ESE 5310: Digital Signal Processing

Lecture 18: March 23, 2023

Optimal Filter Design

Optimal Filter Design

❑ Window method

  ▪ Design Filters heuristically using windowed sinc functions

  ▪ Choose order and window type

  ▪ Check DTFT to see if filter specs are met

❑ Optimal design

  ▪ Design a filter h[n] with $H(e^{j\omega})$

  ▪ Approximate $H_d(e^{j\omega})$ with some optimality criteria - or satisfies specs.

Mathematical Optimization

(mathematical) optimization problem

$$\begin{array}{ll} \text{minimize} & f_0(x) \\ \text{subject to} & f_i(x) \le b_i, \quad i = 1, \ldots, m \end{array}$$

- $x = (x_1, \ldots, x_n)$: optimization variables

- $f_0 : \mathbf{R}^n \to \mathbf{R}$: objective function

- $f_i : \mathbf{R}^n \to \mathbf{R}, \ i = 1, \ldots, m$: constraint functions

optimal solution $x^\star$ has smallest value of f_0 among all vectors that satisfy the constraints

Solving Optimization Problems

general optimization problem

- very difficult to solve

- methods involve some compromise, *e.g.*, very long computation time, or not always finding the solution

exceptions: certain problem classes can be solved efficiently and reliably

- least-squares problems

- linear programming problems

- convex optimization problems

Least-Squares Optimization

$$\text{minimize} \quad \|Ax - b\|_2^2$$

solving least-squares problems

- analytical solution: $x^{\star} = (A^T A)^{-1} A^T b$

- reliable and efficient algorithms and software

- computation time proportional to $n^2 k$ $(A \in \mathbf{R}^{k \times n})$; less if structured

- a mature technology

using least-squares

- least-squares problems are easy to recognize

- a few standard techniques increase flexibility (*e.g.*, including weights, adding regularization terms)

Linear Programming

$$\begin{aligned}\text{minimize} \quad & c^T x \\ \text{subject to} \quad & a_i^T x \leq b_i, \quad i = 1, \dots, m\end{aligned}$$

solving linear programs

- no analytical formula for solution

- reliable and efficient algorithms and software

- computation time proportional to $n^2 m$ if $m \geq n$; less with structure

- a mature technology

using linear programming

- not as easy to recognize as least-squares problems

- a few standard tricks used to convert problems into linear programs (*e.g.*, problems involving ℓ_1- or ℓ_∞-norms, piecewise-linear functions)

Convex Optimization

$$\begin{array}{ll} \text{minimize} & f_0(x) \\ \text{subject to} & f_i(x) \le b_i, \quad i = 1, \dots, m \end{array}$$
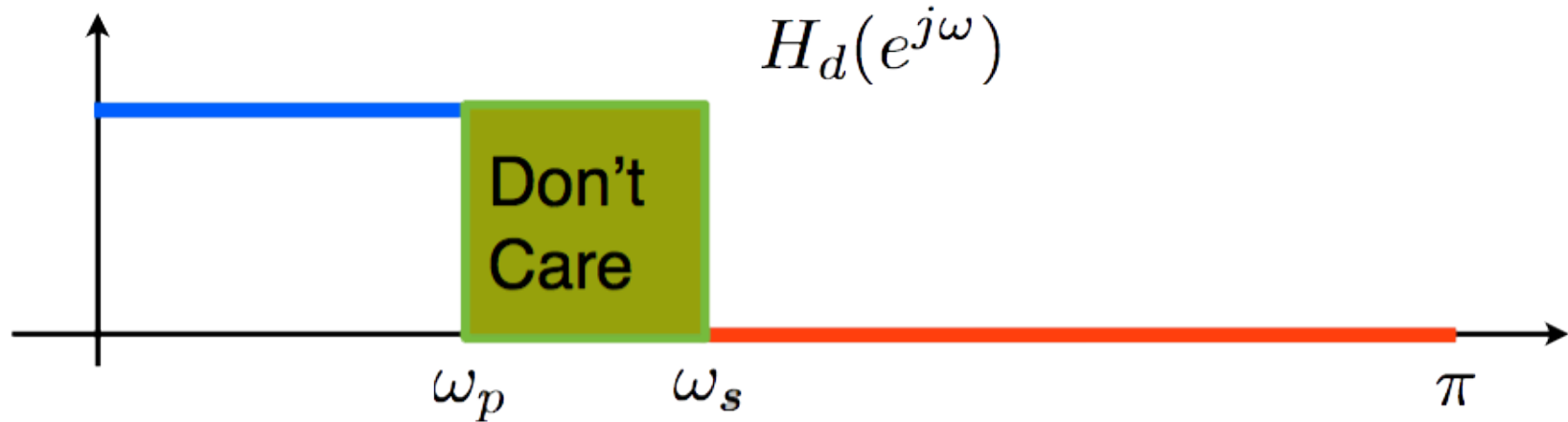
- objective and constraint functions are convex:

$$f_i(\alpha x + \beta y) \le \alpha f_i(x) + \beta f_i(y)$$

if $\alpha + \beta = 1$, $\alpha \ge 0$, $\beta \ge 0$

- includes least-squares problems and linear programs as special cases

Optimality – Least Squares

$$H_d(e^{j\omega})$$

Don't Care

ω_p ω_s π

- Least Squares:

$$\text{minimize} \quad \int_{\omega \in \text{care}} |H(e^{j\omega}) - H_d(e^{j\omega})|^2 d\omega$$

- Variation: Weighted Least Squares:

$$\text{minimize} \quad \int_{-\pi}^{\pi} W(\omega)|H(e^{j\omega}) - H_d(e^{j\omega})|^2 d\omega$$

Design Through Optimization

❏ Idea: Sample/discretize the frequency response

$$H(e^{j\omega}) \Rightarrow H(e^{j\omega_k})$$

❏ Sample points are fixed $\omega_k = k\dfrac{\pi}{P}$

$$-\pi \le \omega_1 < \cdots < \omega_p \le \pi$$

❏ M+1 is the filter order

❏ P >> M + 1 (rule of thumb P=15M)

❏ Yields a (good) approximation of the original problem

Example: Least Squares

- ❑ Target: Design M+1= 2N+1 filter
- ❑ First design non-causal $\tilde{H}(e^{j\omega})$ and hence $\tilde{h}[n]$

