## LOSSLESS FORMATS (FLAC, ETC.)

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#### WHAT IS A LOSSLESS FORMAT?

We compress audio to save memory

 $\rightarrow$  lossy formats like MP3 remove inaudible information – cannot be restored

- Lossless formats allow us to completely reconstruct the original signal
- Typically use more memory than lossy compression

## FREE LOSSLESS AUDIO CODEC (FLAC)

- Open format, royalty free compression format
  - $\rightarrow$  compresses to 50-70% of original size
  - $\rightarrow$  all data can be completely recovered from the compressed version
- Fast encoding and decoding, extensive hardware support, and free reference implementation (Rivero & Mishra 2008)















Computes and compresses the difference between predicted and original signal

#### DICTIONARY-BASED COMPRESSION

 Uses a static or frequency-based dictionary
Commonly used
"words" are stored in dictionary and called by their index



Source: Rivero & Mishra (2008)

#### **GRAMMAR-BASED COMPRESSION**

An algorithm creates a context free grammar for the string to be compressed

 $\rightarrow$  "grammars can capture repetitions occurring far apart in the data," – Cherniavsky & Ladner (2004)

 The grammar replaces substrings with their references in a combination that produces the smallest possible encoding (Humphries, Sidorov, Jones, & Marshall 2021)

#### GRAMMAR-BASED COMPRESSION

Source: Cherniavsky & Ladner (2004)



Figure 1: Overview of grammar compression

#### **BURROWS-WHEELER TRANSFORM**

- Proposed in 1994 as a method to prepare data for compression
- Reorders a string of characters so that there are more segments with repeated characters
  - $\rightarrow$  makes the string more suitable for run-length and move-to-front encoding
- Can be reversed to restore the original string

Consider the string "ABRACA":



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Source: Burrows & Wheeler (1994)

ABRACA

BRACAA

RACAAB

ACAABR

CAABRA

Consider the string "ABRACA":



ABRACA BRACAA RACAAB ACAABR CAABRA AABRAC

Next, we reorder the matrix lexographically, noting the index of the row with the original string



The Burrows-Wheeler transform of of the string is the last column of the new matrix



$$Index = 2$$

#### **BURROWS-WHEELER TRANSFORM**

# $\mathsf{ABRACA} \xrightarrow{} \mathsf{CARAAB}$

The resulting string has more runs of repeated characters, especially if there were repeated words in the input

#### LOSSLESS IMAGE/VIDEO COMPRESSION

Other types of media can also be compressed into lossless formats:
→ photos: PNG, GIF, TIFF
→ videos: H.264 Lossless, H. 265 Lossless, Motion JPEG Lossless, Apple

Animation Quicktime RLE

#### **APPLICATIONS TO MIR**

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## ARCHIVAL PURPOSES

- Cooper (2020)
  - ightarrow archiving a large collection donated to the University of Leeds by Trevor Jones
  - $\rightarrow$  digitized recordings and stored using FLAC in order to retain all information while saving memory
- Lai, Li, & Fujinaga (2005)
  - $\rightarrow$  digitizing album covers from David Edelberg's record collection
  - $\rightarrow$  tested two lossless image compression formats:TIFF and PNG
  - $\rightarrow$  chose PNG for significant file size reduction, open format, and good metadata

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#### HUMPHREYS, SIDOROV, JONES, & MARSHALL (2021)

- Used grammar-based compression to perform musicological tasks
  - $\rightarrow$  detecting transcription errors
  - $\rightarrow$  classifying pieces by melodic characteristics
  - $\rightarrow$  segmenting pieces for musical analysis

Dataset: 7928 scores from Acadia Early Music Archive, CPDL and Musopen

- Used string processing techniques designed for compression and pattern matching within text
- Algorithms used: Lempel-Ziv Welch, Burrows-Wheeler with run-length encoding, and GZIP

#### HUMPHREYS, SIDOROV, JONES, & MARSHALL (2021)

- Error detection: compared size of compressed original data and altered data
  - $\rightarrow$  if the size was different, there was an alteration
  - $\rightarrow$  all algorithms could detect a single error
  - $\rightarrow$  logarithmic response to increasing number of errors
- Classification: used compression distance between two scores to rate their similarity
  - $\rightarrow$  used the Meertens Tune Collections
  - ightarrow compressing scores with common components produces a smaller model
  - $\rightarrow$  success rates: 0.92 for ZZ and 0.83 for IIR-MC

#### HUMPHREYS, SIDOROV, JONES, & MARSHALL (2021)

Segmentation: hypothesized that using a grammar-based compressor would divide the data in a musicologically significant way
→ ZZ performed well on pieces containing exact matches, like Bach's Fugue no. 20 from the Well-Tempered Clavier
→ strong correlation between rules from the grammar-based compressors and analysis by Bruhn (1993)

## CONCLUSIONS

- Lossless compression allows us to store audio and visual data with reduced memory use without losing any information
- Compression algorithms can also be used for pattern recognition that can be applied to structural music analysis, classification, and error detection

#### REFERENCES

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