

# The (Null) Effect of Spectral Estimator on Estimates of Spectral Moments

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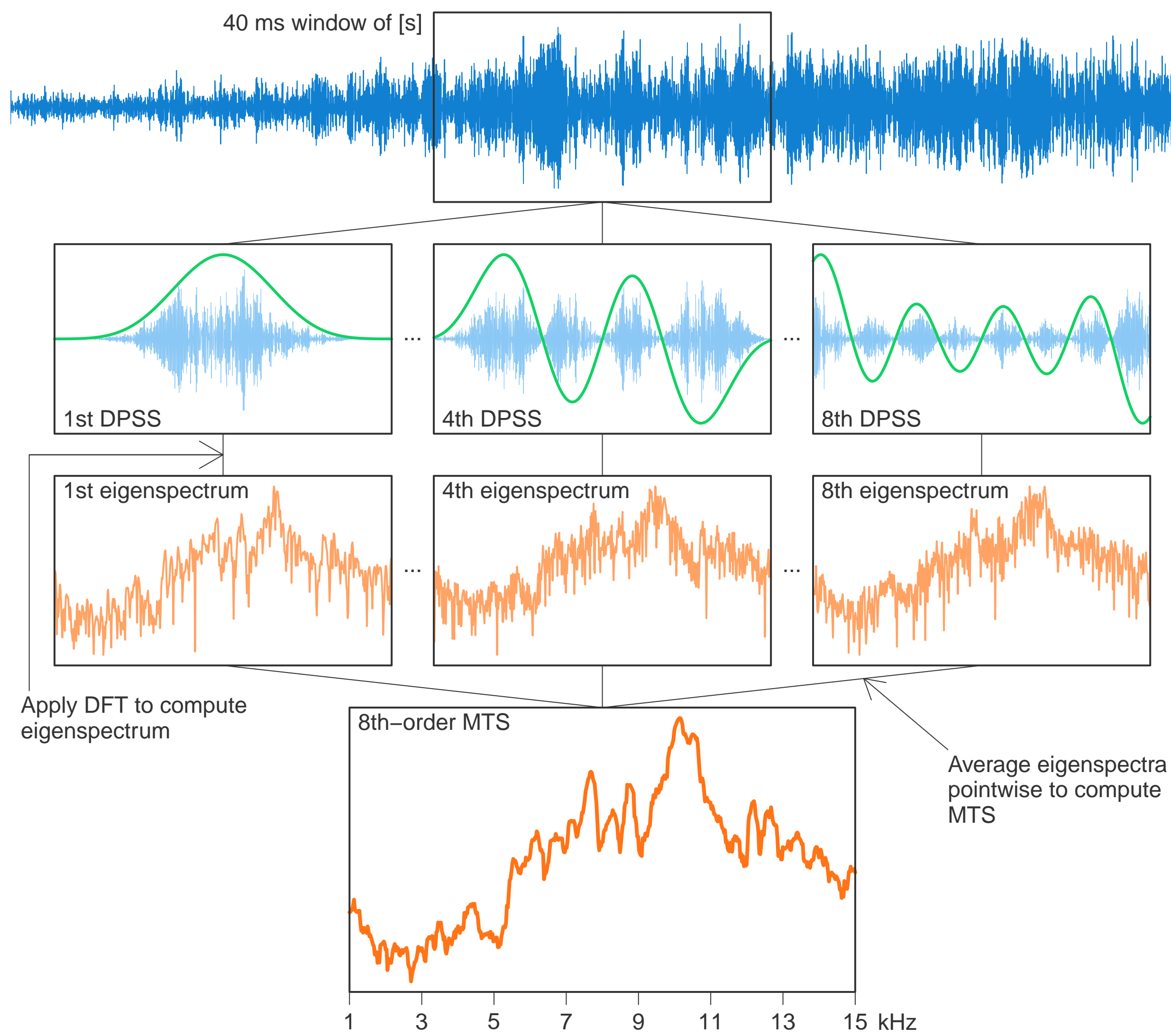


