classical phase space logics, verification of functionality, quantum channels, inductive structures and three-valued logics to present a non-standard, alternative, logical description of collision-based computing models.

At this stage we've put aside reversibility of computation, the billiard ball model — we can do without it when entering the world of gliders, particles, automata signals, solitons and other mobile localizations in nonlinear media.

Chapter 9 — "Signals in Cellular Automata" — by Marianne Delorme and Jacques Mazoyer exposes a huge slice of modern theory of "geometrical computation" in one- and two-dimensional cellular automata. Actually, it was Jacques Mazoyer who strikingly improved the solution of the firing squad synchronization problem in 1987 [15]. Also, in 1998 Jacques Mazoyer and Marianne Delorme edited a collection of inquiries in computing potential of cellular automata [16]. That book is, possibly, the first ever consistent collection of contributions devoted entirely to the computation *not* simulation aspects of cellular automata.

In this book, Marianne Delorme and Jacques Mazoyer study various types of cellular automata, which support propagation of information quanta, or signals. Particularly, they show how a cellular automaton can transform one type of a signal to another. They demonstrate how to design a onedimensional cellular automaton that supports infinite families of signals of different speeds. Feasibility of Delorme-Mazoyer constructions is demonstrated in problems of multiplication in one-dimensional cellular automata.

In 1974 Kenneth Steiglitz wrote a textbook on discrete systems [23]; then he authored other academic bestsellers — an introduction to discrete optimization [19] (printed in 1982 and reprinted in 1998) and a handbook on digital signal processing [24], published in 1996. This explains why Ken Steiglitz was one of those who discovered parity filter cellular automata [20]. The automata of this type are not simply analogs of infinite impulse response digital filters but they also exhibit soliton-like dynamics of localizations. This discovery led to the formation of a concept of particle machines — machines that perform computation by colliding particles in one-dimensional cellular automata. So far, in Chapter 10 — "Computing with Solitons: A Review and Prospectus" — Mariusz Jakubowski, Ken Steiglitz and Richard Squier invite us to take a brief tour into a theory of particle machines and its application to computing with one-dimensional solitons. Various designs of soliton gates are discussed in a context of massively-parallel processors.

Theory of particle machines and discrete, automata, analogs of solitons are studied in a context of iterated automaton maps, or iterons, by Paweł Siwak, Chapter 11 — "Iterons of automata". Paweł considers two classes of iterons. The first class includes mobile localizations, signals or particles, which emerge in classical cellular automata, cells of which update their states in parallel. The second class of iterons consists of traveling patterns arising in serially updated automata networks. The serial updating of an automaton chain is similar to a sort of filtering known as infinite impulse response or recursive filtering. The chapter gives us striking examples of phenomenology of particles in parallel and serial automaton chains. We are not told what types of logical functions can be implemented in collisions of the studied particles. However, for searching minds this is not a problem. Just from the pictures of particles collisions one can derive a great variety of possible collisions-based computational operations. Amongst other remarkable features, Siwak's chapter considers automata localisations in "classical" terms of mathematical machines, thoroughly classifies most types of discrete signals, builds a parallel between automata gliders, solitons and digital filters, and suggests ways to design automata rules that support solitons.

Steve Blair and Kelvin Wagner, authors of Chapter 12 — "Gated Logic with Optical Solitons", are renowned experts in theory and *practice* of optical computing. They are the people who brought soliton-based computing to the realms of the physical world. They are the guys who not simply think but act for the future. Their views on soliton logic, expressed in Chapter 12, result from decades of research in acousto-optic matrix multipliers, many-dimensional optical soliton dragging logic, adaptive optical networks, pulse propagation in non-resonant materials, interaction of solitons and nonlinearities, acousto-optic devices, cascadable spatial soliton circuits and tunable optic filters.

First, Steve Blair and Kelvin Wagner give an accessible introduction to digital logic and discuss a set of requirements to a logical gate. Second, they show why solitons are good for collision-based computing; temporal, spatial and spatio-temporal soliton logic gates are designed there. Third, a typical logical circuit requires composition of many gates, and they are studied in the rest of the chapter. To demonstrate that soliton logical gates may form self-consistent cascades with signal fanout, Steve Blair and Kelvin Wagner study gate transfer function, details of spatial soliton dragging and collision interactions. They prove feasibility of their approach by designing cascaded inverters and NOR gates.

