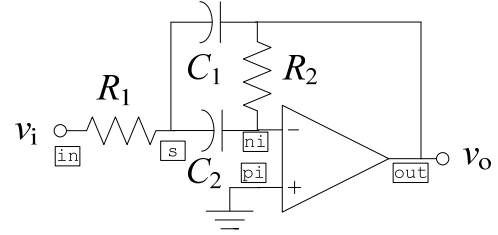


**OPTIMIZING A MULTIPLE-FEEDBACK 2ND ORDER BAND-PASS FILTER: A SOLUTION**

Consider the following multiple-feedback 2nd order band-pass active filter. At a resonant frequency  $f_0 = 15$  KHz, the magnitude of the voltage gain should be  $|A_v| = 800$ , with a bandwidth  $BW = 750$  Hz.

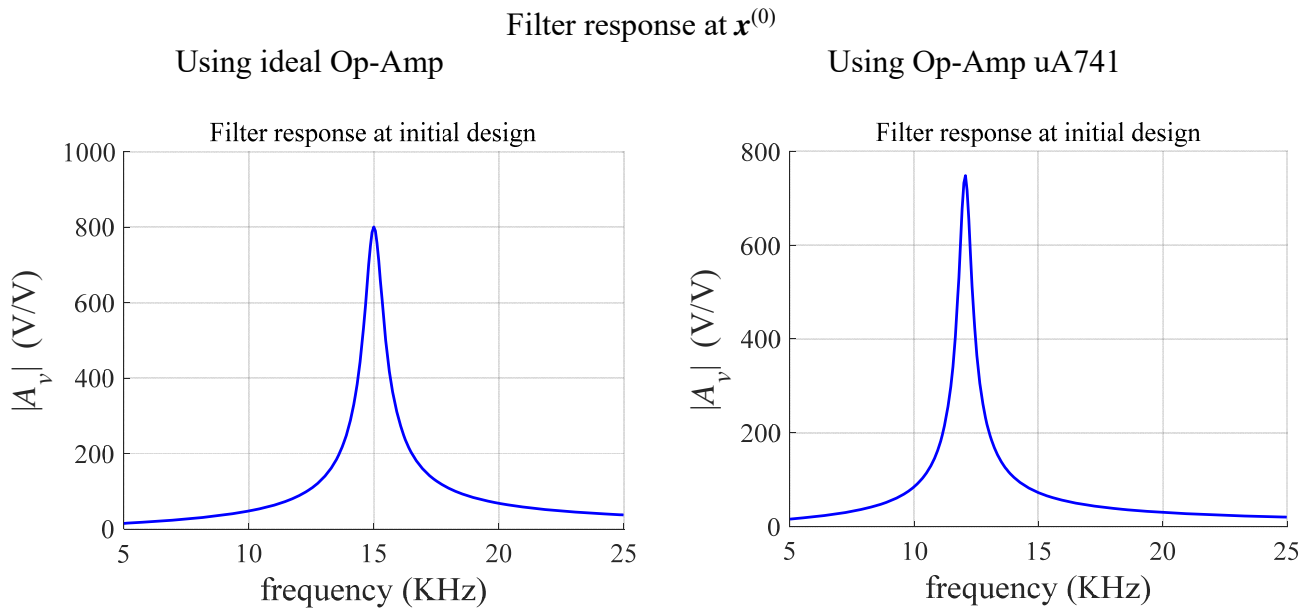
Assuming an ideal Op-Amp, an exact analytical solution can be found following [1]. If  $C_1 = C_2 = 1$  nF, and  $f_0 = 15$  KHz with  $BW = 750$  Hz, then  $Q = 20$ ,  $|A_v| = 800$  at  $f_0$ , yielding  $R_1 = 265.26 \Omega$  and  $R_2 = 424.41$  K $\Omega$ .



**1. Optimization Variables and Starting Point**

The selected vector of optimization variables is  $\mathbf{x} = [R_1(\Omega) \ R_2(K\Omega) \ C(nF)]^T$ , with  $C = C_1 = C_2$ .

