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**Technical Report  
1 July 1990**

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AFOSR-87-0386**

**Title of Contract:  
Computational Complexity and Efficiency  
in Electro-Optical Computing Systems**

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## AFOSR Contract:

# Computational Complexity and Efficiency in Electro-Optical Computing Systems

John Reif, Duke University

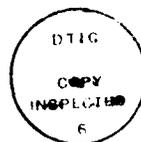
### 0 Abstract of RESEARCH APPROACH and Objectives:

(1) To develop robust theoretical model for a wide class of electro-optical computing systems

(2) To extend the known capabilities, by design of new, more efficient algorithms for electro-optical computing using less time, volume and energy. In particular, to develop efficient algorithms that use optimal combinations of time, volume and energy on electro-optical computing systems

(3) To determine the fundamental theoretical limitations and capabilities of electro-optical computing systems.

In particular, to determine lower bounds on tradeoffs between volume, time, and other resources (such as energy) of any electro-optical computing system to solve fundamental problems.



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## **1 Summary of Previous Technical Progress:**

Work by Reif optical computing has been in four areas:

### **(A) Optical Methods for Message Routing**

#### **(A.1) Reif's Holographic Message Routing System**

This is a very interesting outgrowth of Reif's work in optical computing. See Section A for details.

Message routing in a parallel machine concerns providing arbitrary interconnections between its processors. The Connection Machine, for example, is a 65,536 processor bit serial *SIMD* parallel machine, requiring 65,536 messages to be routed to distinct addresses. There is a bottleneck in this information transfer mechanism: the routing time in these parallel machines is approximately a thousand times longer than the instruction time. Optical hardware provides the potential for high bandwidth, low crosstalk and power dissipation for connecting processors at the board-to-board level. It has also been shown that impedance matching requirements favor optics over electronics for fast data transfer.

Previous work on dynamic optical interconnects has employed spatial light modulators (SLMs) in optical crossbars, or volume holograms to reconfigure connections in real-time. These two approaches have disadvantages: the former requires setting  $N^2$  switches to achieve the interconnections, while the latter is limited by the slow response time of photorefractive recording materials.

Dynamic holographic architectures for connecting processors in parallel computers have been limited by the response time of the holographic recording media.

In [Reif,90] and [Maniloff, Johnson, and Reif,89] we present we present a novel optical interconnect architecture, involving spatial light modulators (SLMs) and volume holograms. which uses spatial light modulators to dynamically control the holographic routing of messages between originator and destination processors. This system is not limited by the response time of the volume holographic recording media, which stores the destination address: the routing is achieved as fast as the optical beam can be modulated by the SLM.

Multiple-exposure holograms are stored in a volume recording media, which associate the address of a destination processor on a spatial light

modulator with a distinct reference beam. A destination address programmed on the spatial light modulator is then holographically steered to the correct destination processor.

A small prototype of the Holographic Message Routing System was constructed by Maniloff and Johnson at Boulder CO in a collaborative project with Reif. We in [Maniloff, Johnson, and Reif,89] present the design and experimental results of a holographic router for connecting four originator processors to four destination processors. Our first prototype holographic router used ferroelectric liquid crystal (FLC) SLMs to connect four originator processors to four destination processors at 10 kHz.

In [Reif,90] We also present preliminary results on reducing the number of switches in the SLM required to route  $N$  originator processors to  $N$  destination processors in a single time step.

## **(A.2) Optical Expanders**

An Optical Expander is a device that expands the dimension of a pattern space. This is a new idea due to Reif that was motivated by needs of the holographic message routing system but appears to be a very basic problem. An optical expander allows the Holographic Message Routing System to be scaled up to very large sizes using a small (logarithmic number) of address bits. Reif has worked with his student Akitoshi Yoshida and with Barakat on new methods for optical expanders For more detail, see section A.3

## **(B). Efficient Optical Algorithms**

### **(B.1) the VLSIO model**

Our goal is to determine the fundamental theoretical limitations and capabilities of optical computing systems. Our first step is to develop a robust theoretical model for a wide class of electro-optical computing systems. [Barakat and Reif,1987] developed a new model for Electro-Optical devices, known as VLSIO. The VLSIO model includes both electrical and also optical components; that is it allows combinations of 2D VLSI chips as well as optical devices such as lenses and holograms. The VLSIO model allows us to compare the time, volume and energy of a wide variety of distinct electro-optical systems.

No other model had been previously invented. The VLSIO model allows one to give a precise comparisons between proposed optical algorithms, using well defined metrics such as time, volume and energy.

This is a new model of computation and we expect that the growth in the optical technology during this decade would spur growth in algorithm research.

See section B.1 for more details.

### **(B.2) Efficient Electro-Optical Algorithms in the VLSIO model**

Our goal here is to extend the known capabilities of electro-optical devices, by design of new, more efficient algorithms for electro-optical computing systems in the VLSIO model. This requires that we develop algorithms that make optimal tradeoffs between key resources of time, volume and energy. We used both known techniques from VLSI algorithms as well as the special 3D properties of optical devices in the VLSIO model.

[Barakat and Reif, 87] developed efficient new VLSIO algorithms using small volume and constant time for matrix multiplication and other matrix problems. Recently [Reif and Tyagi,90] they developed efficient optical algorithms for a much larger class of fundamental problems(including most problems found in standard algorithm texts), which occur frequently in practice.

Actual we consider the two models of computation—VLSIO and DFT-Circuit. We describe both algorithms for a set of direct applications of DFT, as well as algorithms that seem unrelated to the DFT; in particular two sorting algorithms, an algorithm for the element distinctness, and also both one dimensional and two-dimensional string matching algorithms. We compare the performance of DFT-VLSIO algorithms with the known VLSIO lower bounds. In many cases, these are near optimal and much more efficient than other optical algorithms previously proposed and in some cases our algorithms are optimal. See Tables 1 and 2 and Section B.2.

### **(C) Lower bounds for Optical Computation**

Our goal here is to determine lower bounds on volume, time, and other resources (such as energy) of any electro-optical computing system in the VLSIO model to solve fundamental problems. We strive to get

tradeoffs between resources. To do this, we extend techniques developed for obtaining lower bounds for VLSI.

### **(C.1) Lower Bounds for the Volume of Electro-Optical Devices in the VLSIO model**

**INITIAL THEORITICAL RESULTS:** Previously, [Barakat and Reif,87] showed the first known lower bounds for any optical device to compute various functions of  $n$  inputs within time  $T$  and volume  $V$  in the VLSIO model. This was the first time anyone had given general lower bounds on the volume and time tradeoff of Electro-Optical devices. The lower bounds hold for a large class of problems (known as transitive problems) including sorting, routing, and most other standard combinatorial or algorithmic problems.

