

# Signalverarbeitung für offene Hörgeräte

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<http://www.sigproc.uni-oldenburg.de/>

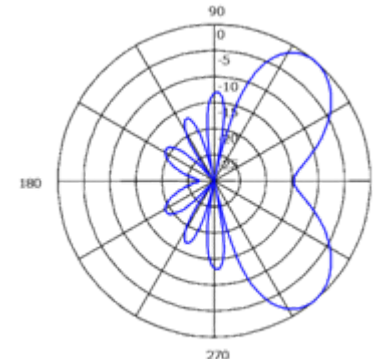
*Kolloquium Kommunikationstechnik, IND - RWTH Aachen, 15.07.2011*

# Outline

- Hearing aids: **open vs. closed fittings**
  - Leakage through open fitting
  - Active ear mould with internal microphone
- **Noise reduction algorithms**
  - Multi-channel Wiener filter (MWF)
  - Integration with active noise control: feedforward → combined feedforward-feedback
- **Experimental results**
  - SNR improvement and robustness
- Conclusions and future work

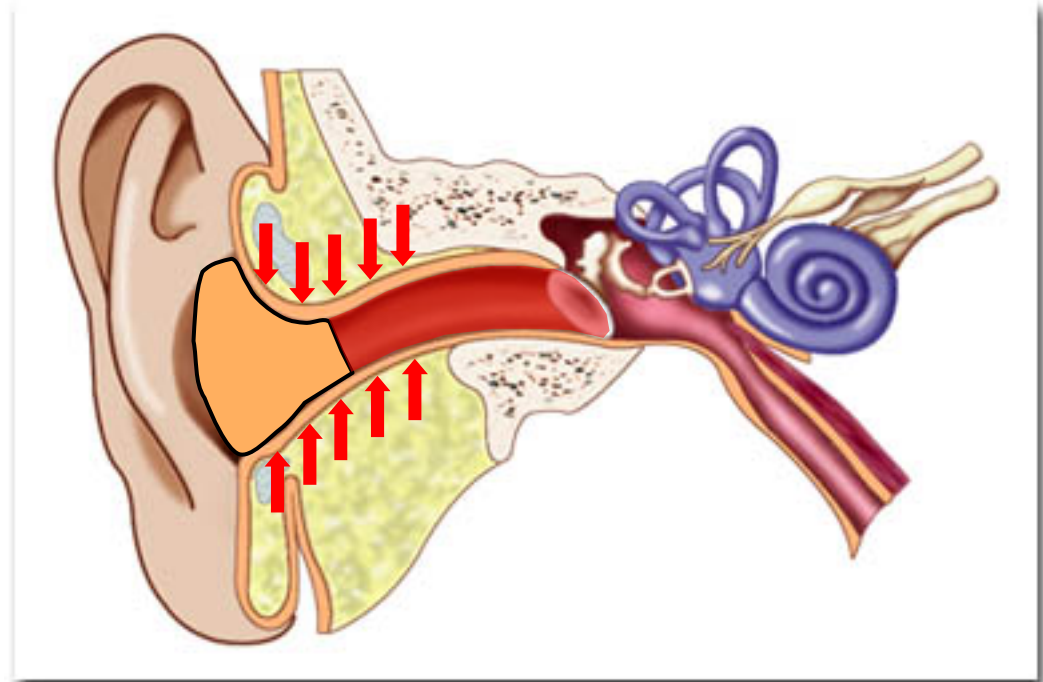
## Signal processing in hearing aids

- **Digital hearing aids** allow for advanced acoustical signal processing:
  - multiple microphones: spectral + spatial processing
  - many hearing impaired fitted with hearing aid at both ears
- **Cochlear loss:**
  - Frequency-specific amplification
  - Dynamic range compression
- **Binaural and central loss:**
  - Noise reduction
  - Binaural Algorithms (cue preservation)
- **“Technical” requirements**
  - Feedback control (40-60 dB acoustic gain!)
  - Occlusion effect / ‘own voice’ detection
  - Classification of acoustic environment
  - (fully digital, 1V supply from very small battery, 5-6d battery time, wireless binaural link)



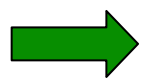
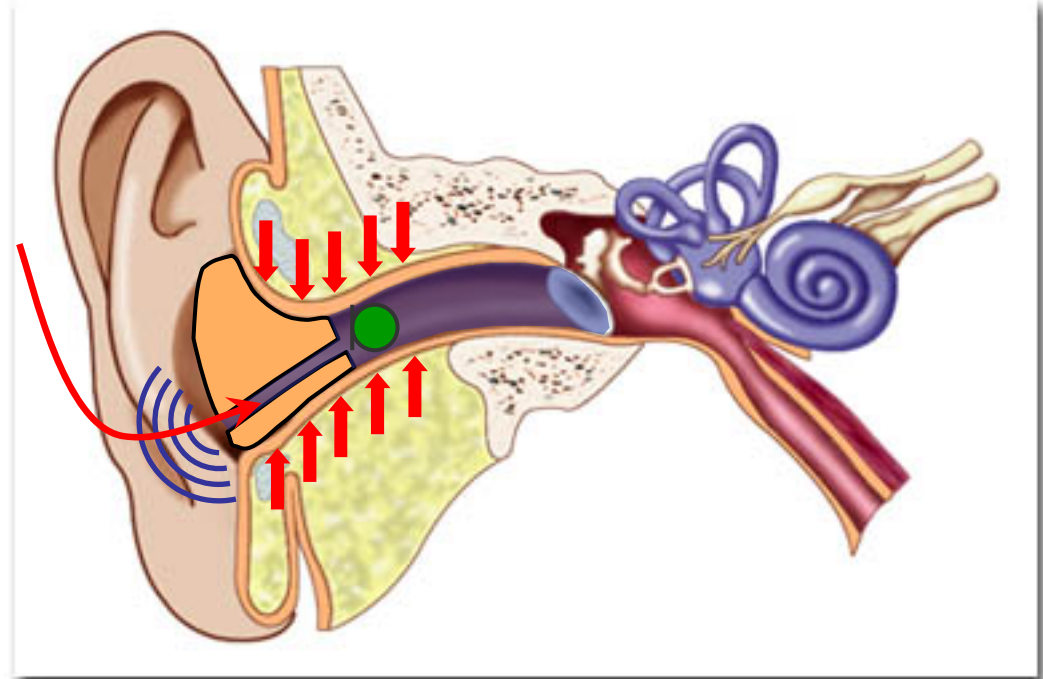
## Open vs. closed fittings