The starting point for optimization is  $\mathbf{x}^{(0)} = [265.26 \ 424.41 \ 1]^T$ .



**2. Design Specifications**

Let  $|A_v|_{3dB} = 800 / \sqrt{2}$ ,  $f_L = f_0 - \frac{BW}{2}$ , and  $f_H = f_0 + \frac{BW}{2}$ .

Design specs are:

$$\begin{aligned}
 &|A_v| = 800 \text{ at } f = f_0 \\
 &|A_v| \leq |A_v|_{3dB} \text{ for } f < f_L \\
 &|A_v| \leq |A_v|_{3dB} \text{ for } f > f_H
 \end{aligned}$$

### 3. Formulation of the Optimization Problem

$$\mathbf{x}^* = \arg \min_{\mathbf{x}} \max \{ \dots e_k(\mathbf{x}) \dots \}$$

where the  $k$ -th error function is given by

$$e_k(\mathbf{x}) = \begin{cases} \frac{|A_v|(\mathbf{x})}{|A_v|_{3\text{dB}}} - 1 & \text{for } f_k < f_L \\ \frac{||A_v|(\mathbf{x}) - 800|}{\varepsilon} - 1 & \text{for } f_0 - \Delta f < f_k < f_0 + \Delta f \\ \frac{|A_v|(\mathbf{x})}{|A_v|_{3\text{dB}}} - 1 & \text{for } f_k > f_H \end{cases}$$

where  $f_k$  is the  $k$ -th simulated frequency point,  $\varepsilon = 0.01(800)$  and  $\Delta f = 10$  Hz.

### 4. Objective Function Implementation

```

% ~~~~~
% Objective Function for a Multiple-Feedback 2nd Order Band-Pass Filter

function MaxError = OF_MFBP2(x)

Avr = 800;
Avr_3dB = Avr/sqrt(2);
fo = 15e3;
BW = 750;
fL = fo - BW/2;
fH = fo + BW/2;

% Calculate Filter Response in Frequency Band of Interest
IF = 12.5e3;
FF = 17.5e3;
FP = 501;
[f,mAv,pAv] = MFBP2_SPICE(x,IF,FF,FP);

% Calculate Error Functions
DeltaAv = Avr/100;
e1 = []; % Initialize error e1.
e2 = []; % Initialize error e2.
e3 = []; % Initialize error e3.
for k = 1:FP
    if f(k) < fL
        e1n = mAv(k)/Avr_3dB - 1; % Upper bound for low frequencies.
        e1 = [e1 e1n];
    elseif f(k) > fH
        e3n = mAv(k)/Avr_3dB - 1; % Upper bound for high frequencies.
        e3 = [e3 e3n];
    else
        if f(k)>fo-10 && f(k)<fo+10
            e2n = abs(mAv(k)-Avr)/DeltaAv - 1; % Equality constraint
            e2 = [e2 e2n]; % for resonant frequency.
        end
    end
end

% Calculating Objective Function Value
e = [e1 e2 e3];
MaxError = max(e);

```

## 5. Optimization Results

$$\mathbf{x}^{(0)} = [265.26 \quad 424.41 \quad 1]^T.$$

### A) Using the Nelder-Mead Method

```
options = optimset('MaxFunEvals',1000,'MaxIter',1000,'TolX',1e-2);
[Xopt, FunVal, EF, output] = fminsearch('OF_MFBP2', Xo, options);
```

| FP   | $\mathbf{x}^{*T}$          | $u(\mathbf{x}^*)$ | iter | OFE |
|------|----------------------------|-------------------|------|-----|
| 151  | [273.373 507.51 0.673232]  | -0.15099          | 91   | 163 |
| 501  | [273.291 507.078 0.673642] | -0.12368          | 94   | 175 |
| 1001 | [272.493 505.297 0.675872] | -0.12365          | 83   | 153 |
| 50   | [5.0e+12 3.7e+12 3.4e+10]  | -1                | 120  | 377 |
| 51   | [273.373 507.51 0.673232]  | -0.15099          | 91   | 163 |

iter: number of iterations.

