## SSL for Circular Arrays of Mics

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#### ABSTRACT

Circular arrays are of particular interest for a number of scenarios, particularly because they can be placed in the center of the sources. That improves the sound capture due to the reduced distance. It also helps on the direction estimation, not only because of the reduced distance, but also because it increases the angle differences. Nevertheless, most research on circular arrays focused on the case of omnidirectional microphones. In this paper we present a new algorithm for sound source localization developed specifically for directional microphones. Results obtained from real meeting room setups show a typical error of less than 3 degrees.

#### General model:

We model signal as reverb and additive noise:

 $x_i(n) = a_i s(n-D) + h_i(n) * s(n) + n_i(n)$ 

Two traditional SSL algorithms: - Steered Beam SSL:

$$p^* = \arg\max_{l} \left( \sum_{m=1}^{M} x_m (t - \tau_m^l) \right)^2$$

- ML 1-TDOA:

$$p^* = \arg \max_{l} \left\{ \sum_{r=1}^{M} \sum_{s \neq r}^{M} \left| W_{rs}(f) X_r(f) X_s^*(f) e^{-j2\pi f(\tau_r - \tau_s)} \right|^2 \right\}$$

$$W_{_{MLR}} = \frac{|X_{_{r}} ||X_{_{s}}|}{2q |X_{_{r}}|^{2} |X_{_{s}}|^{2} + (1-q) |N_{_{r}}|^{2} |X_{_{r}}|^{2} + |N_{_{s}}|^{2} |X_{_{s}}|^{2}}$$

# A hybrid weighting function

Introducing a separable weighting function allows reduced complexity:

 $p^{*} = \arg \max_{l} \left\{ \sum_{r=1}^{M} \sum_{s \neq r}^{M} \left| W_{r} X_{r} W_{s}^{*} X_{s}^{*} e^{-j2\pi f(\tau_{r} - \tau_{s})} \right|^{2} \right\}$ 

Assumption of constant reverb and noise leads to separable weighting function:

 $W_m(f) =$ 

 $q \mid X_{m}(f) \mid +(1-q) \mid N_{m}(f) \mid$ 

## System Level Diagram



- SSL run only frames where speech is detected;
- Temporal filtering based on particle filtering;
- Noise modeling used to update the weighting function;

## The Phase Problem

- Typical directional mics have strong phase response variance for nonfrontal incidence;
- Phase response variability makes modeling unpractical;
- SOLUTION: use only mics in predictable DOA range, usually extending up to 90° or 120°;

Per-	No Compensation			With Compensation			Use cutoff angle		
	Bias	Std	#Fs	Bias	Std	#Fs	Bias	Std	#Fs
<b>T1</b>	-1.9	1.2	249	29.8	79.8	195	-3.9	0.6	338
<b>T2</b>	0.0	0.0	298	156.9	21.2	54	0.0	0.0	320
<b>T3</b>	0.7	0.2	205	-146.3	94.6	229	0.8	0.0	282
<b>T4</b>	-0.6	0.6	112	-168.2	5.7	34	-2.6	0.2	429
<b>T5</b>	0.1	0.2	153	159.6	16.5	271	0.0	0.0	422
<b>T6</b>	7.0	29.9	66	160.0	4.0	426	2.5	0.1	419
<b>T7</b>	24.3	52.6	43	114.7	49.3	76	-2.7	0.4	351
<b>T8</b>	-0.2	0.4	161	-151.3	0.7	3	-1.0	0.4	333
<b>T9</b>	-3.6	0.6	92	-132.7	89.7	154	-3.8	0.4	450

## Hardware







#### EXPERIMENTAL RESULTS

48 recordings;
Six directional mics, 14cm radius;
Rooms 3.6X6m to 5.4X12m;



Bias histogram. On the reference test set (single speaker), all biases were within 4° from the ground truth.

## CONCLUSIONS

- The proposed algorithm is based on:
- Preprocessing (VAD);
   Hybrid SSL function, incorporating Microphone Selection;
- Post-processing;

Typical errors around 3°.

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