Example: Least Squares

❑ Target: Design M+1= 2N+1 filter

❑ First design non-causal $\tilde{H}(e^{j\omega})$ and hence $\tilde{h}[n]$

❑ Then, shift to make causal

$$h[n] = \tilde{h}[n - M/2]$$

$$H(e^{j\omega}) = e^{-j\frac{M}{2}} \tilde{H}(e^{j\omega})$$

Example: Least Squares

$$\tilde{h} = \left[\tilde{h}[-N], \tilde{h}[-N+1], \cdots, \tilde{h}[N]\right]^T$$

$$b = \left[H_d(e^{j\omega_1}), \cdots, H_d(e^{j\omega_P})\right]^T$$

$$A = \begin{bmatrix} e^{-j\omega_1(-N)} & \cdots & e^{-j\omega_1(+N)} \\ & \vdots & \\ e^{-j\omega_P(-N)} & \cdots & e^{-j\omega_P(+N)} \end{bmatrix}$$

$$\operatorname{argmin}_{\tilde{h}} \quad \|A\tilde{h} - b\|_2^2$$

Least-Squares

$$\text{argmin}_{\tilde{h}} \quad ||A\tilde{h} - b||_2^2$$

Solution:

$$\tilde{h} = (A^*A)^{-1}A^*b$$

❑ Result will generally be non-symmetric and complex valued.

❑ However, if $\tilde{H}(e^{j\omega})$ is real, $\tilde{h}[n]$ should have symmetry!

Design of Linear-Phase L.P Filter

❑ Suppose:

  ▪ $\tilde{H}(e^{j\omega})$ is real-symmetric

  ▪ M is even (M+1 length)

❑ Then:

  ▪ $\tilde{h}[n]$ is real-symmetric around midpoint

❑ So:

$$
\begin{aligned}
\tilde{H}(e^{j\omega}) &= \tilde{h}[0] + \tilde{h}[1]e^{-j\omega} + \tilde{h}[-1]e^{+j\omega} \\
&\quad + \tilde{h}[2]e^{-j2\omega} + \tilde{h}[-2]e^{+j2\omega} \cdots \\
&= \tilde{h}[0] + 2\cos(\omega)\tilde{h}[1] + 2\cos(2\omega)\tilde{h}[2] + \cdots
\end{aligned}
$$

Least-Squares Linear Phase Filter

$$H_d(e^{j\omega})$$

Don't Care

ω_p ω_s π
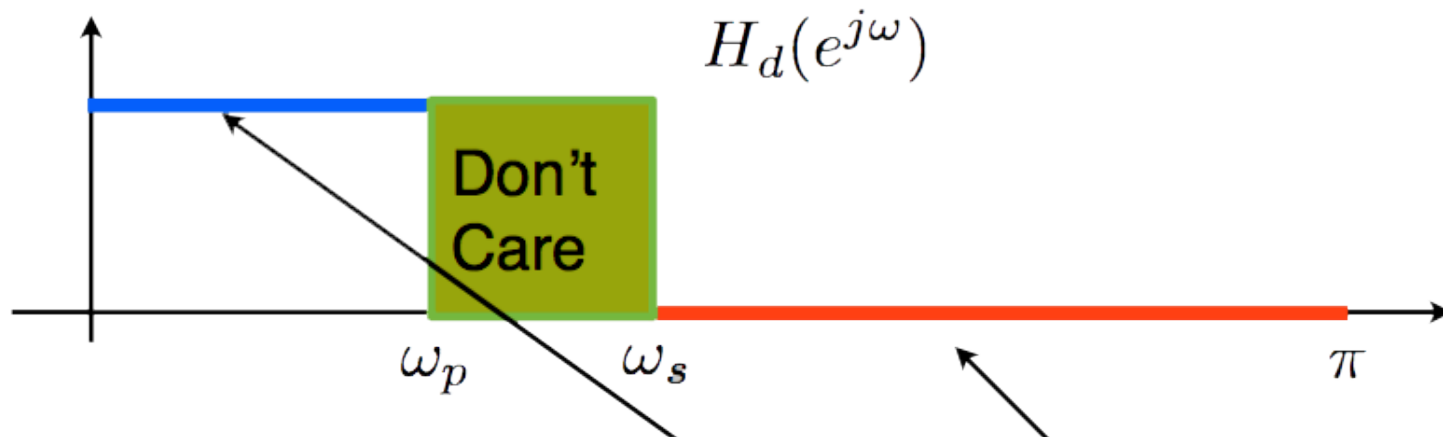
Given M, ω_P, ω_s find the best LS filter:

$$A = \begin{bmatrix} 1 & \cdots & 2\cos(\frac{M}{2}\omega_1) \\ \vdots & & \\ 1 & \cdots & 2\cos(\frac{M}{2}\omega_p) \\ 1 & \cdots & 2\cos(\frac{M}{2}\omega_s) \\ \vdots & & \\ 1 & \cdots & 2\cos(\frac{M}{2}\omega_P) \end{bmatrix}$$

$$b = [1, 1, \cdots, 1, 0, 0, \cdots, 0]^T$$

Capital P

Least-Squares Linear Phase Filter

Given M, ω_P, ω_s find the best LS filter:

$$A = \begin{bmatrix} 1 & \cdots & 2\cos(\frac{M}{2}\omega_1) \\ & \vdots & \\ 1 & \cdots & 2\cos(\frac{M}{2}\omega_p) \\ 1 & \cdots & 2\cos(\frac{M}{2}\omega_s) \\ & \vdots & \\ 1 & \cdots & 2\cos(\frac{M}{2}\omega_P) \end{bmatrix} \qquad b = [1,1,\cdots,1,0,0,\cdots,0]^T$$

$$\tilde{h}_+ = [\tilde{h}[0], \cdots, \tilde{h}[\frac{M}{2}]]^T = (A^*A)^{-1}A^*b$$

$$\tilde{h} = \begin{cases} \tilde{h}_+[n] & n \geq 0 \\ \tilde{h}_+[-n] & n < 0 \end{cases}$$

$$h[n] = \tilde{h}[n - M/2]$$

Extension:

❑ LS has no preference for pass band or stop band

❑ Use weighting of LS to change ratio

want to solve the discrete version of:

$$\text{minimize} \quad \int_{-\pi}^{\pi} W(\omega)|H(e^{j\omega}) - H_d(e^{j\omega})|^2 d\omega$$

where W(ω) is δp in the pass band and δs in stop band

Similarly: W(ω) is 1 in the pass band and δp/δs in stop band

Weighted Least-Squares

$$\text{argmin}_{\tilde{h}_+} \quad (A\tilde{h}_+ - b)^* W^2 (A\tilde{h}_+ - b)$$

Solution:

$$\tilde{h}_+ = (A^* W^2 A)^{-1} W^2 A^* b$$

$$W = \begin{bmatrix} 1 & & & & & & 0 \\ & 1 & & & & & \\ & & \ddots & & & & \\ & & & \frac{\delta_p}{\delta_s} & & & \\ & & & & \ddots & & \\ & & & & & \frac{\delta_p}{\delta_s} & \\ 0 & & & & & & \frac{\delta_p}{\delta_s} \end{bmatrix}$$

Optimality – min-max

❑ Chebychev Design (min-max)

$$\text{minimize}_{\omega \in \text{care}} \quad \max |H(e^{j\omega}) - H_d(e^{j\omega})|$$

- ■ Parks-McClellan algorithm - equiripple
- ■ Also known as Remez exchange algorithms (signal.remez)
- ■ Can also use convex optimization

Parks-McClellan

❑ Allows for multiple pass- and stop-bands.

