

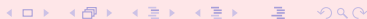
Algebraic Constructions for Expanders

Mikhail Volkov

Ural Federal University, Ekaterinburg, Russia



AAA88, June 20th, 2014

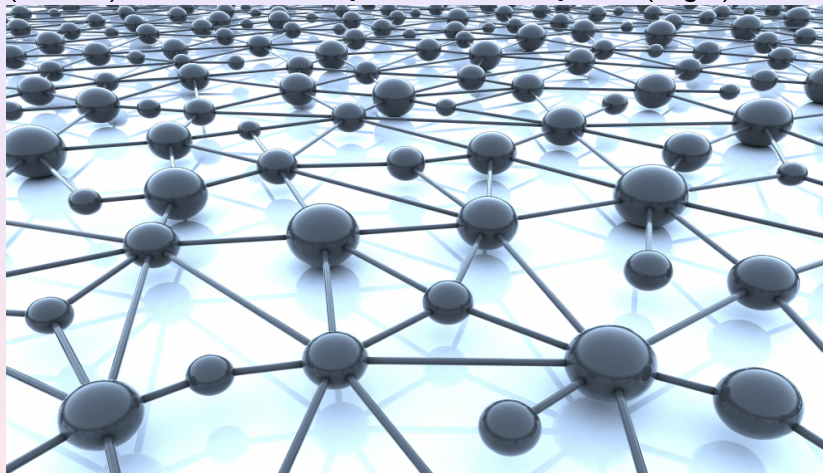


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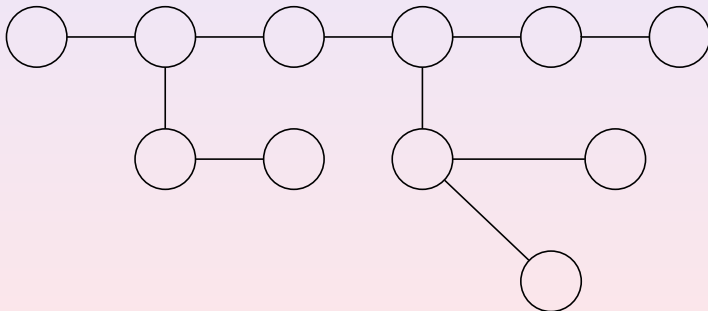


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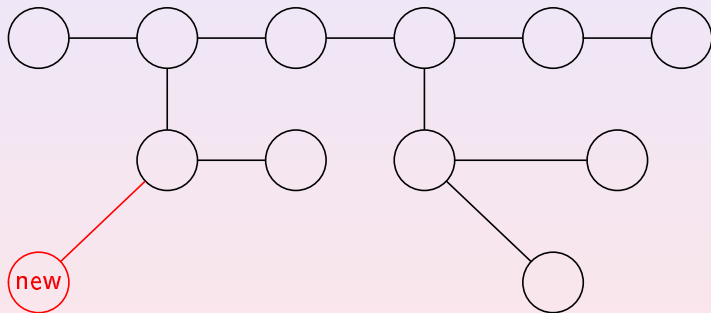
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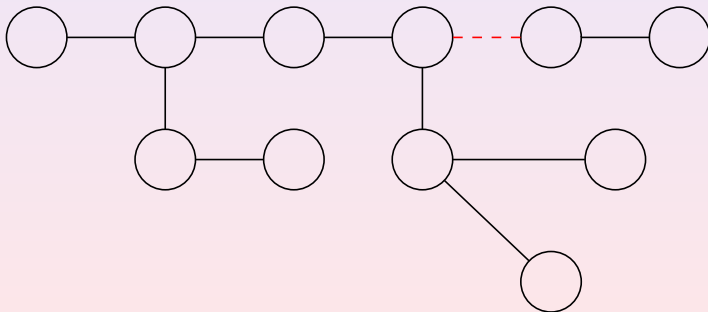


Thus, expanding a network with n nodes to one with twice as many nodes requires only n extra lines.

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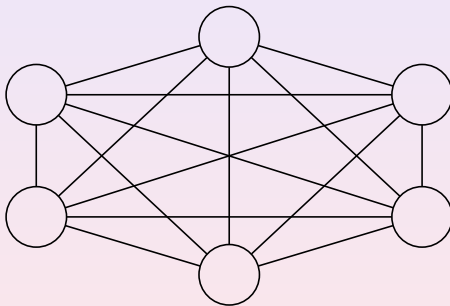
Suppose you want to establish a network consisting of many nodes (vertices) some of which may be connected by lines (edges). The graph must be connected. One possible solution: a **tree**.

