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# Codes for Distributed Storage

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# Codes for Distributed Storage

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## ABSTRACT

In distributed data storage, information pertaining to a given data file is stored across multiple storage units or nodes in redundant fashion to protect against the principal concern, namely, the possibility of data loss arising from the failure of individual nodes. The simplest form of such protection is replication. The explosive growth in the amount of data generated on a daily basis brought up a second major concern, namely minimization of the overhead associated with such redundant storage. This concern led to the adoption by the storage industry of erasure-recovery codes such as Reed-Solomon (RS) codes and more generally, maximum distance separable codes, as these codes offer the lowest-possible storage overhead for a given level of reliability.

In the setting of a large data center, where the amount of stored data can run into several exabytes, a third concern

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arises, namely the need for efficient recovery from a commonplace occurrence, the failure of a single storage unit. One measure of efficiency in node repair is how small one can make the amount of data download needed to repair a failed unit, termed the repair bandwidth. This was the subject of the seminal paper by Dimakis *et al.* [50] in which an entirely new class of codes called regenerating codes was introduced, that within a certain repair framework, had the minimum-possible repair bandwidth. A second measure relates to the number of helper nodes contacted for node repair, termed the repair degree. A low repair degree is desirable as this means that a smaller number of nodes are impacted by the failure of a given node. The landmark paper by Gopalan *et al.* [72] focuses on this second measure, leading to the development of the theory of locally recoverable codes. The two events also led to the creation of a third class of codes known as locally regenerating codes, where the aim is to simultaneously achieve reduced repair bandwidth and low repair degree. Research in a different direction led researchers to take a fresh look at the challenge of efficient RS-code repair, and led to the identification of improved repair schemes for RS codes that have significantly reduced repair bandwidth.

This monograph introduces the reader to these different approaches towards efficient node repair and presents many of the fundamental bounds and code constructions that have since emerged. Several open problems are identified, and many of the sections have a notes subsection at the end that provides additional background.

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# 1

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## Introduction

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Given the failure-prone nature of a storage device, reliability against data loss has always been of paramount importance in the storage industry. In the early days, this was achieved through simple replication of data, for example, triple replication was a commonplace selection within the Hadoop distributed file system (HDFS). However, the explosive growth in the amount of data stored over the past couple of decades encouraged the industry to look for other means of ensuring reliability and having less storage overhead. Here, the class of maximum distance separable (MDS) codes are a natural choice as they incur the least amount of storage overhead for a given level of protection, measured in terms of the maximum number of node failures that can be tolerated.

### 1.1 Conventional Repair of an MDS Code

Many of the schemes employed in redundant array of independent disks (RAID) technology make use of MDS codes. An  $[n, k]$  MDS code is a block code of length  $n$  and dimension  $k$  over a suitably-defined finite field. To store data using an  $[n, k]$  MDS code, the data file is first partitioned into  $k$  equal-sized fragments, that are then stored on  $k$  distinct storage units. An additional set of  $r = (n - k)$  fragments

of redundant data are then created and stored on a further set of  $r$  storage units in such a manner that the contents of any  $k$  out of the  $n$  storage units suffice to recover the data. In this way, the contents of a file are efficiently stored in redundant fashion, across a set of  $n$  storage units. For example, RAID 6 makes use of a  $[5, 3]$  MDS code. Other examples of MDS codes that appear in the erasure coded-version HDFS-EC of HDFS are a  $[9, 6]$  MDS code as well as a  $[14, 10]$  code, the latter employed by Facebook. Throughout the monograph, we will alternately refer to a storage unit as a node.

Today's data centers store massive amounts of information, amounts that can run into several exabytes, i.e.,  $10^{18}$  bytes. While protection against data loss and maintaining low values of storage overhead continue to be of primary importance, a third concern has recently surfaced. This has to do with the efficiency with which a failed storage unit can be repaired. We will view the repair process as one in which a new storage unit, which we will term as the replacement node, is brought in as a substitute for a failed storage unit. The replacement node then draws from the partial or entire contents of all or a subset of the remaining  $(n - 1)$  nodes, and uses the data so received to replicate the contents of the original failed node.