❑ Is an equi-ripple design in the pass- and stop-bands, but allows independent weighting of the ripple in each band.

❑ Allows specification of the band edges.

Parks–McClellan: LP Filter
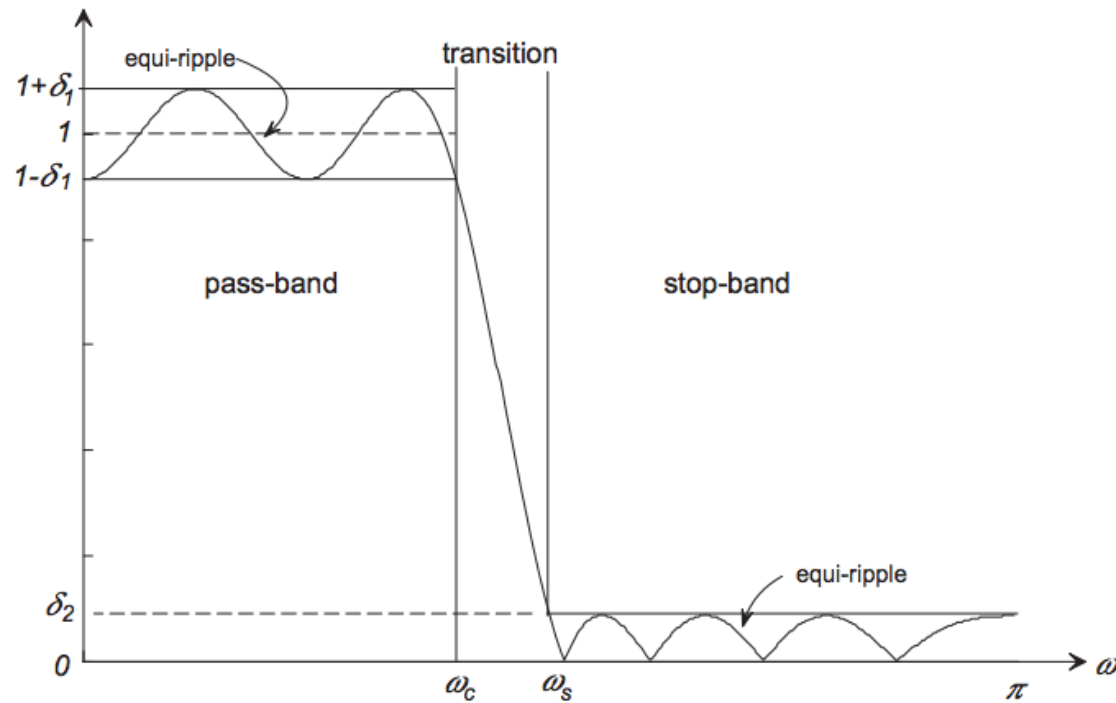
❑ For the low-pass filter shown above the specifications are

$$
\begin{aligned}
1 - \delta_1 &< H(e^{j\omega}) < 1 + \delta_1 &&\text{in the pass-band } 0 < \omega \le \omega_c \\
-\delta_2 &< H(e^{j\omega}) < \delta_2 &&\text{in the stop-band } \omega_s < \omega \le \pi.
\end{aligned}
$$

Parks-McClellan: LP Filter

❑ Need to determine M+1 (length of the filter) and the filter coefficients $\{h_n\}$

Parks-McClellan: LP Filter

❑ Need to determine M+1 (length of the filter) and the filter coefficients $\{h_n\}$

❑ If we assume M even and even symmetry FIR filter (Type I), then

$$A_e(e^{j\omega}) = h_e[0] + \sum_{n=1}^{L} 2h_e[n]\cos(\omega n).$$

$$H(e^{j\omega}) = A_e(e^{j\omega})e^{-j\omega M/2}.$$

Parks-McClellan: LP Filter

❑ Reformulate:

$$A_e(e^{j\omega}) = h_e[0] + \sum_{n=1}^{L} 2h_e[n]\cos(\omega n).$$

❑ …to fitting a polynomial

$$A_e(e^{j\omega}) = \sum_{k=0}^{L} a_k(\cos\omega)^k,$$

$$A_e(e^{j\omega}) = P(x)|_{x=\cos\omega}, \qquad P(x) = \sum_{k=0}^{L} a_k x^k.$$

Parks-McClellan: LP Filter

❑ Define approximation error function

$$E(\omega) = W(\omega)[H_d(e^{j\omega}) - A_e(e^{j\omega})],$$

$$W(e^{j\omega}) = \begin{cases} \delta_2/\delta_1 & \text{in the pass-band} \\ 1 & \text{in the stop-band} \\ 0 & \text{in the transition band.} \end{cases}$$

Parks-McClellan: LP Filter

❑ Define approximation error function

$$E(\omega) = W(\omega)[H_d(e^{j\omega}) - A_e(e^{j\omega})],$$

❑ Apply min-max or Chebyshev criteria

$$\min_{\{h_e[n]:0 \leq n \leq L\}} \left(\max_{\omega \in F} |E(\omega)| \right),$$

Parks-McClellan – Alternation Theorem

❑ The algorithm uses Chebyshev's alternation theorem to recognize the optimal solution.

