



# Data Shaping for Improving Endurance and Reliability in Sub-20nm NAND

Eran Sharon, Stella Achtenberg, Idan Alrod, Avi Klein, Alon Eyal  
*Intelligent Memory Systems, SanDisk Corp.*

*August 2014*

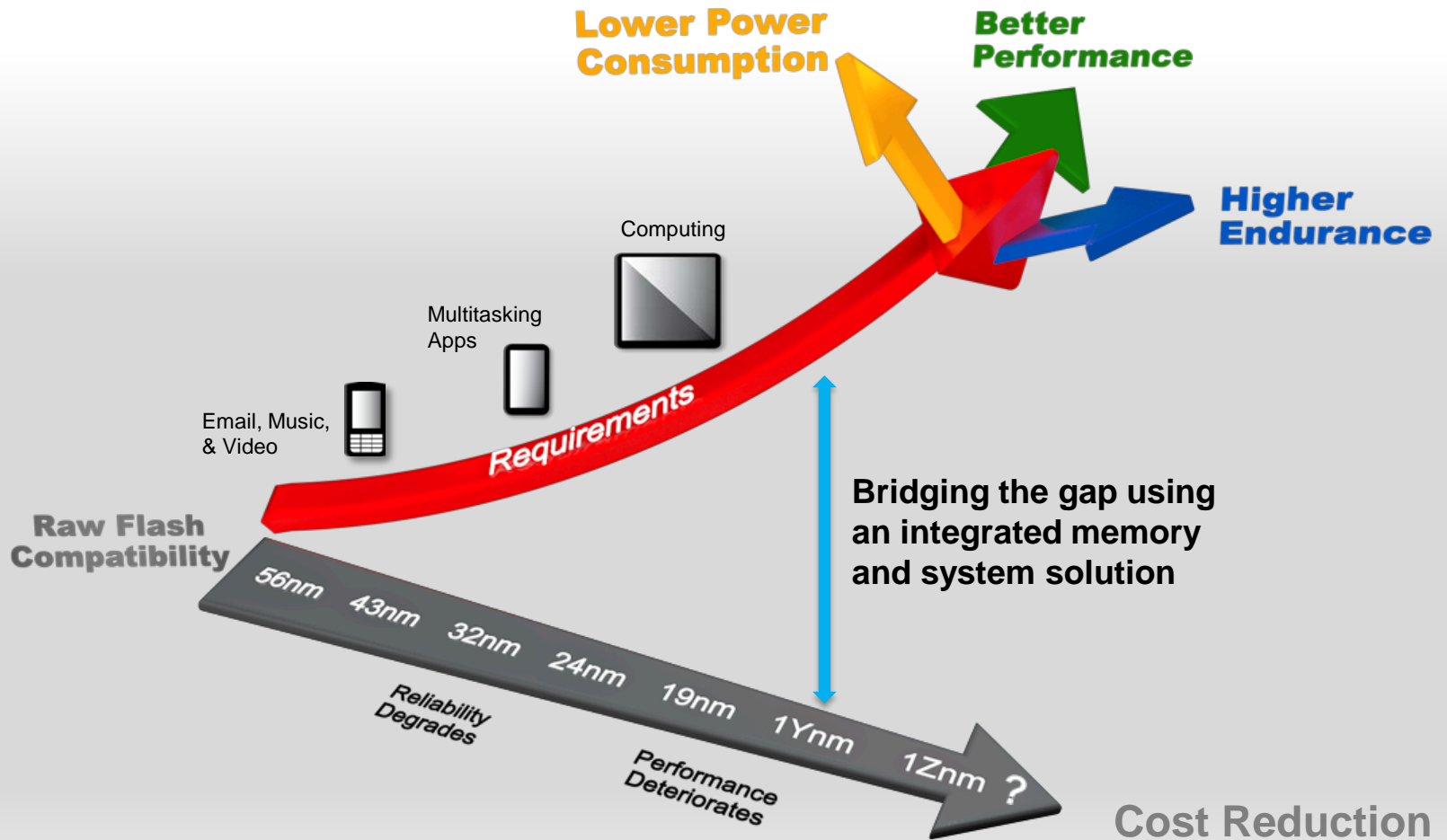


# Outline

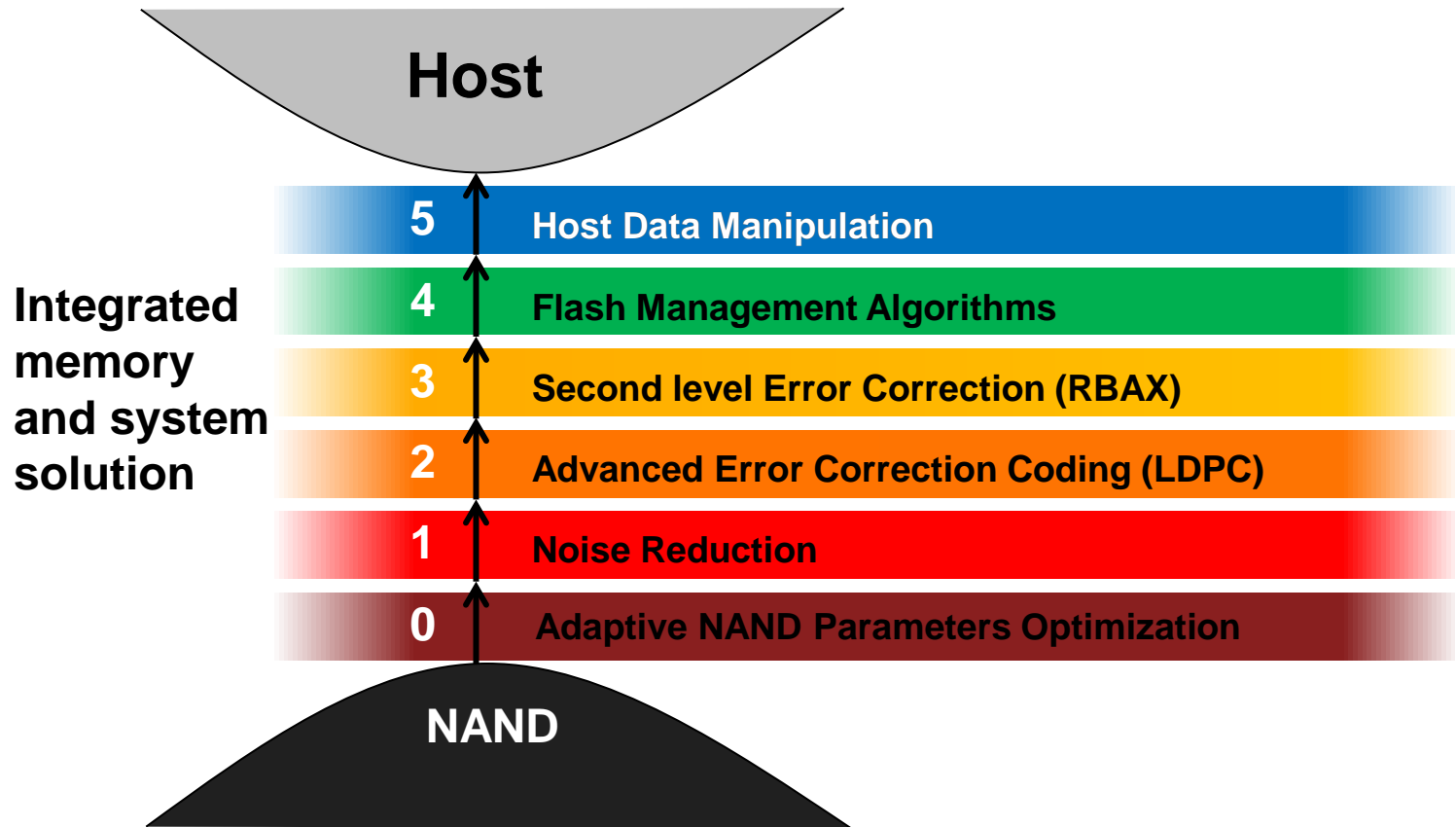
- Gap Between Product Requirements and Technology Capability
- Multi Tier Integrated System & Memory Solution - Recap
- Low Data Entropy in Typical Hosts – Unrealized Potential
- Leveraging Low Host Data Entropy for Data Shaping
- Data Shaping Effect on Memory Endurance and Reliability
- Practical Approaches for Data Shaping
- Eco-System Consideration
- Summary

