

# Joint Optimization of Multiple Behavioral and Implementation Properties of Digital IIR Filter Designs

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*2000 IEEE Int. Sym. on Circuits and Systems*

# Introduction

- Problem
  - Simultaneously optimize multiple characteristics of an existing digital IIR lowpass filter design
- Goal
  - Develop an extensible automated framework
- Solution
  - Solve constrained nonlinear optimization problem by using sequential quadratic programming (SQP)
  - Program Mathematica to derive formulas and generate Matlab programs to perform optimization

# Modeling

- Free parameters
  - Set of  $n$  conjugate pole pairs  $a_k \exp(\pm j b_k)$
  - Set of  $m$  conjugate zero pairs  $c_i \exp(\pm j d_i)$
- Properties
  - *Behavioral*: magnitude response, phase response
  - *Implementation*: quality factors
- Compute
  - Cost function as a weighted mean of distance measures
  - Constraints to enforce numerical stability
  - Closed-form symbolic gradients for robustness

# Objective Measures

- Magnitude response
  - Scale to be unity at DC
- Unwrapped phase response
  - Constrain zeros to be outside passband
- Quality factor  $Q$ 
  - For each pole pair  $a_k \exp(\pm j b_k)$ :  $0.5 \leq Q_k \leq \infty$

$$Q_k = \frac{\sqrt{(1 + a_k^2)^2 - 4a_k^2 \cos^2(b_k)}}{2(1 - a_k^2)}$$

- Effective quality factor is geometric mean of  $Q_k$  factors

# Distance Measures

- Non-negative differentiable measures
  - A value of zero means the ideal case
  - Differentiability necessary for SQP formulation
- Deviation in magnitude response
  - $L_2$  norm of deviation from ideal in passband, stopband and transition bands
- Deviation of quality factors
  - Minimum effective quality factor  $Q_{\text{eff}}$  is 0.5
  - Deviation measured as  $\sigma_q = Q_{\text{eff}} - 0.5$

# Distance Measures

- Deviation from linear phase in passband
  - $L_2$  norm of deviation from perfect linear phase at optimal slope within  $(0, \omega_l)$  where  $\omega_l \leq \omega_p$
  - Approximate optimal slope to obtain analytic form
    - Weighted mean of two first-order estimates
    - Accurate up to four Taylor series terms
    - $\alpha = 0.4163$ ;  $\beta = 0.5837$ ;  $r_1 = 0.5385$ ;  $r_2 = 0.9062$

$$\tilde{m} = \alpha \frac{\angle \tilde{H}(e^{jr_1\omega_l})}{r_1\omega_l} + \beta \frac{\angle \tilde{H}(e^{jr_2\omega_l})}{r_2\omega_l}$$

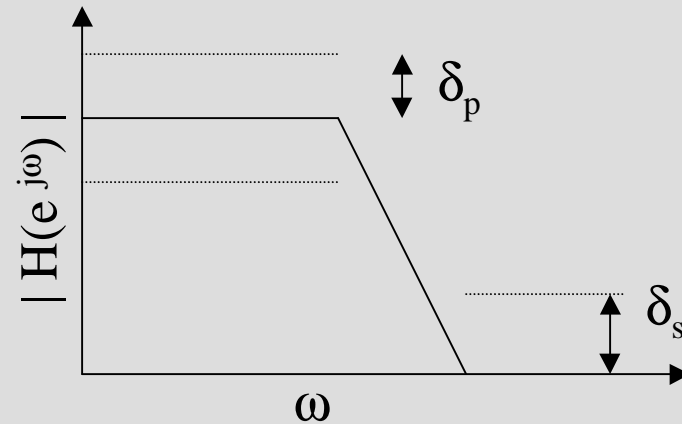
# Overall Cost Function

$$\sigma = \frac{W_p}{\omega_p} \sigma_p + \frac{W_t}{\omega_s - \omega_p} \sigma_t + \frac{W_s}{\pi - \omega_s} \sigma_s + \frac{W_{phase}}{\omega_l} \sigma_{phase} + W_q \sigma_q$$

- Weighted sum of distance measures
  - Passband, transition band, stopband, and phase response are normalized by bandwidth
  - Quality factor
- User-defined weights
  - $W_p, W_t, W_s,$  and  $W_{phase}$  for passband, transition band, stopband, and phase response, respectively
  - $W_q$  for quality factor

# Constraints

- Zero locations outside of the passband
  - Numerical stability of phase response
- Quality factor of each pole pair less than  $Q_{\max}$ 
  - $Q_{\max}$  determined by technology
- Pole locations inside unit circle
- Magnitude constraints
  - Passband  
 $1 - \delta_p < |H(e^{j\omega})| < 1 + \delta_p$
  - Stopband  
 $|H(e^{j\omega})| < \delta_s$





# Implementation

- Mathematica
  - Compute cost function, constraints, and gradients
  - Generate efficient Matlab code for SQP solution to optimization problem
- Matlab
  - Set all user-definable parameters
  - Initial filter design
    - User-supplied or default computed elliptic filter
    - Preferably overdesigned