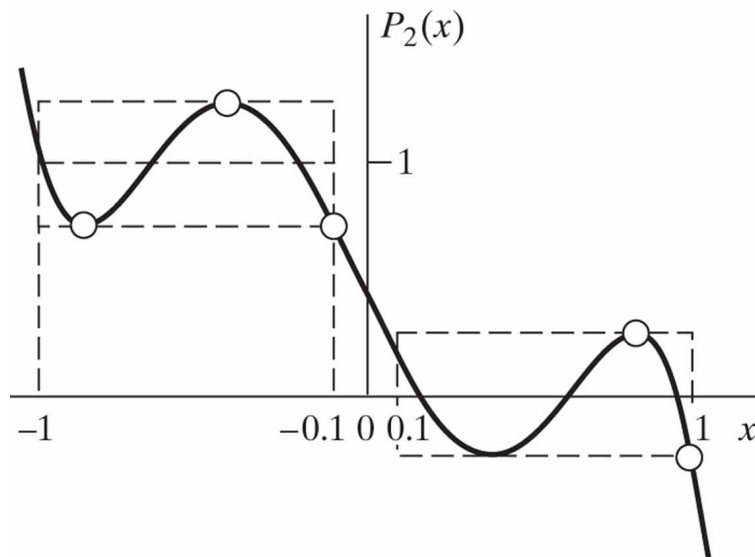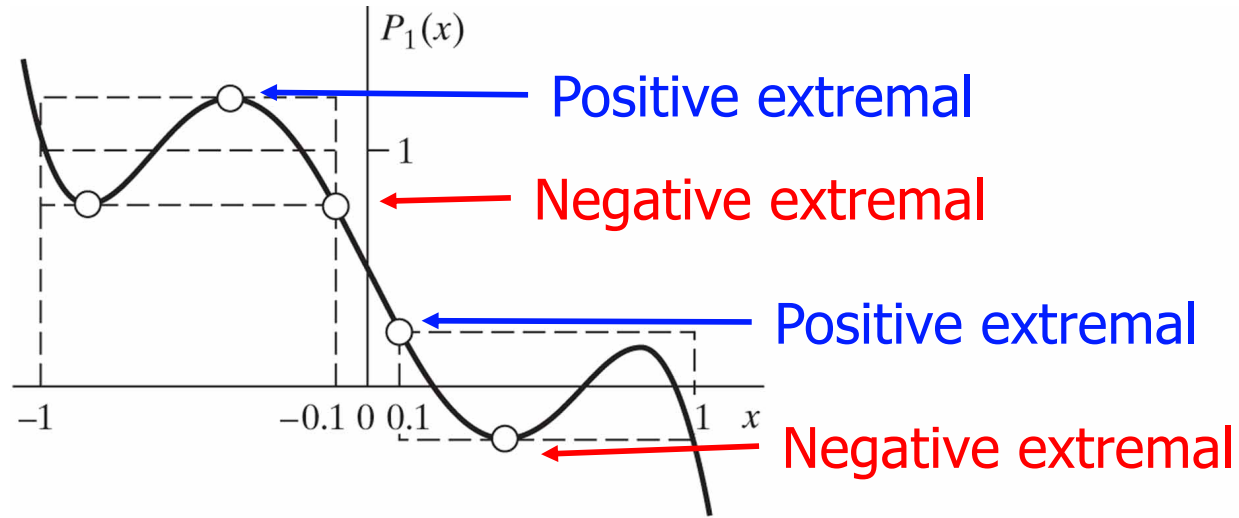Define the error $E(x)$ as above, namely

$$E(e^{j\omega}) = W(e^{j\omega})\left(H_d(e^{j\omega}) - H(e^{j\omega})\right)$$

and the maximum error as

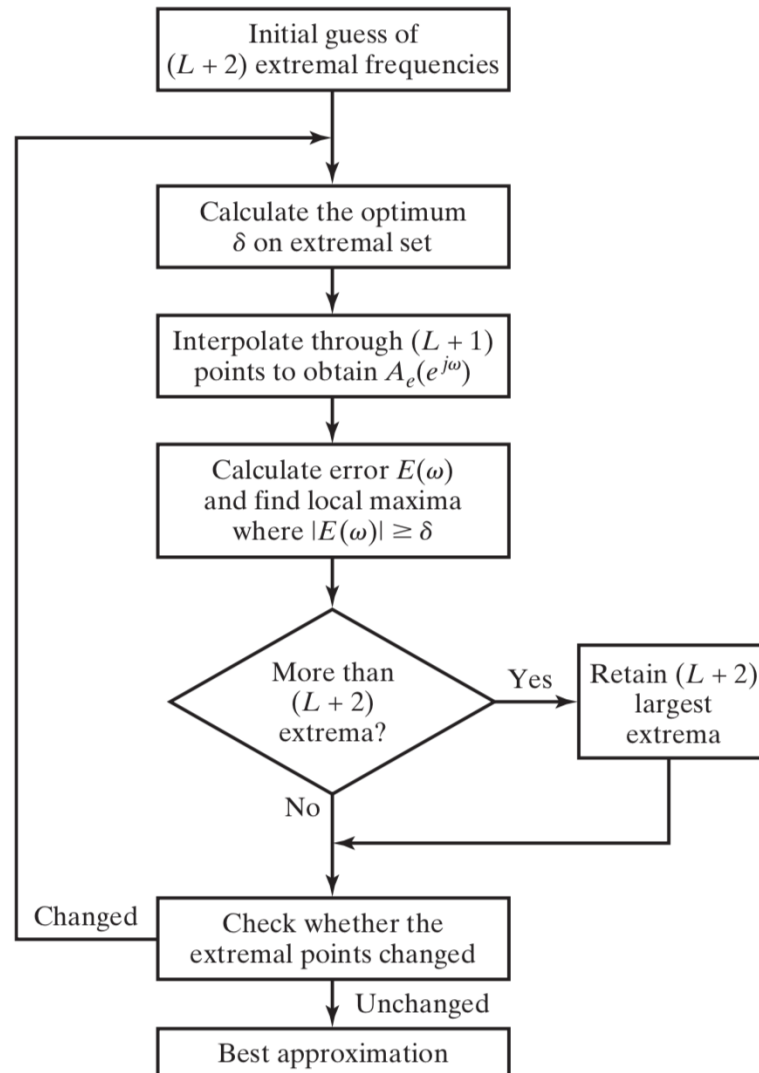$$\|E(e^{j\omega})\|_\infty = \mathrm{argmax}_{x \in \Omega} \left|E(e^{j\omega})\right|$$

A necessary and sufficient condition that $H(e^{j\omega})$ is the unique Lth-order polynomial minimizing $\|E(e^{j\omega})\|_\infty$ is that $E(e^{j\omega})$ exhibit at least $L+2$ extremal frequencies, or "alternations", that is there must exist at least $L+2$ values of ω, $\omega_k \in \Omega$, $k = [0, 1, \ldots, L+1]$, such that $\omega_0 < \omega_1 < \ldots < \omega_{L+1}$, and such that

$$E(e^{j\omega_k}) = -E(e^{j\omega_{k+1}}) = \pm\left(\|E(e^{j\omega})\|_\infty\right).$$