Contra: bad connectivity — removing any edge disconnects the whole network:



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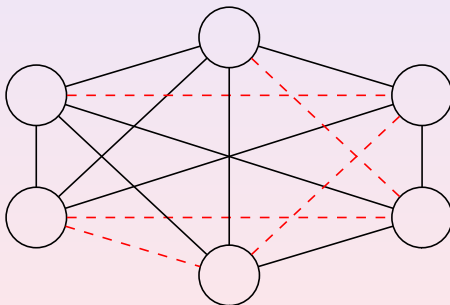
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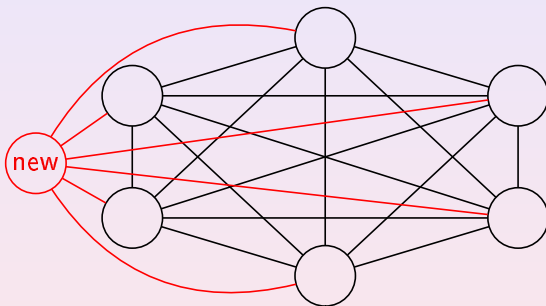
Pro: good connectivity — the network stays connected even after removing several edges:



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An “opposite” solution: a **clique** (complete graph).

Contra: high costs of expanding — n extra lines for each new node:



Thus, expanding a network with n nodes to one with twice as many nodes requires around $\frac{3}{2}n^2$ extra lines.

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How do we formalize good connectivity?

Towards A Formal Definition

Let $G = (V, E)$ be an undirected and d -regular graph; $|V| = n$; loops and multiple edges are allowed. For $S, T \subset V$, let $E(S, T)$ be the set of edges from S to T :

$$E(S, T) = \{(u, v) \mid u \in S, v \in T, (u, v) \in E\}$$

The **boundary** of $S \subset V$ is the set $\partial S = E(S, V \setminus S)$; the set of edges emanating from S to its complement.

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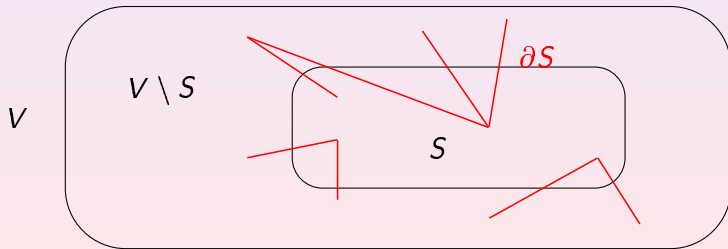
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Good connectivity \Rightarrow every “small” set of vertices has a relatively big boundary \Rightarrow the expansion ratio is not too small.

Definition

A sequence of d -regular graphs $\{G_i\}_{i \in \mathbb{N}}$ of size increasing with i is a **Family of Expander Graphs** if there exists $\varepsilon > 0$ such that $h(G_i) \geq \varepsilon$ for all i .

Families of expander graphs have found extensive and surprising applications in designing algorithms and error correcting codes; they have also been used in proofs of many important results in computational complexity theory, in cryptography, and also in several areas of pure mathematics and statistical physics.

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An Application: Error Correcting Codes

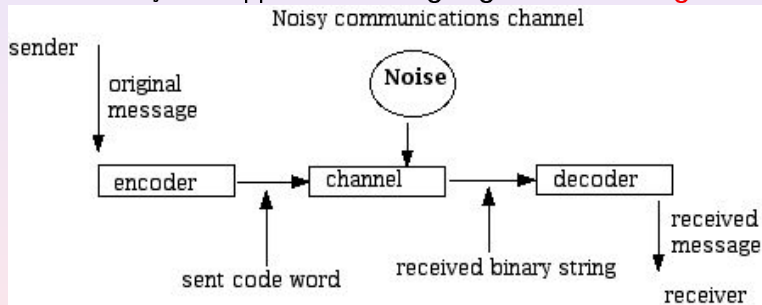
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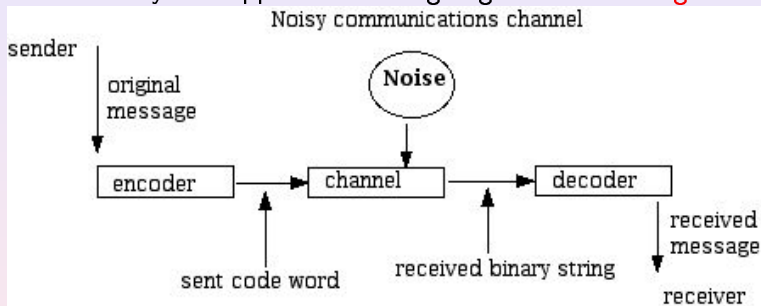
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Alice and Bob communicate over a noisy channel. A fraction p of the bits sent may be altered. What is the smallest number of bits that Alice can send, assuming she wants to communicate an arbitrary k -bit message, so that Bob should be able to unambiguously recover the original message?