*Disclaimer: This tutorial provides an overview of various techniques and concepts, some or all of which may not necessarily reflect what SanDisk is actually using in their products.*

# Gap Between Raw Memory Capability and Applications Requirements



# Integrated Memory & System Solution



# Low Data Entropy in Typical Hosts – Unrealized Potential

- Examination of typical hosts data traffic shows that significant fraction of the data is of low entropy, having many repetitive data patterns



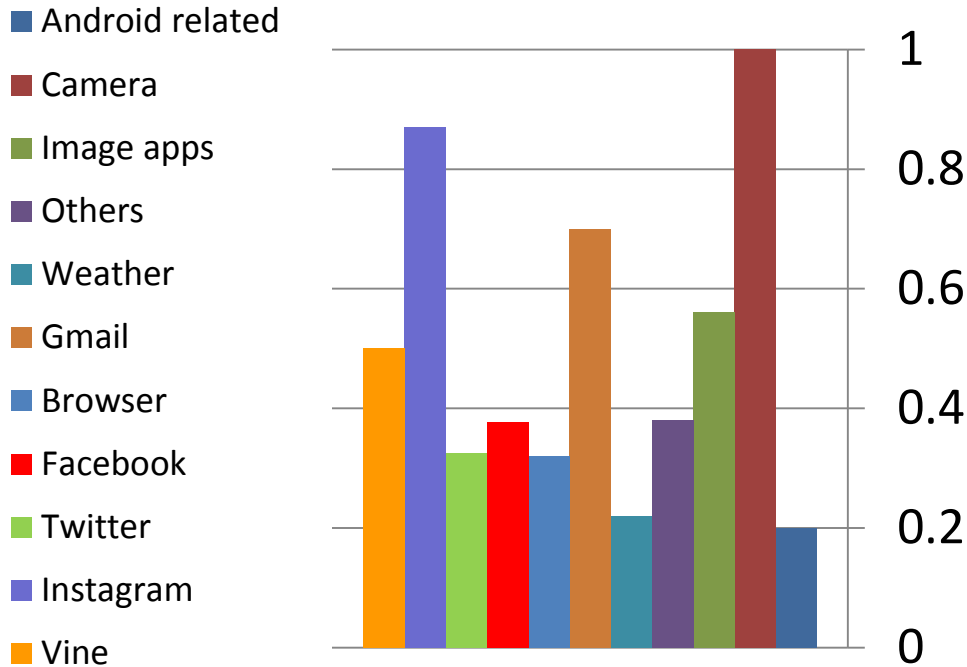
**Entropy** – measure of data randomness

- **Unrealized potential:** the inherent “redundancy” in the host data can be leveraged for improving endurance, reliability, performance and power, by manipulating host data:
  - **Deduplication**
  - **Compression**
  - **Data Shaping – a.k.a Endurance Coding**

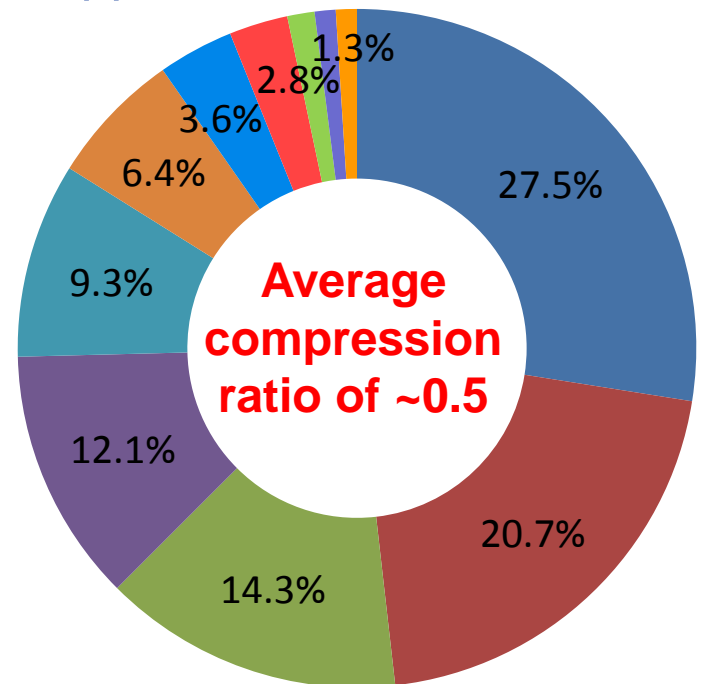
# Analyzing mobile traffic of a sample user