Alternation Theorem Example – 5th order

Positive extremal

Negative extremal

Positive extremal

Negative extremal
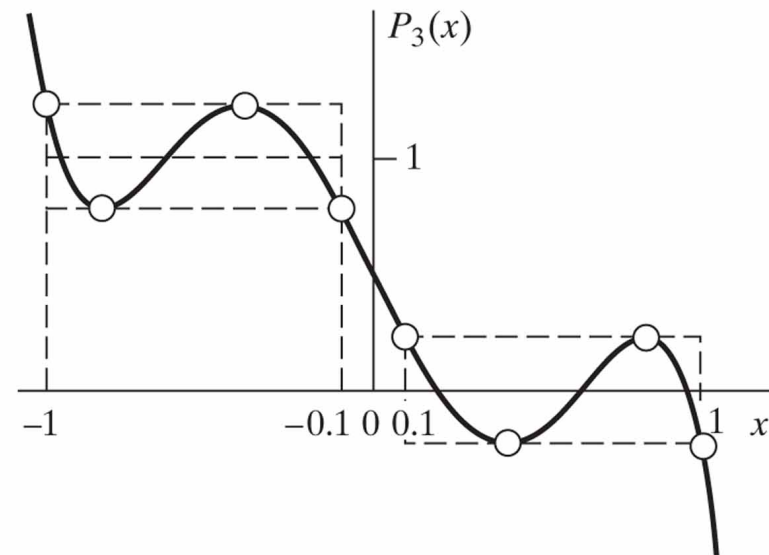
Parks–McClellan algorithm

Min-Max Filter Design

❑ Constraints:

- min-max pass-band ripple

$$1 - \delta_p \leq |H(e^{j\omega})| \leq 1 + \delta_p, \qquad 0 \leq w \leq \omega_p$$
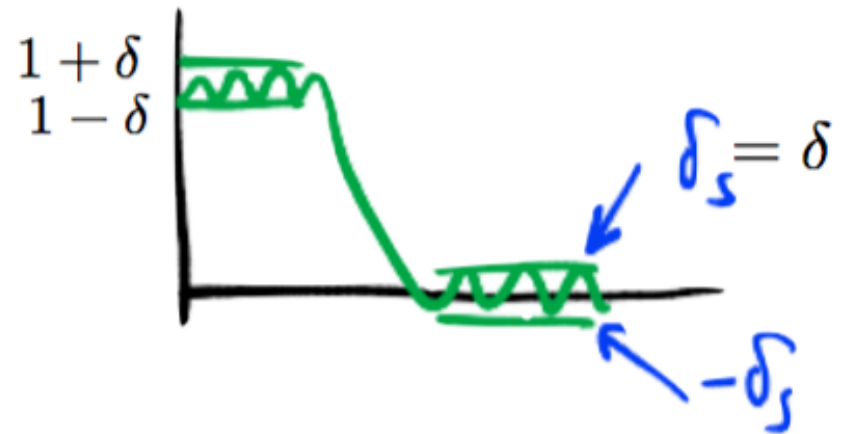
- min-max stop-band ripple

$$|H(e^{j\omega})| \leq \delta_s, \qquad \omega_s \leq w \leq \pi$$

Min-Max Ripple Design

❑ Given ω_p, ω_s, M, find δ, $\tilde{h}_+$

minimize δ

Subject to :

$$1 - \delta \leq \tilde{H}(e^{j\omega_k}) \leq 1 + \delta \qquad 0 \leq \omega_k \leq \omega_p$$

$$-\delta \leq \tilde{H}(e^{j\omega_k}) \leq \delta \qquad \omega_s \leq \omega_k \leq \pi$$

$$\delta > 0$$

❑ Formulation is a linear program with solution δ, $\tilde{h}_+$

❑ A well studied class of problems with good solvers

Min-Max Ripple via LP

$$\text{minimize} \quad \delta$$

$$\text{subject to :}$$

$$1 - \delta \preceq A_p \tilde{h}_+ \preceq 1 + \delta$$

$$-\delta \preceq A_s \tilde{h}_+ \preceq \delta$$

$$\delta > 0$$

$$A_p = \begin{bmatrix} 1 & 2\cos(\omega_1) & \cdots & 2\cos(\frac{M}{2}\omega_1) \\ & \vdots & & \\ 1 & 2\cos(\omega_p) & \cdots & 2\cos(\frac{M}{2}\omega_p) \end{bmatrix}$$

$$A_s = \begin{bmatrix} 1 & 2\cos(\omega_s) & \cdots & 2\cos(\frac{M}{2}\omega_s) \\ & \vdots & & \\ 1 & 2\cos(\omega_P) & \cdots & 2\cos(\frac{M}{2}\omega_P) \end{bmatrix}$$
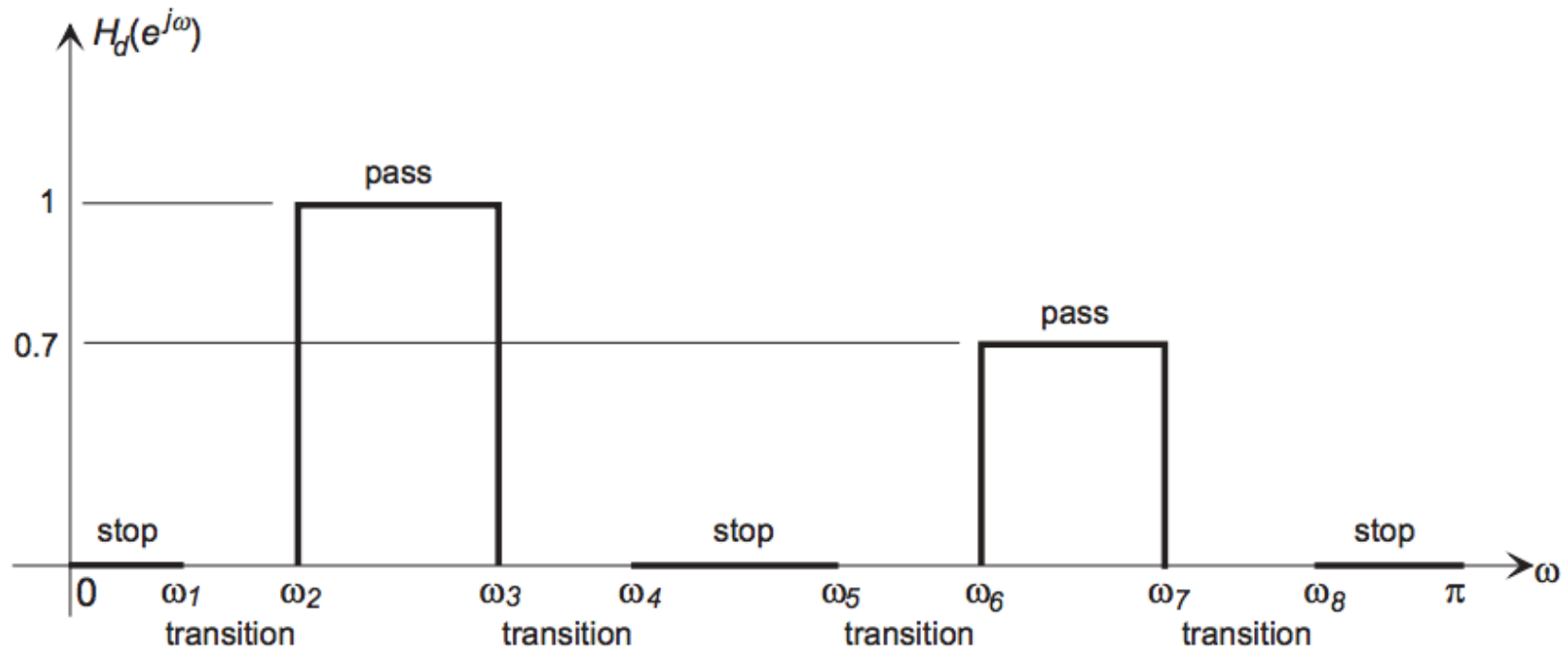
capital P