## Purpose of Study

- The spectrum of a sibilant fricative is “noisy” and difficult to estimate accurately (Shadle, 2006).
- To improve the estimation of sibilant fricatives’ spectra, recent work has argued for the adoption of “reduced-variance estimators” (e.g., Blacklock, 2004).
- However, **spectral estimation is not the endpoint of a linguistic analysis**, as the spectral estimate is almost always reduced to a small number of measures that describe its shape properties, such as spectral moments (e.g., Jongman, Wayland & Wong, 2000).
- Previous work has found **no significant effect of spectral estimator** on estimates of peak and centroid frequency for adult productions of English /s/ and /ʃ/ (Reidy & Beckman, 2012).
- **Current study:** Investigates the effect of spectral estimator on estimates of the first four spectral moments from adults’ and children’s productions of English sibilants.

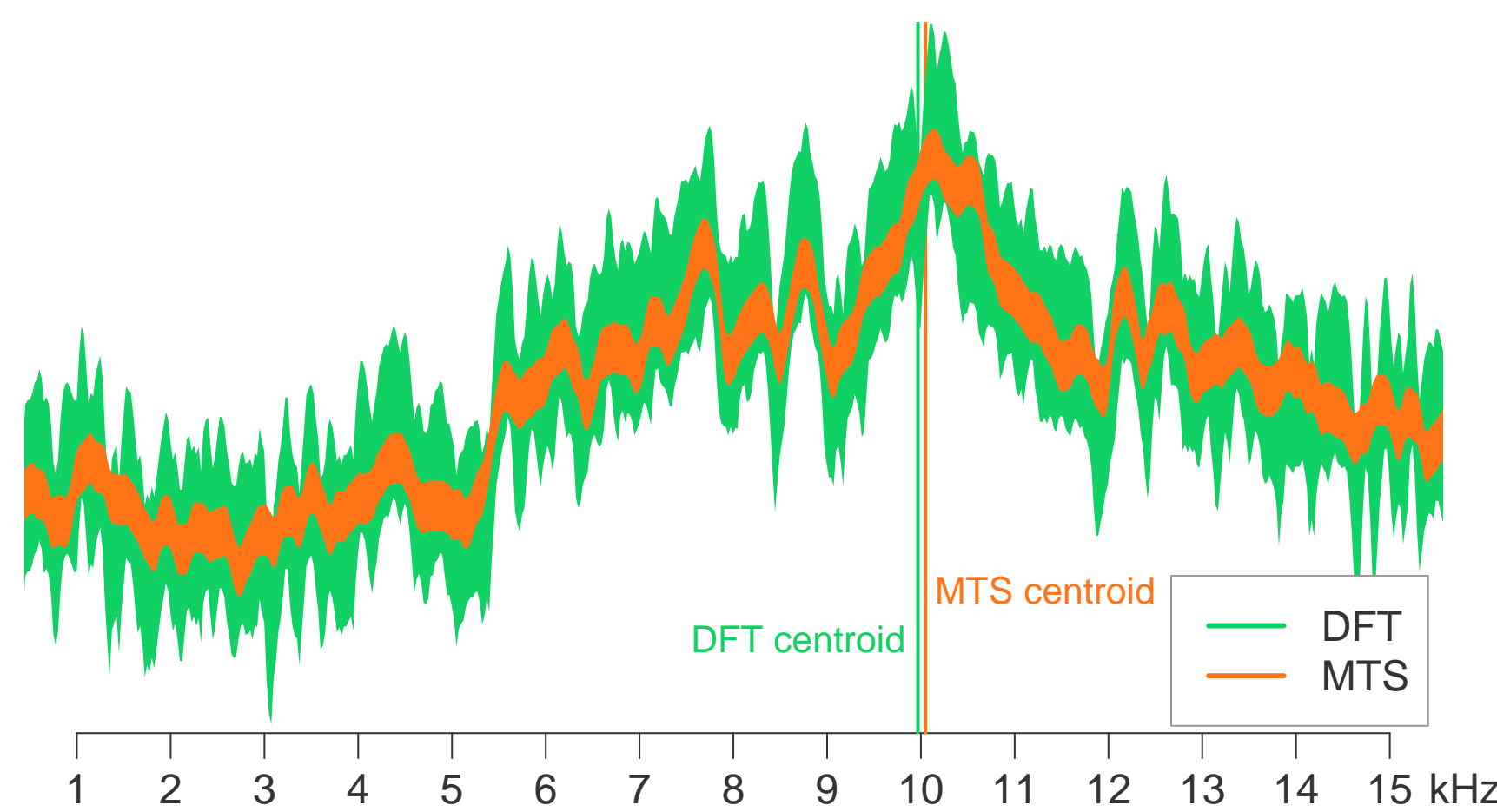
## Background

- Two commonly used spectral estimators are the **discrete Fourier transform (DFT)** and the **multitaper spectrum (MTS)**.
- The MTS is equal to the pointwise average of  $K$  DFTs computed from data that have been windowed by discrete prolate spheroidal sequences (Thomson, 1982).



### Variance properties of MTS & DFT

- Each ordinate of the MTS has  $1/K^{\text{th}}$  the variance of the corresponding ordinate of the DFT (Percival and Walden, 1993).
- Hence, at each frequency, the magnitude of the spectrum is estimated more accurately with the MTS than with the DFT.