- Record the traffic between the host and the controller during sample usage.
- Platform: Android 4.2.2. based Smart Phone
- Average compression ratio of ~50%**

### Compression ratio



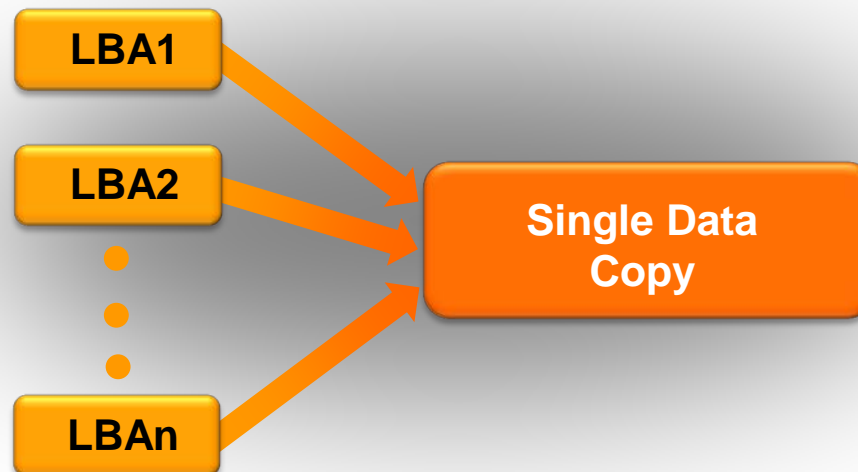
### Applications traffic distribution



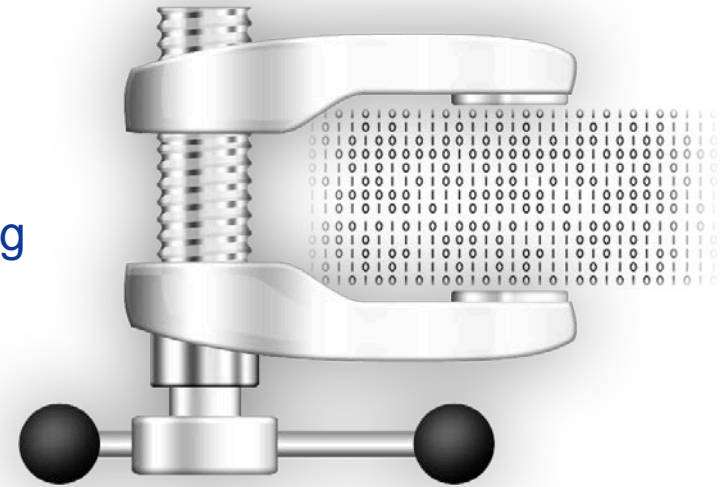
**Average  
compression  
ratio of ~0.5**

## Deduplication

- Specialized data compression technique for eliminating duplicate copies of repeating data
  - Manage multiple pointers to a single stored copy
- Operates on the file system level
  - Less suitable for eMMC level implementation (operates on 4KB sectors, unaware of files)
- Highly suitable for enterprise backup applications



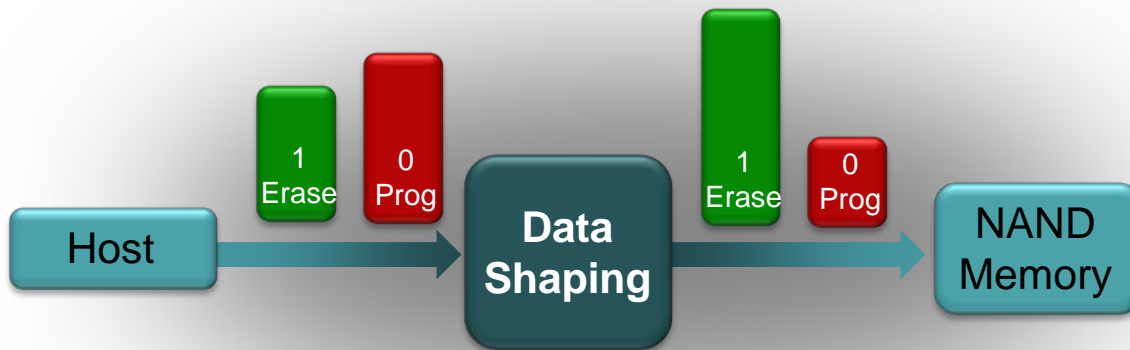
- Typical traffic in Mobile applications is highly compressible
- Compression can provides significant endurance & performance gains
  - Less P/E cycles per GygaByte (GB) written
  - Increases the effective memory over provisioning
    - Improved garbage collection efficiency
    - Reduced write amplification
    - Performance stability
- System level considerations – impact on controller complexity power & cost
  - Requires significant changes in the Flash Management – mapping the logical address space into a variable physical space
  - High throughput, low power and cost compression engine design is challenging





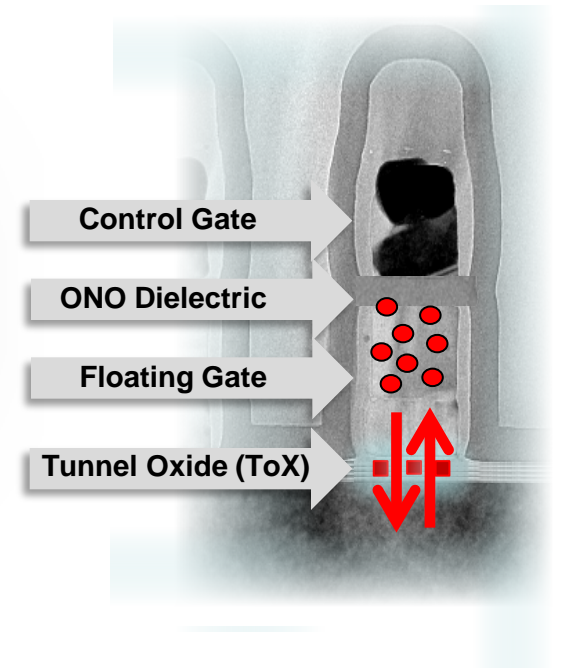
# Data Shaping (“Endurance Coding”)

- **The Challenge:** Increasing Endurance
- **The Means:** Data Shaping – transform input data sequence into a “shaped” data sequence which induces less wearing when programmed to the NAND.
- **SLC Example:** transform the input data into shaped data having **less 0’s**