### **(C.2) Lower Bounds for the energy consumption of Electro-Optical devices in the VLSIO model.**

[Tyagi and Reif, 1989] recently for the first time proved lower bounds on energy consumption, volume and time for a large class of problems using any possible Electro-Optical devices. This is the first time anyone has given general lower bounds on the energy consumption of Electro-Optical devices. In particular, they showed for time  $T$  and energy  $E$ , the Product  $ET$  is greater than a certain function of the input size and demonstrated matching upper bounds on the  $ET$  product for shifting. Again, these lower bounds hold for a large class of problems (known as transitive problems), including sorting, routing, and most other standard combinatorial or algorithmic problems. See Appendix C

### **(D) The Ray Tracing Problem**

In a recent paper, [Reif, Tygar, Yoshida,90] we have investigated a problem that is fundamental for optical system design. In particular, we consider optical systems consisting of a set of refractive or reflective surfaces. The ray tracing problem is, given an optical system and the position and direction of an initial light ray, to decide if a light ray reaches some given final position. We assume the position and the tangent of the incident angle of the initial light ray is rational. For many years, ray tracing has been used for designing and analyzing optical systems. Ray tracing is now also extensively used in computer graphics to render scenes with complex curved objects.

The computability and complexity of various ray tracing problems are investigated. Our results are:

- Ray tracing in three dimensional optical systems which consist of a fixed finite set of curved reflective or refractive surfaces is undecidable, even if all the surfaces are represented by systems of rational quadratic inequalities. However, the problem is recursively enumerable.
- Ray tracing in three dimensional optical systems which consist of a fixed finite set of flat reflective or refractive surfaces is undecidable, if the coordinates of the endpoints of some of surfaces are irrational. However, the ray tracing system is PSPACE-hard, if we restrict ourselves to surfaces with rational coordinates.
- For any  $d \geq 2$ , the ray tracing of  $d$  dimensional optical systems which consist of a fixed finite set of flat reflective surfaces is in PSPACE, if the positions of all the surfaces are rational, and are placed perpendicular to each other.

For details, see section D.

## **2 Summary of new Research to be Done Summer, 1990**

### **2.1 Optical Memory and Storage**

One of the biggest challenges in the electro-optical field to to develop methods for fast memory storage and retrieval, for large amount of data.

#### **2.1.1 Holographic Memory Storage**

The use of holography for memory storage is an old idea, but is becoming increasingly practical and exciting due to the use of LiNi crystals which can store from hundreds up to a thousand images, where each image can resolve a page of up to a few megabytes of storage. A key problem in the practical development of holographic memory storage is the use of orthogonal images to address the holographic memory, which is solved by the use of the optical expanders described in A.1 See appendix A.2 for a further discussion of holographic matching and holographic memory storage.

#### **2.1.2 Optical Memory Storage and Computation Using Fiber Optic Delay Loops**

The use of delay loops for memory is an old idea, dating back to the use of mercury storage tubes in the early digital computers of the 50's. Nevertheless it is an becoming an important now for optical computation, since it is one of very few known methods for doing storage completely in the optical domain. The key problem is that data can only be accessed with the delay for the propagation around the loop.

In very new research , Reif and Tyagi have developed efficient algorithms for bit serial optical computers using fiber optic delay lines for auxiliary storage. In particular, they have some very interesting new techniques for using a very small set of optical delay loops to manage the intermediate storage for a wide range of algorithms and computations on interconnect networks. The key new idea is a method for utilizing data just at the right time so that there is no delay for the propagation around the appropriate loop. This extends the work of [Jordan, 1989] at Boulder, who has implemented a delay loop memory system and discussed its use in simulating networks.

[Reif and Tyagi,to appear 90]

### **2.2 Multi-frequency Optics**

The use of multiple frequencies to aid in computation and in optical storage is very intriguing; Reif is just beginning to explore this idea.

### **2.2.1 Multi-frequency Storage**

Using a single fiber optic delay loop of approx a kilometer on a single frequency, up to tens of kilobytes can be stored. It is possible that with the use of multiple frequency up to possibly a megabyte could be stored. Reif will investigate these possibilities.

### **2.2.2 \*Multi-frequency Computation**

Reif will also investigate the use of multi-frequency in general computation; this may decrease the volume required by electro-optical devices. Also, Reif will also investigate the use of multi-frequency to allow numerical computations to be done in optics with much higher accuracy. There may be limitations to the use of multi-frequency; Reif will investigate lower bounds as well.

### **2.3 Further Work in Summer 1990:**

We are also investigating further work on discovery of new (volume and time efficient) VLSIO algorithms for various fundamental combinatorial and graph problems:

- (1) searching problems
- (2) graph connectivity
- (3) minimal path problems
- (4) linear programming

### 3 Recent Publications:

A Holographic Network for Parallel Processing Machines (with E.S. Maniloff and K. Johnson). EPS/EUROPTICA/SPIE International Congress on Optical Science and Engineering, Paris, France, April 1989.

#### Journal Publications

R. Barakat and J Reif, "Lower bounds on the computational efficiency of optical computing systems", Journal of Applied Optics, Vol 26, p 1015-1018, March 15, 1987.

R. Barakat and J. Reif, "A Discrete Convolution Algorithm for Matrix Multiplication with Application in Optical Computers", Journal of Applied Optics, Vol 26, p 2707-2711, 1987.

#### Conference Publications

(3) E.S. Maniloff, K.M. Johnson, and J. Reif "Holographic Routing Network for Parallel Processing Machines"  
EPS/Europtica/SPIE International Congress on Optical Science and Engineering, Paris, France, April 1989.

(4) J. Reif, A. Yoshida, and D. Tygar. The Computability and Complexity of Optical Beam Tracing, To be presented at The Foundations of Computer Science conference, October, 1990.

(5) A. Tyagi and J. Reif, Energy Complexity of Optical Computations, to appear in Indian Conference on Computer Science  
Further Papers

(6) K. Johnson and J. Reif, "Very High Speed Holographic Message Routing For Parallel Machines", (funded DARPA proposal) fall 1987.

(7) J. Reif, S. Sen and D. Tygar, "The Computational Complexity of Optical Beam Tracing", Nov 1989.

(8) R. Barakat and J. Reif, "Optical Expanders", Aug 1989. Papers to appear

(9) A. Tyagi and J. Reif, "Efficient Parallel Algorithms for Optical Computing with the DFT Primitive", to Dec 1989.

(10) J. Reif and A. Yoshida. Optical Expanders with Holographic Memory and Routing Applications, May, 1990.

## 4 Personnel

### 4.1 The Background of the PI:

Reif is a theoretical computer scientist and applied mathematician by training, but is known for working in diverse areas, including robotics and parallel computing, and has written over 80 papers in these areas. His research style is to work on newly developing area, and to contribute basic new models, new lower bound techniques and particularly new and novel algorithmic techniques which can be used in the particular domain.

To solve problems in a new emerging area, Reif brings to bear to a large number of diverse techniques he has learnt in exploring other related areas (some time obviously related, sometime apparently unrelated). In some cases, Reif's work leads to results that may be practical and that have been implemented. Examples are

(1) the parallel nested dissection algorithm of [Pan and Reif] implemented in [Leiserson et. al, 86] and [Opsahl and Reif, 86]

(2). the massively parallel BLITZEN machine described in [Davis and Reif, 88] and [Blevins et. al, 90], and

(3) the parallel compression described in [Storer and Reif, 88]

(4) as well as the holographic routing system described herein.

