

Computational linguistic analysis of speech tasks indexes symptom severity and change in Arabic-speaking individuals with schizophrenia

hikma.

Background

- Computational speech and natural language processing analysis may improve objective symptom assessment to help diagnose and monitor psychiatric disorders.
- However, there is limited research applying this approach in non-Western languages.
- In the current study, we examined the ability of computational speech analysis to index symptom severity and track symptom change in Arabic-speaking patients with schizophrenia.

Methods				
Participant characteristics	Algeria	Jordan	Saudi Arabia	
n	14	27	16	
Age (years)	33.7 (12)	34.7 (11.3)	34.3 (10.9)	
Gender	4 F / 10 M	15 F / 12 M	2 F / 14 M	
Education (% post-secondary completed)	42.9%	96.3%	62.5%	
PANSS Total	37.9 (8.7)	57.5 (16.3)	89.8 (25.5)	
PANSS Positive	9.1 (4.6)	12.4 (5.6)	20.0 (5.5)	
PANSS Negative	10.2 (4.9)	15.0 (6.9)	26.6 (9.4)	
PANSS General	18.6 (2.8)	30.1 (9.2)	43.2 (15.2)	

- **Participants:** 57 outpatients diagnosed with schizophrenia, from three clinical sites in the Middle East and North Africa.
- Study design: Longitudinal design with seven monthly visits
- **Clinical assessment:** Positive and Negative Syndrome Scale (PANSS).
- Speech tasks (from the Winterlight assessment app): Journaling, Picture Description, Phonemic Fluency, Semantic Fluency, Paragraph Reading and Recall.
- **Speech processing:** Participant audio recordings were transcribed and translated into Modern Standard Arabic, and then analyzed with signal and natural language processing (NLP) to extract features capturing different properties of speech: acoustic, timing, lexical, morphological, syntactic, semantic coherence, and discourse.



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Michael J. Spilka¹, Mengdan Xu¹, Jessica Robin¹, & William Simpson^{1,2} ¹Winterlight Labs, Toronto, ON, Canada. ²McMaster University, Hamilton, Canada.

Methods, continued

- Analyses: Associations between PANSS severity (Positive, Negative, General, Total) and speech features from each task were examined using Spearman correlations pooling all visits, and significant correlations (*p* < .05, FDR-corrected within tasks) were validated with Spearman partial correlations adjusted for age, sex, education, and study site.
- Associations between longitudinal change in identified speech features and change in symptom severity were examined with partial Spearman correlations performed on change scores from adjacent visits and evaluated for statistical significance at p < .05, FDR-corrected within tasks.

Results: associations with symptom change

Speech features that significantly tracked longitudinal symptom change



- 25 significant correlations spanning 5 unique acoustic features • Features with correlations present on multiple tasks:
- Decreasing intensity variance was associated with increasing PANSS Total and General from one visit to the next
- Increasing shimmer was associated with an increase in all symptoms from one visit to the next
- Most associations were present for multiple symptom domains
- Association strength was in the small range after adjusting for demographic variables and study site (*rho* = -0.26 to -0.18 and 0.16 to 0.23).

Linguistic Features

Results: speech markers of symptom severity Features significantly associated with symptom severity on at least one task constituency_average_PP_length morph aspect perf sitional_density_ratio_propositions unfilled_pauses total_duration_audio short_pause_duration medium_pause_duration mean_pause_duration long_pause_count normalized zcr_kurtosis shimmer local shimmer_apq3 shimmer_apq11 mfcc_var_40 mfcc_var_37 PANSS score Total Positive mfcc_var_33 mfcc_var_20 Negative General mfcc_skewness_13 mfcc_mean_37 mfcc_mean_31 mfcc_mean_21 mfcc_mean_20 mfcc_kurtosis_40 mfcc_kurtosis_39 mfcc_kurtosis_38 mfcc_kurtosis_24 mfcc_kurtosis_13 mfcc_kurtosis_0 jitter_ddp intensity_variance intensity_range intensity min intensity_max fundamental_frequency_min

Morphological pro Lexical Timing Acoustic	
pro Lexical Timing Acoustic	
Timing	posi
Acoustic	

- - Lexical: noun use
 - *Timing*: medium pause duration
- Most associations were present for multiple symptom domains
- Associations were small to medium for bivariate correlations and decreased to small after adjusting for demographic variables and study site (*rho* = -0.19 to -0.11 and 0.11 to 0.24).

- Computational speech and analysis can identify features associated with symptom severity and symptom change in Arabic-speaking schizophrenia participants, suggesting the crosslinguistic utility of this approach.
- Identified speech features may serve as novel digital markers to facilitate screening and symptom monitoring in clinical trials.



• 116 significant correlations spanning 36 unique features • Features with correlations present on more than one task:

> • Acoustic: intensity variance, minimum fundamental frequency, zero-crossing rate, shimmer, jitter, MFCCs

Conclusions