- **Closed-fitting:**
  - Increase in low-frequency sound pressure when ear canal is blocked from the acoustical environment
  - Own voice is being perceived as hollow (occlusion effect)



## Open vs. closed fittings

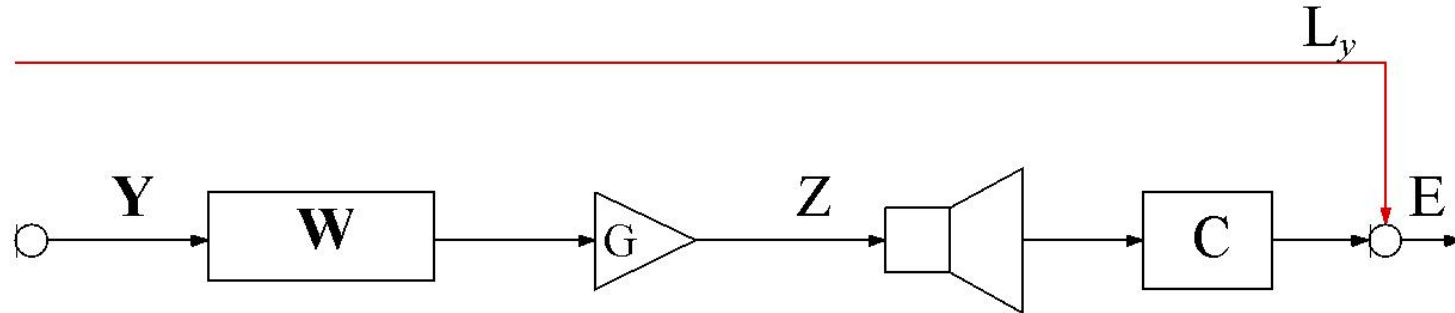
- **Open-fitting (venting):**
  - Reduces occlusion effect
  - However, undesired perceptual effects (direct + delayed sound)
  - Increased risk of feedback
  - Ambient noise leakage



combination of (multi-microphone) speech enhancement and active noise control using **internal microphone**

# Noise reduction algorithms

## Hearing aid configuration



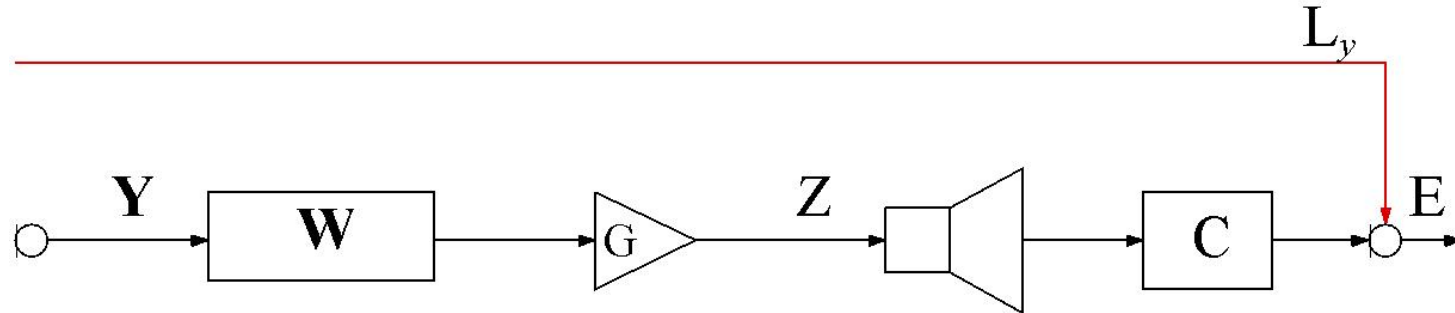
- **Configuration:** microphone array with  $M$  external microphones

$$Y_m(\omega) = X_m(\omega) + V_m(\omega), \quad m = 0 \dots M - 1$$

$\uparrow$                        $\uparrow$   
 speech component    noise component

- Receiver (loudspeaker) signal:  $Z = G\mathbf{W}^H\mathbf{Y}$  (G: amplification of HA)
- Error microphone signal:  $E = C\mathbf{Z} + L_y$  (C: secondary path)

## Multi-channel Wiener filter (MWF)



- **MWF:** estimate speech component in microphone signal (usually front mic) + possible trade-off between noise reduction and speech distortion

$$D = GX_1 e^{-j\omega\Delta}$$

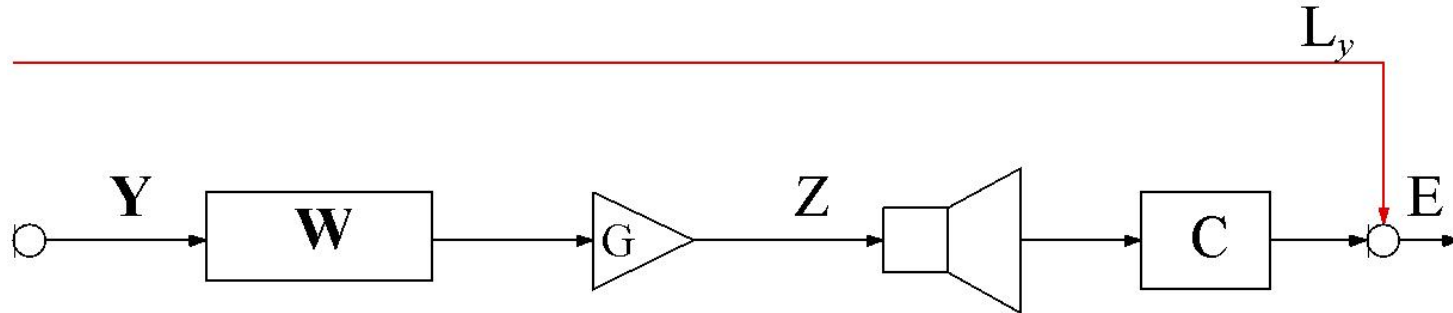
$$J_{\text{MWF}}(\mathbf{W}) = \mathcal{E}\{|Z - D|^2\}$$

$$\boxed{\mathbf{W}_{\text{MWF}} = \mathbf{R}_y^{-1} \mathbf{R}_x \mathbf{e}_{1,\Delta}}$$