As is well known, an  $[n, k, d_{\min}]$  code  $\mathcal{C}$  is protected against data loss if the number of node failures does not exceed  $(d_{\min} - 1)$ . For a given value of  $(d_{\min} - 1)$ , MDS codes in general, and Reed-Solomon (RS) codes in particular, have the least possible value of storage overhead given by  $\frac{n}{k} = \frac{n}{n - d_{\min} + 1}$ . This follows as the minimum distance  $d_{\min}$  of an MDS code satisfies  $d_{\min} = (n - k + 1)$ , which by the Singleton bound [156] is the largest value possible. In coding-theoretic terms, the problem of node repair is equivalent to recovery from erasure of a single code symbol. The most obvious approach is to invoke a parity-check (p-c) equation involving the erased code symbol. Let

$$\underline{c} = (c_1 \ c_2 \ \dots \ c_n)$$

be a code word and let us assume without loss of generality, erasure of the first code symbol  $c_1$ . Any p-c equation involving  $c_1$  of the form

$$\sum_{i=1}^n h_i c_i = 0, \quad h_1 \neq 0,$$

is associated to a codeword

$$\underline{h} = (h_1 \ h_2 \ \dots \ h_n)$$

belonging to the  $[n, n - k]$  dual code  $\mathcal{C}^\perp$ . In the case of an MDS code  $\mathcal{C}$ , its dual  $\mathcal{C}^\perp$  is also an MDS code and hence has parameters  $[n, n - k, k + 1]$ . Thus any codeword  $\underline{h}$  in  $\mathcal{C}^\perp$  has Hamming weight  $w_H(\underline{h}) \geq k + 1$ . Thus if a p-c equation

$$\sum_{i=1}^n h_i c_i = 0,$$

is used to recover the code symbol  $c_1$ , then we have

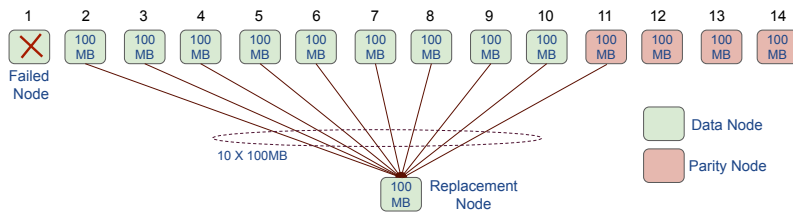
$$c_1 = \sum_{i=2}^n \left( \frac{-h_i}{h_1} \right) c_i, \quad (1.1)$$

with at least  $k$  terms of the form  $\frac{-h_i}{h_1}$  on the right side being nonzero.

## 1.2 Regenerating Codes and Locally Recoverable Codes

For the operation of a data center, equation (1.1) has two implications. Firstly, that the replacement of the failed node must necessarily contact  $k$  “helper nodes”, i.e., nodes that store the code symbols  $\{c_i \mid \frac{h_i}{h_1} \neq 0\}$ . Secondly, equation (1.1) suggests that each helper node must transfer its entire contents (represented by  $c_i$ ) for repair of the failed node. The number of helper nodes contacted (at least  $k$  in the case of an MDS code) is called the repair degree of the code. The total amount of data downloaded for repair of the failed node is termed the repair bandwidth. In the case of an MDS code, it is clear that the repair bandwidth is at least  $k$  times the amount of data stored in the failed node.

