# Long-Term JPEG Data Protection and Recovery for NAND Flash-Based Solid-State Storage

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# Overview

- SD cards and eMMC consistute massive storage
  - Tens to hundreds of Exabytes per year
- JPEG pictures are one of the most valuable data in them
- Leaving JPEG files in SD and eMMC for a long term is risky
  - NAND flash is prone to have retention errors
  - Uncorrectable errors  $\rightarrow$  corrupted pictures





A Few Years Later



# Contributions

- Increase the robustness of JPEG stored in NAND flash
  - At the cost of 9.9% storage overhead
- Rescue corrupted JPEG files
- Four techniques based on our observations
  - Strong-page header protection
  - Bit error propagation prevention
  - DC error propagation mitigation
  - Huffman-assisted error correction
- Compatible with existing JPEG viewers

# Outline

- JPEG Background
- Observations and Design
- Evaluation
- Conclusion

# JPEG Encoding Steps (Simplified)



- **DCT**: Discrete Cosine Transform
- **DPCM**: Differential Pulse Code Modulation
- JFIF: JPEG File Interchange Format















Popular values  $\rightarrow$  Less bits Less-popular values  $\rightarrow$  More bits





 Picture width & height Sampling method
 Huffman tables

# Outline

#### Background

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- Conclusion

# **Observations**

- Unequal criticality of JPEG file contents
- Error propagation phenomena
  - Bit error propagation
  - DC error propagation
- Skewed reliability of NAND flash

# **Unequal Criticality of JPEG File Contents**





# **Unequal Criticality of JPEG Data**



#### Header having a single bit error → very likely corrupts the entire picture



# **Unequal Criticality of JPEG Data**



**Body** having a single bit error  $\rightarrow$  the results depends





Nearly identical
 Horizontal stripes
 Totally corrupted



# **Observations**

- Unequal criticality of JPEG
- Error propagation phenomena
  - Bit error propagation
     → Totally corrupted



DC error propagation
 → Horizontal stripes



### **Bit Error Propagation Phenomenon**



Huffman is a variable-length coding scheme

- $\rightarrow$  bit error can change code length
- ightarrow many following codes can thus be mis-decoded



### **DC Error Propagation Phenomenon**



 JPEG stores differential DC values
 → Once a bit error interferes with one value, the following values are also mis-decoded



# **Observations**

- Unequal criticality of JPEG
- Error propagation phenomena
  - Bit error propagation
    DC error propagation
- Skewed reliability of NAND flash

# **Skewed Storage Reliability**

- One third of flash pages can store data much more reliably than the other pages
  - We refer to them as strong/weak pages
- This property is known to SD and eMMC vendors but is not exposed to users and applications



# **Skewed Storage Reliability**

- Bits are grouped into MSB, CSB, LSB pages
- LSB pages are strong pages for the flash we tested



# **Proposed Techniques**

- Strong-page header protection
- Bit error propagation prevention
- DC error propagation mitigation
- Huffman-assisted error correction

## **Applications Oblivious to Strong/Weak Pages**



#### **Strong-Page Header Protection**



# **Bit Error Propagation Prevention**

- We additionally store the length of each 8×8 block in JPEG header
- Stop bit errors from propagation



# **DC Error Propagation Mitigation**

- Thumbnail
  - Small JPEG embedded in the header of the main JPEG
  - Facilitate image preview
- We propose to set the width and height of the thumbnail to be 1/8 of the main JPEG
  - By doing so, thumbnail pixels approximate the DC values of the main JPEG



# **DC Error Propagation Mitigation**

- Use thumbnail pixels to calibrate decoded DCs
- Error propagation is mitigated

Thumbnail:



# **Huffman-Assisted Error Correction**

- Many 8×8 blocks contain only single bit error
  - 8×8 block is around 100 bits
  - Target bit error rate is 10<sup>-2</sup>
- We propose to correct single bit error per 8×8 block in a trial-and-error manner



# **Huffman-Assisted Error Correction**

 We additionally store the number of Huffman codes of each 8×8 block in the header to check whether decoding is successful



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# Setup

#### Platform

- Xilinx Zedboard FPGA
- 16nm, 3-bit-per-cell flash chip
- 105 JPEG files
  - 100 from personal iPhone (3264×2448)
  - Five from the Kodak suite (3072×2048)
- Temperature acceleration
  - 70 hours under 85°C = 10 years under 25°C
- Assume bit error rates greater than  $5 \times 10^{-3}$  are uncorrectable



# Experiments

- Flash characterization
  - Average bit error rate
  - Percentage of uncorrectable 2KB data blocks
- JPEG image quality at retention time wihin 10 years
  - PSNR (Peak Signal to Noise Ratio)
  - SSIM (Structural Similarity Index)

#### Average Raw BERs (Within 10 Years at 25 °C)



#### **Average % of Uncorrectable 2KB Blocks**



# Image Quality (10 Years at 25 °C)



Ideal JPEG

#### Baseline

- Strong-page header protection
- Bit error propagation prevention
- This work All the four techniques

#### Average PSNR (Within 10 Years at 25 °C)



#### Average SSIM (Within 10 Years at 25 °C)



# **Concerns About Employing Extra ECC Parities**

- Employing that at flash chip level
  - Cost per bit increases
  - Vendors are reluctant to do so
- Employing that at disk level
  - Disk capacity becomes non-constant
  - May be problematic to applications and operating systems
- Employing that at application level
  - Effectiveness of the extra parities is limited
  - Modern ECCs heavily rely on low-level accesses to flash memory

# Conclusion

- Increasing the robustness of JPEG files and rescue corrupted JPEG files in flash-based storage
- Four techniques
  - Strong-page header protection
  - Bit error propagation prevention
  - DC error propagation mitigation
  - Huffman-assisted error correction
- Rescue corrupted JPEG files (10 years @ 25 °C)
  - Up to 24.3 dB PSNR improvement
  - At the cost of 9.9% of storage overhead
- Backward compatible with existing JPEG viewers

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# JPEG Decoding and Recover Speed

- It takes 12 seconds on average for our program to recover a corrupted (10-year) JPEG file
- Note that
  - Speed is not a top concern for rescuing corrupted JPEG files
  - It is easy to parallelize the recovery tasks of multiple corrupted JPEG files

#### **Skewed Storage Reliability**