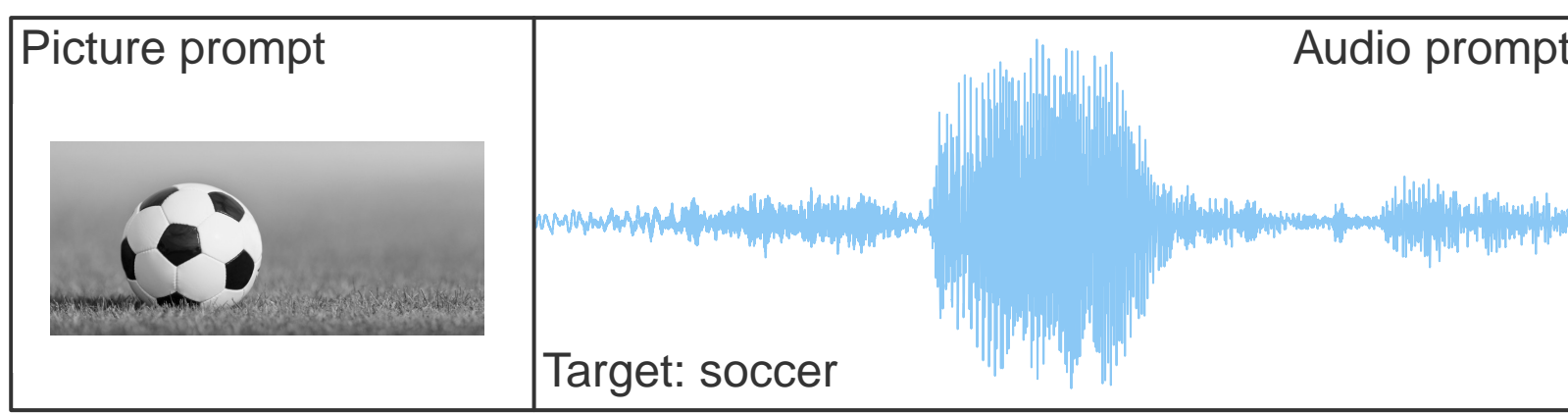


## Experiment

### Participants

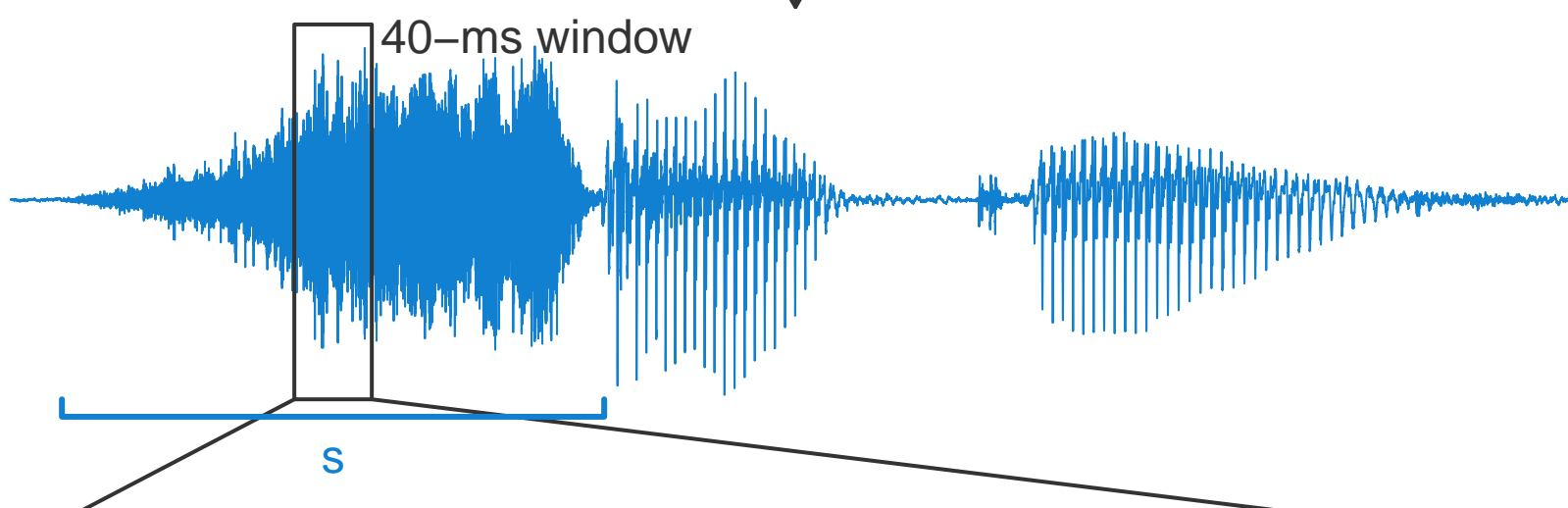
Age group	No. participants (males)	No. /s/ tokens (males)	No. /ʃ/ tokens (males)
Adults	20 (10)	297 (150)	300 (150)
5-year-olds	20 (9)	212 (90)	252 (111)
4-year-olds	21 (11)	191 (89)	265 (130)
3-year-olds	20 (10)	153 (84)	189 (96)
2-year-olds	19 (11)	120 (73)	82 (40)
Total	100 (51)	973 (486)	1088 (527)