This is illustrated below in the case of an  $[14, 10]$  MDS code. Assume a data file of size equal to 1 GB. The data file is partitioned into 10 fragments, each of size 100 MB and each data fragment is stored in a different node. Four parity nodes are then created, corresponding to the four parity symbols of the MDS code. The contents of the 14 nodes can be regarded as the layering of  $10^8$  codewords, each belonging to the  $[14, 10]$  MDS code over  $\mathbb{F}_{28}$ . Fig. 1.1 shows repair of a failed node. As



**Figure 1.1:** Illustrating the repair degree and repair bandwidth involved in the conventional repair of a failed node in a  $[14, 10]$  MDS code

can be seen, there are  $k = 10$  helper nodes corresponding to nodes 2 through 11 and each helper node passes on the 100 MB of data or parity stored in the respective node, to the repair center. Thus in this case the repair degree equals 10 and the repair bandwidth equals  $10 \times 100 \text{ MB} = 1 \text{ GB}$ .

Seminal papers by Dimakis *et al.* [50] and Gopalan *et al.* [72] heralded the theory of two entirely new classes of erasure-recovery codes, termed as regenerating codes (RGCs) and locally recoverable codes (LRCs), that were designed with the express aim of lowering the repair bandwidth and repair degree respectively. The development of the theory of RGCs and LRCs also led to the creation of a class of codes termed as locally regenerating codes by Kamath *et al.* [117] and Rawat *et al.* [189], where the aim is to simultaneously achieve reduced repair bandwidth and low repair degree. Research in a slightly different direction, pioneered by Shanmugam *et al.* [215] and Guruswami and Wootters [85], led to a re-examination of the repair bandwidth of RS codes and the design of more efficient repair schemes that permitted node repair with reduced repair bandwidth.

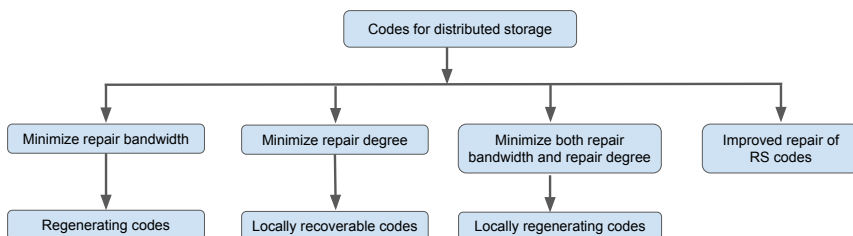
As an indication of the kind of impact that research on the topics of RGCs and LRCs has had on the development of coding theory, we note that papers reporting research in this area have received many best paper awards over the years. The list includes [50], [62], [72], [103], [137], [185], [228], [229], [237], [255].



### 1.3 Overview of the Monograph

This monograph presents an overview of how research on the topic of codes for distributed storage has evolved in a certain direction (see Fig. 1.2 for an overview of topics covered here). There have been several excellent prior surveys on the topic, including those found in [46], [51], [136], [145]. Additionally, concise surveys by the authors of the present monograph can be found in [10], [178].

Given the vast nature of the literature on the topic of codes for distributed storage, we have undoubtedly missed many papers that have made a strong contribution. We apologize in advance to the authors of these papers for the inadvertent omission. Furthermore, as can be seen from the listing of topics in Fig. 1.2, our focus here is only on certain specific approaches to coding for distributed storage.



**Figure 1.2:** An overview of the coverage of codes for distributed storage in this monograph.

**MDS Codes** Section 2 provides background on MDS, RS codes and a generalization of RS codes known as generalized RS (GRS) codes.