In Chapter 13 — "Finding Gliders in Cellular Automata" — Andrew Wuensche describes how to classify cellular-automaton rules for a spectrum of ordered, complex — supporting gliders, and chaotic dynamics. Also methods of "automatic" filtering of gliders and parametrization of automata global dynamics are discussed there.

The chapter arose from Andrew Wuensche's inquires into space-time dynamics of discrete matter at the edge of phenomenology and complexity. In 1992 Andy presented us with his marvelous atlas of global dynamics of one-dimensional cellular automata [32]. His volume gives an accessible introduction to discrete dynamics, guides to parametrization of global dynamics of automata networks, and displays breathtaking pictures of cellular-automata global transition graphs. Wuensche's chapter in this book is as lavishly illustrated as any of his publications.

There are traveling localizations everywhere — solitons in optical media, breathers in polymers, excitons in mono-molecular arrays, worms in liquid crystals, groups of oscillons in vibrating granular materials and quasiparticles in reaction-diffusion systems. The phenomena are discussed in Andrew Adamatzky's Chapter 14 — "New Media for Collision-Based Computing". An illuminating comparison of logical-gate architectures realized in "real" systems and their automata models gives us a vision of what types of collision-based computer prototypes can be built in laboratories.

The findings, discussed in Chapter 14, result from research directions outlined in Adamatzky's previous books on reconstruction of cell state transition rules from global configurations of cellular automata [1] and on spatial computation in active nonlinear media [2].

Particle dynamics on two-dimensional lattices with fixed, rotating or flipping mirrors is amazingly interpreted in terms of Turing machines by Leonid Bunimovich and Milena Khlabystova in Chapter 15. In their lattice gas model of a Turing machine, a particle, hoping from one vertex to another, represents a reading or writing head of the machine. The lattice is populated with mirrors, which are analogs of symbols, written on the tape. When traveling on the lattice, particles rotate or flip mirrors thus updating contents of the Turing tape.

A knowledgeable reader would benefit from a look at the previous publications by Leonid Bunimovich, related to dynamics theory. We could refer to a wonderful collection of papers on dynamical systems, compiled and edited by Leonid in 1989. More recent results on dynamical systems are summarized in two more books — notes of Sinai's seminars on dynamical systems [8] and ergodic theory of dynamical systems [9]. The Bunimovich-Khlabystova results on dynamic of Lorentz gases may also help us to refresh and reconsider ideas related to classical models of collision-based universality, billiard ball model or number-conserving reversible cellular automata.

A book should close on a nice, accessible and, possibly, not too boring note. The last three chapters of the book do this well.

Chapter 16 combines arithmetic operations, implemented in a particle machine, with a self-replicating loop. All authors of the chapter — Enrico Petraglio, Gianluca Tempesti and Jean-Marc Henry — are from the famous Logics Systems Lab (EPFL, Switzerland), an incubator of embryonic electronics, bio-inspired machines and evolving reconfigurable hardware. The ultimate goal of the approach is to find efficient ways of "natural" growing of large-scale integrated circuits. In the chapter, a cellular automaton is developed that is capable of self-replication, based on a modified version of the Langton loop. Techniques of Jakubowski-Steiglitz-Squier particle-machine computation are adopted and modified to program the self-replicating automaton to implement such arithmetical tasks as binary addition and multiplication.

Game of Life cellular automaton is the first formal model which is proved to be collision-computationally universal [6]. It is the most famous and the most talked about cellular automaton. Surprisingly, the Game of Life did not get proper treatment in academic journals — significant results and miraculous constructions are still attributed rather to cyberspace. To fill the gap, and to attract more Game of Life fans to the field of collision-based computing, we include two chapters dealing with the Game of Life.

Chapter 17 — "Implementation of Logical Functions in the Game of Life" — by Jean-Philippe Rennard gives a brief introduction to the subject and then shows particulars of logical gate implementation via collision of glider streams. The chapter partly overlaps with a popular excursion to the field of Artificial Life, prepared by Jean-Philippe Rennard [21]. Sophisticated and detailed constructions of Game of Life implementation of a universal Turing machine are presented by Paul Rendell in his Chapter 18 — "Turing Universality of the Game of Life". The constructions include an adder, a sliding block memory, a memory cell and many more fascinating parts. Even a finite state device and a Turing tape are designed from stationary cellular patterns, glider and spaceship guns, and other curiosities.

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