

1 **MEG signature of social conformity: evidence from evoked and induced responses.**

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24

25 **Abstract**

26 Humans often adjust their behavior to match the group norms. In this study, we used
27 magnetoencephalographic (MEG) source imaging to investigate the electromagnetic responses to
28 the perceived mismatch between individual and group opinions. After participants were exposed
29 to group opinion that conflicted with their own, we observed an evoked response in the posterior
30 medial prefrontal cortex (pMPFC) occurring around 200 ms, corresponding to the feedback-
31 related negativity (FRN) – a component of the evoked response associated with processing
32 negative feedback and reinforcement learning. This response was accompanied by an increase in
33 power of theta oscillations (4-8 Hz) over a number of frontal sites (including OFC and pMPFC).
34 The magnitude of both evoked and induced responses to the perceived conflict with social norms
35 was stronger in participants who showed relatively low conformity. Overall, our results suggest
36 that the activation of the pMPFC following conflicts with group opinion, as recorded by MEG,
37 may reflect an enhanced control state – a process complimentary to the reinforcement learning
38 signal in the ventral striatum reported in previous studies of social conformity.

39 **Introduction**

40 Defined as a tendency to align one's attitudes, beliefs and behaviors to match the group norms,
41 social conformity, is a well-documented phenomenon in social psychology (Cialdini and
42 Goldstein, 2004). Yet only recently the neuroscience has focused on neurobiological
43 mechanisms underlying conformity (see Izuma 2013, for a review). A number of fMRI studies
44 demonstrated that being exposed to a group opinion conflicting with one's individual opinion
45 triggered the activations in the posterior medial prefrontal cortex (pMPFC) and ventral striatum
46 (Klucharev et al., 2009; Berns et al., 2010; Campbell-Meiklejohn et al., 2010; Izuma and
47 Adolphs, 2013). The pMPFC has been implicated in the generation of a so-called reward
48 prediction error signal when the result of an action mismatches the expectation (Holroyd & Coles
49 2002; Nieuwenhuis et al. 2004; Rushworth et al. 2007; Cohen & Ranganath 2007; but also see

50 Botvinick 2007). This signal presumably reflects a process of updating predictions of action
51 values and thus guiding future action selection (Niv, 2009). This findings led to suggest that
52 social conformity may be based on general action-monitoring and reinforcement learning
53 mechanisms (Klucharev et al. 2009; Klucharev et al. 2011; Shestakova et al. 2013)-

54 Several electroencephalographic (EEG) studies (Kim et al., 2012; Shestakova et al., 2013)
55 demonstrated that a mismatch between individual opinion and the opinion of the group elicited
56 the feedback-related negativity (FRN), an event-related brain potential (ERP) component
57 associated with outcome evaluation and behavioral adaptation (see Walsh & Anderson 2012, for
58 a review). Moreover, a growing body of literature links FRN to a modulation of ongoing theta-
59 band (4-8Hz) oscillations over the anterior cingulate cortex (ACC), pMPFC and several other
60 frontal sites (Cohen et al., 2007; Cavanagh et al., 2010, 2012; van de Vijver et al., 2011).

61 More specifically, we hypothesized that (1) the conflict between individual and group opinions
62 would trigger evoked responses over the pMPFC, corresponding to the FRN, accompanied with
63 the increase in power of theta oscillations in that region, and that (2) the dynamics of these
64 responses would be predictive of individual differences in proneness to social conformity.

65 To test these hypotheses, we used a paradigm in which a person's initial judgments, that is,
66 perceived trustworthiness of faces, were open to the social influence of the opinion of a group.
67 Participants rated the trustworthiness of faces and after each rating they were informed about an
68 'average group rating' of the face given by a large group of people. With this procedure, we
69 introduced conflict between a person's own judgment and the opinion of a group and compared
70 MEG activity calculated over trials in which the group rating differed from the participant's
71 rating (conflict trials) with all no-conflict trials. Next, we probed whether such activity differed
72 between participants who demonstrated high and low levels of conformity.