MATLAB Parks-McClellan Function

❑ `b = firpm(M,F,A,W)`

- `b` is the array of filter coefficients (impulse response)

- `M` is the filter order (`M+1` is the length of the filter),

- `F` is a vector of band edge frequencies in ascending order

- `A` is a set of filter gains at the band edges

- `W` is an optional set of relative weights to be applied to each of the bands
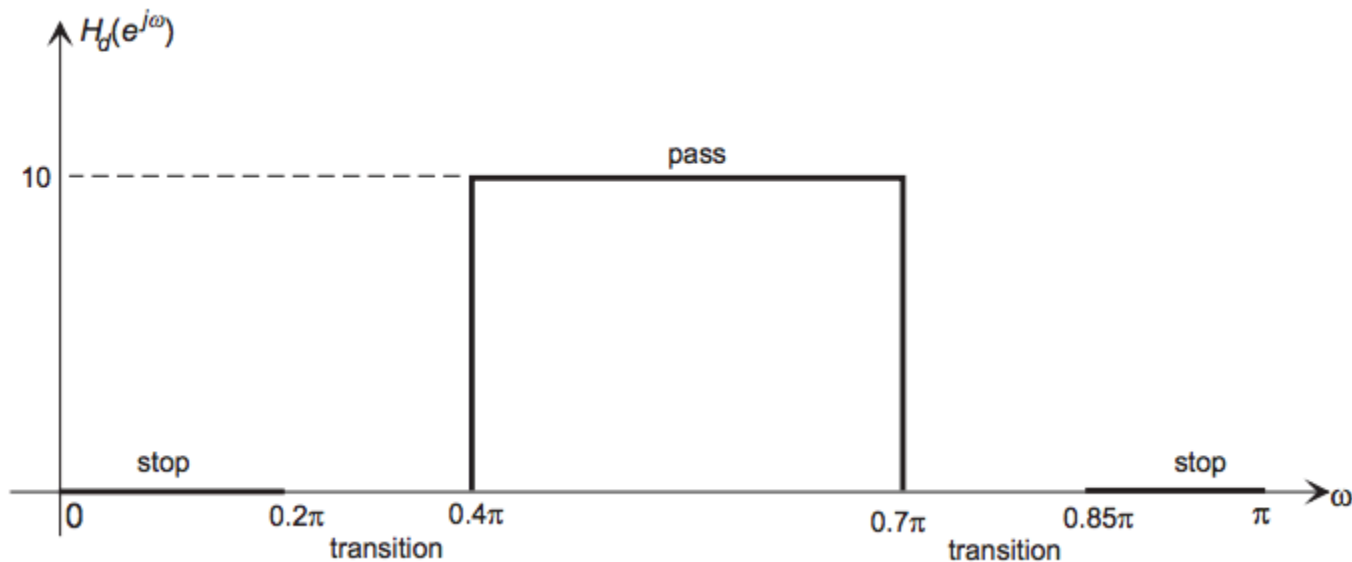
MATLAB Parks-McClellan Function

$$F = [0 \quad \omega_1 \quad \omega_2 \quad \omega_3 \quad \omega_4 \quad \omega_5 \quad \omega_6 \quad \omega_7 \quad \omega_8 \quad 1]$$
$$A = [0 \quad 0 \quad 1 \quad 1 \quad 0 \quad 0 \quad 0.7 \quad 0.7 \quad 0 \quad 0]$$
$$W = [10 \quad 1 \quad 10 \quad 1 \quad 10]$$