## Minimize number of programmed cells per P/E cycle

- Minimize average number of electrons tunneling in & out of the ToX per P/E cycle
- Slow down ToX quality degradation





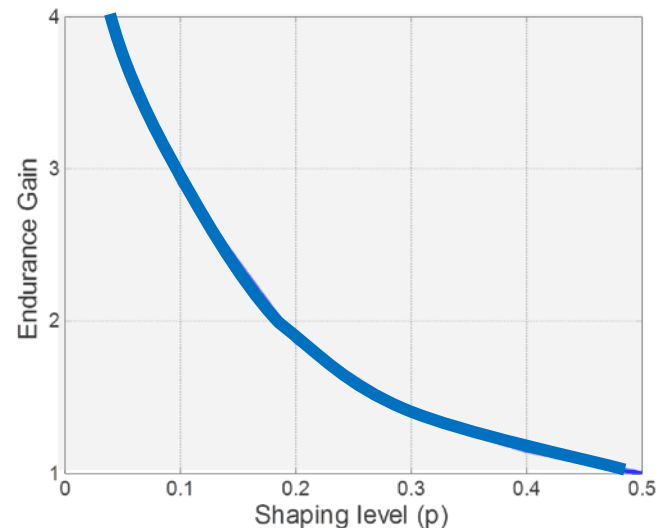
# Achievable Endurance Enhancement via Data Shaping

- Cell wearing is proportional to the probability  $p$  of the cell to be programmed
- Simplified model:**
  - $W_E$  – Wearing of an erased cell during a P/E cycle
  - $W_P$  – Wearing of a programmed cell during a P/E cycle
  - $W_P \gg W_E$  (Much more electrons passing through ToX for programmed cells)
  - Total wearing as a function of the shaping level  $p$ :  $W(p) = (1-p) \cdot W_E + p \cdot W_P$
  - Endurance gain due to using Shaped data ( $p < 0.5$ ) vs. Scrambled data ( $p = 0.5$ ):

$$\text{Gain}(p) = \frac{W(0.5)}{W(p)} = \frac{\alpha + 0.5}{\alpha + p},$$

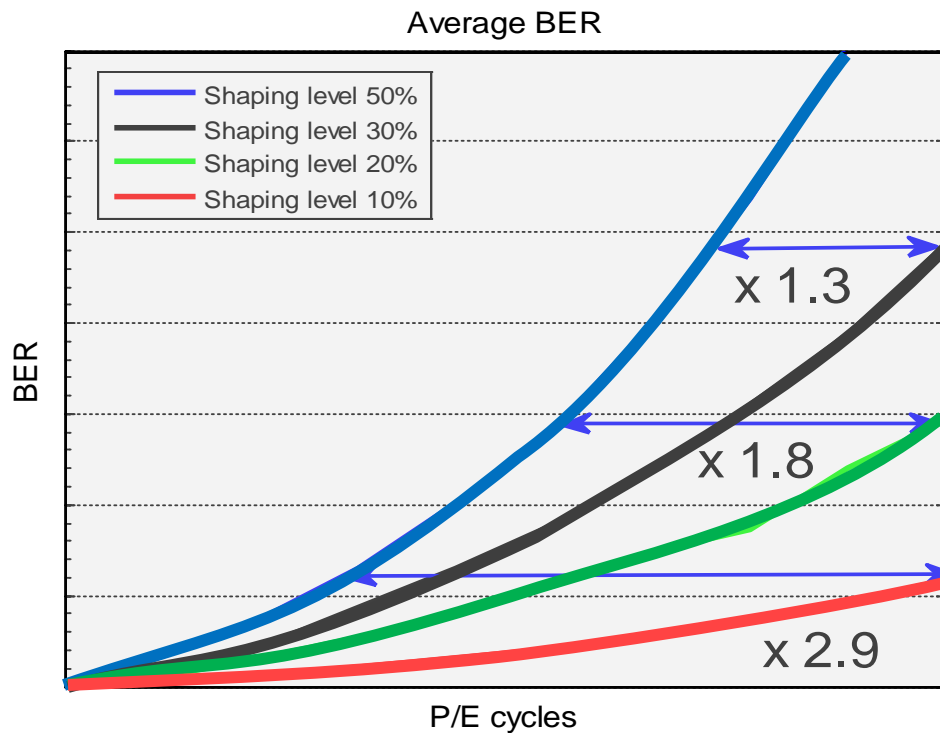
$$\text{where } \alpha = \frac{W_E}{W_P - W_E}$$

( $\alpha$  is specific per memory technology)



# Achievable endurance Enhancement via Data Shaping - Empirical measurements

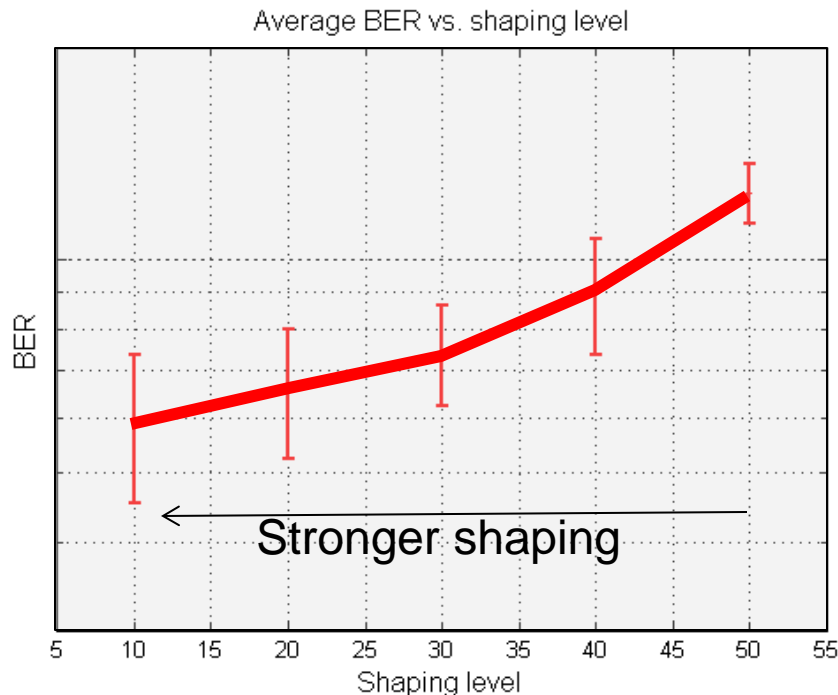
- **Objective:** measure the cumulative wearing reduction effect of shaping
- **Experiment:**
  - Cycle the memory with shaped data (different shaping levels, up to different cycles)
  - At the last cycle, program with scrambled data ( $p = 0.5$ ) and measure BER
  - Compare BER deterioration with cycling as a function of the average shaping level



