# In Search of I/O-Optimal Recovery from Disk Failures

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# The Quest for Reliability

- How do we ensure data reliability
  - Replication (easy but inefficient)
  - Erasure Coding (complex but efficient)
- Storage space was a relatively expensive resource
- MDS codes used to achieve optimal storage efficiency for a given fault tolerance

# Times (& workloads) change...

- Emergence of workloads/scenarios where recovery dictates overall I/O performance
  - System updates
  - Deep archival stores
- A traditional k-of-n MDS code would require k I/Os to recover from a single failure
- Can we do better than k I/Os?



## Our Approach

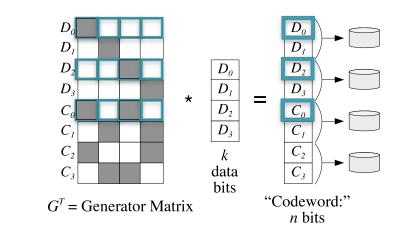
- Existing approaches use matrix inversion
  - Represents one possible solution, not necessarily the one with the lowest I/O cost
- We have come up with a new way to recover lost data which minimizes the number of I/Os needed for recovery
  - Its computationally intensive, though all common failure scenarios can be computed apriori
  - Applicable to any matrix based erasure code



## **Decoding equations**

 Collection of bits in the codeword whose corresponding rows in the Generator matrix sum to zero

 We can decode any one bit as long as the remaining bits in that equation are not lost



•  $\{D_0, D_2, C_0\}$  is a decoding equation



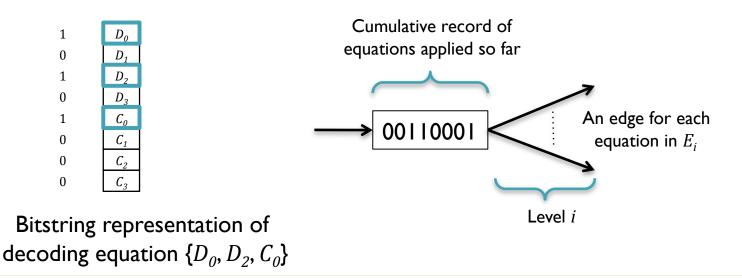
# Algorithm

- Finds a decoding equation for each failed bit while minimizing the number of total elements accessed
- Enumerate all decoding equations and for each  $f_i \in F$ , determine set  $E_i$ 
  - F is set of failed bits
  - $E_i$  is set of decoding equations which include  $f_i$
- Goal: Select one equation  $e_i$  from each  $E_i$  such that  $|\bigcup_{i=1}^{|F|} e_i|$  is minimized



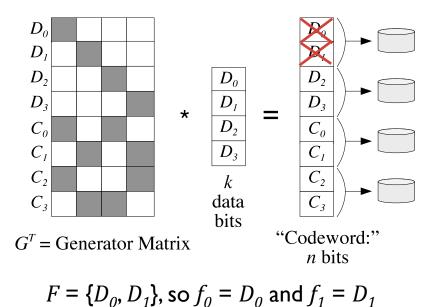
# Algorithm(contd.)

- Finding all such  $e_i$  is NP-Hard but we can convert equations into a directed weighted graph and find the shortest path
  - $\circ$  Pruning makes it feasible to solve for practical values of |F| and  $|E_i|$





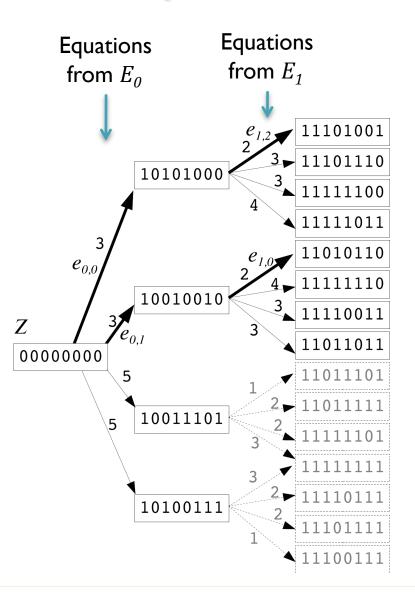
## Failure Example



| $E_0$                | $E_1$                |  |
|----------------------|----------------------|--|
| $e_{0,0} = 10101000$ | $e_{1,0} = 01010100$ |  |
| $e_{0,1} = 10010010$ | $e_{1,1} = 01101110$ |  |
| $e_{0,2} = 10011101$ | $e_{1,2} = 01100001$ |  |
| $e_{0,3} = 10100111$ | $e_{1,3} = 01011011$ |  |
|                      |                      |  |
| Recovery options     | Recovery options     |  |
| for $f_0$            | for $f_1$            |  |
|                      |                      |  |