## Bibliography

Solving sparse systems of linear equations on the Connection Machine (with C.E. Leiserson, J.P. Mesirov, L. Nekludova, S.M. Omohundro and W. Taylor). *Annual SIAM Conference*, A51, Boston, MA, July 1986.

Solving sparse systems of linear equations on the Massive Parallel Machine (with T. Opsahl). *First Symposium on Frontiers of Scientific Computing*, NASA, Goddard Space Flight Center, Greenbelt, MD, 2241-248, Sept. 1986.

Real-time compression of video on a grid-connected parallel computer (with J.A. Storer). *3rd International Conference on Supercomputing*, Boston, MA, May 1988.

Architecture and Operation of the BLITZEN Processing Element (with E.W. Davis). *3rd International Conference on Computing on Supercomputing*, Boston, MA, May 1988.

BLITZEN: a highly integrated, massively parallel machine (with D.W. Blevins, E.W. Davis and R.A. Hector). *2nd Symposium on Frontiers*

*of Massively Parallel Computation*, Fairfax, VA, Oct. 1988. Also in *Journal of Parallel and Distributed Computing*, Feb. 1990.

#### **4.2 Other Faculty Supported**

#### **4.3 Graduate Student Support**

Akitoshi Yoshida

Sandeep Sen (postdoc since December, 1989)

## 5 Recent Travel:

On March 15, 1989, visit to Boulder, Colorado to view 1st demonstration of prototype holographic router being constructed in collaboration between Reif and Johnson at University of Colorado at Boulder. (This work began under AFSOR support, and was in 1989 augmented by a DARPA/ARO contract to Reif which has now expired.)

On Aug, 1989 visited Barakat at Harvard to work on paper on Optical Expanders to improve holographic router. Begin computer simulations of optical expander system.

On Sept, 1989 visit to Boulder, Colorado to discuss with Johnson construction of a larger scale holographic router at University of Colorado at Boulder.

On Sept, 1989 gave a talk optical computation and holographic routing at Univ Saarbucken, West Germany on optical routing system. Possible collaboration discussed.

On Feb, 1990 gave an invited talk on optical computation and holographic routing at the Pen State.

On Feb, 1990 gave an invited talk on optical computation and holographic routing to a large audience at the Parallel Computation Workshop at Courant Inst, NYU.

On April, 1990 gave an invited talk on optical computation and holographic routing at the University of North Carolina

On May, 1990 gave a invited talk on optical computation and parallel algorithms at the Parallel Computation Workshop (run by Vishkin at Univ Maryland) Workshop at Annapolis, Maryland.

On June, 1990 gave an invited talk on optical computation and holographic routing at Brandeis Univ, MA.

On July, 1990 will gave invited talks on optical computation and holographic routing in Greece (at Crete) and at various location in Israel (at Technion, at the University of Tel Aviv, and the University of Jerusalem)

## **Section A**

### **Holographic Based Computing**

#### **A.1 Holographic Message Routing**

We describe an electro-optical message routing system for sending  $N$  messages between  $N$  processors in constant time using  $2N \log N$  switches. A spatial light modulator (SLM) is used to holographically steer messages directly to their destination processor. The system is unique in that it uses fixed holograms to achieve free space dynamic routing. A small prototype implementation has been already constructed [Maniloff, Johnson and Reif,89]. (An appendix describes practical issues.)

We introduce a new optical technique which we call the optical expander. We discuss how an optical expander can be used to solve a key problem, namely the orthogonality of message patterns. In particular, the optical expander system is used to decrease the number of address bits used by the router and to improve separation of distinct address patterns matched by the holograms. We discuss the theory of the optical expander system and give for the first time a rigorous proof of its correctness and performance.

##### **A.1.1 The Potential of Optical-Electronic Systems**

The inherent high parallelism and connectivity of optical signal processing lends itself directly to such applications as optical interconnection. (See the recent text of [Feitelson,88]). The recent development of moderately high speed, high dynamic range spatial light modulators has lead to the prototype development of variety of optically based signal processing systems.

##### **A.1.2 Our Holographic Routing System**

Dynamic message switching is the problem of sending  $N$  messages between  $N$  processors, where the destination permutation is given dynamically. In this section we describe a novel holographic message routing system for dynamic message switching. We use a spatial light modulator (SLM) to holographically steer messages directly in free space to their destination processor. An important innovation of our holographic routing system is the use of fixed holographs to do the dynamic message switching. It uses  $2N \log N$  boolean switches, which is optimal within a factor of 2. It has a constant time bound to do the routing and uses volume

$O(N^{3/2} \log N)$ . These time and volume bounds are within a  $\log N$  factor of asymptotically optimal with respect to the VLSIO model (this is a theoretical model for optical-electronic computing developed in [Barakat and Reif, 1987])

In brief, our holographic message routing system is a unique architecture which uses  $N$  multiple-exposure holograms, each containing  $N$  images to connect  $N$  processors to  $N$  processors, via free space routing. The system uses  $N$  spatial light modulators (SLMs), each with  $2 \log N$  pixels. A column of light illuminates each processor's SLM which is programmed with an encoded address for a destination processor. This optically encoded address is routed directly to the correct processor by a hologram containing  $N$  images, each correlated with a particular destination processor. This optical interconnection network is a direct message router taking constant time as compared to conventional fixed interconnection networks which require time delay at least  $\log N$ . Our holographic message system can be applied to do very high speed message routing for massively parallel machines such as the CONNECTION machine.

### **A.1.3 An Implementation of the Holographic Routing System**

There was a collaborative Optical Routing Project between theoretical computer scientist, John Reif, at the Computer Science Department, Duke University and optical engineers Kristina Johnson and Eric Maniloff at the Center for Optoelectronic Computing Systems at University of Colorado, Boulder. While Reif initially conceived of the theory of the system, the practical implementation was due to Johnson and Maniloff, who built a 4 by 4 prototype holographic routing system (for implementation details see [Maniloff, Johnson and Reif, 89]) at the Center for Optoelectronic Computing Systems at University of Colorado, Boulder. This running prototype implementation was completed in April, 1989. Because of the small size of this prototype system, an optical expander system was not required. They have also developed in [Strasser, Maniloff, Johnson, Goggin, 89] a procedure for recording multiple-exposure holograms with equal diffraction efficiency in photorefractive media. Reif has also directed computer simulations of the message routing applications. (the availability of a device which can control light with a high spatial resolution and with a short cycle time is critical to the successful realization of a second generation our system; for this we acknowledge the technical assistance from Derek Lile, Colorado State University, on the development of III-V MQW/CCD SLMs.)

#### A.1.4 Comparison with other Routing Systems

Interconnection networks in parallel processing computers are very important subjects. There are many interconnection networks for different applications, since different algorithm requires different degree of globality of the interconnects. Because of the availability of non-linear devices as gates which is extensively used in the interconnection network, electrically implemented interconnections are widely seen among many computer organizations. \cite{hwang:84} However, the future of electric interconnections is not necessarily bright. The problem comes from its restricted dimension—the wiring is confined on a two dimensional plane—and from RC delay on interconnections.