Measured endurance gain increases as the fraction of programmed cells ( $p$ ) reduces

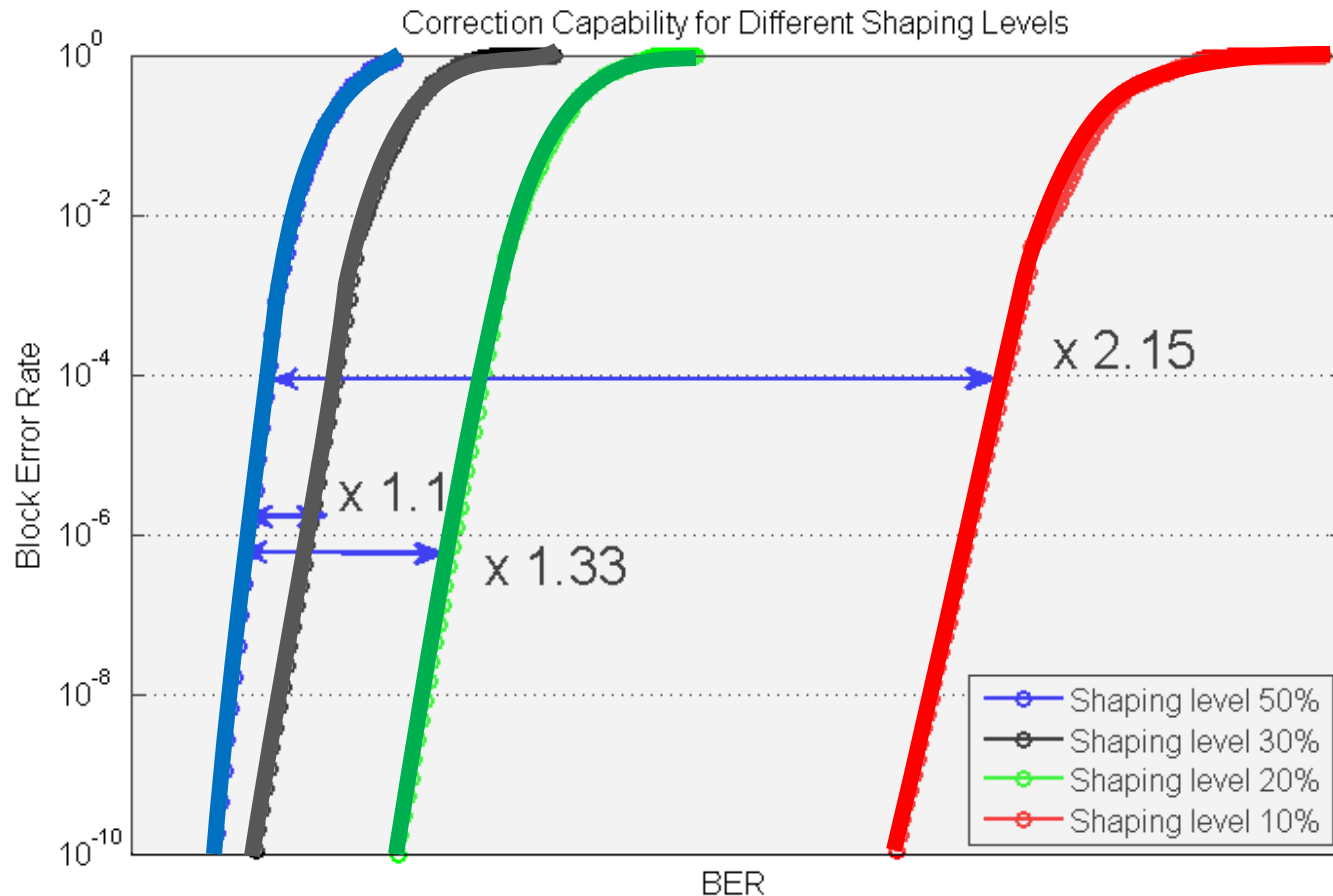
# “Noise” Reduction due to Data Shaping - Empirical measurements

- **Objective:** measure the local BER reduction effect of shaping
- **Experiment:**
  - Cycle the memory with scrambled data
  - Program with shaped data at the last cycle and measure BER
  - Compare BER level at the last cycle as a function of the shaping level  $\rho$ .



# Effect of Shaping on Error Correction Capability

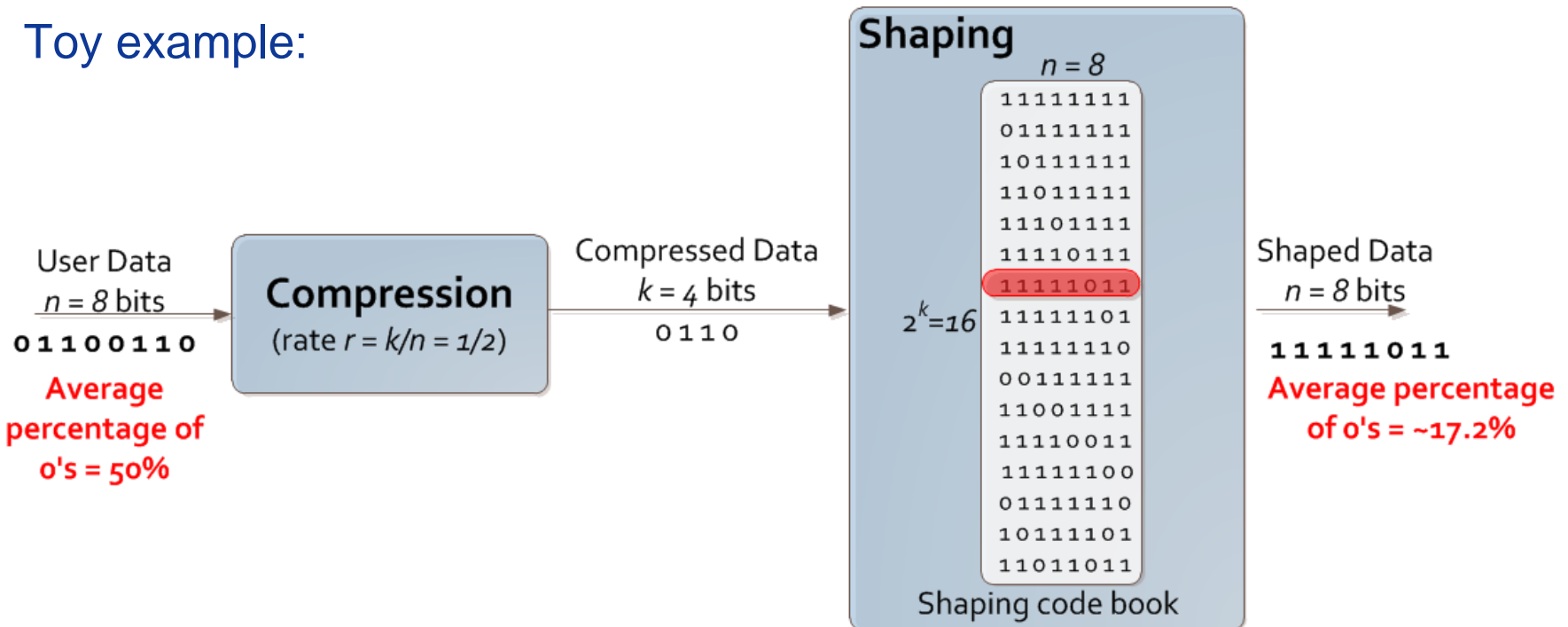
- Decoder correction capability can be significantly improved for shaped data
- Adjust decoder soft input metrics based on the estimated shaping level