Error Correcting Codes I

The basic idea (due to Claude Shannon) is to create a **code** $C \subset \{0, 1\}^n$ of size $|C| = 2^k$ such that the Hamming distance between any two strings in C is greater than $2pn$. (The **Hamming distance** $d_H(u, v)$ is the number of coordinates i such that $u_i \neq v_i$.) Alice and Bob agree about the **encoding**: a bijection $\varphi : \{0, 1\}^k \rightarrow C$. If Alice needs to send a message $x \in \{0, 1\}^k$, she transmits $\varphi(x) \in C$. Bob receives $y \in \{0, 1\}^n$ which is a corrupted version of $\varphi(x)$. Since $d_H(y, \varphi(x)) \leq pn$, Bob can recover $\varphi(x)$ as the string $z \in C$ that is closest to y and then find $x = \varphi^{-1}(z)$.

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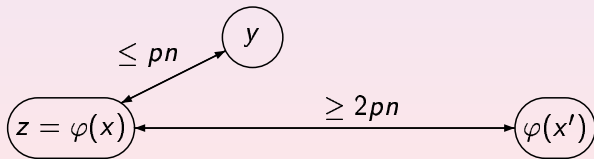
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For a code $C \subset \{0, 1\}^n$, its **rate** is

$$r = \frac{\log |C|}{n}$$

and its **(normalized) distance** is

$$\delta = \frac{\min_{c_1 \neq c_2 \in C} d_H(c_1, c_2)}{n}.$$

The distance of a code controls its power to overcome noise while its rate measures its efficiency in channel utilization.

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Problem

Is it possible to **explicitly** design arbitrarily large codes $\{C_k\}$ of size $|C_k| = 2^k$, with $r(C_k) \geq r_0$ and $\delta(C_k) \geq \delta_0$ for some **absolute** constants $r_0, \delta_0 > 0$?

Magic Bipartite Graphs

We utilize a **bipartite** version of expanders.

A bipartite graph $G = (L \cup R, E)$ is said to be **(n, d) -magic** if $|L| = n$, $|R| = 3n/4$, every left vertex has degree d , and the following two properties hold:

- (1) for every $S \subset L$ with $|S| \leq \frac{n}{10d}$, the set $\Gamma(S)$ of all neighbors of S in R is of size at least $\frac{5d}{8}|S|$;
- (2) for every $S \subset L$ with $\frac{n}{10d} < |S| \leq \frac{n}{2}$, the set $\Gamma(S)$ is of size at least $|S|$.

Observe that for every nonempty $S \subset L$ with $s = |S| \leq \frac{n}{10d}$, there is a vertex in R with exactly one neighbor in S . Indeed, there are exactly ds edges between S and $\Gamma(S)$. Since $|\Gamma(S)| \geq \frac{5ds}{8}$, the average number of neighbors in S that a vertex in $\Gamma(S)$ has is at most $ds : \frac{5ds}{8} = \frac{8}{5} < 2$. Since each vertex in $\Gamma(S)$ has at least one neighbor in S , some vertices must have exactly one neighbor in S .

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- (2) for every $S \subset L$ with $\frac{n}{10d} < |S| \leq \frac{n}{2}$, the set $\Gamma(S)$ is of size at least $|S|$.

Observe that for every nonempty $S \subset L$ with $s = |S| \leq \frac{n}{10d}$, there is a vertex in R with exactly one neighbor in S . Indeed, there are exactly ds edges between S and $\Gamma(S)$. Since $|\Gamma(S)| \geq \frac{5ds}{8}$, the average number of neighbors in S that a vertex in $\Gamma(S)$ has is at most $ds : \frac{5ds}{8} = \frac{8}{5} < 2$. Since each vertex in $\Gamma(S)$ has at least one neighbor in S , some vertices must have exactly one neighbor in S .