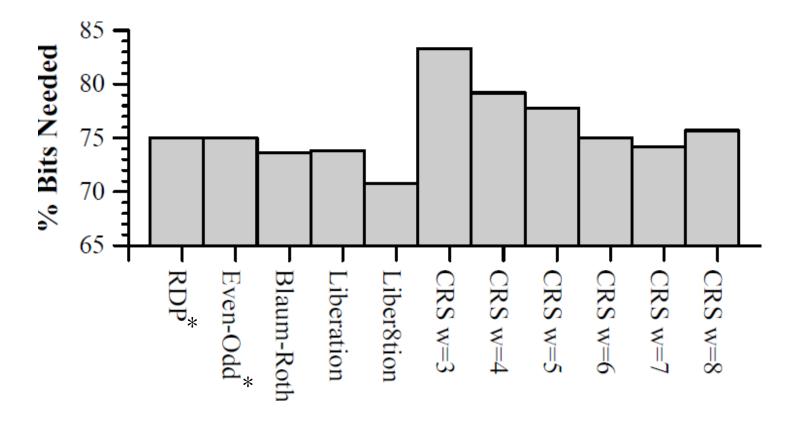


#### **Directed Graph**





#### Comparison



\* Results similar to existing work

# Looking for I/O-Optimal Recovery beyond MDS codes..

- So we have found a way to make recovery I/O of matrix based MDS codes optimal
  - How about non-MDS codes?
- Can we achieve better recovery I/O performance at the cost of lower storage efficiency?
- Replication and MDS codes seem to be the two extrema in this tradeoff



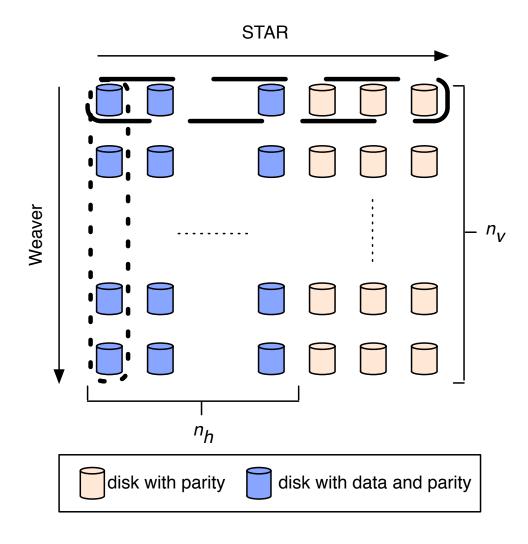


## **GRID** codes

- GRID codes allow two (or more) erasure codes to be applied to the same data, each in its own dimension
- To achieve low recovery I/O coupled with high fault tolerance, we use
  - Weaver codes: recovery I/O independent of stripe size
  - STAR codes: builds up redundancy
- All single failures can be recovered in the Weaver dimension



## **GRID**(Weaver, STAR)



## Storage efficiency vs recovery I/O

|                | l/Os for<br>recovery | # disks<br>accessed | Storage<br>efficiency | Fault<br>tolerance |
|----------------|----------------------|---------------------|-----------------------|--------------------|
| GRID(S,W(2,2)) | 4                    | 3                   | 31.25%                | II                 |
| GRID(S,W(3,3)) | 6                    | 3                   | 31.25%                | 15                 |
| GRID(S,W(2,4)) | 7                    | 4                   | 20.8%                 | 19                 |

|           | I/Os for<br>recovery | # disks<br>accessed | Storage<br>efficiency | Fault<br>tolerance |
|-----------|----------------------|---------------------|-----------------------|--------------------|
| RS(20,31) | 20                   | 20                  | 60.6%                 |                    |
| RS(30,45) | 30                   | 30                  | 66.6%                 | 15                 |
| RS(30,49) | 30                   | 30                  | 61.2%                 | 19                 |

## Future Work & Open Questions...

• We conjecture that there is a fundamental tradeoff between storage efficiency and recovery I/O

• Formal relationship?

- Programmatic search of generator matrices with optimal recovery I/O schedules
  - Large search space but reasonably sized systems (100 disks?) may be a feasible option

## Thank you!