

# ACOUSTIC PATTERNS IN SCHIZOPHRENIA. A SYSTEMATIC REVIEW AND META-ANALYSIS

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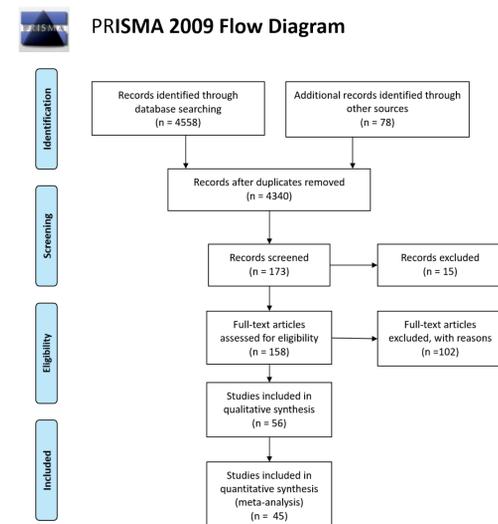
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## INTRODUCTION

- Reported **atypical voice patterns** in schizophrenia: poverty of speech, increased pauses, distinctive pitch and intensity (mean and variability).
- Atypical voice patterns are associated with **clinical features** (e.g. flat affect), and may play a role in the **social impairment** experienced by patients.
- However, there is **uncertain quantitative evidence**, and very little is known on the underlying mechanisms: how voice atypicalities relate to motor, cognitive, social and clinical factors.
- We systematically reviewed the literature and performed a **meta-analysis of the evidence** quantifying acoustic patterns in schizophrenia.
- We aimed at identifying evidence for **acoustic markers of schizophrenia** and its clinical features, as well as needs for further research and **barriers to collective advancements** on these issues.

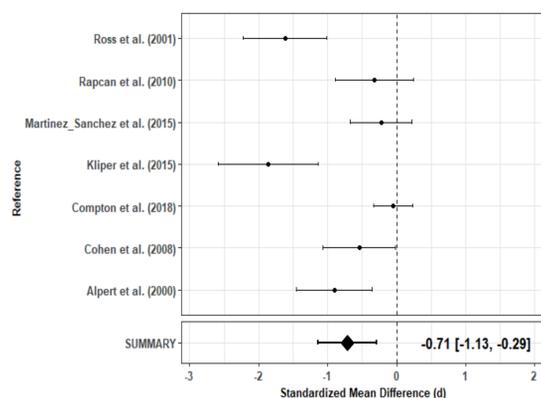
## METHODS

- We adopted the “PRISMA Statement” guidelines and pre-registered the study at Open Science framework (OSF) and PROSPERO (details and pre-registration at: <https://doi.org/10.1111/dpm.12111>).
- Literature search conducted on Pubmed and Google Scholar: ((prosody) OR (inflection) OR (intensity) OR (pitch) OR (fundamental frequency) OR (speech rate) OR (voice quality) OR (acoustic) OR (intonation) OR (vocal)) AND (schizo\*).
- Inclusion criteria were: (a) empirical study, (b) quantification of acoustic features in the vocal production, (c) at least two individuals with schizophrenia, (d) inclusion of a comparison group, or acoustic features in relation to severity of clinical features.
- The meta-analysis consisted of random-effects regression models, one per each relevant acoustic feature.



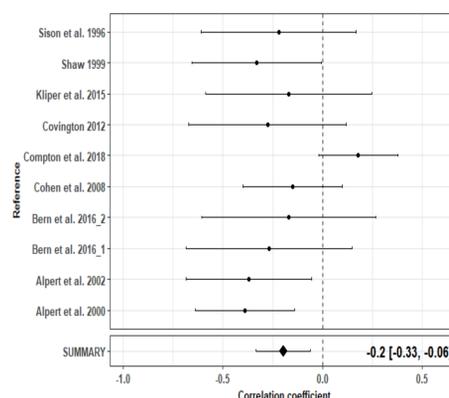
## RESULTS

### META-ANALYSIS OF PITCH VARIABILITY



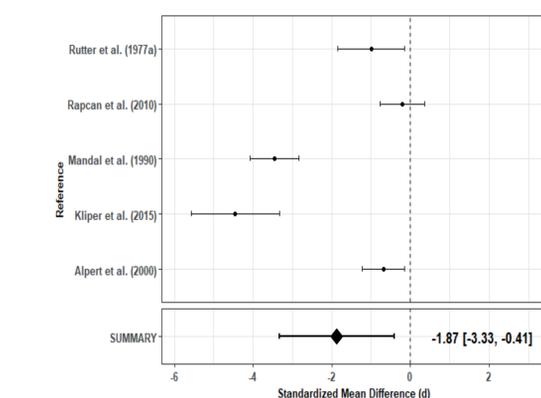
- **Reduced pitch variability.**
- A total of 351 participants with schizophrenia and 232 healthy controls.
- Variance in effects due to true between-studies variance (Q-stats: 47.7,  $p < .001$ ).
- No influential study.
- The data revealed a likely publication bias (Kendall's tau = -0.89,  $p < .001$ ).