73 ***Materials and Methods***

74 ***Participants***

75 20 female volunteers took part in the experiment (mean age 24.2, range 18-28, right-handed
76 (Oldfield, 1971), with normal or corrected to normal eyesight). All participants reported no
77 history of neurological or psychiatric disease, drug abuse or head trauma. The data of one
78 participant was discarded from the group analysis due to a large number of artifacts. The
79 participants received monetary compensation of 500 rubles (equivalent of 16 US dollars) for
80 participating in the experiment. The amount received covers typical one day food (grocery store)
81 expenses for a single person in Moscow.

82 All participants were familiarized with experimental procedure and signed the informed consent
83 form. The study was approved by the Ethics committee of Saint Petersburg State University. The
84 participants' personality traits were tested using the Eysenck Personality Inventory (Eysenck and
85 Eysenck, 1994), Sensation Seeking scale (Aluja et al., 2010), a short version of Big Five
86 questionnaire (Gosling et al., 2003), the Mehrabian Conformity Scale (Mehrabian, 1997),
87 individual level of anxiety (Hajcak et al., 2003; Gu et al., 2010), the Locus of Control
88 questionnaire (Rotter, 1966) and Spielberger's State Trait Anxiety Inventory (Spielberger et al.,
89 1970). We did not find any significant correlations between the behavioral results and the
90 aforementioned personality traits ($p > 0.2$).

91 *Stimuli and procedure*

92 In present study we use the face judgment task (Campbell-Meiklejohn et al., 2010) where
93 participants were instructed to rate the trustworthiness of faces. While their MEG was recorded
94 (session 1), participants were exposed to a series of 222 photographs of female faces (stimuli
95 duration=2s, inter-trial interval=2.5–3.0s, overall duration of the session=35min). At the
96 beginning of each trial (Fig.1A), the participants were exposed to a photograph of a female face
97 for 2 seconds (with the face occupying approximately 60% of the picture). According to the
98 instruction participants decided whether to trust a substantial sum of money (equivalent of 1500
99 US dollars) to the person presented on the screen or not. Participants rated each face using the

100 eight-point scale ranging from 1 (very untrustworthy) to 8 (very trustworthy. The participants
101 indicated their choices by pressing the appropriate button. The participant's rating (initial rating,
102 blue rectangular frame) was visualized on the screen immediately after the button press. At the
103 end of each trial, the participant was informed about the average rating of the same face given by
104 a large group of students from the same Russian university (group rating, green rectangular
105 frame). The difference between the participant's and the group rating was additionally indicated
106 by a score above the scale (0, +/-2 or +/-3 points). The frame and the number indicating the
107 deviance from the group opinion appeared for both '*conflict*' and '*no-conflict*' trials. Actual
108 group ratings were generated pseudorandomly as $R_g = R_0 + M$, where R_g is the group rating, R_0 is
109 initial rating given by the participant and M is a (pseudo) random modifier. Our sampling
110 scheme used the adaptive algorithm described in Klucharev et al. (2009) ensuring that for 33% of
111 the trials the "group rating" agreed with the participants' initial rating (no-conflict trials, $M = 0$),
112 whereas in 67% of the trials the group rating were above or below the participants' initial ratings
113 by 2 or 3 points (conflict trials, $M = [2, 3, -2, -3]$). Thus, the relative number of 'more negative',
114 'more positive' or 'equal' group ratings was approximately equal for every participant.
115 Participants were neither informed regarding the real purpose of the experiment nor were they
116 informed about the way the group ratings were created.

117 After the first MEG session, the participants were offered a 30-min rest break outside the MEG
118 room. Next, participants were instructed to rate the same set of faces again during the second
119 session (subsequent rating, session 2). Before and after the first experimental session we also
120 recorded two 10- min blocks of participants' resting-state activity to estimate task independent
121 brain noise covariance matrix. To probe the duration of the conformity-related effects, we asked
122 participants to rate the trustworthiness of the same faces again three months after the MEG
123 experiment (subsequent session 3 data was collected for 15 out of 20 participants).