# Design Example

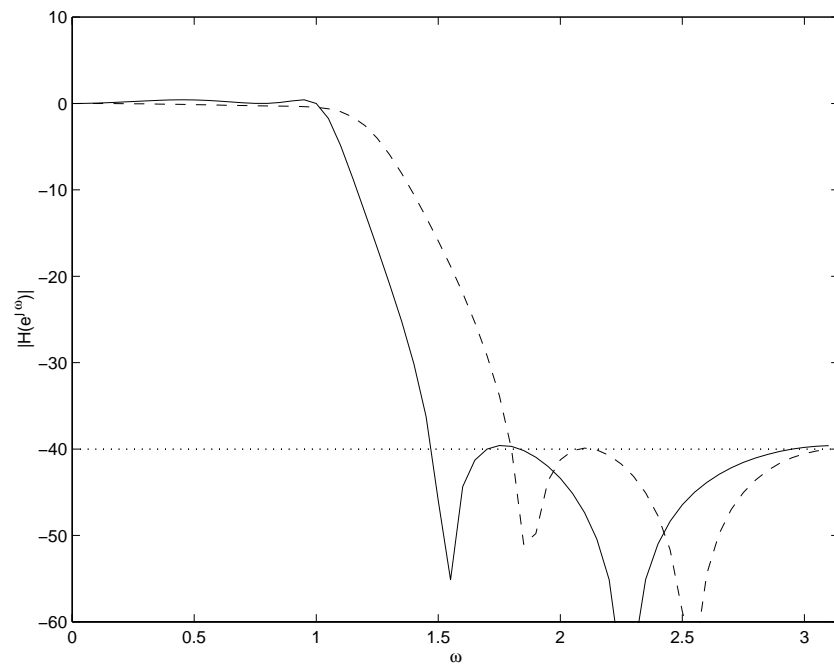
- Optimization of phase response with constraints on quality factors and magnitude response
- Phase optimized over the entire passband
- Magnitude response constraints
  - Passband: (0 - 1) rad, ripple 0.05
  - Stopband: (1.8 -  $\pi$ ) rad, ripple 0.01
- Initial filter
  - Fourth-order elliptic filter generated by Matlab
  - Fails quality factor constraints (SQP relaxation)

# Design Example

- Optimized filter
  - Phase response closer to linear (shown on next slide)
  - Lower quality factors
  - Satisfies magnitude response constraints

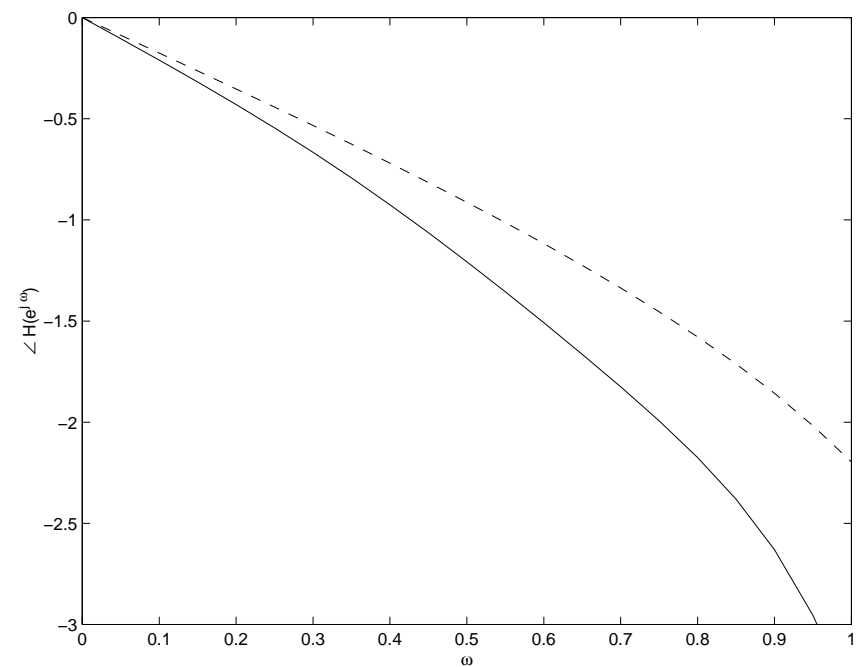
	<i>Initial</i>	<i>Final</i>
<i>Pole pair 1</i>	$0.5176 \pm j0.3264$	$0.2145 \pm j0.1651$
<i>Pole pair 2</i>	$0.4584 \pm j0.7602$	$0.2982 \pm j0.7306$
<i>Quality factors</i>	0.72, 3.62	0.57, 2.00

# Design Example



Magnitude Response

— Initial filter



Phase Response

----- Optimized filter

# Conclusions

- Extensible framework for automated digital IIR filter design optimization
- Symbolic computation eliminates algebraic errors
- Error-free generation of source code
- Robust due to symbolic computation of gradients
- Easy to change objective functions, measures and constraints
- Software available at  
[http://www.ece.utexas.edu/~bevans/projects/syn\\_filter\\_software.html](http://www.ece.utexas.edu/~bevans/projects/syn_filter_software.html)