MATLAB Example

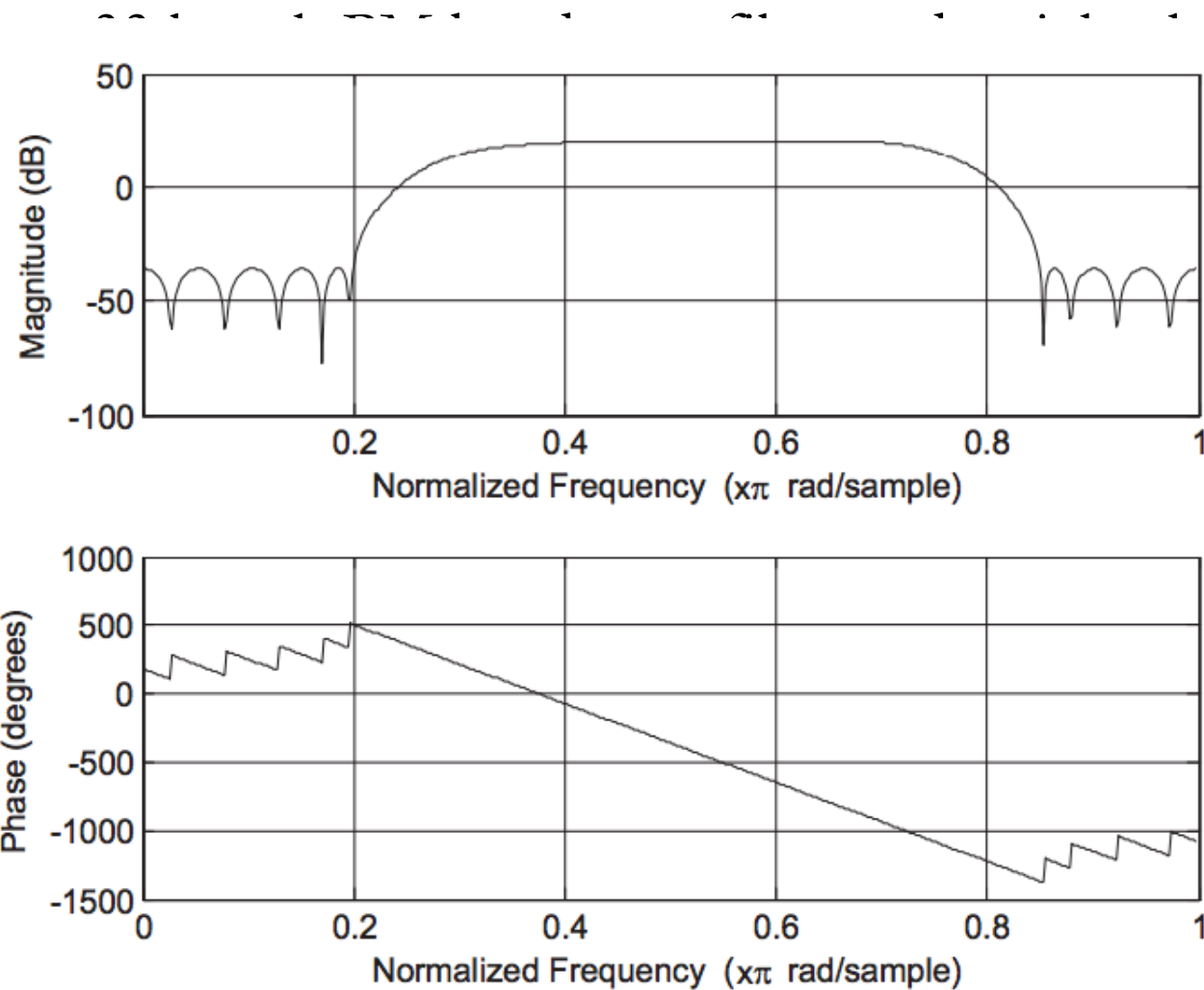❑ Design a 33 length PM ???? filter and weight the stop-band ripple 10x more than the pass-band ripple


```
h=firpm(32,[0 0.2 0.4 0.7 0.85 1],[0 0 10 10 0 0],[10 1 10])
freqz(h,1)
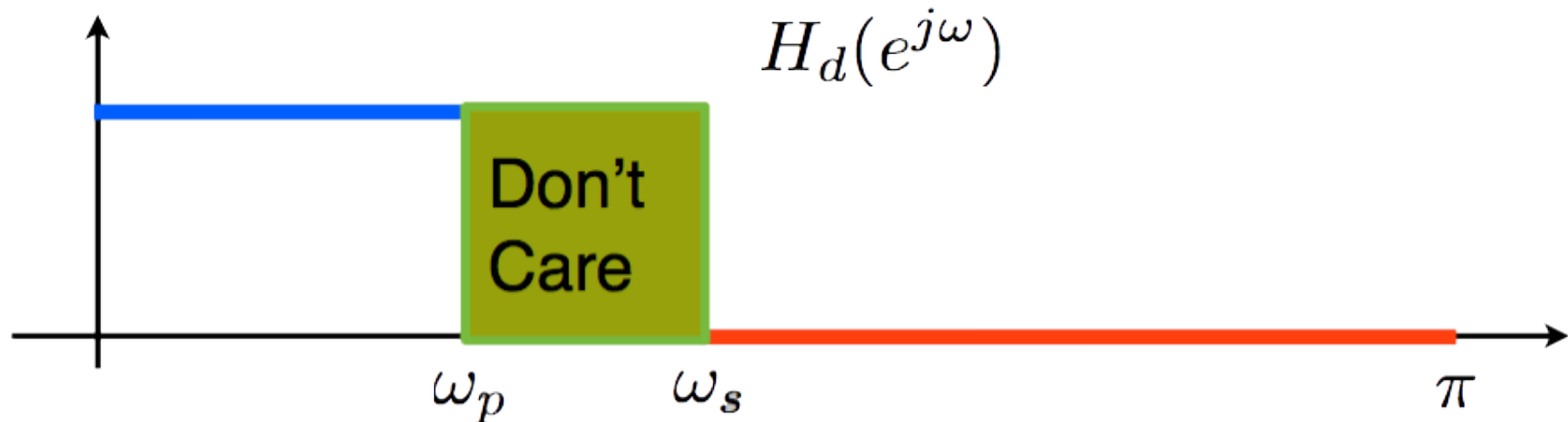```

# MATLAB Example

❑ De 33-band PM bandpass filter ... ... top-
   ban