124 ***MEG acquisition and preprocessing***

125 We registered and processed MEG in accordance with the recent guidelines to good practices for
126 conducting MEG studies (Gross et al., 2013): We used 306 channel Electa Neuromag System
127 (102 magnetometers and 204 planar gradiometers, 1000 Hz sampling rate, the data was low-
128 passed filtered with 333 Hz cut-off frequency). To control for cardiac and eye-movement related
129 artifacts electrocardiographic (ECG) and electrooculographic (EOG) electrodes were mounted
130 prior to MEG acquisition. Head movements were controlled using the continuous head position
131 identification (cHPI) system. ECG electrodes were placed on the breastbone and on axillary
132 furrow approximately near the 5th rib. Vertical EOG (vEOG) electrodes were placed above and
133 below the center of left eye, horizontal EOG (hEOG) were placed on frontal processes of left and
134 right zygomatic bones. ECG and EOG recordings were used as additional source of information
135 for projecting out artifacts. Anatomical landmarks (NAS, LPA, RPA), cHPI-coil positions and
136 100 +/-5 additional head shape points were digitized using Polhemus Isotrak digital tracker
137 system (Polhemus, Colchester, VT, USA). Participants were instructed to avoid movements and
138 blink as little as possible during the experiment. The stimuli were presented on a semi-
139 transparent display via a projector situated outside the room. The distance between participant's
140 head and the display was 1.5m. To assure equal distance between frontal and occipital sensors
141 and participants' head a special cushion was used whenever it was necessary.
142 Magnetoencephalogram was preprocessed using the Neuromag Maxfilter software by the means
143 of the temporally-extended signal space separation (tSSS) algorithm (Taulu and Hari, 2009) with
144 a temporal autocorrelation threshold of 0.9 and segment length of 1 second. The MEG data was
145 recalculated to compensate for head movements and to correspond to default head origin
146 coordinates of (0, 0, 45)mm.

147 *Structural MRI acquisition and forward model*

148 Individual structural MRI T1-images were collected for each participant using the 1.5 T Philips
149 Intera scanner. The reconstruction of cortical surfaces was performed with the Freesurfer image
150 analysis suite (<http://surfer.nmr.mgh.harvard.edu>). Resulted cortical surface meshes were

151 imported into Brainstorm (Tadel et al., 2011) and down-sampled to 15 000 vertices for further
152 processing. Forward modeling was performed using overlapping spheres method (Huang et al.,
153 1999) as implemented in the Brainstorm Software. Due to unavailability of individual structural
154 MRI the default MNI anatomy with 1mm resolution was used for 2 participants.

155 **Analysis of behavioral data**

156 To detect whether the conflict with the group rating had led to the subsequent change of
157 trustworthiness ratings we compared participants' initial and subsequent ratings assigned to the
158 same face during the two experimental sessions (conformity effects). The trials were then
159 grouped based on whether the group rating was more positive (by 2 or 3 points), more negative
160 (by 2 or 3 points) or identical to the participant's initial rating (total 5 groups). Mean size of the
161 conforming face rating changes following conflict between the sessions was calculated. To
162 ensure that actual conformity effects were probed and provide for comparability between
163 subjects we also computed mean rating change for trials where group agreed with participant and
164 subtracted it from each participant's conformity scores data.

165 To account for limitations of repeated measurements inherent to experiments involving
166 preference changes (Chen and Risen, 2010) and to isolate the conformity effects we used the
167 following randomization approach. For each participant we performed 1000 randomizations of
168 the behavioral data during which we permuted the "group ratings" while keeping the initial and
169 subsequent ratings from the first and the second sessions constant. Such randomization scheme
170 keeps all the properties of the "group rating" constant but destroys the possible causal connection
171 of the subsequent rating with the "group ratings". For each iteration, we calculated the mean
172 "conforming rating change" (i.e. positive shift for trials where the group was more positive
173 minus negative shift when the group was more negative about the face, similar to Kim et al.
174 2012) for the randomly generated surrogate data and built the sampling distribution of this
175 quantity. Same analysis was repeated for the frequency of such conforming rating adjustments

