



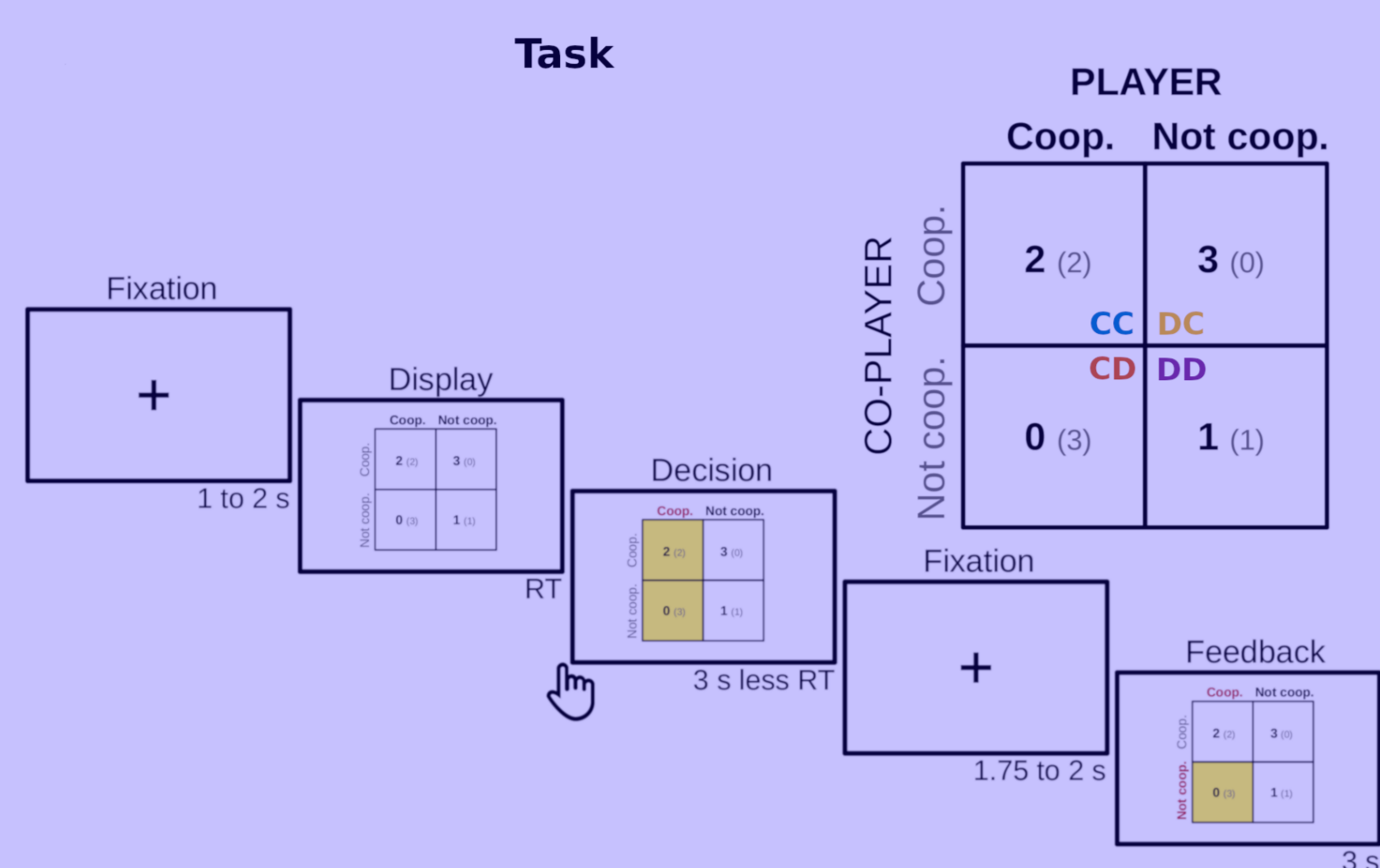
## Summary findings

Earliest brain signatures of choice at iterated prisoner's dilemma (iPD) gameplay are analyzed by electroencephalography (EEG). Three feedback components serve to indicate a player's tendency to cooperate at the next round of the game. 'Sucker's payoff' (worst outcome) elicits the fastest, transient indices, whereas (game-optimal) mutual cooperation entails the most delayed modulations.