These drawbacks which are found in electrical interconnections do not exist in optical interconnections. Light beams need not be confined in a wave guide such as an optical fiber, but can travel freely through space. In addition, light beams can have a great bandwidth, and the propagation of light traveling through space or in a fiber is not affected by resistance, capacitance, or inductance. Thus, optical interconnections offer a high data transfer rate in a simple architecture by a set of light beams freely traveling through space. The various papers discuss the potential of optical interconnections.

Among various interconnection networks, the highest level of interconnection network is a crossbar network which uses  $N^2$  interconnects available for  $N$  source units and  $N$  destination units. If such a network is implemented electrically for large  $N$ , it will become very expensive in terms of both time—setting individual  $N^2$  switches takes time—and complexity. The property of light beams which we briefly mentioned above may give great potential for an inexpensive and high-speed optical crossbar network.

## **A.2 Holographic Memory Storage**

### **Holographic Matching**

In this section, we describe the general idea of holograms and that of holographic associative matching.

#### **Principle of Holograms**

A photograph records the intensity distribution of the light wave scattered by an object. A hologram, however, records the intensity and phase distribution of the light scattered by an object. Since a hologram has the information about the intensity and the phase of the scattered light wave, we can reconstruct the image of the object from the hologram.

In order to record the phase information of the scattered light, we superimpose a reference wave to the light wave scattered by an object. Then, the resulted interference pattern can be recorded on a photographic plate.

#### **Wave Front Recording and Associative Matching**

We describe the basic idea of wave front recording and holographic associative matching. A typical arrangement used to produce a hologram is shown in figure 1. Two coherent beams are used in the recording. Both the object beam, which we wish to record, and a reference beam illuminate the photographic medium. The photographic medium records the interference fringes which are produced as the interaction between the object beam and the reference beam. After the recording, when the recorded fringes are illuminated by a reconstruction beam—typically a reproduction of the reference beam, the fringes diffract the reconstruction beam into three main beams; the zero order term which corresponds to the reconstruction beam, a first order diverging virtual image which corresponds to the reconstructed object beam, and the other first order converging real image which corresponds to the conjugate of the object beam. The arrangement of the recording must be carefully done so that these beams do not overlap each other. When the wave length or the position of a reconstruction beam differs from those of the reference beam, the reconstructed images will be altered.

The geometry of hologram formation affects the diffraction properties of the hologram. The thickness of plane holograms is small compared to the spacing of the interference fringes recorded on the media. This type of

the holograms can be considered as a plane diffraction grating. On the other hand, volume holograms are thick, and the interference fringes are recorded in three dimensions. Thus, the volume holograms can be considered as volume diffraction gratings where the diffracted beams obey Bragg's law. The reconstruction of the volume hologram is very sensitive to the direction of the reconstruction beam. If this direction is not identical to the direction obtained from Bragg's law, there will be no images reconstructed. This property offers a possibility in making multiple-exposure distinct holograms in a single piece of volume photographic medium. The distinct holograms may be recorded by using distinct reference beams. Later, each hologram can be reconstructed by using the corresponding reference beam as a reconstruction beam. Thus, illuminating a multiple-exposure volume hologram by a reconstruction beam can be viewed as addressing a stored image associated with the reconstruction beam.

### **Media for Volume Holograms**

As a media for volume holograms, thick photographic emulsion can be used. However, other mediums such as various types of photorefractive nonlinear optical crystals are favored for their flexibility. The most widely used such media is Fe-doped lithium niobate ( $\text{LiNbO}_3$ ). When this type of crystals is illuminated, the concentration of photocarriers in the crystal will be changed. These photocarriers will be trapped, and will produce the change in the refractive index of the crystal.

Unlike a plane hologram, holograms made from these photorefractive crystals produce significantly high diffraction efficiency. Theoretically, the diffraction efficiency of such a volume hologram—a phase modulated volume hologram—can be 100%. On the other hand, a phase modulated thin hologram produces about 33%. Amplitude modulated holograms such as one made from a development of a photographic emulsion without bleaching, or of a thick photographic emulsion, produce lower diffraction efficiencies than those phase modulated counterparts.

Many researchers have investigated multiple-exposure holograms on volume media. They showed hundreds of distinct holograms may be recorded, if the medium is thick enough, and the different reference beams has an angler displacement of a few minutes. Staebler et al. showed that at least 512 multiple holographic exposures can be recorded in volume media, as long as the distinct reference beams enter at angular displacements of at least  $\pi/1000$ . Therefore, we can use a multiple-exposure volume hologram to store  $N = 512$  images as long as we use  $N$  beams, each of which has a

distinct incident angle from every other beam. These  $N$  beams can be constructed by use of our optical expanders.

### **Holographic Memory Storage**

Holograms can be used to implement memory storage systems. The basic idea of holographic memory storage is that the data is arranged in blocks, which are stored on holograms. A block of memory can be read by using its corresponding reference beam. This type of memory is particularly suited for read-only applications, since the holograms can be fixed. However, dynamically modifiable holograms such as photorefractive materials may give potential for active holographic memory storage systems.

The holographic memory storage system uses  $d$  light beams to retrieve  $N$  blocks of data, where  $d \geq 2 \log N$ . Without our optical expanders, a naive approach requires a set of  $N$  orthogonal patterns—this requires  $N$  distinct light beams—to retrieve  $N$  blocks of data. Our optical expanders create such a set of  $N$  light beams from input of  $d$  light beams.

### A.3 Optical Expanders

An optical expander is a non-linear electro-optical system which creates  $N$  distinct orthogonal boolean patterns, each of size  $N$  bits from  $N$  distinct input patterns, each of size  $d$  bits, where  $d$  is no greater than  $2 \log N$ . In other words, an optical expander takes as an input a pattern encoded in  $d$  bits, and transform it to an expanded pattern as its output which is encoded in  $N$  bits. Each output pattern is required to be orthogonal to every other pattern.

More precisely, an optical expander takes as input one of  $N$  distinct boolean vectors  $p_1, p_2, \dots, p_N$  of length  $d$ , where  $d = c \log N$ . (Note:  $c$  can be about as small as 1.5. However, setting  $c = 2$  makes the coding scheme simple, and thus may be preferable in practice.) We call these vectors the {input patterns}. Each input pattern is optically encoded by using  $d$  pixels, each pixel being either ON (denoted by 1) or OFF (denoted by 0). We will require that each input pattern has exactly  $d/2$  pixels ON. The optical expander produces a spatial output pattern  $r_i$  from given input pattern  $p_i$ . Each output pattern  $r_i$  is one of  $N$  distinct orthogonal boolean vectors of length  $N$ . Furthermore, we assume each output pattern is represented by a coherent light beam—a coherent light beam can address a hologram.

A linear optical system can not be used as an optical expander, since any linear mapping from input of size  $d$  creates no more than  $d$  linear independent output patterns. Thus, it is impossible to create a set of  $N$  distinct orthogonal patterns by any linear optical system.