176 occurring for each subject (similar to Berns et al. 2010). Since the original group ratings were
177 generated based on random increments to subjects' ratings (and thus are independent), the
178 permutability assumption is justified and we can use such a randomization scheme to recover the
179 distribution of 'conformal adjustments' under the null hypothesis of no causal connection
180 between group and individual ratings. Using this null hypotheses distribution we computed the z-
181 scores of the observed magnitude of conformity using the mean and the standard deviation of the
182 null-hypothesis distribution. The proposed scheme resolves the problems associated with
183 possible artificial correlations between the direction of participant's ratings changes and
184 randomly generated 'group opinion' induced by the scale finiteness and probes the actual
185 conformity effect.

186 The resulting two-modal distribution of z-scores suggested the existence of two readily
187 identifiable groups of participants. For the purposes of further analysis we assigned 6 of 19
188 participants falling into the higher mode (mean = 1.67, SD = 0.61) to 'conformists' group, while
189 other 13 participants forming the lower mode (mean = -0.39, SD = 0.43) were labeled as 'non-
190 conformists'.

191 Mean conforming rating changes were submitted to a 3-way ANOVA with the within-subject
192 factors *conflict direction* (group's opinion is more positive vs. group's opinion is more
193 negative), *conflict size* (small vs. large conflict) and the between-subject factor *level of*
194 *conformity* (conformists vs. non-conformists group).. Additionally, we separately analyzed the
195 conformity effects following the intermediate initial ratings (4 and 5 points) to account for the
196 regression towards the mean and scale finiteness effects that may have given rise to artificial
197 correlations between group rating and subsequent rating changes. Based on the results of the
198 procedure described above we compared the MEG data between participants who demonstrated
199 stronger conformity effects and the participants who demonstrated conformity effects at chance
200 level.

201 **MEG data analysis**

202 MEG data analysis was performed using Brainstorm package (Tadel et al., 2011) and custom
203 written Matlab routines (The MathWorks, Inc.). Prior to the analysis, the recordings were down-
204 sampled to a 500 Hz sampling rate. Event-related magnetic fields (ERF) and time-frequency
205 maps were locked onto the presentation of the group rating for the *conflict* trials (i.e., when the
206 participant 's ratings mismatched the group rating) and for the *no-conflict* trials (i.e., when the
207 participant 's ratings matched the group rating) separately.

208 ***Sensor space evoked response field (ERF) analysis.*** For the ERF analysis, we extracted epochs
209 in the -200 ms to 800 ms time window locked to the stimulus onset (group opinion
210 presentation). To remove the DC (Direct Current) offset from each trial, a zero-order polynomial
211 detrend was applied based on the pre-stimulus interval (-200 ms, 0 ms). To identify time
212 windows of components of the evoked response that account for the differences in activation
213 between the *conflict* and *no-conflict* trials we computed Global Field Power (GFP) Root-Mean-
214 Squared (RMS) curves separately for all magnetometers and all gradiometers. We used
215 permutation tests followed by false discovery rate correction (FDR = 0.1, for 500 time points,) to
216 estimate time windows where the significant differential activation was observed. To increase
217 the reliability of the test we restricted analysis to time-windows that exceeded 20 ms in duration.

218 ***Source space evoked field analysis.*** To localize the cortical sources, we first computed the
219 averaged waveforms for *conflict* and *no-conflict* trials in sensor space. We then used the
220 Brainstorm implementation of cortically constrained Tikhonov-regularized normalized
221 minimum-norm estimate (MNE)(Hämäläinen and Ilmoniemi, 1994) with the fixed dipole
222 orientations and depth weighting coefficient 0.6 (Lin et al., 2006) to solve the inverse problem
223 and localize the sources of the evoked activity (Baillet et al., 2001). In the group analysis,
224 individual source-space ERF data was projected on default MNI brain with a 1mm resolution
225 using iterative closest point search algorithm as implemented in Brainstorm software (Tadel et al.

226 2011).