### Elicitation



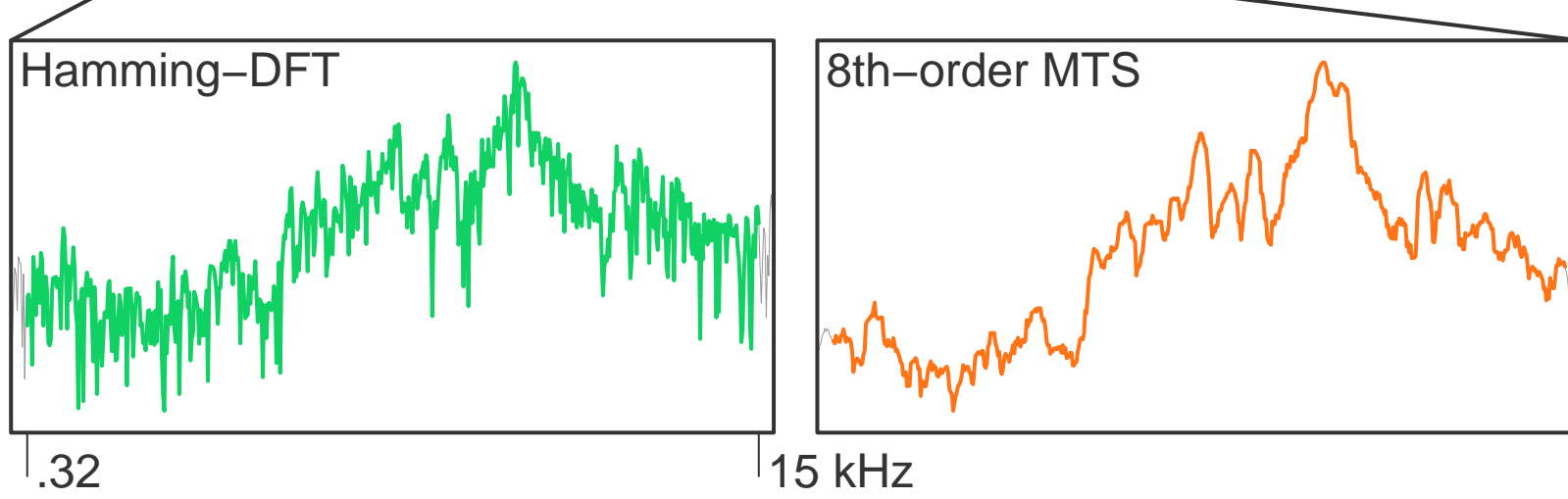
- Picture-prompted word-repetition task.
- Word-initial, pre-vocalic tokens of /s/ and /ʃ/.

### Recording



- Recorded at 44.1 kHz.
- Frication onset and offset marked by hand.
- Phonemically transcribed; excluded if incorrect.

### Spectral analysis



- DFT & MTS estimated from central 40-ms.
- Centroid, variance, skewness & kurtosis computed within the .32–15 kHz band.

## Results and Analysis

Paired  $t$ -tests revealed an effect of estimator on the even, but not the odd moments.

Moment	$t(2060)$	$\mu(\text{MTS} - \text{DFT})$	p-value
Centroid	-1.772	-7.241	0.076
Variance	5.599	$6.301 \times 10^4$	$2.443 \times 10^{-8}$
Skewness	-1.597	-0.006	0.110
Kurtosis	-3.01	-0.068	0.002

- Caveat: when tested with all /s/ and /ʃ/ tokens included and the moments computed across the entire frequency range (0–22.05 kHz), the estimator effect did not reach significance (at the Bonferroni corrected  $\alpha = .05$  level) for any of the moments.

Magnitude of estimator effect is dwarfed by place-of-articulation effect for all moments.

- Place effect:  $|\mu(/s/) - \mu(/ʃ/)|$ , for MTS & DFT.

- Estimator effect:  $\mu(|\text{MTS} - \text{DFT}|)$ , averaged across all tokens.