# Leveraging low host data entropy for shaping

- Compression – Expansion approach
  - Compress:  $n$  user bits into  $k$  compressed bits
  - Expand:  $k$  compressed bits into  $n$  shaped bits

- Toy example:



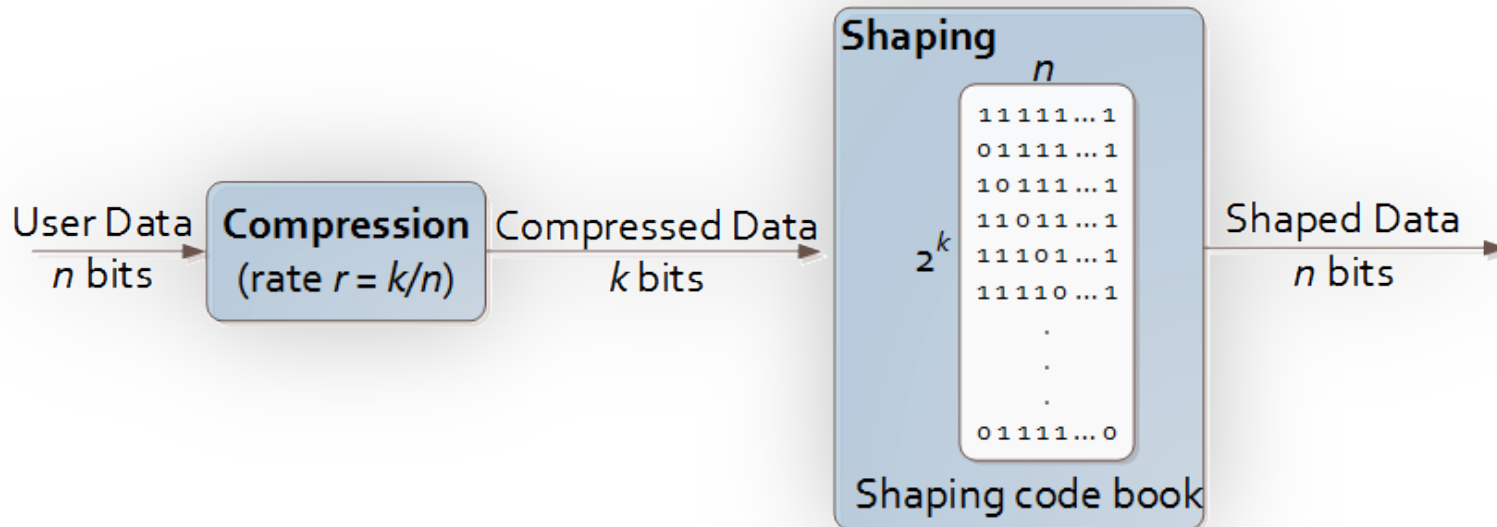
# Achievable Shaping Level as a function of Data Compressibility

- What is the achievable shaping level of the Compression- Expansion approach?
- Assume data compression rate  $r=k/n$ , an optimal shaping code book will include all the  $2^k$  length  $n$  binary vectors having a minimal number of 0's  $j$ , up to at most  $m$ .

$$\Rightarrow 2^k = \sum_{j=0}^m \binom{n}{j} \underset{n \rightarrow \infty}{\cong} 2^{n \cdot H_b\left(\frac{m}{n}\right)} \Rightarrow H_b\left(\frac{m}{n}\right) = \frac{k}{n} = r$$

where  $H_b(p) = -p \log_2(p) - (1-p) \log_2(1-p)$  is the binary entropy function

$\Rightarrow$  The achievable shaping level of an optimal scheme is:  $p = \frac{m}{n} = H_b^{-1}(r)$

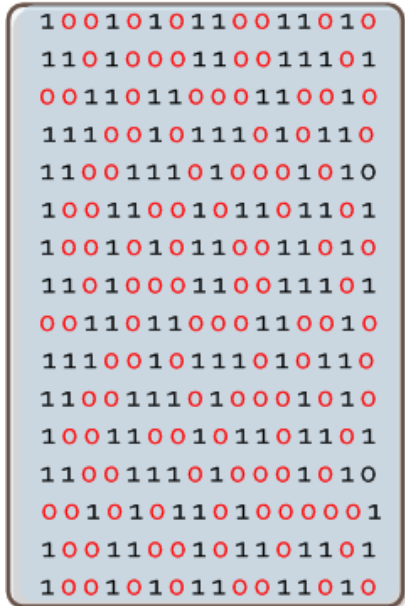




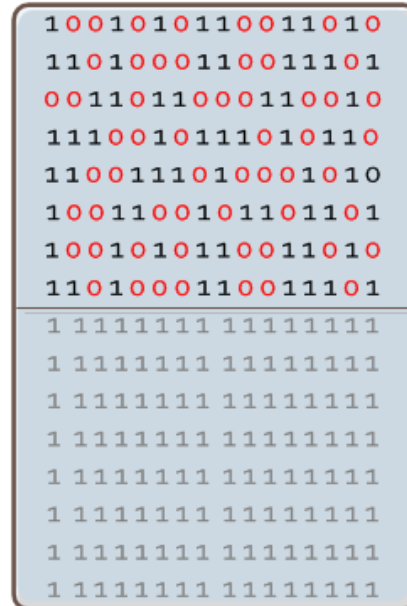
# Endurance Enhancement Potential - Shaping Vs. Compression