OFE: number of objective function evaluations = WinSpice simulations.

It is seen that the case with 50 frequency points fails because the error function at the resonant frequency is not computed in the objective function.

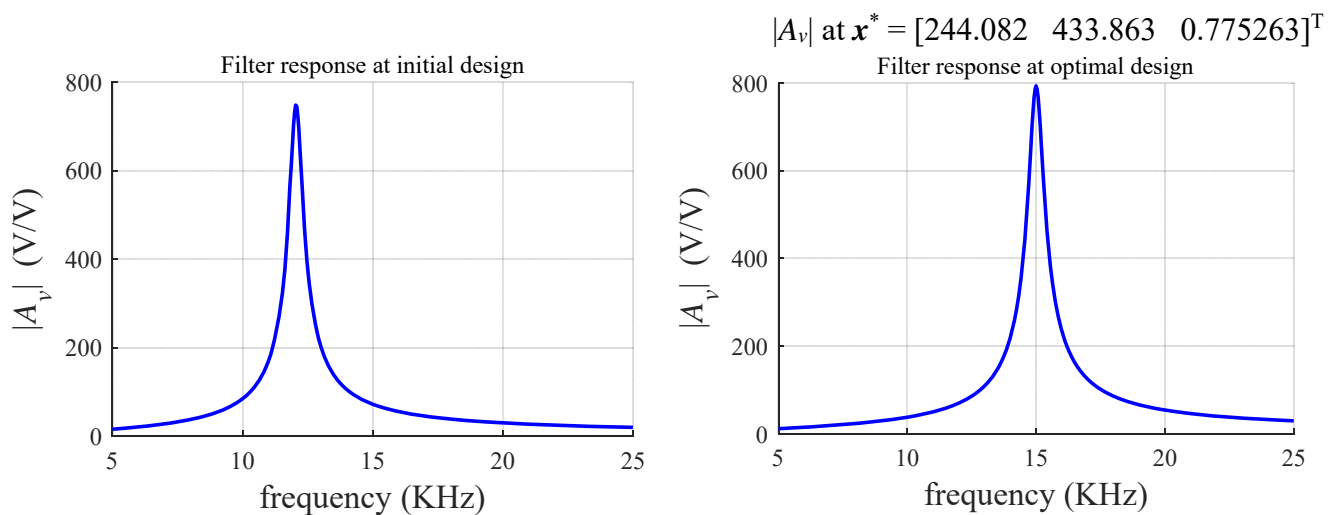
Using `'TolX' = 1e-8` and `FP = 501`, Nelder-Mead requires much more iterations and function evaluations:  $\mathbf{x}^* = [269.718 \quad 497.799 \quad 0.684895]^T$ ,  $u(\mathbf{x}^*) = -0.1247$ , iter = 496, OFE = 891.

### B) Using Gradient-Based Methods (gradients calculated by finite central differences, $h = 1e-5$ )

```
MaxIter = 1000; epsg = 1e-8; epsx = 1e-8;
```

FP = 501

| Method              | $\mathbf{x}^{*T}$          | $u(\mathbf{x}^*)$ | iter | OFE |
|---------------------|----------------------------|-------------------|------|-----|
| Steepest Descent    | [244.082 433.863 0.775263] | -0.13169          | 12   | 387 |
| Conjugate Gradient  | [243.651 434.58 0.77494]   | -0.13005          | 5    | 195 |
| Quasi-Newton (BFGS) | [244.152 434.33 0.773367]  | -0.10364          | 4    | 155 |



[1] S. Franco, *Design with Operational Amplifiers and Analog Integrated Circuits*. New York, NY: McGraw-Hill, 1988, pp. 130-131.