There are various ways to introduce non-linearity in an optical system. One possibility is to use different coding schemes. In other words, we can apply some linear filtering operations in the spatial frequency domain. After the filtering operations, the coding can be transformed back to the original spatial domain. In coherent optics, spatial fourier transform can be easily implemented by a lens. Another possibility is to use a threshold device. When the intensity of light illuminating a surface is thresholded at a certain level, the thresholded output becomes a non-linear function of the intensity. In this approach, depending on a type of thresholding devices, either coherent or incoherent optics can be used. Our optical expanders use threshold devices to introduce non-linearity.

In the following section (2), we describe applications of our optical expanders. In order to understand the basic idea, we first describe

holographic matching in section (2.1), and then in section (2.2) holographic interconnects are discussed. In section (3), we describe our optical expander in detail. Our optical expander consists of two parts; a linear part and a non-linear part. The linear part is a matrix-vector multiplier, and the non-linear part is an array of thresholding devices. In section (3.1), optical matrix-vector multipliers are discussed. In section(3.2), thresholding operations are discussed.

We describe and investigate an optical system which is called the *optical expander*. An optical expander creates a large number  $N$  of distinct orthogonal boolean patterns by use of an electro-optical device with at most  $d$  boolean inputs, where  $d \geq 2 \log N$ . We show that an optical expander can not be constructed by using linear optical systems, and so a non-linear optical filter must be used. In our optical expanders, non-linearity is introduced by threshold operations.

Applications of our optical expanders include a *holographic memory storage system* and a *holographic message routing system*. A holographic memory storage system stores  $N$  images, each image indexed by a pattern. These patterns must be orthogonal in order to minimize crosstalk among other images. Our optical expanders produce these  $N$  orthogonal patterns with input of  $d$  pixels. Thus, with our optical expanders, addressing stored images can be carried out by directly using binary encoded addresses which are sent from the electric interfaces.

Our optical expanders can be used to implement an optical interconnection network, which is capable of dynamically connecting  $N$  source units to  $N$  destination units in a single step. Without our optical expanders, such an optical network typically requires setting of  $N^2$  individual switches—each source unit must electrically set  $N$  switches to connect itself to its destination. In a VLSI system where the wiring is confined on a two dimensional plane, configuring physical wires to set these switches may produce a practical problem for large  $N$ . Our optical expanders solve this problem by not actually setting individual  $N^2$  switches, but optically creating a set of spatially modulated patterns which corresponds to setting of  $N^2$  switches. Then, the set of patterns can be used to optically establish connections from  $N$  source units to  $N$  destination units via holograms.

Thus, our optical expanders are essential in implementing practical optical interconnection networks.

## **Description of Optical Expanders**

An Optical expander is a non-linear electro-optical system which creates  $N$  distinct orthogonal boolean patterns, each of size  $N$  bits from  $N$  distinct input patterns, each of size  $d$  bits, where  $d$  is no greater than  $2 \log N$ . In other words, an optical expander takes as an input a pattern encoded in  $d$  bits, and transform it to an expanded pattern as its output which is encoded in  $N$  bits. Each output pattern is required to be orthogonal to every other pattern.

More precisely, an optical expander takes as input one of  $N$  distinct boolean vectors  $p_1, p_2, \dots, p_N$  of length  $d$ , where  $d = c \log N$ . (Note:  $c$  can be about as small as 1.5. However, setting  $c = 2$  makes the coding scheme simple, and thus may be preferable in practice.) We call these vectors the *input patterns*. Each input pattern is optically encoded by using  $d$  pixels, each pixel being either ON (denoted by 1) or OFF (denoted by 0). We will require that each input pattern has exactly  $d/2$  pixels ON. The optical expander produces a spatial output pattern  $r_i$  from given input pattern  $p_i$ . Each output pattern  $r_i$  is one of  $N$  distinct orthogonal boolean vectors of length  $N$ . Furthermore, we assume each output pattern is represented by a coherent light beam—a coherent light beam can address a hologram.

### **Optical Expanders require Non-linear optical systems**

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### **Non Linear Optical Filters**

There are various ways to introduce non-linearity in an optical system. One possibility is to use different coding schemes. In other words, we can apply some linear filtering operations in the spatial frequency domain. After the filtering operations, the coding can be transformed back to the original spatial domain. In coherent optics, spatial fourier transform can be easily implemented by a lens. Another possibility is to use a threshold device. When the intensity of light illuminating a surface is thresholded at a certain level, the thresholded output becomes a non-linear function of the intensity. In this approach, depending on a type of thresholding devices, either coherent or incoherent optics can be used. Our optical expanders use threshold devices to introduce non-linearity.

Our optical expander consists of two parts; a linear part and a non-linear part. The linear part is a matrix-vector multiplier, and the non-linear part is an array of thresholding devices. See [Reif and Yoshida, 90] for details.

## Section B

### VLSIO Algorithms

#### B.1 The VLSIO MODEL

##### DFT-VLSIO and DFT-Circuit Models

##### VLSI Model:

It has been observed many times that the conventional electronic devices are inherently constrained by 2-dimensional limitations. Indeed, this was the original motivation for the VLSI model of Thompson [Thompson 80] which has been successfully applied to model such circuits. The widely accepted VLSI model allowed us both to compare the properties of algorithms such as area and time, and also to determine the ultimate limitations of such devices.

Let us first summarize the 2-D VLSI model, which is essentially the same as the one described by Thompson [Thompson 79]. A computation is abstracted as a communication graph. A communication graph is very much like a flow graph with the primitives being some basic operators that are realizable as electrical devices. Two communicating nodes are adjacent in this graph. A layout can be viewed as a convex embedding of the communication graph in a Cartesian grid. Each grid point can either have a processor or a wire passing through. A wire cannot go through a grid point with a processor unless it is a terminal of the processor at that grid point. The number of layers is limited to some constant  $\gamma$ . Thus both the fanin and fanout are bounded by  $4\gamma$ . Wires have unit width and bandwidth and processors have unit area. The initial data values are localized to some constant area, to preclude an encoding of the results. The input words are read at the designated nodes called input ports. The input and subsequent computation are synchronous and each input bit is available only once. The input and output conventions are where-determinate but need not be when-determinate.

##### VLSIO Model:

The recent development of high speed electro-optical computing devices allows us to overcome the 2-D limitations of traditional VLSI. In particular, the optical computing devices allow computation to be done in 3 dimensions, with full resolution in all the dimensions.

A rather different model for 3-D electro-optical computation is described in [Barakat, Reif, 87], which combines use of optics and electronics components in ways that models currently feasible devices. This model is known as the VLSIO model, with the O standing for optics. In this model, the fundamental building block is the optical box, consisting of a rectilinear parallelepiped whose surface consists of electronic devices modeled by the 2-D VLSI model and whose interior consists of optical devices. Communication from the surface is assumed to be done via electrical-optical transducers on the surface. Given specified inputs on the surface of the optical box, it is assumed that the output to the surface is produced in 1 time unit. Note that we do not rule out the possibility of two wide optical beams crossing, while still transmitting distinct information. However, there is an assumption (justified by a theorem of Gabor [Gabor, 61]) that a beam of cross section  $A$  can transmit at most  $O(A)$  bits per unit time. This is the only assumption made about the power of the optical boxes.