- Example: Compression rate  $r = \frac{1}{2}$ , achievable shaping level =  $p = H_b^{-1}(r) = 0.11$

Reference system  
Host data is **scrambled**  
~50% of the cells are programmed per GB



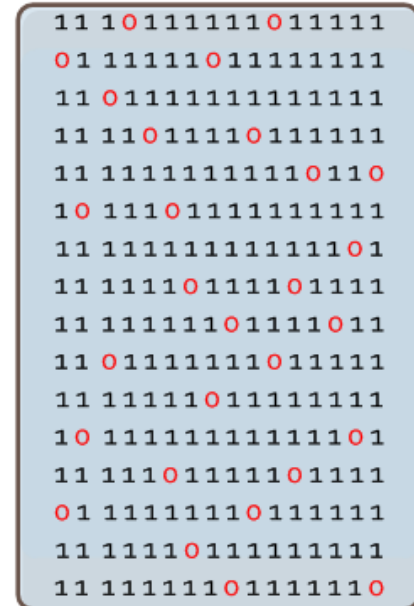
System employing compression  
Host data is **compressed**  
~25% of the cells are programmed per GB



Potentially **X2** the endurance

(excluding indirect effects like write amplification reduction)

System employing shaping  
Host data is **shaped**  
~11% of the cells are programmed per GB



Potentially **X2.8** the endurance

(depending on the specific memory technology and the shaping scheme optimality)



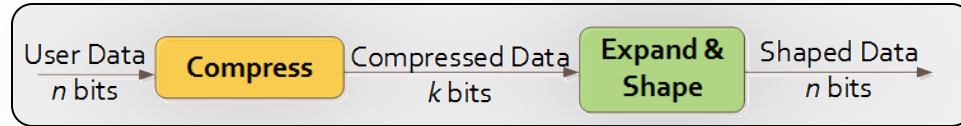


# Flash Management Implications - Shaping Vs. Compression

- **Impact on the Flash Management (Backend Firmware):**
  - **Compression** – **Significant impact**  
Converts  $n$  bits to  $k$  bits ( $k < n$ )  
Changes the logical to physical address management –  
Map logical sectors to variable physical sub-sectors
  - **Shaping** – **Transparent to the Flash Management**  
Converts  $n$  bits to  $n$  bits  
Logical to physical address mapping unchanged –  
Can be considered simply as a different type of scrambler...

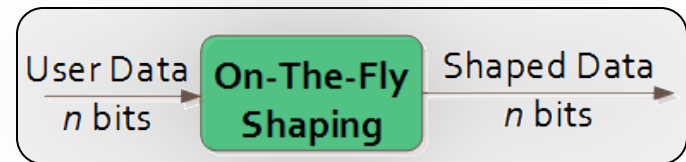
# Practical approaches for data shaping

## ■ Compression – Expansion approach:



- Two stage approach:
  - Compress using a lossless compression algorithm – e.g. LZ compression
  - Expand using a shaping code - e.g. Adaptive Reverse Huffman/Run-Length
- **Pros:** near optimal – can closely approach the theoretical shaping limit
- **Cons:** High complexity, High power consumption, Large latency (need to support variable compression-expansion rates)

## ■ Direct shaping approach:

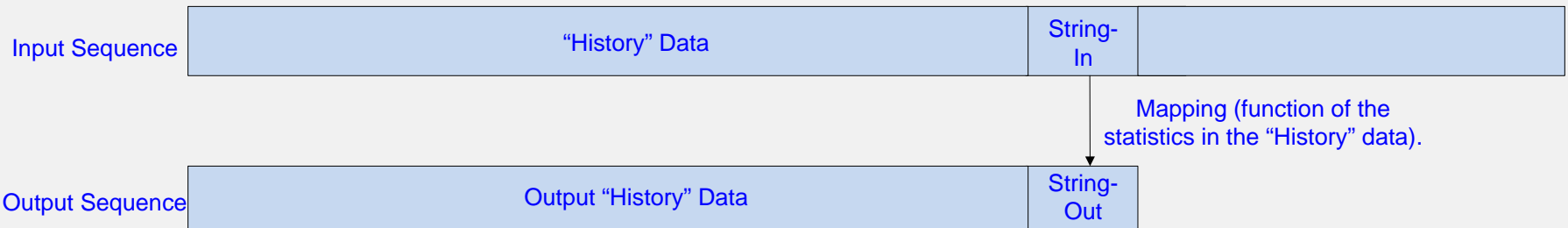


- Single stage approach: Direct shaping transformation from n (compressible) input bits to n(shaped) output bits
- **Pros:**
  - Negligible complexity
  - Negligible power consumption
  - Can be done On-The-Fly at very high throughputs
- **Cons:** Sub-optimal – achieves lower shaping level than theoretical limit

# Direct Shaping

- Transform  $n$  **compressible** bits into  $n$  **shaped** bits
- Convert each input string into a shaped output string using an adaptive mapping
- The mapping used for the current input string is a function of the statistics of previous strings, matching the most frequent “historic” strings to the most shaped strings

## Direct Shaping Scheme



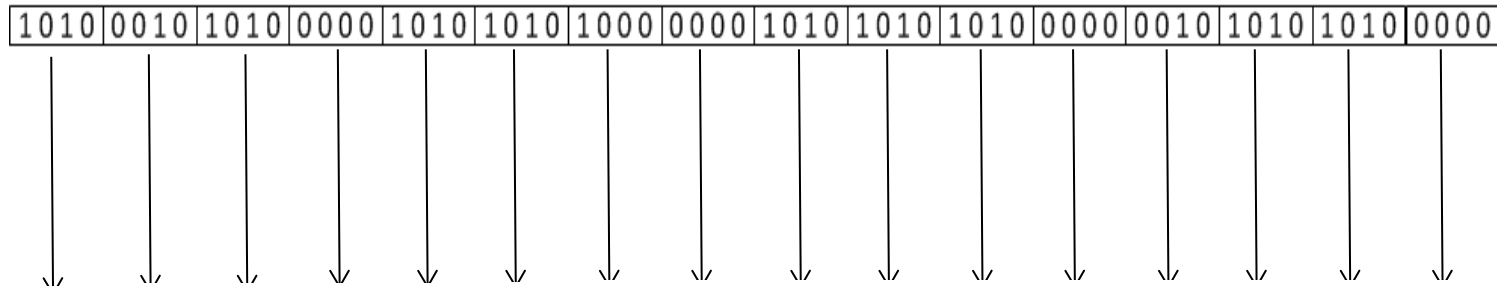
- **Reversibility:** all mapping decisions are based on the “history” and hence can be traced back by the De-Shaping algorithm → No need to store any side information
- **Amenable to an extremely slim design (few Kgates), negligible power consumption, OTF operation at high throughput**