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Magic Graphs Provide Powerful Codes

Let $G = (L \cup R, E)$ be an (n, d) -magic graph. Define the $R \times L$ matrix $A = (a_{ij})$ by setting $a_{ij} = 1$ if $i \in R$ is adjacent to $j \in L$ and $a_{ij} = 0$ otherwise. Let $C = \{x \in \{0, 1\}^n \mid Ax = 0\}$.

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Thus, $d_H(c, 0) > \frac{n}{10d}$ for every $c \in C \setminus \{0\}$ whence

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One gets $\delta(C) = \frac{\min_{c_1 \neq c_2 \in C} d_H(c_1, c_2)}{n} > 1/10d$.

Low Density Parity Check Codes

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The corresponding LDPC codes give simultaneously the best coding parameters as well as best algorithmic performance.

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A sequence of d -regular graphs $\{G_i\}_{i \in \mathbb{N}}$ of size n_i increasing with i is a **Family of Expander Graphs** if there exists $\varepsilon > 0$ such that
$$h(G_i) = \min_{|S| \leq \frac{n_i}{2}} \frac{|\partial S|}{|S|} \geq \varepsilon \text{ for all } i.$$

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The existence of expanders is easy to prove: in fact, it can be shown that if one chooses for each i a **random** d -regular graph G_i with i vertices, then the sequence $\{G_i\}_{i \in \mathbb{N}}$ will be an expander family almost surely.

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However, it is not what we really need: the applications require **explicit** and **efficient** constructions for expander families.

Constructing Expanders: Margulis's Family

The first explicitly constructed family of expander graphs is due to Grigory Margulis, “Explicit Construction of Concentrators”, Prob. Per. Infor. 9(4):325–332, 1975 (in Russian). This is a family of 8-regular graphs M_n where n runs over the set of positive integers. The vertex set of M_n is $\mathbb{Z}_n \times \mathbb{Z}_n$; the neighbors of the vertex (x, y) are $(x \pm y, y)$, $(x \pm (y + 1), y)$, $(x, y \pm x)$, and $(x, y \pm (x + 1))$, where the arithmetics is modulo m . This is an example of a **very explicit** expander family.

Margulis had not provided any specific bound on $h(M_n)$; later it was shown that $h(M_n) \geq \frac{8-5\sqrt{2}}{2}$ (Gabber and Galil, 1981). Both Margulis's and Gabber–Galil's results are rather hard to prove and use some heavy mathematical machinery.

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Constructing Expanders: Another Family

Another family consists of 3-regular graphs I_p indexed by primes. The vertex set of I_p is \mathbb{Z}_p ; the neighbors of the vertex x are $x \pm 1$ and x^{-1} , where the arithmetics is modulo p and $0^{-1} := 0$. The proof relies on a deep result in number theory (Selberg's 3/16 theorem). Observe that the family I_p is in a sense less explicit than Margulis's family since no deterministic polynomial algorithm for generating large primes is known.

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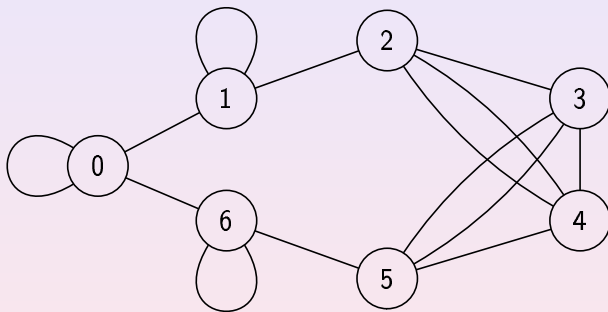
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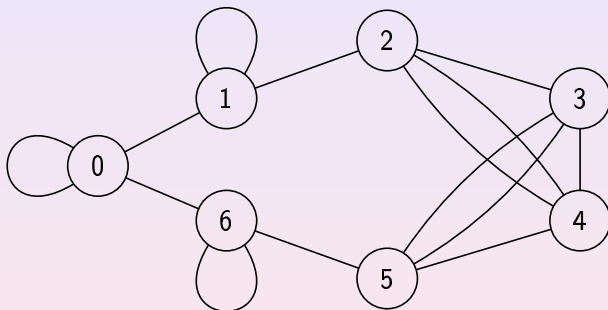
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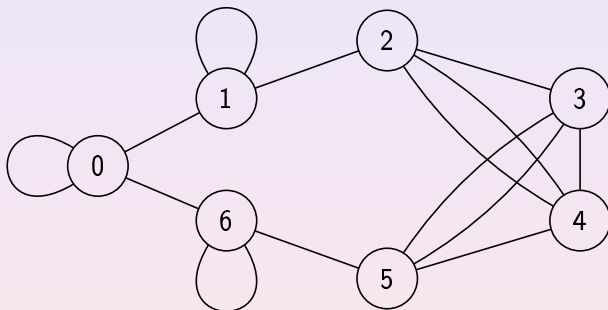
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Algebra Comes Into The Play: Cayley Graphs

It turns out that the **Cayley graphs** of finite groups form a powerful source for explicit constructions of expanders. Let H be a finite group and let S be a generating set for H . The Cayley graph $\text{Cay}(H, S)$ has H as the vertex set and a pair (g, h) is an edge in the graph if and only if $gs = h$ for some $s \in S$.

