P135
Poster Session - Mental Health - Day 1 (Poster)

Machine Learning-based Predictions of Cross-Sectional and Follow-Up Mental Health from Sleep Quality, Lifestyle, Personality, and Demographics

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Introduction:

Existing studies have provided evidence for the link between sleep quality, lifestyle, personality, and demographics with mental health. However, they have primarily focused on univariate associations and population-wide effects. The complex interaction between these factors at the individual participant level calls for a multivariate approach to assess their combined roles in predicting cross-sectional and follow-up mental health using a machine learning predictive model.

Method:

From the eNKI-Rockland Sample cohort, 630 participants were divided into a training set with baseline data (562 individuals, 21-85 years, 376 females), and a test set with baseline and one-year follow-up data (68 individuals, 40-71 years, 52 females). Our data include sleep quality (seven components of the Pittsburgh Sleep Quality Index), lifestyle (alcohol and tobacco use, physical activity, social contacts within/outside the family, diet/eating behavior), personality (NEO-Five-Factor-Inventory), and demographics (age, sex, and socio-economic status). Mental health was assessed using the sum of the items associated with affective (anxiety/depressive) and somatic problems as defined by the Adult Self Report questionnaire. Support vector machine with rbf kernel was trained and hyperparameters tuned using a 5-fold, 10-times repeated nested cross-validation on the training set. The trained models were then applied to the test set for cross-sectional test and follow-up test results.

Results:

Sleep quality (alone) moderately predicted depressive symptoms (training R2 = 0.16, test-cross-sectional R2 = 0.25, test-follow-up R2 = 0.22) but not anxiety (R2 = 0.06, 0.06, 0.06) and somatic problems (R2 = 0.05, 0, -0.04). Lifestyle variables didn't improve predictions, while adding personality traits substantially increased predictive accuracy for mental health outcomes, mainly for anxiety and depressive symptoms, but not somatic problems (training R2 = 0.30, 0.41, 0.08;

test-cross-sectional R2 = 0.43, 0.65, 0) test-follow-up R2 = 0.47, 0.60, -0.16, respectively). Adjustment for age and sex, or including all demographic information as features, didn't alter these outcomes.

Conclusion:

We found strong associations between sleep, personality traits, and affective mental health well-being. Although we didn't find a robust predictive role of lifestyle, our findings suggest that personalized mental health improvement strategies should consider the integrated role of personality and sleep quality.

Conflict of Interest: No-