```
h=firp                                                    1 10])
freqz(
```

Optimality – Least Squares

$$H_d(e^{j\omega})$$

Don't Care

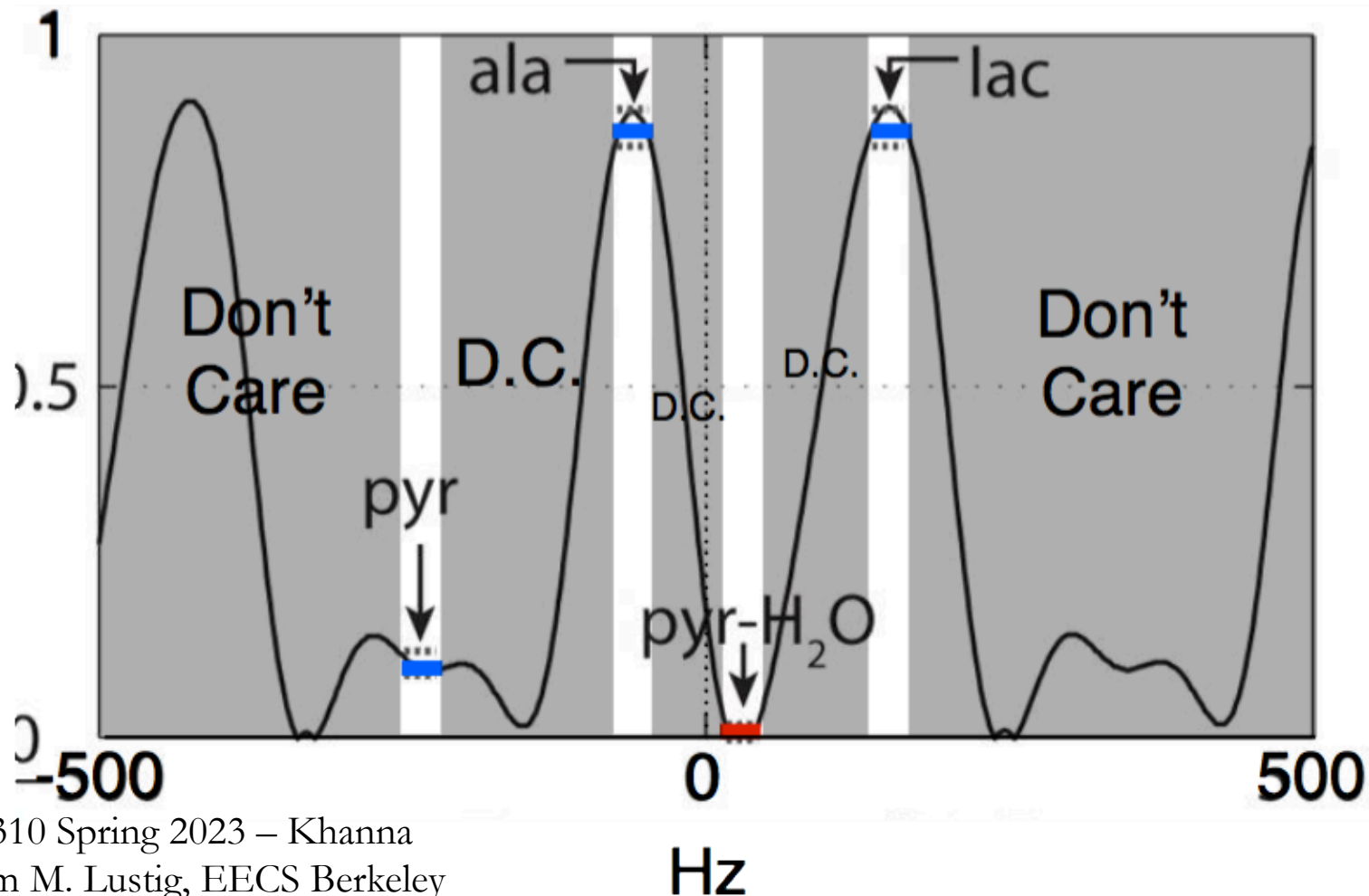ω_p ω_s π

❑ Least Squares:

$$\text{minimize} \quad \int_{\omega \in \text{care}} |H(e^{j\omega}) - H_d(e^{j\omega})|^2 d\omega$$

❑ Parks-McClellan

$$\min_{\{h_e[n]:0 \leq n \leq L\}} \left(\max_{\omega \in F} |E(\omega)| \right),$$

Example of Complex Filter

❑ Larson et. al, "Multiband Excitation Pulses for Hyperpolarized 13C Dynamic Chemical Shift Imaging" JMR 2008;194(1):121-127

❑ Need to design length 11 filter with following frequency response:

Convex Optimization

❑ Many tools and Solvers

❑ Tools:

  ▪ CVX (Matlab) http://cvxr.com/cvx/

  ▪ CVXOPT, CVXMOD (Python)

❑ Optimization Engines:

  ▪ Sedumi (Free)

  ▪ MOSEK (commercial)

Using CVX (in Matlab)

```
M = 16;
wp = 0.5*pi;
ws = 0.6*pi;
MM = 15*M;
w = linspace(0,pi,MM);

idxp = find(w <=wp);
idxs = find(w >=ws);

Ap = [ones(length(idxp),1) 2*cos(kron(w(idxp)',
[1:M/2]))];
As = [ones(length(idxs),1) 2*cos(kron(w(idxs)',
[1:M/2]))];

% optimization
cvx_begin
    variable hh(M/2+1,1);
    variable d(1,1);

    minimize(d)
    subject to
        Ap*hh <=1+d;
        Ap*hh >=1-d;
        As*hh < d;
        As*hh > -d;
        ds>0;
cvx_end
h = [hh(end:-1:1) ; hh(2:end)];
```
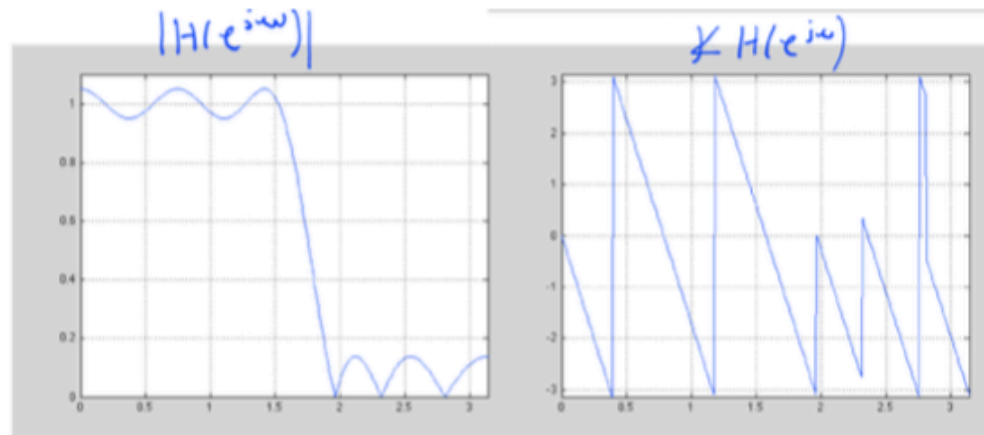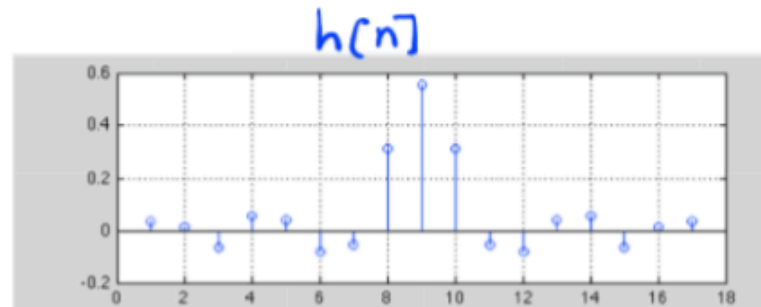

$h[n]$

$|H(e^{i\omega})|$ and $\angle H(e^{i\omega})$

Admin

- ❑ Project1 out now
    - Due Tuesday 3/28
- ❑ Project 1 Submission
    - 2 assignments on Gradescope
    - Project 1 Report
        - Late penalty judged off this
    - Project 1 code
        - Can submit multiple files any format

- ❑ Project questions?