- $\mathbf{e}_{1,\Delta} = [e^{+j\omega\Delta} \quad \dots \quad 0 \quad \dots \quad 0]^T$
- $\mathbf{R}_v = \mathcal{E}\{\mathbf{V}\mathbf{V}^H\}$ : noise correlation matrix
- $\mathbf{R}_y = \mathcal{E}\{\mathbf{Y}\mathbf{Y}^H\}$ : speech + noise correlation matrix
- $\mathbf{R}_x = \mathbf{R}_y - \mathbf{R}_v$ : speech correlation matrix

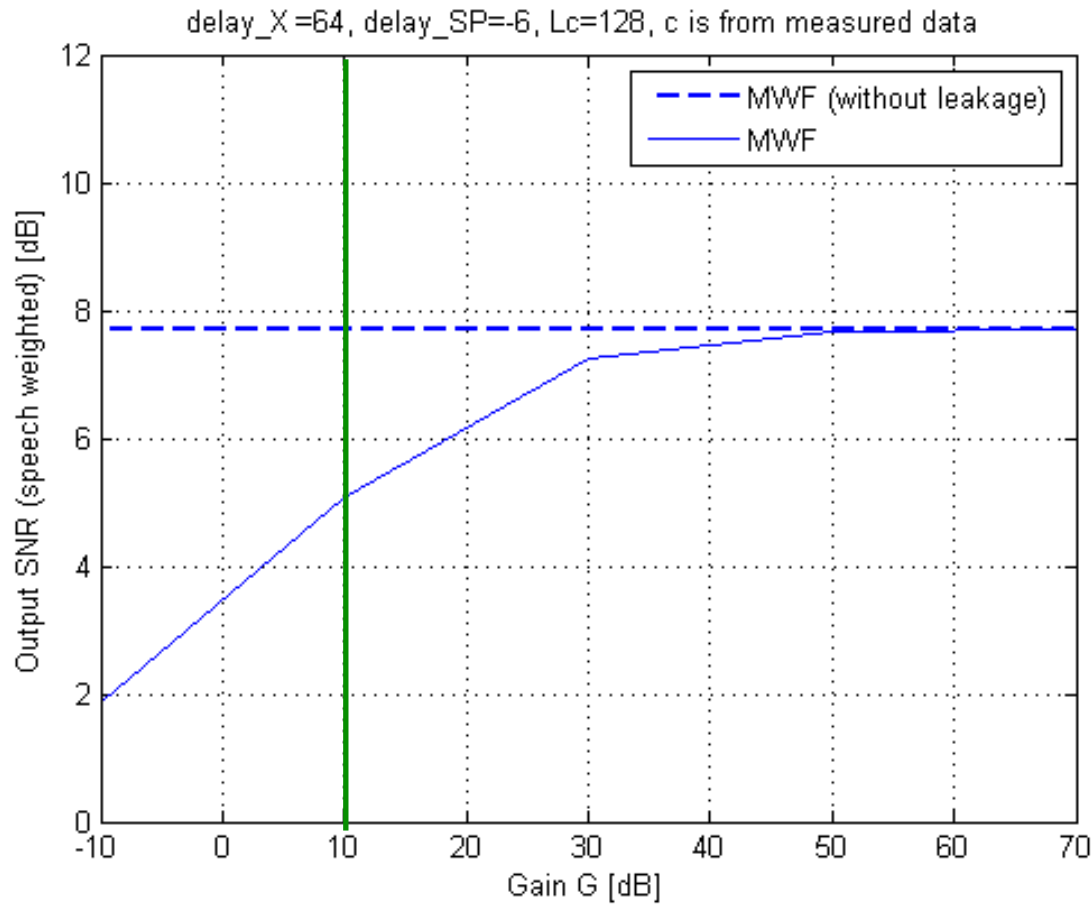


## Multi-channel Wiener filter (MWF)



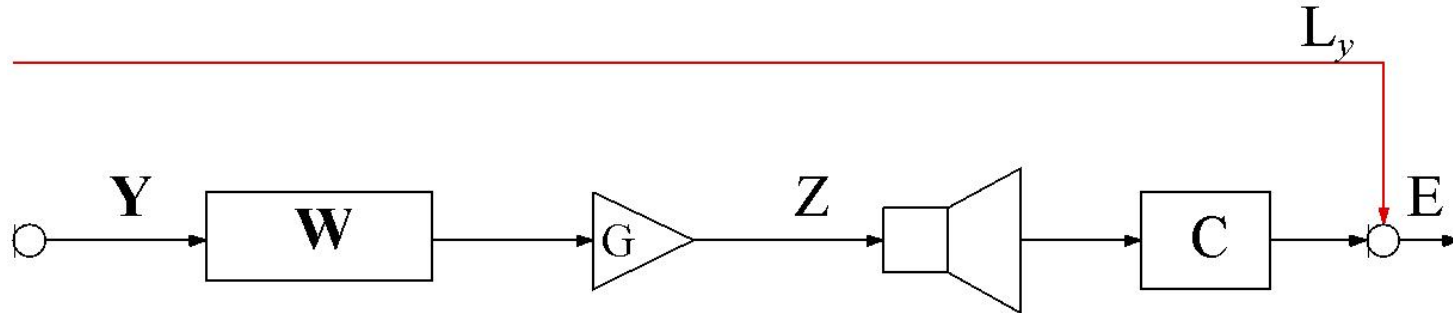
- **MWF:** estimate of speech component in microphone signal (usually front mic) + possible trade-off between noise reduction and speech distortion
  - Estimate  $\mathbf{R}_y$  during speech-dominated time-frequency segments, estimate  $\mathbf{R}_v$  during noise-dominated segments, requiring robust voice activity detection (VAD) mechanism
  - No assumptions about positions of microphones and sources
  - Different implementations:
    - Batch (off-line) vs. adaptive (update correlation matrices)
    - Using spatial prediction (SP) between speech components [Chen 2008]

