

Proceedings

# 35th Annual Symposium on Foundations of Computer Science

November 20 - 22, 1994

Santa Fe, New Mexico

*Edited by*  
Shafi Goldwasser

*Sponsored by*  
IEEE Computer Society Technical Committee on  
Mathematical Foundations of Computing



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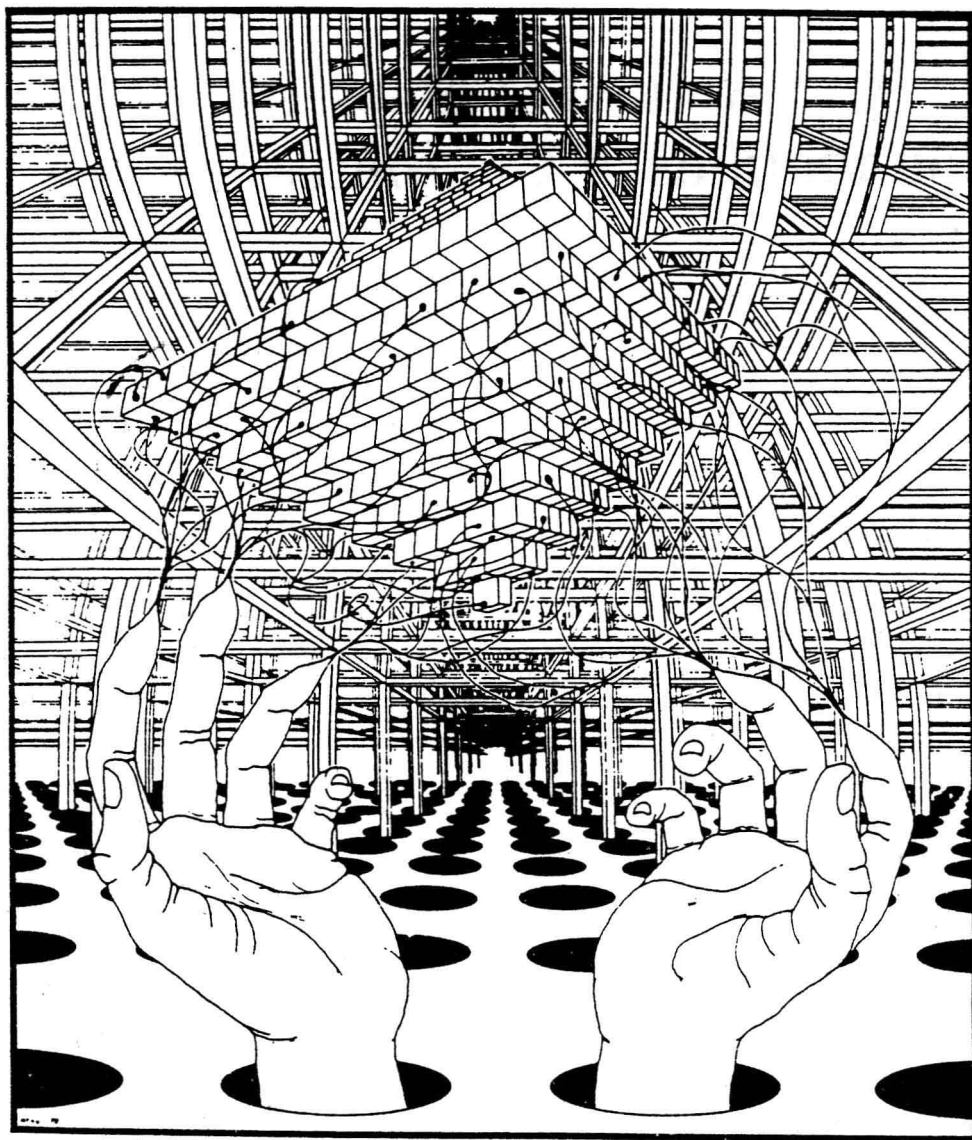
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## Preface

The papers in this volume were presented at the 1994 IEEE 35th Annual Symposium on Foundations of Computer Science (FOCS'94), sponsored by the IEEE Computer Society Technical Committee on Mathematical Foundations of Computing. The conference was held in Santa Fe, New Mexico from November 20-22, 1994.