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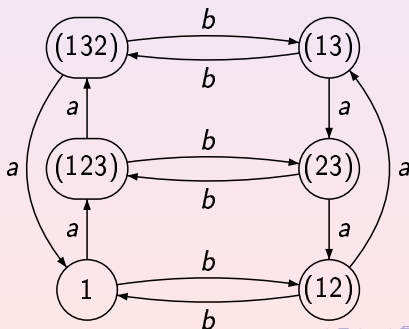
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Here is the Cayley graph of the symmetric group \mathbb{S}_3 with respect to its generating set $\{a = (123), b = (12)\}$:



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It turns out that the **Cayley graphs** of finite groups form a powerful source for explicit constructions of expanders. Let H be a finite group and let S be a generating set for H . The Cayley graph $\text{Cay}(H, S)$ has H as the vertex set and a pair (g, h) is an edge in the graph if and only if $gs = h$ for some $s \in S$. This definition yields a directed graph.

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Problem

For which finite groups H and their generating set S do the Cayley graphs $\text{Cay}(H, S)$ form a family of expander graphs?

All Groups Have Small Generating Sets

Observation

Every finite group H has a generating set of size $\log |H|$.

Proof: It is a simple greedy algorithm: having picked i elements g_1, g_2, \dots, g_i from H into the generating set, we list out the elements of the subgroup H_i generated by the set $\{g_1, g_2, \dots, g_i\}$. If $H_i \neq H$, we pick any $g_{i+1} \in H \setminus H_i$ as the next element in the generating set. The subgroup H_{i+1} generated by $\{g_1, \dots, g_i, g_{i+1}\}$ contains H_i properly whence $|H_{i+1}| \geq 2|H_i|$ by Lagrange's theorem. The process will stop after at most $\log |H|$ steps.

This bound is tight: the group $H = \mathbb{Z}_2^n$ has 2^n elements and dimension n as the vector space over \mathbb{Z}_2 . Hence every generating set of H contains at least $n = \log |H|$ elements.

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Alon–Roichman Theorem

Noga Alon and Yuval Roichman (“Random Cayley Graphs and Expanders”, Random Struct. Algorithms, 5(2):271–285, 1994) have proved that **every** finite group has a choice of logarithmically many generators which yield an expanding Cayley graph.

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Theorem (Alon and Roichman)

For every ε such that $1 > \varepsilon > 0$ there exists a constant $c(\varepsilon) > 0$ such that the following holds. Let H be a group of order n , and let S be a random set of $c(\varepsilon) \log n$ elements of H , then the Cayley graph $G = \text{Cay}(H, S)$ is an expander with $h(G) \geq \varepsilon$ almost surely. (The probability that G is such an expander tends to 1 as $n \rightarrow \infty$.)

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Recently, it has been shown by Arvind, Mukhopadhyay, and Nimbhorkar (“Erdős–Rényi sequences and deterministic construction of expanding Cayley graphs”, LATIN 2012: 37–48) that the Alon–Roichman theorem admits an efficient **derandomization**.

Alon–Roichman Theorem: Derandomization

Theorem (Derandomized version of the Alon–Roichman theorem)

For every ε such that $1 > \varepsilon > 0$ there exists a constant $c(\varepsilon) > 0$ such that the following holds. There exists a polynomial in n algorithm that, given a group H of order n , produces a generating set S of H of size $c(\varepsilon) \log n$ elements of H such that the Cayley graph $G = \text{Cay}(H, S)$ is an expander with $h(G) \geq \varepsilon$.

Thus, the algebraic approach can be used to produce **explicit** families of expanders.

What else should be done? If H is given in a more efficient way, we want the algorithm to work in time polynomial in the size of the **description** of H rather than the size of H itself. A more efficient way—as a group of permutations or matrices; if, say, H is specified as a subgroup of S_m , the algorithm is to be polynomial in m , etc.

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