# **Modeling of long and complex responses using Kautz filters and time-domain partitions** Tuomas Paatero

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### **A Transcription of the Title**

**Complex responses** – long duration, high sample rate, complex time-frequency characteristics: distributed onset, high mode/resonance density, variable decay rates – in our case, measured room impulse responses **Kautz filters** – a special class of pole-zero filters, originating from rational orthonormal basis representations – favorable properties due to orthogonality and the transversal (allpass) structure

**Time-domain partitions** – splitting the modeling task into manageable portions, a time-domain approach using 1) interlaced (polyphase) decomposition or 2) sequential segmentation of the target response

#### **Sales talk – why Kautz filters?**

- Efficient pole-zero modeling using FIR filter-like structure and design
- Kautz filter techniques using our pole generation method – challenges conventional IIR filter design
- Unconditionally stable, good numerical properties due to the transversal (allpass) structure
- Trivial model reduction/modification schemes due to orthogonality

### **Basic design steps**

Example II: a measured room impulse response (44.1) kHz, 32768 s.), approximated by an  $64 \times 60$ th order Kautz model:



# **Motivation and premises**

- The need for transfer function models for complicated systems such as room impulse responses
- Traditional choices: finite or infinite impulse response (FIR/IIR) linear time-invariant (LTI) filters using conventional structures and design methods
- Harsh reality:
- -FIR: high filter orders are required due to the nature of the target responses – a practical burden
- -IIR: in addition or consequently, potential stability issues – or simply, impossible to construct – also a principled problem
- Kautz filters: provide efficient high-order IIR filters for many purposes with considerably less computational complexity compared to FIR filters
- For really tough cases, such as concert hall impulse responses at high sample rates/full band-width: vari-

- Generate candidate pole sets (using our BU-method) w.r.t. the target response and desired model orders
- Possible variants (of the BU-method) using combined warping and frequency-zooming techniques • Evaluate the Kautz-Fourier weights, inspect the result
- If needed, modify the pole set: prune, tune, attach, cluster – re-evaluate the weights, construct the model Example I: Kautz models for a measured room impulse response (sample rate 22050 Hz, 8192 samples, 371 ms):



- The implied sub-signal length is 512 samples
- A fixed sub-filter order 60 could be optimized • The normalized square error is 0.0024

# **Sequential Segmentation**

A given target response may also be partitioned into successive segments corresponding to the transfer function  $H(z) = \sum_{k=0}^{M} z^{-t_k} H_k(z), \quad 0 \le t_0 < t_1 < \dots < t_M < N$ 

or schematically as below ( $d = t_0$  is the initial delay):



ous subband techniques, partial artificial reproduction and/or the proposed time-domain partitions

# **Kautz filters in a nutshell**

The generic form of a Kautz filter is given by the transfer function

> $\hat{H}(z) = \sum_{i=0}^{N} w_i G_i(z)$  $=\sum_{i=0}^{N} w_i \left( \frac{\sqrt{1-z_i z_i^*}}{1-z_i z^{-1}} \prod_{i=0}^{i-1} \frac{z^{-1}-z_j^*}{1-z_i z^{-1}} \right)$

and it is specified by two sets of parameters

- Poles  $\{z_j\}_{j=0}^N$ ,  $|z_j| < 1$ , define the orthonormal (Kautz) functions  $G_i(z), i = 0, ..., N$  – and the filter order
- Tap-output weights  $\{w_i\}_{i=0}^N$  in our case, orthogonal (Kautz-Fourier) expansion/projection coefficients The recurrent form of the basis functions  $G_i(z)$  result in the depicted transversal structure:

• A straightforward demonstration of the BU-method • Kautz models, orders 60–340, in steps of 40

• Intermediate Bark-scale warping ( $\lambda \approx 0.65$ ) is used to emphasize low-frequencies (warped BU-method)

### **Utilizing two time-domain partitions**

- Impossible dimensions: for example, 100 000 samples and more than 1000 relevant resonant frequencies • Solutions: subband techniques, artificial reproduction
- Alternative or additional methods: following partitions

# **Polyphase Decomposition**

The *M*th order polyphase decomposition of an impulse response h(n), n = 0, ..., NM, is given by  $H(z) = \sum_{k=0}^{M-1} z^{-k} H_k(z^M), \quad H_k(z) = \sum_{n=0}^{N-1} h(Mn+k) z^{-n}$ The component FIR filters  $H_k(z)$  are then simply apThe component FIR filters  $H_k(z)$  are then once more approximated by Kautz filters, taking into account the possible IIR leakage:

• Choose the partition, isolate the target response

• Construct the Kautz model of a desired/sufficient order

• Subtract the possible "overflow" of the Kautz model responses when forming following target responses Example III: the early part of a concert hall impulse response modeled by a chosen partition of Kautz models:





- The Kautz filter for complex conjugate pole pairs, a modified real Kautz filter structure is used. More familiar special cases of the Kautz filter:
- For  $z_i \equiv 0$  it degenerates to an FIR filter
- For  $z_i \equiv a, -1 < a < 1$ , it is a Laguerre filter

proximated by Kautz filters:

- Design the Kautz sub-filters w.r.t  $h_k(n)$
- The construction rely on "waveform matching" • The required sub-filter order  $N_k$  is typically  $\approx N/10$



• Partition into relevant events – early reflections? • A low-order model – exact match by increasing order • "Parametric" control of the early response?

#### **Conclusions and Remarks**

- Kautz filter techniques are proposed as a genuine alternative to traditional FIR/IIR filter design
- Two simple time-domain partitions are used for unwrapping long and complex responses

• Just an idea – many open aspects, and possibilities?