## MWF: effect of noise leakage



Leakage degrades noise reduction performance, especially for small G

## MWF + Active Noise Control (ANC)

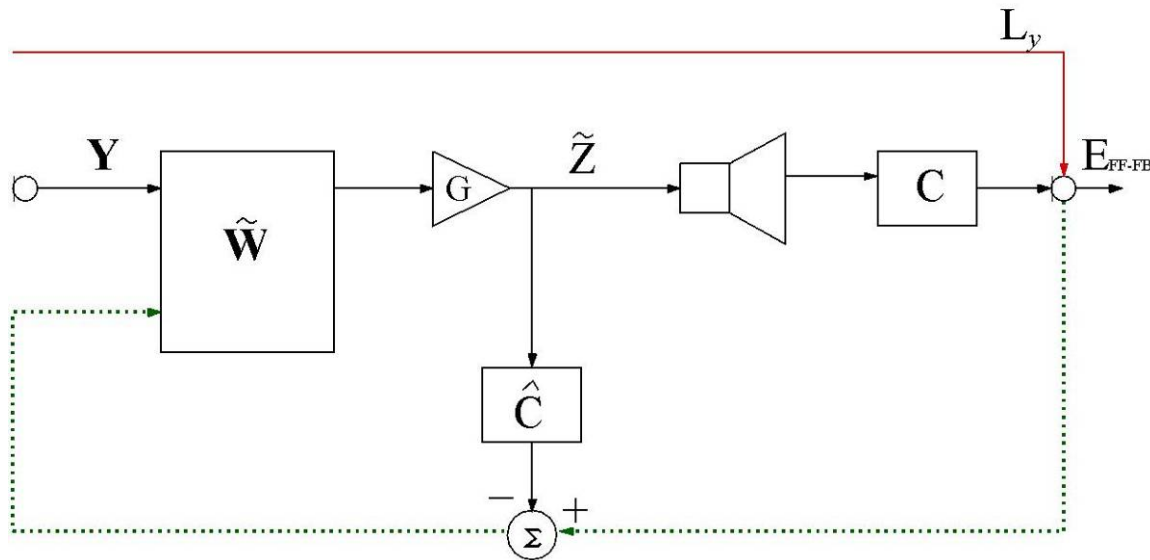


- Use external microphones + internal **error microphone**
- Difference with “standard” ANC: estimate of speech component + anti-noise
- **Feedforward (FF) configuration** [Serizel 2010]
  - Take into account leakage component

$$J_{\text{FF}}(\mathbf{W}) = \mathcal{E}\{|E - D|^2\} = \mathcal{E}\{|CZ + L_y - D|^2\}$$

$$\mathbf{W}_{\text{FF}} = (GC^* \mathbf{R}_y)^{-1} (G \mathbf{R}_x \mathbf{e}_{1,\Delta} - \mathbf{r}_{y/l_y})$$

# MWF + Active Noise Control (ANC)



$$\tilde{Z} = G\tilde{W}^H\tilde{Y}$$

$$\tilde{Y} = \begin{bmatrix} \mathbf{Y} \\ L_y \end{bmatrix}$$

$$E_{\text{FF-FB}} = C\tilde{Z} + L_y$$

- **Combined Feedforward-Feedback (FF-FB) configuration**

- Leakage component in error microphone is used as **additional** input
- Can be estimated if (estimate of) secondary path C is available

$$J_{\text{FF-FB}}(\tilde{W}) = \mathcal{E}\{|E_{\text{FF-FB}} - D|^2\} = \mathcal{E}\left\{\left|GCW^H \begin{bmatrix} \mathbf{Y} \\ L_y \end{bmatrix} + L_y - D\right|^2\right\}$$

$$\tilde{W}_{\text{FF-FB}} = (GC^*\tilde{R}_y)^{-1}(G\tilde{R}_x\mathbf{e}_{1,\Delta} - \tilde{r}_{y/l_y})$$

## Comparison of the algorithms

- MWF:

$$J_{\text{MWF}}(\mathbf{W}) = \mathcal{E}\{|G\mathbf{W}^H\mathbf{Y} - D|^2\}$$

$$\mathbf{W}_{\text{MWF}} = \mathbf{R}_y^{-1}\mathbf{R}_x\mathbf{e}_{1,\Delta}$$

- leakage signal is not taken into account

- FF ANC:

$$J_{\text{FF}}(\mathbf{W}) = \mathcal{E}\{|CG\mathbf{W}^H\mathbf{Y} + L_y - D|^2\}$$

$$\mathbf{W}_{\text{FF}} = (GC^*\mathbf{R}_y)^{-1}(G\mathbf{R}_x\mathbf{e}_{1,\Delta} - \mathbf{r}_{y|y})$$

- leakage signal is taken into account
- leakage signal is not filtered

- FF-FB ANC:

$$J_{\text{FF-FB}}(\tilde{\mathbf{W}}) = \mathcal{E}\{|CG\tilde{\mathbf{W}}^H \begin{bmatrix} \mathbf{Y} \\ L_y \end{bmatrix} + L_y - D|^2\}$$