The program committee met from June 26-28, 1994, and selected 70 papers from the 235 extended abstracts submitted for review. The submissions were not refereed, and many of them represent reports of continuing research. It is expected that most of these papers will appear in a more complete and polished form in scientific journals in the near future. In addition, Leonard Adleman, Manuel Blum, and Ravi Kannan were invited to give plenary lectures, reprinted in these proceedings.

The committee selected the papers, "Efficient Oblivious Branching Programs for Threshold Functions," by Rakesh Kumar Sinha and Jayram S. Thathacher and, "An Efficient Membership-Query Algorithm for Learning DNF with Respect to the Uniform Distribution," by Jeffrey Jackson, to receive the Machtey Award, given to the best student-authored papers.

The committee wishes to thank all of those who submitted papers for consideration, as well as the individuals who helped with the process of evaluating the extended abstracts. A list of the latter is given on the following page.

The program committee consisted of Avrim Blum, Anne Condon, Oded Goldreich, Shafi Goldwasser, Johan Håstad, Howard Karloff, Laszlo Lovasz, Yishay Mansour, Friedhelm Meyer auf der Heide, Satish Rao, Raimund Seidel, Victor Shoup, Eva Tardos, Moshe Vardi, and Mihalis Yannakakis.

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# Table of Contents

Preface.....	xi
Referees.....	xii
Committees.....	xiii

## Sunday Session 1A:

*Chair: L. Lovasz*

Approximate Graph Coloring by Semidefinite Programming .....	2
<i>D. Karger, R. Motwani, and M. Sudan</i>	
Finding Separator Cuts in Planar Graphs Within Twice the Optimal .....	14
<i>N. Garg, H. Saran, and V.V. Vazirani</i>	
Polynomial Time Randomized Approximation Schemes for the Tutte Polynomial of Dense Graphs .....	24
<i>N. Alon, A. Frieze, and D. Welsh</i>	
A Note on the $\theta$ Number of Lovász and the Generalized Delsarte Bound .....	36
<i>M. Szegedy</i>	

## Sunday Session 1B:

*Chair: A. Blum*

An Efficient Membership-Query Algorithm for Learning DNF with Respect to the Uniform Distribution .....	42
<i>J. Jackson</i>	
On Learning Discretized Geometric Concepts .....	54
<i>N.H. Bshouty, Z. Chen, and S. Homer</i>	
PAC Learning with Irrelevant Attributes .....	64
<i>A. Dhagat and L. Hellerstein</i>	
The Power of Team Exploration: Two Robots Can Learn Unlabeled Directed Graphs .....	75
<i>M.A. Bender and D.K. Slonim</i>	

## Plenary Session

*Chair: M. Yannakakis*

Algorithmic Number Theory — The Complexity Contribution .....	88
<i>L.M. Adleman</i>	

## Sunday Session 2A:

*Chair: V. Shoup*

On the Power of Quantum Computation .....	116
<i>D.R. Simon</i>	

Algorithms for Quantum Computation: Discrete Logarithms and Factoring .....	124
<i>P.W. Shor</i>	
The Complexity of the Membership Problem for 2-Generated Commutative Semigroups of Rational Matrices.....	135
<i>J.-Y. Cai, R.J. Lipton, and Y. Zalcstein</i>	
Efficient Average-Case Algorithms for the Modular Group .....	143
<i>J.-Y. Cai, W.H. Fuchs, D. Kozen, and Z. Liu</i>	

#### **Sunday Session 2B:**

*Chair: E. Tardos*

Finding the $k$ Shortest Paths.....	154
<i>D. Eppstein</i>	
Long Tours and Short Superstrings.....	166
<i>S.R. Kosaraju, J.K. Park, and C. Stein</i>	
Maximum (s,t) — Flows in Planar Networks in $O( V  \log  V )$ Time .....	178
<i>K. Weihe</i>	
Estimating the Size of the Transitive Closure in Linear Time .....	190
<i>E. Cohen</i>	

#### **Sunday Session 3A:**

*Chair: F. Meyer auf der Heide*

Rapid Rumor Ramification: Approximating the Minimum Broadcast Time.....	202
<i>R. Ravi</i>	
The Load, Capacity and Availability of Quorum Systems.....	214
<i>M. Naor and A. Wool</i>	
Fast and Lean Self-Stabilizing Asynchronous Protocols .....	226
<i>G. Itkis and L. Levin</i>	
Local Optimization of Global Objectives: Competitive Distributed Deadlock Resolution and Resource Allocation .....	240
<i>B. Awerbuch and Y. Azar</i>	