**Regenerating Codes** The next seven sections deal with RGCs. The definition of an RGC along with a fundamental upper bound on file size is presented in Section 3. The bound reveals that there is a tradeoff between the storage overhead and the repair bandwidth. Sections 4 and 5 present constructions for the two main classes of RGCs, namely minimum bandwidth regenerating (MBR) codes and minimum storage regenerating (MSR) codes, that lie at the two ends of the storage-repair

bandwidth tradeoff. The tradeoff itself is explored in the following section, Section 6. Constructions for RGCs that lie on interior points of the tradeoff are presented in Section 7. The sub-packetization level of an RGC may be regarded as denoting the number of symbols stored per node. An alternate viewpoint is to regard a regenerating code as a code over a vector symbol alphabet of the form  $\mathbb{F}_q^\alpha$ , with  $\alpha$  denoting the sub-packetization level. Lower values of sub-packetization are desirable in practice, as a large sub-packetization level, apart from increasing the complexity of implementation, also limits the smallest size of a file that can be stored. Section 8 presents lower bounds on the sub-packetization level of an MSR code.

Several variants of RGCs have been explored in the literature. Piggy-back codes,  $\epsilon$ -MSR codes and the codes of Li-Liu-Tang, are MDS codes that have reduced repair bandwidth and much smaller sub-packetization level. Cooperative RGCs explore the cooperative repair of a set of  $t > 1$  failed nodes. Secure RGCs are designed to provide security in the presence of an eavesdropper or an active adversary. Rack-aware RGCs are designed to minimize the amount of cross-rack repair data that is transferred. An erasure-recovery code is said to possess the repair-by-transfer (RBT) property, if it enables repair of a failed node without need for computation at either helper or replacement node. Fractional repetition codes form a class of erasure-recovery codes that possesses the repair-by-transfer property and can be viewed as a generalization of a class of RBT MBR codes. The former codes potentially offer reduced storage overhead at the cost of reduced freedom in the selection of helper nodes. All these variants of RGCs can be found discussed in Section 9.

**Locally Recoverable Codes** As noted above, the need for repair of a failed node with low degree prompted the creation of LRCs. Section 10 introduces LRCs and presents an upper bound on the rate and minimum distance of an LRC as well as optimal code constructions.

One means of handling the simultaneous failure of several nodes with low repair degree is to make the local codes that are at the core of an LRC more powerful. There are other approaches however, each with its own advantages and disadvantages. The three sections that follow present these other approaches. Availability codes, discussed in

Section 11, represent one such example. This class of codes has the additional feature that in the case of a single erased node, there are multiple, node-disjoint means of recovering from the node failure. This can be a very useful feature to have in practice, particularly as a means of handling cases when there are multiple simultaneous demands for the data contained within a particular node.

Sequential-recovery LRCs place the least stringent conditions on an LRC for the local recovery from multiple erasures, and consequently, have smallest possible storage overhead. These are discussed in Section 12. If an LRC has large block length and small value of repair degree  $r$ , and a particular local code is overwhelmed by erasures, the only option is to fall back on the properties of the full-length block code to recover from the erasure pattern, leading to a sharp increase in the repair degree. Codes with hierarchical locality, discussed in Section 13, are designed to address this situation, provide layers of local codes having increasing block length as well as erasure-recovery capability, and permit a more graceful degradation in repair degree with an increasing number of erasures.

Maximally recoverable codes (MRCs), discussed in Section 14, may be regarded as the subclass of LRCs that are as MDS as possible in the sense that every set of  $k$  columns of the generator matrix of an MRC is a linearly independent set, unless the locality constraints imposed make it impossible for this to happen. An MRC is maximal in the sense that if an MRC is not able to recover from an erasure pattern, then no other code satisfying the same locality constraints can possibly recover from the same erasure pattern.

**Locally Regenerating Codes** Section 15 introduces a class of codes in which the local codes are themselves regenerating codes. As a result, these codes simultaneously offer both low repair degree as well as low repair bandwidth.

**Improved Repair Schemes for RS Codes** The evolution of RGCs and LRCs spurred researchers to take a fresh look at the challenge of efficient RS-code repair and led to the identification of improved repair

schemes for RS codes having significantly reduced repair bandwidth. These developments are described in Section 16.

**Codes in Practice** The final section, Section 17, discusses the impact that the theoretical developments discussed in this monograph have had in practice.

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