For the purposes of upper bounds, we would have to be more specific about the computational power of optical boxes. The use of electro-optical devices will certainly allow us to overcome the  $\Omega^2$  limitations. The VLSIO potentially has more advantages over 2-D VLSI than just 3-dimensional interconnections of 3-D VLSI. In particular, it is well known that a 2 dimensional Fourier transform or its inverse can be computed by an optical device in unit time. In our discrete model, we assume that an optical box of size  $n^{1/2} \times n^{1/2} \times n^{1/2}$  with an input image of size  $n^{1/2} \times n^{1/2}$  can compute a 2-D Discrete Fourier Transform (DFT) in unit time. We call this the DFT-VLSIO model.

This is consistent with the capabilities of the electro-optical components constructed in practice. In this case, the VLSIO model is clearly more powerful than the 3-D VLSI model, *e.g.* since in that model we cannot do a DFT in constant time. A VLSIO device consists of a convex volume with a packing of optical boxes whose interiors do not intersect, but may be connected by wires between their surfaces. This allows for communication between two optical boxes. *Note that the VLSIO model encompasses the 3-D VLSI model as a subcase: the particular subcase where each optical box is just a 2-D surface with no volume.*

A VLSIO circuit is an embedding of a communication graph with the nodes corresponding to optical boxes in a three dimensional grid. The volume of a VLSIO circuit is the volume of the smallest convex box enclosing it. Due to Gabor's theorem [Gabor, 61] establishing a finite

bound on the bandwidth of an optical beam, without any loss of generality, we assume that only binary values are used in transmitting information.

### The DFT-Circuit Model:

Let  $R$  be an ordered ring. A circuit over  $R$  consists of an acyclic graph with a distinguished set of input nodes, and a labeling of all the non-input nodes with a ring operation. In the DFT circuit model, we allow:

1. scalar operations such as  $\times$ ,  $/$ ,  $+$  and comparison with 2 inputs, and
2. DFT gates with  $n$  inputs and  $n$  outputs.

The *size* of the DFT circuit is the sum of the number of edges and the number of nodes. Recall from Parberry, Schnitger [Parberry, Schnitger, 88] that a *threshold* circuit is a Boolean circuit of unbounded fanin, where each gate computes the threshold operation. Threshold circuits are shown in Reif and Tate [Reif, Tate, 87] to compute a large number of algebraic problems such as polynomial division, triangular Toeplitz inverse, integer division, sin, cosine etc. in  $n^{O(1)}$  size and simultaneous  $O(1)$  depth.

Since the first output of a DFT gate is the sum of the inputs, and since comparison operations are allowed, a DFT circuit clearly has at least the power of a threshold circuit of the same size and depth. The question we address in this section is the power of the DFT operation above and beyond its power to compute threshold. Note that no non-trivial lower bounds on a threshold circuit computing a DFT are known. But, just by its definition, at least  $n$  threshold gates are required for a DFT computation.

## **B2 Efficient Optical Algorithms Using The DFT Primitive**

### **B2.0**

The optical computing technology offers new challenges to the algorithm designers since it can perform an  $n$ -point DFT computation in only unit time. Note that DFT is a non-trivial computation in the PRAM model. We develop two new models, DFT-VLSIO and DFT-Circuit, to capture this characteristic of optical computing. We also provide two paradigms for developing parallel algorithms in these models. Efficient parallel algorithms for many problems including polynomial and matrix computations, sorting and string matching are presented. The sorting and string matching algorithms are particularly noteworthy. Almost all of these algorithms are within a polylog factor of the optical computing (VLSIO) lower bounds derived in [Barakat, Reif 87] and [Tygar, Reif 89].

### **B2.1**

Over the last 15 years, VLSI has moved from being a theoretical abstraction to being a practical reality. As VLSI design tools and VLSI fabrication facilities such as MOSIS became widely available, the algorithm design paradigms such as systolic algorithms, that were thought to be of theoretical interest only, have been used in high performance VLSI hardware. Along the same lines, the theoretical limitations of VLSI predicted by area-time tradeoff lower bounds have been found to be important limitations in practice. The field of electro-optical computing is at its infancy, comparable to the state of VLSI technology, say, 10 years ago. Fabrication facilities are not widely available—instead, the crucial electro-optical devices must be specially made in the laboratories. However, a number of prototype electro-optical computing systems—perhaps most notably at Bell Laboratories under Wong, as well as optical message routing devices at Boulder, Stanford and USC, have been built recently. The technology for electro-optical computing is likely to advance rapidly in the 90s, just as VLSI technology advanced in the late 70s and 80s. Therefore, following our past experience with VLSI, it seems likely that the theoretical underpinnings for optical computing technology—namely the discovery of efficient algorithms and of resource lower bounds, are crucial to guide its development.

What are the specific capabilities of optical computing that offer room for new paradigms in algorithm design? It is well known that optical

devices exist that can compute a two-dimensional Fourier transform or its inverse in unit time, see Goodman [Goodman, 82]. This is a natural characteristic of light. This opens up exciting opportunities for the algorithm designers. In the widely accepted model of parallel computation—PRAM, not many interesting problems can be solved in  $O(1)$  time. In particular, the best known parallel algorithm for Discrete Fourier Transform—FFT, takes time  $O(\log n)$  for an  $n$ -point DFT. Given this powerful technology, the question we address is, “which problems can use the DFT computation primitively gainfully?” It is not immediately clear that given a problem, apparently disparate from DFT, such as sorting, how one reduces it to several instances of DFT to derive an efficient algorithm. We identify two general techniques that benefit a host of problems. First, we show a way to compute 1-dimensional  $n$ -point DFT efficiently using a series of 2-dimensional DFTs. Note that the optical devices compute a 2-dimensional DFT. However, the 1-dimensional DFT seems to be the one which is more naturally usable in most of the problems. Secondly, we demonstrate an efficient way to perform a parallel-prefix computation with DFT primitives. Equipped with these two techniques, we propose constant time solutions for a variety of problems including sorting, several matrix computations and string matching.

We consider discrete models for optical computing with a DFT primitive. In particular, an  $n$ -point DFT operation or its inverse can be computed in unit time using  $n$  processors. The development of a new model of computation is a task full of trade-offs. Only the essential characteristics of the underlying computing medium should be reflected in the model. Any unnecessary characteristics only serve to undermine the usefulness of such a model. PRAM (parallel random access machine) has provided a much needed model for the development of parallel algorithms for some time now. The algorithm designers do not have to worry about underlying networks and the details of timing inherent in the VLSI technology used to implement the processors. In a similar vein, our objective is to develop a model that captures the essence of optical computing medium with respect to algorithm design. We believe that the most important characteristic that distinguishes the optical technology from the VLSI technology is the ability to compute a powerful primitive, DFT, in unit time. Not surprisingly then, this is the focus of our models. Our new models are:

- [DFT-Circuit Model:] where we allow an  $n$ -point DFT primitive gate along with the usual scalar operations of bounded fanin.