#### **Sunday Session 3B:**

*Chair: A. Condon*

(De)randomized Construction of Small Sample Spaces in $NC$ .....	252
<i>D.R. Karger and D. Koller</i>	
Computing with Very Weak Random Sources .....	264
<i>A. Srinivasan and D. Zuckerman</i>	
Randomness-Efficient Oblivious Sampling .....	276
<i>M. Bellare and J. Rompel</i>	
On the Robustness of Functional Equations .....	288
<i>R. Rubinfeld</i>	

**Monday Session 1A:****Chair: J. Hastad**

A Lower Bound for the Monotone Depth of Connectivity .....	302
<i>A.C.-C. Yao</i>	
Efficient Oblivious Branching Programs for Threshold Functions .....	309
<i>R.K. Sinha and J.S. Thathachar</i>	
Products and Help Bits in Decision Trees .....	318
<i>N. Nisan, S. Rudich, and M. Saks</i>	
On Rank vs. Communication Complexity .....	831
<i>N. Nisan and A. Wigderson</i>	

**Monday Session 1B:****Chair: S. Rao**

On the Design of Reliable Boolean Circuits that Contain Partially Unreliable Gates .....	332
<i>D. Kleitman, T. Leighton, and Y. Ma</i>	
Nearly Tight Bounds for Wormhole Routing .....	347
<i>A. Ranade, S. Schleimer, and D.S. Wilkerson</i>	
Scheduling Multithreaded Computations by Work Stealing .....	356
<i>R.D. Blumofe and C.E. Leiserson</i>	
Fast and Feasible Periodic Sorting Networks of Constant Depth .....	369
<i>M. Kutylowski, B. Oesterdiekhoff, K. Lorys, and R. Wanka</i>	

**Plenary Session****Chair: S. Goldwasser**

Program Result-Checking: A Theory of Testing Meets a Test of Theory .....	382
<i>M. Blum and H. Wasserman</i>	

**Monday Session 2A:****Chair: H. Karloff**

Beyond Competitive Analysis .....	394
<i>E. Koutsoupias and C.H. Papadimitriou</i>	
A Theory of Competitive Analysis for Distributed Algorithms .....	401
<i>M. Ajtai, J. Aspnes, C. Dwork, and O. Waarts</i>	
On-Line Admission Control and Circuit Routing for High Performance Computing and Communication .....	412
<i>B. Awerbuch, R. Gawlick, T. Leighton, and Y. Rabani</i>	
IP Over Connection-Oriented Networks and Distributional Paging .....	424
<i>C. Lund, S. Phillips, and N. Reingold</i>	

**Monday Session 2B:****Chair: O. Goldreich**

CS (Computationally-Sound) Proofs .....	436
<i>S. Micali</i>	

On Monotone Formula Closure of SZK .....	454
<i>A. De Santis, G. Di Crescenzo, G. Persiano, and M. Yung</i>	
On the Complexity of Bounded-Interaction and Noninteractive Zero-Knowledge Proofs .....	466
<i>J. Kilian</i>	
Reducibility and Completeness in Multi-Party Private Computations .....	478
<i>E. Kushilevitz, S. Micali, and R. Ostrovsky</i>	

### Monday Session 3A:

*Chair: M. Yannakakis*

"Go With the Winners" Algorithms .....	492
<i>D. Aldous and U. Vazirani</i>	
Randomized Simplex Algorithms on Klee-Minty Cubes .....	502
<i>B. Gärtner and G.M. Ziegler</i>	
Motion Planning on a Graph .....	511
<i>C.H. Papadimitriou, P. Raghavan, M. Sudan, and H. Tamaki</i>	
The Localization Problem for Mobile Robots .....	521
<i>J.M. Kleinberg</i>	