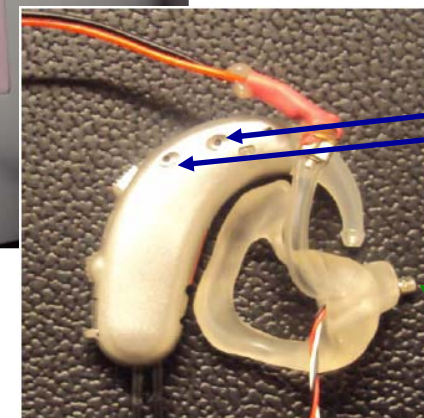
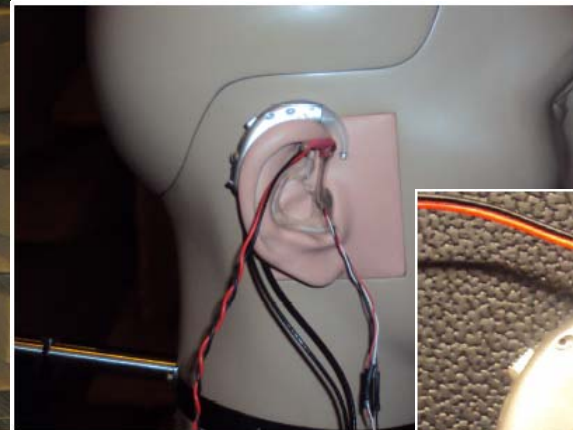
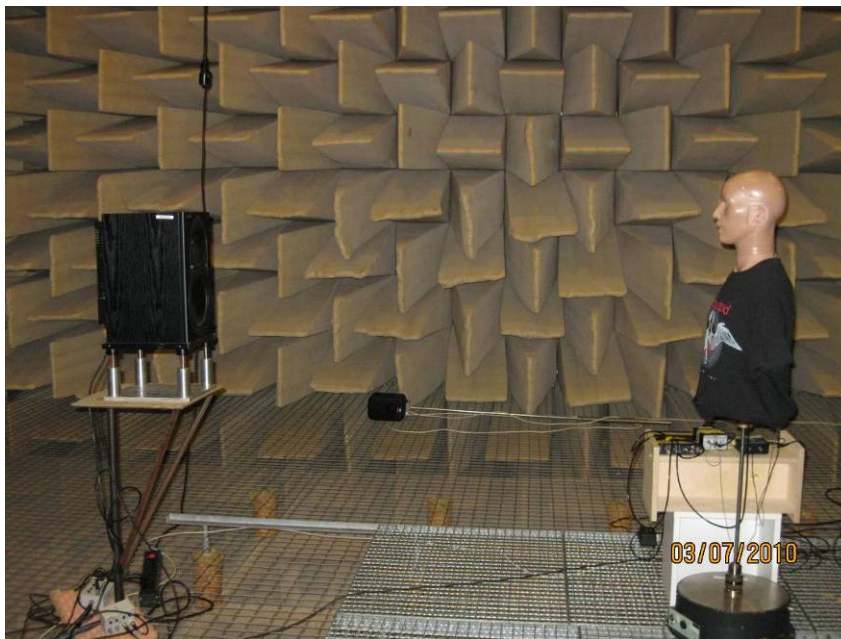
$$\tilde{\mathbf{W}}_{\text{FF-FB}} = (GC^*\tilde{\mathbf{R}}_y)^{-1}(G\tilde{\mathbf{R}}_x\mathbf{e}_{1,\Delta} - \tilde{\mathbf{r}}_{y|y})$$

- leakage component of error microphone is used as an additional input
- leakage component of error microphone is filtered

# Experimental results

## Recordings

- Anechoic room recordings with KEMAR HATS
  - Sound sources @ 3m from HATS, every 5° angle
- BTE hearing aid + **active ear mould** (vent size = 2mm):
  - 2 external microphones
  - external receiver (Knowles, TWFK-30017-000)
  - internal microphone (Knowles, FG-23329-PO7) + KEMAR microphone



External  
mics

Internal  
mic

# Recordings

- Anechoic room recordings with KEMAR HATS
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- **Used signals:**
  - Speech source: HINT, angle = 0°
  - Noise source: babble noise, angles = 90°, 180°, 270°
  - $f_s = 16$  kHz
- **Simulation parameters:**
  - Secondary path  $C$  estimated and known ( $L_c = 128$ )
  - MWF:  $L = 128$ ,  $\Delta = 64$



# Performance Analysis

- Performance measures:

- Frequency-dependent SNR improvement:  $\Delta\text{SNR}_j = 10 \log_{10} \frac{P_{j,e_x}}{P_{j,e_v}} - 10 \log_{10} \frac{P_{j,x_1}}{P_{j,v_1}}$
- Speech-intelligibility-weighted broadband SNR improvement

$$\Delta\text{SNR}_{int} = \sum_{j=1}^J I_j \Delta\text{SNR}_j$$

- SNR improvement for:

