Perceptual Distortion-Rate Optimization of Long Term Prediction in MPEG AAC

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2 Current approach for LTP parameter value selection









Current approach for LTP parameter value selection

3 Proposed RD optimization of LTP parameter values



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• Audio Signal

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• Signal divided into overlapping frames



• Frame transformed

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• Frame transformed



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• Transform coefficients split into bands





• Transform coefficients split into bands





• Bands quantized and coded to generate bitstream



• Coding problem definition: Achieve minimum perceptual distortion at a given rate

- Perceptual?
  - Based on content, human brain can tolerate (or mask) variable amount of noise in each band
  - Captured in distortion measure as Maximum Noise to Mask Ratio (MNMR)

 $MNMR = \max_{\forall \text{ bands}} \frac{\text{Quantization noise energy}}{\text{Masking threshold}}$ 

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- MDCT exploits redundancies within the current frame
- Audio signal has a repeating pattern

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- Audio signal has a repeating pattern
- Previously reconstructed data available at decoder



- MDCT exploits redundancies within the current frame
- Audio signal has a repeating pattern
- Previously reconstructed data available at decoder
- Can we exploit this correlation?



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• MPEG AAC uses the Long Term Prediction (LTP) tool

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- MPEG AAC uses the Long Term Prediction (LTP) tool
- Predicts current frame from history



- MPEG AAC uses the Long Term Prediction (LTP) tool
- Predicts current frame from history
- Reference position indicated via lag index

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- Waveforms matched via gain factor

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- MPEG AAC uses the Long Term Prediction (LTP) tool
- Predicts current frame from history
- Reference position indicated via lag index
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- Transformed



• Transformed coefficients split into bands



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- Prediction residue generated



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- Compared with original



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- Prediction residue generated
- Compared with original
- Per band LTP flag set



- Transformed coefficients split into bands
- Prediction residue generated
- Compared with original
- Per band LTP flag set
- Per frame flag indicates if LTP is used at all in current frame



#### • The overall LTP parameter set includes

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- Lag index
- Gain factor
- Per band LTP flag
- Per frame LTP flag



2 Current approach for LTP parameter value selection

3 Proposed RD optimization of LTP parameter values



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• Lag and gain selected to minimize a mean squared prediction error cost

WANNAMAMAAAA Previous Samples Current Samples M.M.M.M.M.M.M.

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# Current approach

• Gain (G) calculated as

$$\mathbf{G} = \frac{\sum_{m=0}^{2K-1} x[m] z[m+2K-\mathbf{L}]}{\sum_{m=0}^{2K-1} z^2[m+2K-\mathbf{L}]}$$

• Gain further quantized to one of the 8 levels



- For each band, LTP flag chosen as
  - $1, \ \ \, if Energy \ of \ prediction \ residue < Energy \ of \ original \ coefficients$

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- 0, otherwise
- The per frame flag is set if heuristic bit savings due to LTP > side-information rate of LTP

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- Given all LTP parameters, core AAC parameters are selected via a two-loop search (TLS)
- For every band, an inner loop finds quantization step size for a target distortion criterion
- The outer loop then finds Huffman code books that minimize the bits to encode and if this doesn't meet the rate constraint for the frame, the target distortion is changed and inner loop repeated

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- We know that TLS is sub-optimal for core AAC parameters selection
  Could this be the reason for the poor RD performance?
- Replace TLS with RD optimal Trellis based core AAC parameters selection [Aggarwal et al. 2006]

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### • Objective results for Trellis based AAC coder with and without LTP



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- LTP tool is expected to give improvements for single instrument harmonic files
- Shortcomings attributed to the sub-optimal LTP parameter selection
  - RD optimal approach has to select all encoder parameters with the objective of minimizing perceptual distortion for a given rate
  - Current approach clearly sub-optimal as LTP parameters selected to minimize mean squared prediction error, and independent of core AAC parameters
  - Lag and gain selection ignores eventual prediction switching off in select bands
    - Time domain lag and gain selection effectively considers all transform coefficients
    - Lag and gain thus selected not the best when considering a reduced set of coefficients
  - The heuristically estimated bit savings due to LTP doesn't match actual bit savings reflected after the quantization and coding process

# Motivation

• LTP tool is expected to give improvements for single instrument harmonic files

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### • Trellis based approach RD optimal for core AAC parameter selection

- Extension
  - All possible LTP parameter combinations formed
  - Each case RD evaluated via Trellis
  - Case which minimizes the distortion for a give rate forms final choice

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- Computationally prohibitive as LTP adds significantly more choices of parameters for
  - gain (8)
  - lag (frame length)
  - per band LTP flags (2 power number of bands)

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Current approach for LTP parameter value selection





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### • We achieve computational efficiency by

- Limiting LTP lag and gain parameter space by careful selection of "prediction survivors"
  - Retains the simplicity of time domain lag and gain calculation
  - Limiting number of LTP parameter combinations also limits the number of full RD evaluations
  - Full RD evaluation enables selection of encoder parameters aligned with the end objective of minimizing perceptual distortion for a given rate
- Trellis approach, which operates in frequency domain, for selecting the band wise quantization and coding parameters, is extended to select the per band LTP flags as well

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• P lag indices with the highest normalized cross-correlation are retained

$$R[\mathbf{L}] = \frac{\sum_{m=0}^{2K-1} x[m] z[m+2K-\mathbf{L}]}{\sqrt{\sum_{m=0}^{2K-1} z^2[m+2K-\mathbf{L}]}}$$

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• Forming the P lag survivors


• Gain value for each of these lags found

$$\mathbf{G}[\mathbf{L}] = \frac{\sum_{m=0}^{2K-1} x[m] z[m+2K-\mathbf{L}]}{\sum_{m=0}^{2K-1} z^2[m+2K-\mathbf{L}]}$$



• Closest Q quantization levels to each gain value are retained



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#### • To form the overall PQ survivors



# Transformation

• For each survivor, prediction residue is calculated and transformed



# RD evaluation

• Each of these are rate-distortion evaluated via Trellis



# Per frame LTP flag

• To find per frame flag, current frame is transformed and RD evaluated



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# Final selection

• Parameters resulting in minimum distortion for the given rate chosen



# Trellis optimization



• Trellis with stages for each band *I*, states in each stage for every combination of per band LTP flags, quantization and coding parameter values

#### • Each state associated with corresponding distortion and rate costs

• Transition between states associated with costs to differentially encode quantization and coding parameters

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- Dynamic programming pursued to find optimal path through trellis
- This path corresponds to optimal set of per band parameters

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# Low complexity variant

• For low complexity Trellis replaced with Two Loop Search



# Low complexity variant

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#### • For Trellis based AAC coder with and without LTP



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#### • Trellis based coders compared to the TLS based coders



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#### • Along with results for proposed low complexity coder



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#### • For other files



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# Objective evaluation results

• For other files



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- MUSHRA listening tests for coders operating at 32 kbps
- 12 listeners score on a scale of 0 (bad) to 100 (excellent)
- Plots show average MUSHRA scores and 95% confidence interval

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- Joint selection of LTP and core AAC parameters which optimize perceptual distortion-rate performance proposed
- Low complexity two-loop search based variant also proposed
- Subjective and objective evaluations show substantial improvements
- We conclude that when rightly optimized LTP can be a potent tool

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Thank you for your attention

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# Questions?