### Monday Session 3B:

*Chair: V. Shoup*

Algebraic Computation Trees in Characteristic $p > 0$ .....	534
<i>M. Ben-Or</i>	
An $O(n^{1+\epsilon} \log b)$ Algorithm for the Complex Roots Problem .....	540
<i>C.A. Neff and J.H. Reif</i>	
Complexity Lower Bounds for Computation Trees with Elementary Transcendental Function Gates .....	548
<i>D. Grigoriev and N. Vorobjov</i>	
On the Computation of Boolean Functions by Analog Circuits of Bounded Fan-In .....	553
<i>G. Turán and F. Vatan</i>	

### Tuesday Session 1A:

*Chair: L. Lovasz*

Expander Codes .....	566
<i>M. Sipser and D.A. Spielman</i>	
The Geometry of Graphs and Some of Its Algorithmic Applications .....	577
<i>N. Linial, E. London, and Y. Rabinovich</i>	
Tail Bounds for Occupancy and the Satisfiability Threshold Conjecture .....	592
<i>A. Kamath, R. Motwani, K. Palem, and P. Spirakis</i>	
Priority Encoding Transmission .....	604
<i>A. Albanese, J. Blömer, J. Edmonds, M. Luby, and M. Sudan</i>	

**Tuesday Session 1B:***Chair: M. Vardi*

Graph Connectivity and Monadic NP .....	614
<i>T. Schwentick</i>	
A Polynomial-Time Algorithm for Deciding Equivalence of Normed Context-Free Processes .....	623
<i>Y. Hirshfeld, M. Jerrum, and F. Moller</i>	
On the Combinatorial and Algebraic Complexity of Quantifier Elimination.....	632
<i>S. Basu, R. Pollack, and M.-F. Roy</i>	
Set Constraints with Projections are in NEXPTIME.....	642
<i>W. Charatonik and L. Pacholski</i>	

**Plenary Session***Chair: L. Lovasz*

Markov Chains and Polynomial Time Algorithms.....	656
<i>R. Kannan</i>	

**Tuesday Session 2A:***Chair: R. Seidel*

A Spectral Approach to Lower Bounds .....	674
<i>B. Chazelle</i>	
Parallel Algorithms for Higher-Dimensional Convex Hulls.....	683
<i>N.M. Amato, M.T. Goodrich, and E.A. Ramos</i>	
More Output-Sensitive Geometric Algorithms.....	695
<i>K.L. Clarkson</i>	
Randomized and Deterministic Algorithms for Geometric Spanners of Small Diameter.....	703
<i>S. Arya, D.M. Mount, and M. Smid</i>	

**Tuesday Session 2B:***Chair: S. Rao*

A New Efficient Radix Sort.....	714
<i>A. Andersson and S. Nilsson</i>	
Multi-Index Hashing for Information Retrieval.....	722
<i>D. Greene, M. Parnas, and F. Yao</i>	
Optimizing Static Calendar Queues .....	732
<i>K.B. Erickson, R.E. Ladner, and A. LaMarca</i>	
Fully Dynamic Cycle-Equivalence in Graphs.....	744
<i>M. Rauch Henzinger</i>	

**Tuesday Session 3A:***Chair: E. Tardos*

Maximum Agreement Subtree in a Set of Evolutionary Trees — Metrics and Efficient Algorithms .....	758
<i>D. Keselman and A. Amir</i>	

Optimal Evolutionary Tree Comparison by Sparse Dynamic Programming .....	770
<i>M. Farach and M. Thorup</i>	
Tractability of Parameterized Completion Problems on Chordal and Interval Graphs: Minimum Fill-In and Physical Mapping .....	780
<i>H. Kaplan, R. Shamir, and R.E. Tarjan</i>	

### **Tuesday Session 3B:**

*Chair: A. Condon*

Lower Bounds on Hilbert's Nullstellensatz and Propositional Proofs .....	794
<i>P. Beame, R. Impagliazzo, J. Krajíček, T. Pitassi, and P. Pudlák</i>	
Measure on Small Complexity Classes, with Applications for BPP .....	807
<i>E. Allender and M. Strauss</i>	
On Syntactic versus Computational Views of Approximability .....	819
<i>S. Khanna, R. Motwani, M. Sudan, and U. Vazirani</i>	

Author Index .....	837
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# **Sunday Session 1A**