# Direct Data Shaping – How does it Work?

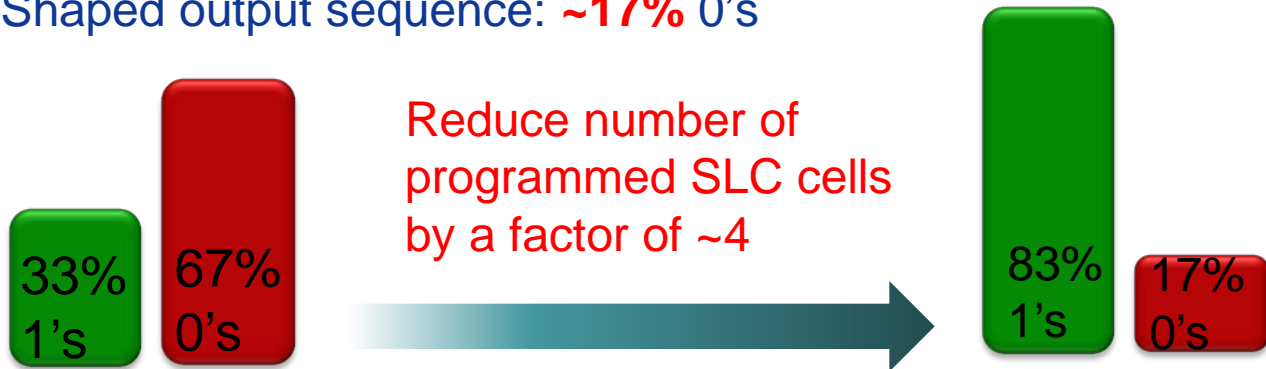
- **Toy example:**
- Convert a 64 bit compressible input sequence into a 64 bit shaped output sequence
- At step  $j$  map the most frequent 4 bit strings up to step  $j-1$  to 4 bit strings with less 0's

input	output	count
1 0 1 0	1 1 1 1	9
0 0 0 0	1 1 1 0	4
0 0 1 0	1 1 0 1	2
1 0 0 0	1 0 1 1	1
0 0 0 1	0 1 1 1	0
0 1 0 0	1 1 0 0	0
0 0 1 1	1 0 1 0	0
0 1 0 1	0 1 1 0	0
1 0 0 1	1 0 0 1	0
0 1 1 0	0 1 0 1	0
1 1 0 0	0 0 1 1	0
0 1 1 1	1 0 0 0	0
1 0 1 1	0 1 0 0	0
1 1 0 1	0 0 1 0	0
1 1 1 0	0 0 0 1	0
1 1 1 1	0 0 0 0	0

Compressible input sequence: **~67% 0's**



Shaped output sequence: **~17% 0's**





# Shaping Advantages - Summary

- 1. Reduced cell wearing (main motivation)
  - 2. Less disturb effects
  - 3. Higher ECC capability
- Orthogonal advantages
- Shaping gain is threefold

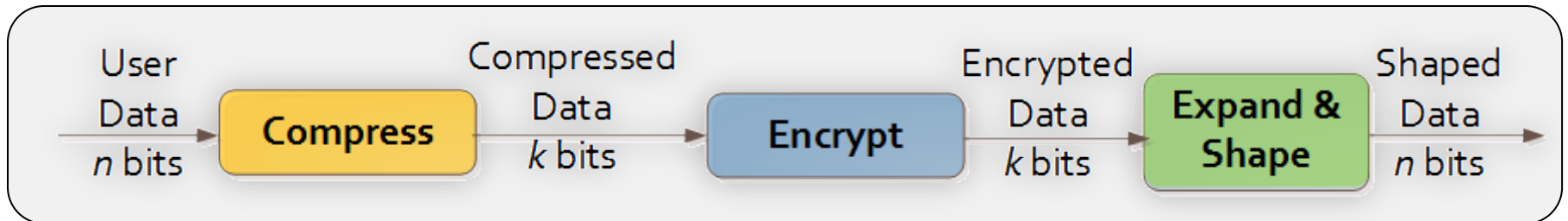
- First advantage is **cumulative** – cell wearing is a function of the entire history of shaped and non-shaped data that was programmed to it
- The second two advantages are **local** – observed only when currently programmed data is shaped - improve the average performance, power and reliability

- 4. Negligible complexity & power, High throughput On-The-Fly operation
- 5. FW transparent – can be considered as a different type of scrambling

# Leveraging Low Host Data Entropy

## - Ecosystem Considerations

- Data encryption results in high data entropy (randomizes the data)
- Data encryption at the host side should be avoided in order to take advantage of the low host data entropy via compression or shaping
- Encryption and Data Shaping can co-exist if they are performed at the memory controller level in the following order:
  - Compress
  - Encrypt
  - Expand via shaping



# Summary

- **Analyzing mobile traffic reveals low host data entropy**
  - ~0.5 average compression rate measured for sample usage on an Android based Smart Phone
- **Unrealized potential: the inherent “redundancy” in the host data can be leveraged for improving endurance, reliability, performance and power**
  - Apply methods of Deduplication, Compression and Shaping
- **Shaping provides a FW transparent low complexity & power approach for taking advantage of the low host data entropy**
  - Reduced cell wearing
  - Reduced error rates
  - Increased error correction capability

} Improved endurance, performance and reliability
- **Ecosystem cooperation is required in order to take advantage of the low host data entropy, under security and encryption requirements**



Thank you!

Questions?

**Contact:**

[eran.sharon@sandisk.com](mailto:eran.sharon@sandisk.com) or  
stop by SanDisk booth # 204