- [DFT-VLSIO:] which extends the standard VLSI model to 3-dimensional optical computing devices that compute the 2-D DFT as a primitive operation. We refer to an electro-optical computation as VLSIO, where O stands for *optics*.

Note that although we did not mention a PRAM-DFT model where a set of  $n$  processors can perform a DFT in unit time; all the algorithms in DFT-Circuit model work for such a PRAM-DFT model.

A PRAM-DFT can simulate a DFT-Circuit of size  $s(n)$  and time  $t(n)$  with  $s(n)$  processors in time  $O(t(n))$ . Hence, a PRAM-DFT model is an equally acceptable choice for the development of parallel algorithms in optical computing.

Our main results are efficient parallel algorithms for solving a number of fundamental problems in these models.

The problems solved include:

1. prefix sum
2. shifting
3. polynomial multiplication and division
4. matrix multiplication, inversion and transitive closure.
5. Toeplitz matrix multiplication, polynomial GCD, interpolation and inversion.
6. sorting
7. 1 and 2 dimensional string matching

*The sorting and string matching algorithms were not at all obvious.* Although, we don't have any lower bounds in the DFT-circuit model, many of these parallel algorithms are optimal with respect to the VLSIO model. The known lower bound results in VLSIO are as follows. Barakat and Reif [Barakat, Reif 87] showed a lower bound of  $\Omega(I_f^{3/2})$  on  $V T^{3/2}$  of a VLSIO computation for a function  $f$  with information complexity  $I_f$ .  $V$  denotes the volume of the VLSIO system computing  $f$ . We [Tyagi, Reif 89] proved a lower bound of  $\Omega(I_f f(I_f^{1/2}))$  on the energy-time product for a VLSIO model with the energy function  $f(x)$ . We compare our results with the

best-known PRAM algorithms for the corresponding problems. All the bounds are in Big-Oh notation ( $O$ ).

### C. Lower Bounds for the energy consumption of Electro-Optical devices in the VLSIO model.

Over the last 15 years, VLSI has moved from being a theoretical abstraction to being a practical reality. As VLSI design tools and VLSI fabrication facilities such as MOSIS became widely available, the algorithm design paradigms such as systolic algorithms, that were thought to be of theoretical interest only, have been used in high performance VLSI hardware. Along the same lines, the theoretical limitations of VLSI predicted by area-time tradeoff lower bounds have been found to be important limitations in practice. The field of electro-optical computing is at its infancy, comparable to the state of VLSI technology say 10 years ago. Fabrication facilities are not widely available—instead, the crucial electro-optical devices must be specially made in the laboratories. However, a number of prototype electro-optical computing systems—perhaps most notably at Bell Laboratories under Wong, as well as optical message routing devices at Boulder, Stanford and USC, have been built recently. The technology for electro-optical computing is likely to advance rapidly in the 90s, just as VLSI technology advanced in the late 70s and 80s. Therefore, following our past experience with VLSI, it seems likely that the theoretical underpinnings for optical technology—namely the discovery of efficient algorithms and of resource lower bounds, are crucial to guide its development.

Barakat and Reif [Barakat, Reif 87] developed a model for electro-optical computing systems. They refer to an electro-optical computation as VLSIO, where *O* stands for *optics*. Since we anticipate the number of VLSI components in optical computers to be large, the VLSI prefix in VLSIO can be reasonably used. The following two significant aspects distinguish VLSI from VLSIO. VLSIO has a 3 dimensional character. Secondly, the information in VLSIO is carried by optical beams rather than electrical currents.

Just as *area*, *energy* and *time* are three fundamental resources in a VLSI computation, *volume*, *energy* and *time* are the resources of interest in a 3-D VLSI circuit or an optical computing system. The *volume*, *time* lower bounds for optical computations have been established by Barakat and Reif [Barakat, Reif 87] along the lines of  $AT^2$  VLSI bounds. But, a similar asymptotic analysis of energy bounds in VLSIO computations is missing. A study of energy requirements in 3-D VLSI has also not been undertaken. Energy has received increased attention recently because the power consumption largely determines the total cost of a high performance

computer due to heat dissipation. The theoretical physicists have also considered the viability of characterizing the computational costs entirely in terms of energy. All of the recent research activity in energy complexity has been directed at the study of the energy requirements in 2-D VLSI computations. More specifically, the first formal result in switching energy was due to Lengauer, Mehlhorn [Lengauer, Melhorn 81], which shows that the switching energy of transitive functions,  $E$ , is  $\Omega(n^2/P \log(AP^2/n^2))$ , which is  $\Omega(n^2)$  for  $AP^2 = O(n^2)$ .  $P$  is the period of a pipelined computation. Kissin [Kissin 82, 85] proposed a formal model for switching energy distinguishing between uniswitch and multiswitch models. When a wire is assumed to switch at most once during the course of computation, it is a *uniswitch* circuit. Most of the pipelined computations fall in this class. The more general model, that allows each wire to switch any number of times, is called the *multiswitch* model. Snyder, Tyagi [Snyder, Tyagi 86] and Leo [Leo 84] considered variations on Lengauer, Mehlhorn result. The first tight bound on uniswitch and multiswitch energy-period product [ $\Omega(n^2)$ ] for shifting was obtained by Aggarwal et. al. [Aggarwal et. al, 88]. Tyagi [Tyagi 89] derived a tight bound on multiswitch energy,  $\Omega(n^{1.5})$ , and average case uniswitch and multiswitch energy. The 3-D VLSI model has been studied by Rosenberg [Rosenberg 81], Preparata [Preparata 83], and Leighton, Rosenberg [Leighton, Rosenberg 86] with respect to volume-time trade-offs. *We analyze the energy requirements in 3-D VLSI and VLSIO systems.*

The energy consumption model developed in Kissin [Kissing 82] applies to the 3-dimensional VLSI as well. But, as a first step, a consistent model of energy consumption in optical computing is needed. In this section, we propose two models for the energy consumption in an optical computer which are consistent with the VLSIO model described in [Barakat, Reif 87]. Within these models, we demonstrate tight bounds on both energy and energy-time product for the optical computation of several functions.

A key property which we will consider in this work is the energy consumed by an electro-optical device. This is determined by summing the energy consumed by each wire and by each optical beam. This energy consumption is assumed to be due to switching. In all the energy models considered to date—a wire of length  $d$  consumes switching energy  $\Theta(d)$ , which is consistent with the currently used CMOS technology. However, in an optical computation, an energy cost non-linear (even exponential) in the length of the switching wire is justifiable for some frequency range. This leads to a generalization of the energy model. In particular, we assume an energy function,  $f(d)$ , such that  $f(d)$  energy is consumed by a wire/beam of

length  $d$  switching between 0 and 1. Here  $f(d)$  is a function that may or may not be nonlinear, but  $f$  and its first derivative must be continuous functions. We argue that  $f(d)$  can, in theory, be an exponential function in  $d$  for optical beams. We also show why, in practice,  $f(d)$  may be a polynomial or even a linear function. Our energy lower bounds encompass any such energy function  $f(d)$ . *Note* that the case of a nonlinear energy function has not been considered previously even for 2-D VLSI. The local cutting techniques used for the linear energy model consider the energy consumption of the unit-length wire segments incident on the cut. However, in such a local context, any non-linear energy function, at best, measures the same energy consumption at the cut as does the linear energy function. The unit length segments consume the same order of energy for all the energy functions. Hence a somewhat more global lower bound approach is needed in the generalized energy model.