Chair: L. Lovasz

# Approximate Graph Coloring by Semidefinite Programming

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## Abstract

We consider the problem of coloring  $k$ -colorable graphs with the fewest possible colors. We give a randomized polynomial time algorithm which colors a 3-colorable graph on  $n$  vertices with  $\min\{O(\Delta^{1/3} \log^{4/3} \Delta), O(n^{1/4} \log n)\}$  colors where  $\Delta$  is the maximum degree of any vertex. Besides giving the best known approximation ratio in terms of  $n$ , this marks the first non-trivial approximation result as a function of the maximum degree  $\Delta$ . This result can be generalized to  $k$ -colorable graphs to obtain a coloring using  $\min\{\tilde{O}(\Delta^{1-2/k}), \tilde{O}(n^{1-2/(k+1)})\}$  colors. Our results are inspired by the recent work of Goemans and Williamson who used an algorithm for semidefinite optimization problems, which generalize linear programs, to obtain improved approximations for the MAX CUT and MAX 2-SAT problems. An intriguing outcome of our work is a duality relationship established between the value of the optimum solution to our semidefinite program and the Lovász  $\vartheta$ -function. We show lower bounds on the gap between the optimum solution of our semidefinite program and the actual chromatic number; by duality this also demonstrates interesting new facts about the  $\vartheta$ -function.

## 1 Introduction

A legal vertex coloring of a graph  $G(V, E)$  is an assignment of colors to its vertices such that no two adjacent vertices receive the same color. Equivalently, a legal coloring of  $G$  by  $k$  colors is a partition of its vertices into  $k$  independent sets. The minimum number of colors needed

for such a coloring is called the chromatic number of  $G$ , and is usually denoted by  $\chi(G)$ . Determining the chromatic number of a graph is known to be NP-hard (cf. [19]).

Besides its theoretical significance as a canonical NP-hard problem, graph coloring arises naturally in a variety of applications such as register allocation [11, 12, 13] and timetable/examination scheduling [8, 40]. In many applications which can be formulated as graph coloring problems, it suffices to find an *approximately optimum* graph coloring—a coloring of the graph with a small though non-optimum number of colors. This along with the apparent impossibility of an exact solution has led to some interest in the problem of approximate graph coloring. The analysis of approximation algorithms for graph coloring started with the work of Johnson [25] who shows that a version of the greedy algorithm gives an  $O(n/\log n)$ -approximation algorithm for  $k$ -coloring. Wigderson [39] improved this bound by giving an elegant algorithm which uses  $O(n^{1-1/(k-1)})$  colors to legally color a  $k$ -colorable graph. Subsequently, other polynomial time algorithms were provided by Blum [9] which use  $O(n^{3/8} \log^{8/5} n)$  colors to legally color an  $n$ -vertex 3-colorable graph. This result generalizes to coloring a  $k$ -colorable graph with  $O(n^{1-1/(k-4/3)} \log^{8/5} n)$  colors. The best known performance guarantee for general graphs is due to Halldórsson [24] who provided a polynomial time algorithm using a number of colors which is within a factor of  $O(n(\log \log n)^2 / \log^3 n)$  of the optimum.

Recent results in the hardness of approximations indicate that it may be not possible to substantially improve the results described above. Lund and Yannakakis [33] used the results of Arora, Lund, Motwani, Sudan, and Szegedy [6] and Feige, Goldwasser, Lovász, Safra, and Szegedy [17] to show that there exists a (small) constant  $\epsilon > 0$  such that no polynomial time algorithm can approximate the chromatic number of a graph to within a ratio of  $n^\epsilon$  unless  $P = NP$ . Recently, Bellare and Sudan [7] showed that the exponent  $\epsilon$  in the hardness result can be improved to  $1/10$  unless  $NQP \neq \text{co-RP}$ , and to  $1/13$  unless  $NP = \text{co-RP}$ . However, none of these hardness results apply to the special case of the problem where the input graph is guaranteed to be  $k$ -colorable for some small  $k$ . The best hardness result in this direction is due to Khanna, Linial, and Safra [26] who show

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that it is not possible to color a 3-colorable graph with 4 colors in polynomial time unless  $P = NP$ .