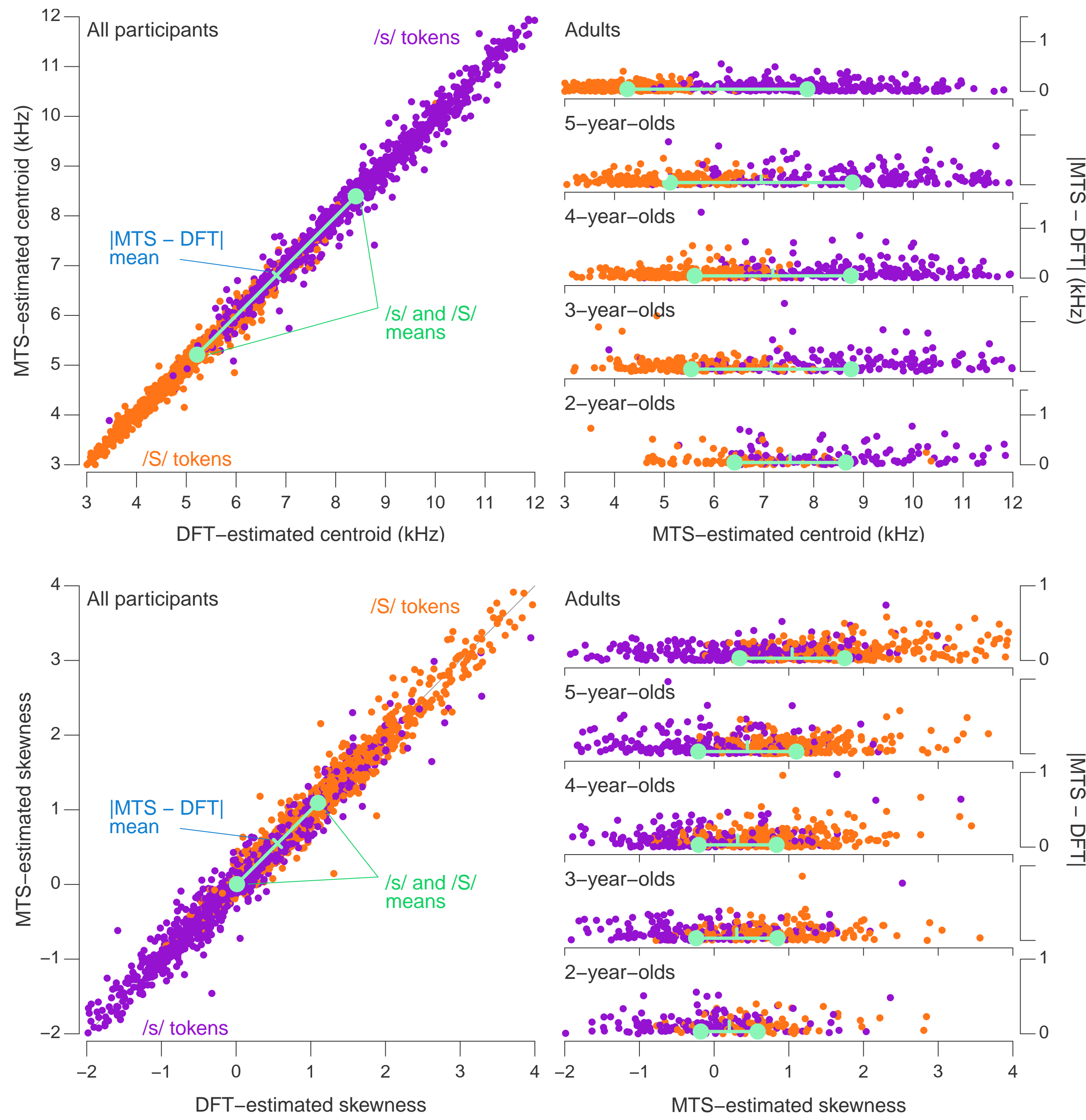
Moment	MTS place effect	DFT place effect	Estimator effect
Centroid	$3.304 \times 10^3$	$3.311 \times 10^3$	$1.226 \times 10^2$
Variance	$2.027 \times 10^6$	$1.967 \times 10^6$	$3.127 \times 10^5$
Skewness	1.175	1.178	0.130
Kurtosis	1.221	1.167	0.499

- Choice of spectral estimator does not seem to affect the ability to distinguish /s/ from /ʃ/ in terms of any of the spectral moments.
  - MTS and DFT give comparable estimates of the place effect for all moments.
  - For most moments, the estimator effect is an order of magnitude smaller than either place effect.