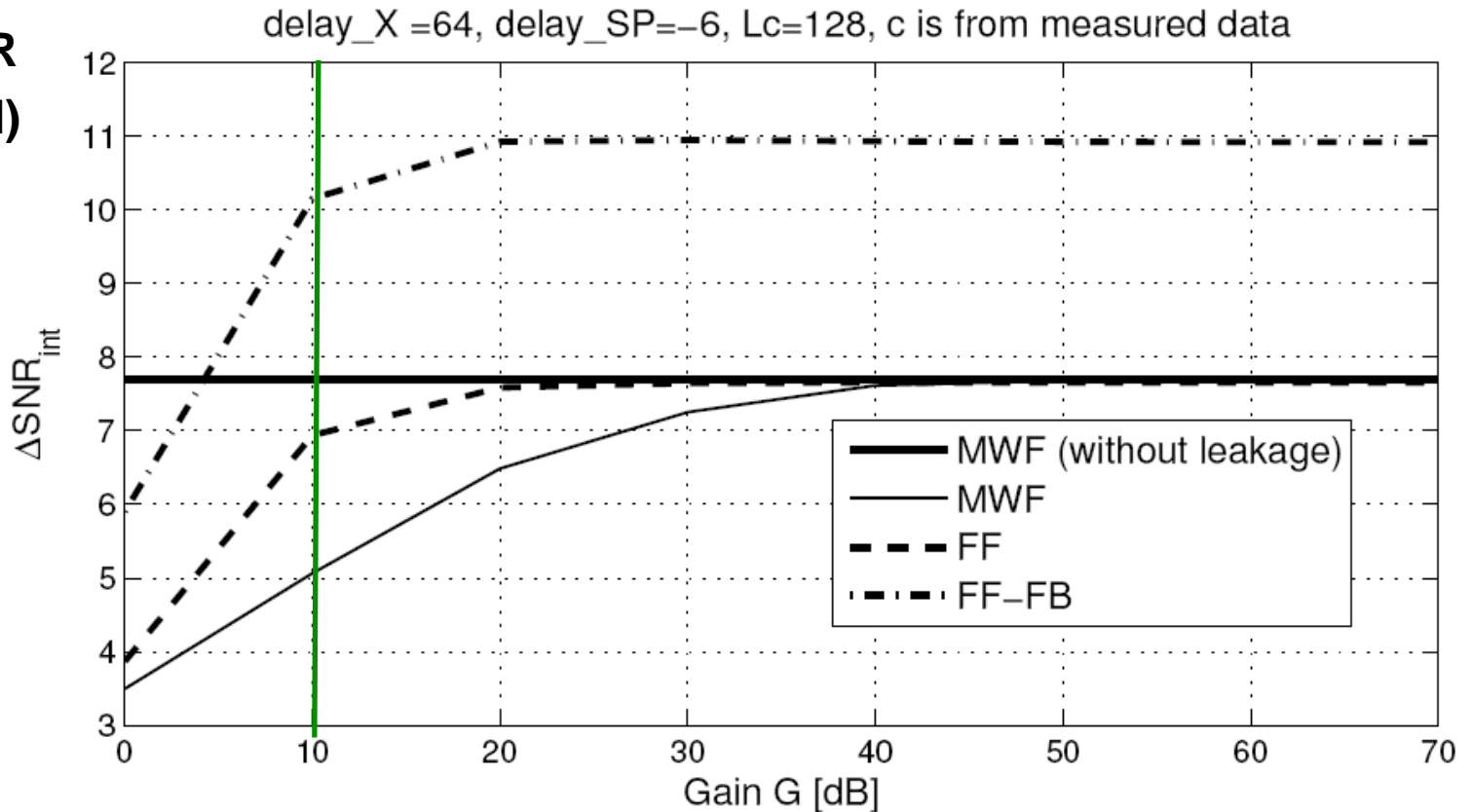
- Different amplifications  $G$  (0-70dB)  $\rightarrow$  *different noise leakage power*
- Different algorithms (MWF, FF, FF-FB)

- Three cases:

- case ER-ER: both filters and performance are computed at error microphone
- case KE-KE: both filters and performance are computed at KEMAR microphone
- case ER-KE: filters computed at error microphone, performance at KEMAR microphone  $\rightarrow$  investigate **robustness**