### CORRELATION - PITCH VARIABILITY AND FLAT AFFECT



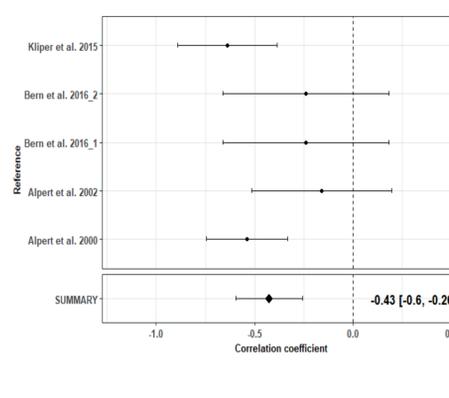
- **Reduction in pitch variability associated with flat affect.**
- A total of 367 participants with schizophrenia.
- The variance in effects due to true between-studies variance (Q-stats: 17.9,  $p = .035$ ).
- One influential study (Compton et al., 2018). Removing it yielded an overall effect size of -0.27 (95% CI: -0.38 -0.16,  $p < .001$ ).
- No publication bias (Kendall's tau = 0.16,  $p = .60$ ).

### META-ANALYSIS OF SPEECH PRODUCTION (PERCENTAGE)



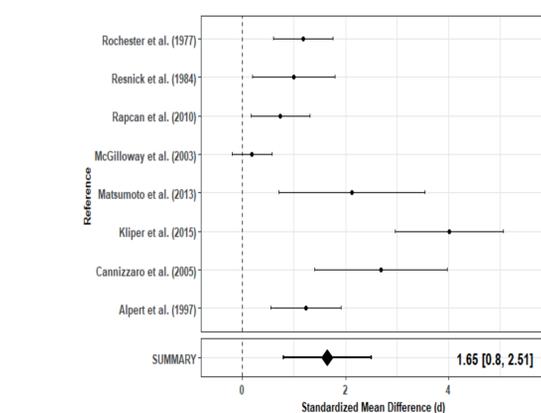
- **Reduced speech production.**
- A total of 159 participants with schizophrenia and 130 healthy controls.
- The variance in effects due to true between-studies variance (Q-stats: 98.4,  $p < .001$ ).
- No influential study.
- The data did not reveal any likely publication bias (Kendall's tau = -0.47,  $p = .27$ ).

### CORRELATION - SPEECH PRODUCTION (PERCENTAGE) AND ALOGIA



- **Reduction in speech production associated with alogia.**
- A total of 138 participants with schizophrenia.
- The variance in effects due to between-studies random-sample variability (Q-stats: 7.3,  $p = .12$ ).
- No influential study.
- The data did not reveal any likely publication bias (Kendall's tau = 0.33,  $p = .44$ ).

### META-ANALYSIS OF PAUSE DURATION



- **Increased pause duration**
- A total of 221 participants with schizophrenia and 150 healthy controls.
- The variance in effects due to true between-studies variance (Q-stats: 75.6,  $p < .001$ ).
- No influential study.
- The data revealed a likely publication bias (Kendall's tau = 0.67,  $p = .013$ ).

## CONCLUSIONS

### DISCUSSION

- **Clear effects of reduced speech production** (speech percentage, pause percentage and speech rate), and **pitch variability and pause duration** (but with evidence for publication bias).
- No effects of pitch mean, mean intensity, number of pauses and mean utterance duration.
- **Limited effect sizes**, in contrast with the large effect sizes reported by studies using clinical rating scales.

### OPEN ISSUES

- **Barriers to open data:** of the 71 authors contacted, 21 have non-working email addresses (29.5%), 36 responded (51%), but only 9 (13%) provided at least some of the data requested.
- **Lack of a systematic approach.**
- **Lack of theory driven hypotheses.**

### RECOMMENDATIONS

- Larger sample sizes.
- **Systematic assessment** of multiple acoustic features and multiple speech tasks, standardized acoustic processing methods.
- **Shared standards** are needed to make individual level data available, as well as **more extensive data sharing** possible within privacy and ethical constraints.

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