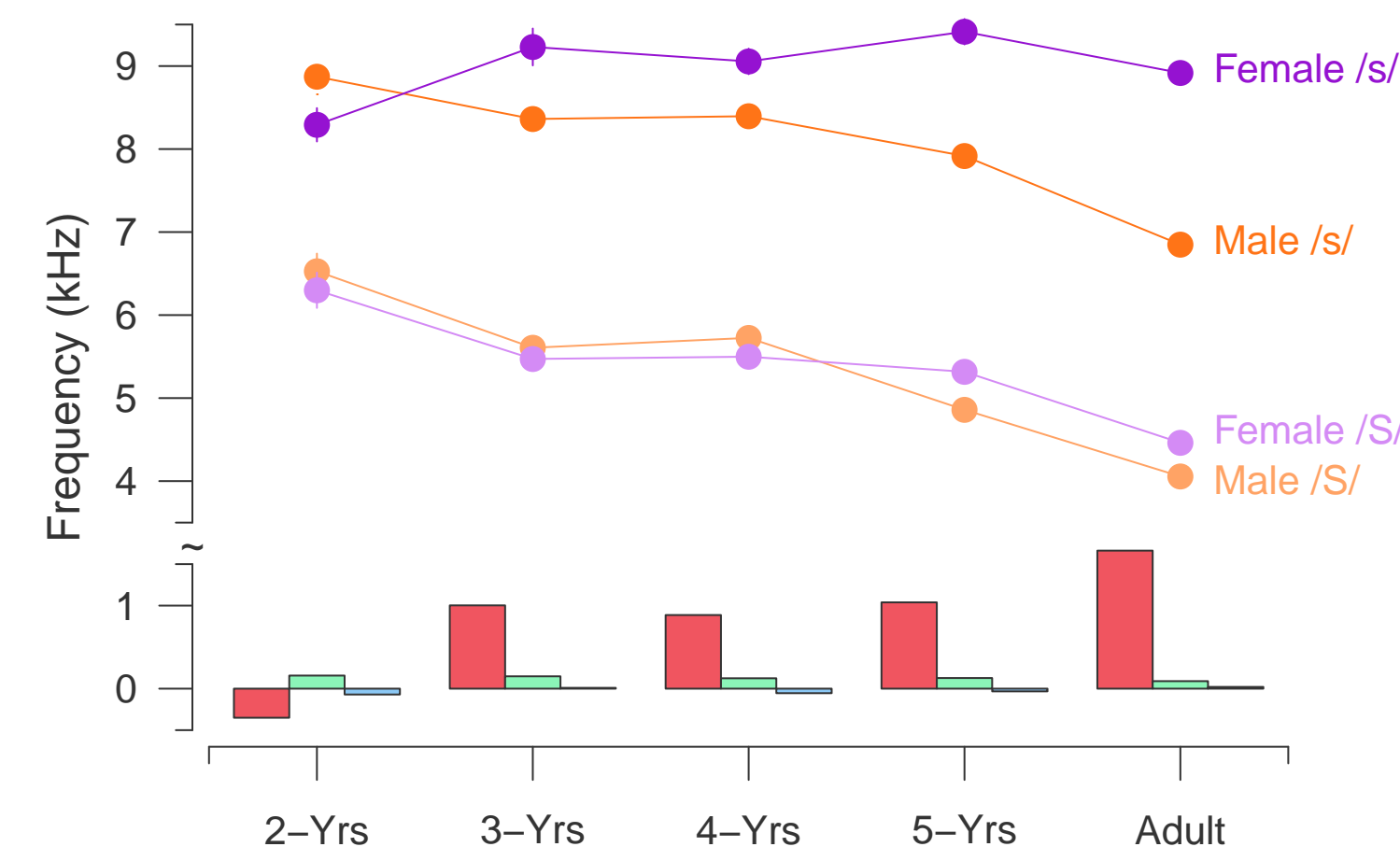
## Results and Analysis

### Comparison of estimator and place effects on centroid and skewness, by age group

- Across studies, centroid and skewness are the moments that most consistently differentiate /s/ from /ʃ/ (see Koenig, Shadle, Preston & Mooshammer, 2013).
- Two-year-olds produce /s/ and /ʃ/ relatively close together in terms of centroid and skewness; however, even for this group, the estimator effect is a fraction of the place effect.



### Gender effects, when present, also dwarf the effect of spectral estimator.



- The /s/-/ʃ/ centroid contrast is used, from a young age, to signal gender identity (see also Fox & Nissen, 2005).
- This **gender effect** (i.e., difference in category means between females and males) seems insensitive to choice of spectral estimator given its size relative to the **estimator effect** and to the **difference between the MTS & DFT** gender effects.

## Acknowledgements

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