## Background

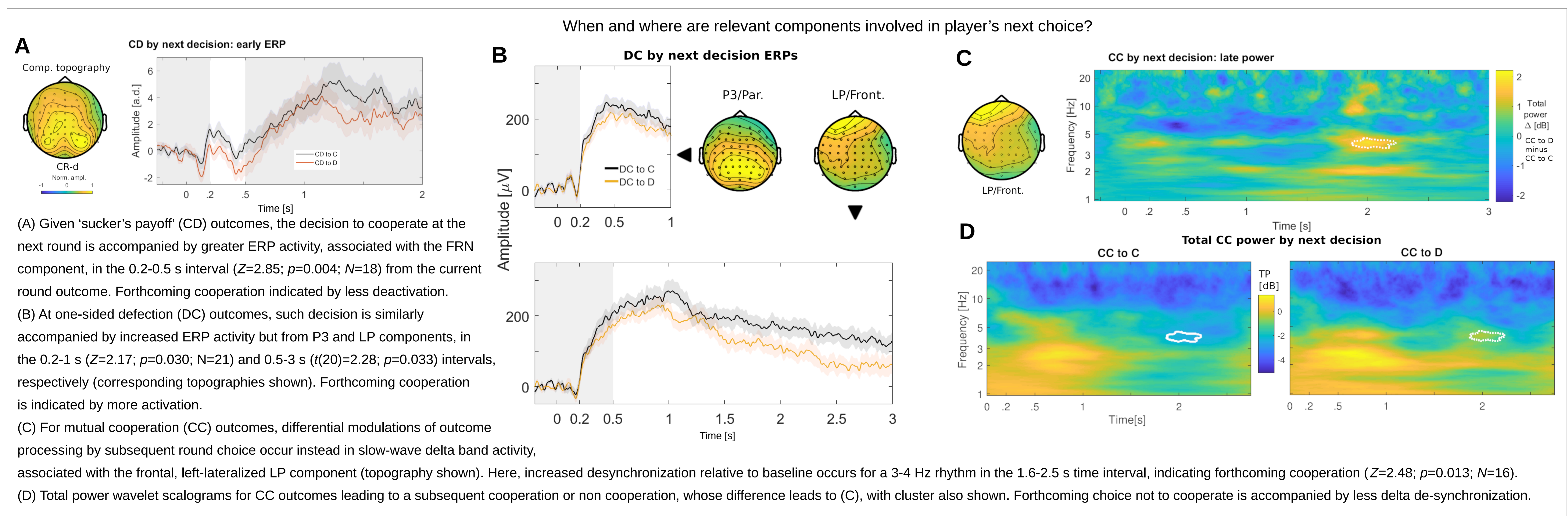
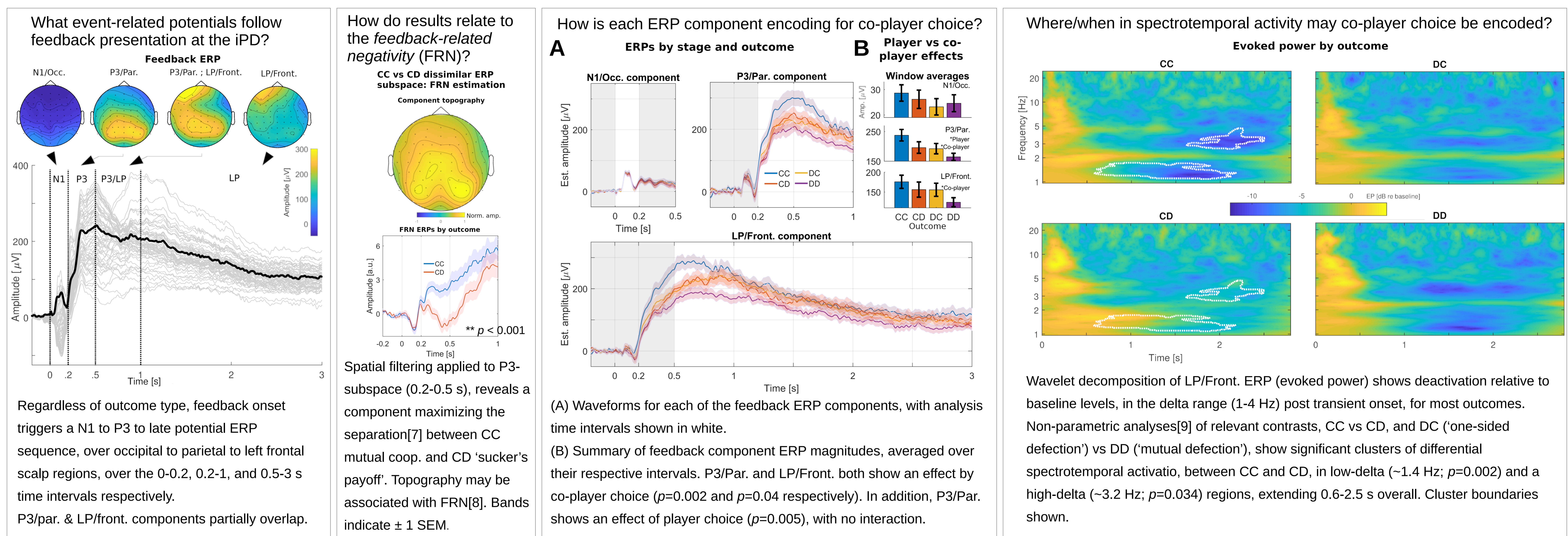
→ Neurobiological mechanisms of cooperation remain unknown, with crucial impact over organized social life. The iterated prisoner's dilemma (iPD) is a formalism addressing cooperation[1]. Current insights emphasize a distinction between intuitive versus deliberative cooperation[2,3]. Yet it is unclear how is the distinction potentially supported over neural time.  
→ EEG studies of the iPD have been primarily based on hyperscanning - dyadic measures from simultaneously interacting partners[4,5]. The possibility of measuring individuals' EEG responses in order to predict cooperation during the game was however recently raised[6].