In this paper we present improvements on the result of Blum. In particular, we provide a randomized polynomial time algorithm which colors a 3-colorable graph of maximum degree  $\Delta$  with  $\min\{\tilde{O}(\Delta^{1/3}), O(n^{1/4} \log n)\}$  colors; moreover, this can be generalized to  $k$ -colorable graphs to obtain a coloring using  $\tilde{O}(\Delta^{1-2/k})$  or  $\tilde{O}(n^{1-3/(k+1)})$  colors. Besides giving the best known approximations in terms of  $n$ , our results are the first non-trivial approximations given in terms of  $\Delta$ . Our results are based on the recent work of Goemans and Williamson [20] who used an algorithm for *semidefinite optimization problems* (cf. [22, 2]) to obtain improved approximations for the MAX CUT and MAX 2-SAT problems. We follow their basic paradigm of using algorithms for semidefinite programming to obtain an optimum solution to a relaxed version of the problem, and a randomized strategy for “rounding” this solution to a feasible but approximate solution to the original problem. Motwani and Naor [35] have shown that the approximate graph coloring problem is closely related to the problem of finding a CUT COVER of the edges of a graph. Our results can be viewed as generalizing the MAX CUT approximation algorithm of Goemans and Williamson to the problem of finding an approximate CUT COVER. In fact, our techniques also lead to improved approximations for the MAX  $k$ -CUT problem [18]. We also establish a duality relationship between the value of the optimum solution to our semidefinite program and the Lovász  $\vartheta$ -function [22, 23, 31]. We show lower bounds on the gap between the optimum solution of our semidefinite program and the actual chromatic number; by duality this also demonstrates interesting new facts about the  $\vartheta$ -function.

Alon and Kahale [4] use related techniques to devise a polynomial time algorithm for 3-coloring random graphs drawn from a “hard” distribution on the space of all 3-colorable graphs. Recently, Frieze and Jerrum [18] have used a semidefinite programming formulation and randomized rounding strategy essentially the same as ours to obtain improved approximations for the MAX  $k$ -CUT problem with large values of  $k$ . Their results required a more sophisticated version of our analysis, but for the coloring problem our results are tight up to poly-logarithmic factors and their analysis does not help to improve our bounds.

Semidefinite programming relaxations are an extension of the linear programming relaxation approach to approximately solving NP-complete problems. We thus present our work in the style of the classical LP-relaxation approach. We begin in Section 2 by defining a relaxed version of the coloring problem. Since we use a more complex relaxation than standard linear programming, we must show that the relaxed problem can be solved; this is done in Section 3.

We then show relationships between the relaxation and the original problem. In Section 4, we show that (in a sense to be defined later) the value of the relaxation bounds the value of the original problem. Then, in Sections 5, 6, 7, and 8 we show how a solution to the relaxation can be “rounded” to make it a solution to the original problem. Combining the last two arguments shows that we can find a good approximation. Section 3, Section 4, and Sections 5–8 are in fact independent and can be read in any order after the definitions in Section 2. In Section 9, we investigate the relationship between vector colorings and the Lovász  $\vartheta$ -function, showing that they are in fact dual to one another. We investigate the approximation error inherent in our formulation of the chromatic number via semi-definite programming in Section 10.

## 2 A Vector Relaxation of Coloring

In this section, we describe the relaxed coloring problem whose solution is in turn used to approximate the solution to the coloring problem. Instead of assigning colors to the vertices of a graph, we consider assigning ( $n$ -dimensional) unit vectors to the vertices. To capture the property of a coloring, we aim for the vectors of adjacent vertices to be “different” in a natural way. The vector  $k$ -coloring that we define plays the role that a hypothetical “fractional  $k$ -coloring” would play in a classical linear-programming relaxation approach to the problem. Our relaxation is related to the concept of an orthonormal representation of a graph [31, 22].

**Definition 2.1** Given a graph  $G = (V, E)$  on  $n$  vertices, a vector  $k$ -coloring of  $G$  is an assignment of unit vectors  $u_i$  from the space  $\mathbb{R}^n$  to each vertex  $i \in V$ , such that for any two adjacent vertices  $i$  and  $j$  the dot product of their vectors satisfies the inequality

$$\langle u_i, u_j \rangle \leq \frac{1}{k-1}.$$

The definition of an orthonormal representation [31, 22] requires that the given dot products be equal to zero, a weaker requirement than the one above.

## 3 Solving the Vector Coloring Problem

In this section we show how the vector coloring relaxation can be solved using semidefinite programming. The methods in this section closely mimic those of Goemans and Williamson [20].

To solve the problem, we need the following auxiliary definition.