# Experimental results (1)

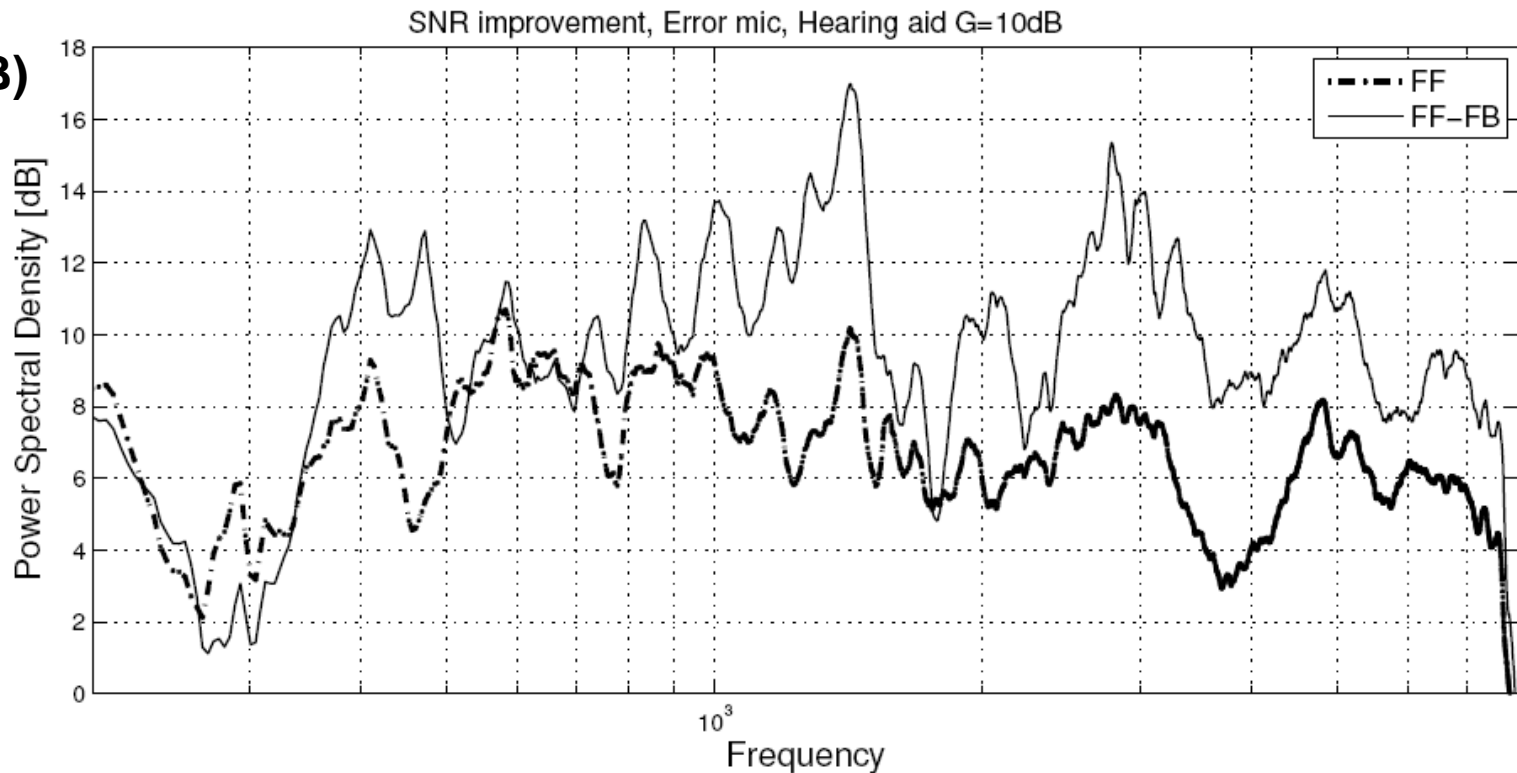
**Case ER-ER (broadband)**



Combined FF-FB ANC algorithm outperforms FF ANC and standard MWF algorithm

## Experimental results (2)

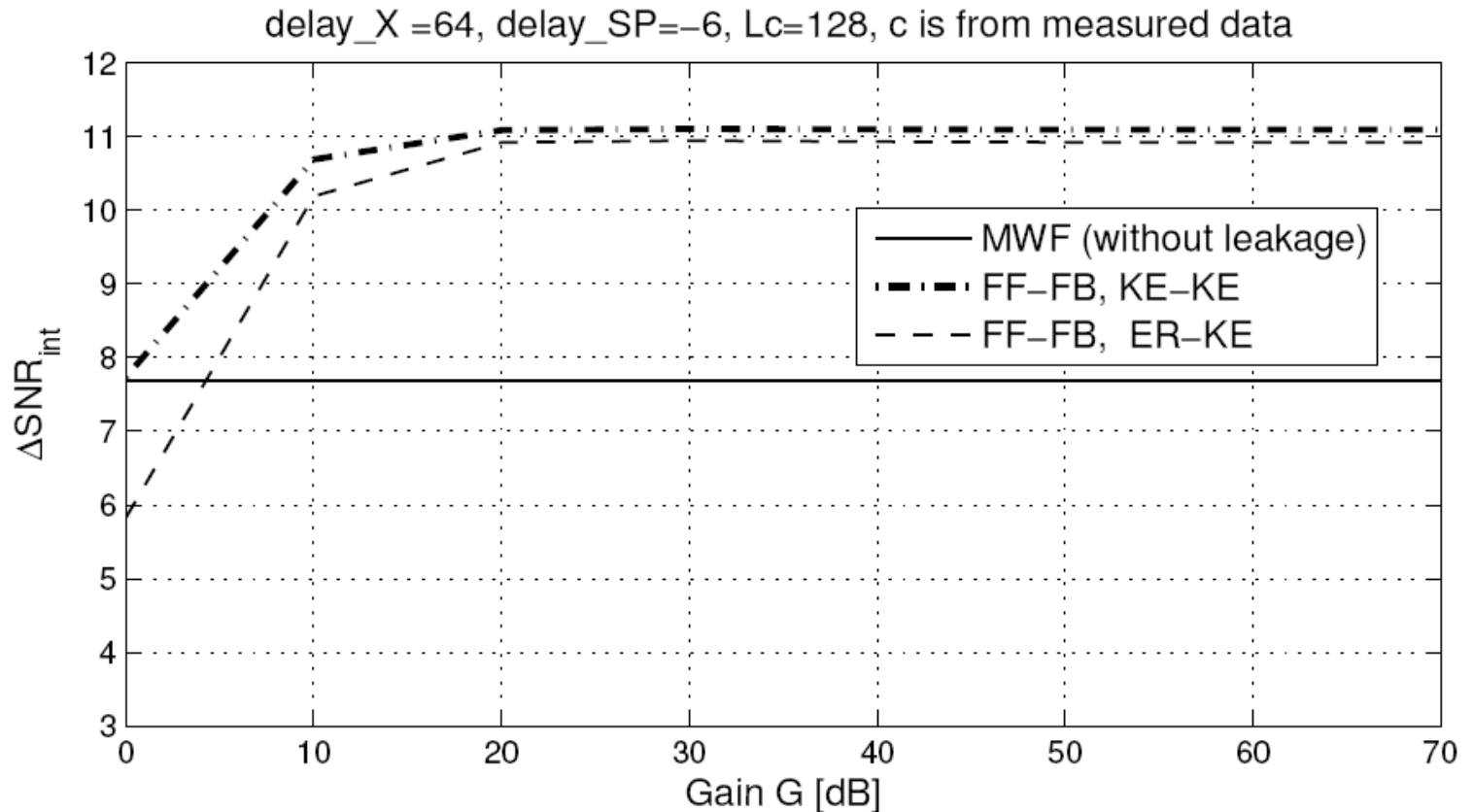
**Case ER-ER  
(freq, G=10dB)**



Combined FF-FB ANC algorithm outperforms FF ANC and standard MWF algorithm

## Experimental results (3)

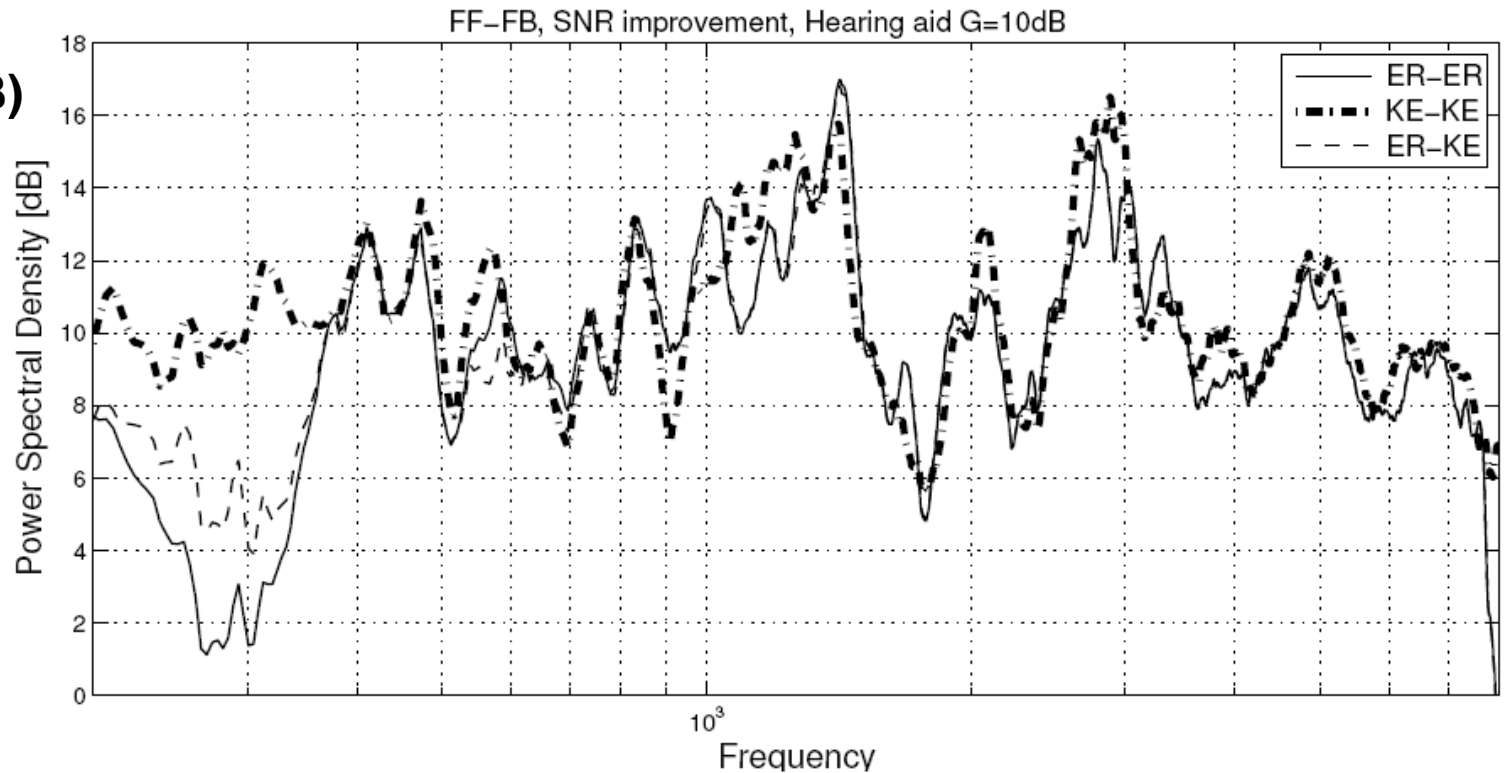
**Robustness  
(broadband)**



Performance at KEMAR microphone is hardly degraded when  
Using filters computed at error microphone → robustness

## Experimental results (4)

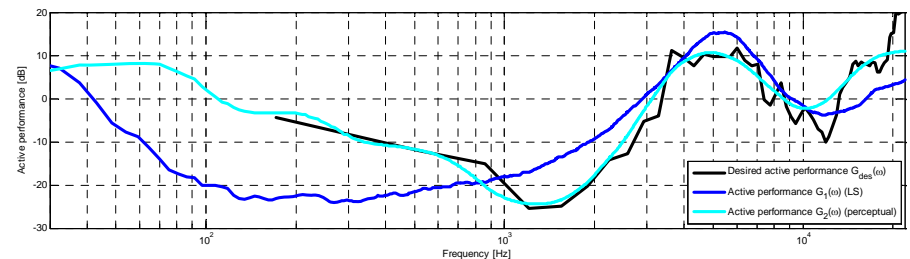
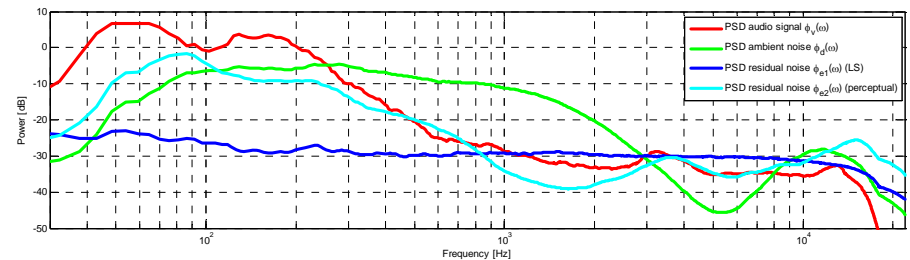
**Robustness  
(freq, G=10dB)**



Main difference in lower frequencies (<400 Hz), to be further investigated

## Future work

- Adaptive algorithms (e.g. estimate of secondary path)
- Combination with feedback suppression
- Integration of ear canal models and psycho-acoustic hearing properties in ANC filter optimisation
  - Use estimate of the sound pressure at the ear drum
- Real-time implementation (low-latency, speedgoat) and subjective validation



## Conclusions

- **Open fittings:** no occlusion effect, but leakage degrades noise reduction performance, especially for small gains
- Use of active ear mould with **internal microphone:**
  - **FF ANC:** leakage is taken into account
  - **FF-FB ANC:** leakage is used as additional input
- **Combined FF-FB ANC algorithm** outperforms FF ANC and standard MWF algorithm for noise reduction
- Performance computed at KEMAR microphone is hardly degraded, showing the **robustness** of the proposed approach.



Questions ?



***House of Hearing, Oldenburg***