## Methods



→ 30 participants (16 female; mean age 22.3  $\pm$  2.9 SD) completed 200 rounds of the game at EEG sessions, against a probabilistic algorithm representing a confederate co-player, and were instructed to maximize earnings.  
→ Spatial filtering techniques[7] were used to extract components related to feedback processing. Event-related potential and spectrotemporal analysis methods were further employed to identify which are modulated by co-player choice.  
→ From these components, relevant waveform and spectrotemporal cluster feedback data were partitioned by player's choice at the following round, analyzed with a minimum of 10 trials per partition.  
→ Two-way RM ANOVA (player, co-player) were applied to feedback ERPs. Nonparametric analyses were applied to relevant contrasts in spectrotemporal data. Tests for differences by subsequent choice were performed (Wilcoxon rank sum or paired *t*-tests), depending on normality of underlying distributions assessed with the Shapiro-Wilk GOF test.

## Results



## Discussion

→ The FRN, P3 and delta-band lateralized frontal activity are key EEG indices of feedback processing at the iterated prisoner's dilemma.  
→ Earliest modulations per subsequent choice are contingent on current outcome: associations are found for FRN with 'sucker's payoff', P3 and a late frontal potential with unilateral defection, and delta-band desynchronizations therein with mutual cooperation.  
→ FRN is interpreted as a prediction error signal (reinforcement learning)[10] which might indicate expected reward or salience of a given 'betrayal' event  
→ Frontoparietal networks are on the other hand involved in theory of mind[11], which might be involved in framing an analogous prediction error but in co-player terms[12].  
→ Frontal EEG asymmetries are indices of approach/avoidance behavior[13], while wakeful delta rhythms may be involved in homeostatic regulation[14]. Suppression is consistent with inhibition of defense mechanisms, possibly conditioned on the representation of conditions for further engagement.

## Conclusion

The feedback stage of the iterated prisoner's dilemma entails an early window where to gauge intent to cooperate. Involvement of predictive coding mechanisms[15] in triggering the ensuing decisional process, at distinct timescales and over different relevant networks, is suggested.

## Acknowledgments



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