*Results:* We derive the lower bounds, shown in the table below, on uniswitch and multiswitch energy  $E$  and energy-time product  $ET$  of a transitive function. The matching upper bounds are established for a transitive function: *shifting*.

*Note that the objective of multiswitch circuits is to find a tight embedding for the devices under the premise that it leads to shorter links. The overall energy saving is derived from the observation that the repeated use of short links leads to a smaller  $ET$  product. On the other hand, a uniswitch circuit will have to make links long in order to propagate information far enough. But it will use every link only once. Hence, as shown in [Tyagi 89], in 2-D VLSI a multiswitch circuit always has a lower energy consumption than a uniswitch circuit. Interestingly, as we show, the only 3-D VLSI examples satisfying the multiswitch lower bound for  $f(x) < x^{4/3}$  are uniswitch circuits. We believe that no 3-D circuits exist satisfying the lower bound in this energy function range. This says that for the 3-D case, there is a zone :  $x < f(x) < x^{4/3}$ , where long links leading to higher volume perform better than a circuit with short links, defying the conventional wisdom.*

## D Complexity of Optical Ray Tracing

We examine ray tracing problems in [Reif, Akitoshi, and Tygar, 90]. The history of ray tracing goes back at least to Archimedes, who examined images formed by a mirror to understand the law of reflections. In the 15th to 18th centuries, many scientists and astronomers in Europe worked on geometrical optics and invented optical instruments such as telescopes. In 1730, Newton published his book "Opticks" in which he formally defined the reflective and refractive laws of optics, and first defined and investigated some ray tracing problems. These classical ray tracing problems are very important to the design of most optical systems which consists of a set of refractive or reflective surfaces, and involve tracing the path of rays to investigate the performance of the systems. Ray tracing also has important application in computer graphics, where ray tracing is used to render pictures which consist of objects with surfaces that reflect or refract light rays.

The *ray tracing problem* is a decision problem: given an optical system (namely, a finite set of reflective or refractive surfaces) and an initial position and direction of a light ray and some fixed point  $p$ , does the light ray eventually reach the point  $p$ .

Our optical systems consist of a finite set of optical objects that may be totally reflective (we call these *mirrors*), partially reflective (we call these *half-silvered mirrors*), or totally absorbent (we call these *lenses*). We restrict ourselves to optical systems constructed out of flat (e.g., line segments) mirrors and half-silvered mirrors; and out of lenses whose boundaries are quadratic curves. (We call these lenses *quadratic lenses*.) Do mirrors reflect if a light-beam is directed exactly at an endpoint? It will turn out that this matters for the case when we form a corner out of two mirrors. What should happen when the light beam is directed exactly at the corner? We shall allow mirrors (and half-silvered mirrors) to reflect entirely along the surface of either a closed, half-closed, or open line segment.

The positions of our mirrors, half-silvered mirrors, and lenses can be either *rational* or *irrational*. If the optical system consists only of mirrors or half-silvered mirrors with endpoints with rational coordinates, we say that the optical system is *rational*. If the optical system contains mirror or half-silvered mirrors with endpoints that have irrational coordinates then we say the optical system is *irrational*.

We are interested in if the light will reach a final certain position, and not in the intensity of the light at that position. Throughout this section, we assume that the path taken by light rays are determined by the classical laws of optics: *the law of reflection* and *the law of refraction*.

(The law of reflection states that the incident angle and the reflected angle are equal, and the law of refraction states that the angle of refraction depends on the incident angle and the index of refraction of the materials.) We always assume that the initial position of the light ray has rational coordinates and the tangent of the initial incident angle is rational, and the test point  $p$  has rational coordinates. (In general, in our lower bound proofs, it suffices to let the light rays initially enter perpendicular to a window of the optical systems.) Our surprising discovery is that if the optical system is rational it may have high complexity, or even be undecidable. We generally denote  $n$  to be the number of bits in binary encoding of the optical system.

Our results of the computational complexity for ray tracing in various optical systems may be summarized as follows:

1. Ray tracing in three dimensional optical systems which consist of a finite set of mirrors, half-silvered mirrors, and quadratic lenses is undecidable, even if the endpoints of the objects in the optical system all have rational coordinates. However, the problem is recursively enumerable.
2. Ray tracing in three dimensional optical systems which consist of a finite set of mirrors is undecidable, if the mirrors' endpoints are allowed to have irrational coordinates. However, the ray tracing problem is PSPACE-hard, if we restrict ourselves to mirrors with endpoints that are rational coordinates.
2. For any  $d \geq 2$ , ray tracing of  $d$  dimensional optical systems which consist of a finite set of mirrors surfaces lies in PSPACE, if the positions of all the surfaces are rational, and they lie perpendicular to each other. For  $d \geq 3$ , the problem is PSPACE-complete.

We consider three optical models in this section:

In optical model (1), each optical system consists of a finite set of quadratic lenses, mirrors, and half-silvered mirrors. A light ray travels

through the system with reflections or refractions. We show that the problem of deciding if the light ray will reach a given final position in this system is undecidable. In order to show this, we simulate a universal Turing machine with this optical model. What is perhaps surprising, is that our optical system has a fixed number of optical lenses and mirrors, and yet the ray tracing problem for it simulates any recursive enumerable computation, where the input is given by the initial position of the light ray.

In optical model (2), each optical system consists of a finite set of mirrors and half-silvered mirrors in three dimensional space. We again show that the problem of deciding is undecidable. To show this, we simulate a 2-counter machine with this optical model. Next, we consider the computational complexity when we restrict ourselves to rational optical systems. In this case, we show that the problem is PSPACE-hard. To show this, we first define a certain augmented bounded 2-counter machine. Then, we simulate this augmented bounded 2-counter machine with this optical system. By showing the augmented bounded 2-counter machine can compute an arbitrary polynomial space problems, we conclude that the problem of deciding if the light ray reach a given final position in this system is in PSPACE-hard. (Although we show that the problem is PSPACE-hard, we do not even know if this restricted problem is decidable.)

Optical model (3) is a generalization of optical model (2). In optical model (3), each optical system occurs in a unit-sized  $d$  dimensional hypercube. The hypercube contains a rational optical system of mirrors. Each of the mirrors lies perpendicular to every other mirror. We show that the problem of deciding if the light ray will reach a given final position has a non-deterministic polynomial space algorithm, thus showing the problem is in PSPACE.

Theoretically, these optical systems can be viewed as general optical computing machines, if our constructions can be carried out with infinite precision, or perfect accuracy. However, these systems may not be practical, since the above assumption may not hold in physical world. The motivation for this work comes from an interest in investigating the problem complexities in ray tracing problems.