227 We then conducted a cluster mass-based permutation test on the cortical activation maps for
228 *conflict vs. no-conflict* conditions (Maris and Oostenveld, 2007) using all participants data. The
229 mass of the cluster was calculated as the sum of signed t-scores in the adjacent vertices and time
230 points. The threshold for cluster inclusion was set to correspond to uncorrected p -value < 0.025
231 for a two-tailed t-test. For each cluster in the original data p -value was computed as a probability
232 of observing a cluster of larger (positive or negative separately) mass over 2000 random
233 permutations. We performed a soft version of maximum distribution-based correction for
234 multiple comparisons using the FWER principle. Ten (and not one as in the standard procedure)
235 largest clusters per each permutation were used to compute the p -value. To alleviate the multiple
236 comparisons problem we limited the studied cortical surface to bilateral frontal lobes (including
237 medial surface) delineated by postcentral gyrus posteriorly and superior temporal gyrus laterally.
238 For the same reason we also limited the source analysis to three 100 ms time intervals (the earlier
239 interval lasted from 150 to 250 ms, the intermediate from 350 to 450ms and the latter from 450
240 to 550 ms intervals) based on the results of GFP analysis. We could do so because the GFP does
241 not provide any spatially specific information. The data for each cortical hemisphere was
242 analyzed separately.

243 ***Region of interest (ROI) analysis.*** To elucidate the dynamics of MEG activation related to
244 conformity, we analysed four significant ROIs (right MPFC, left OFC, left anterior MPFC and
245 left posterior MPFC) identified at the earlier stage of analysis using the source space cluster-
246 based permutation test described above. To estimate the temporal profile of ROI activation
247 power we extracted the absolute value of the first mode PCA component loading of the
248 difference waveform (conflict – no conflict), computed for all vertices comprising each ROI.
249 We then performed permutation tests to probe whether such ROI activations differed between
250 the two groups of participants by randomly assigning them to what we called “conformist” and
251 “non-conformist” groups. Test results were corrected for multiple comparisons by identifying the

252 largest cluster (in the time domain) of significant t-scores over 2000 permutations.

253 *Sensor-Space time-frequency data analysis.* To analyze the induced oscillatory activity, we
254 extracted epochs that included a 1-s pre-stimulus and 2-s post-stimulus locked to the presentation
255 of the group opinion. DC offset was removed from each epoch by aligning the time series to the
256 average amplitude of 1 sec pre-stimulus interval. In order to remove the phase-locked activity,
257 we subtracted the averaged evoked response from each epoch before further analysis.

258 The data was filtered in the theta (4-8Hz) frequency band. We applied Hilbert transform to
259 extract the amplitude envelope and calculated event-related (de)synchronization (ERS/ERD)
260 coefficients by aligning the absolute Hilbert amplitude envelope values, averaged over 600 ms
261 after stimulus presentation to the averaged baseline amplitude calculated based on the - 400ms -
262 0ms pre-stimulus interval for a cluster of 44 frontal gradiometers (Fig. 4,A).

263 The resulting ERS coefficients were analyzed using the two-way ANOVA to probe whether the
264 increase in frontal theta amplitude differed between the conditions (*conflict* and *no-conflict*) and
265 the two groups of participants (*“conformists”* and *“non-conformists”*).

266 *Source space time-frequency data analysis*

267 In order to localize sources of theta oscillatory activity, we first computed a spatial filter that
268 maximized the variance between the *conflict* and *no-conflict* conditions for each participant using
269 the Common Spatial Pattern (CSP) approach (for details see (Blankertz et al., 2008)). We used
270 only magnetometer data filtered in the theta frequency band. Tikhonov regularization with
271 parameter $\lambda = 0.001$ was applied to condition the covariance inverse matrix. We then
272 applied MNE localization procedure to the CSP's corresponding to the two largest eigenvalues
273 of the generalized covariance matrix. Similarly to the ERF analysis, we projected individual
274 MNE solutions obtained for the a.m. CSP components on the default anatomy for grand
275 averaging.

276 **Results**

277 **Behavioral results**

278 Overall, the participants rated faces (session 1) as moderately trustworthy: mean rating = 4.3, SD
279 = 0.67. When participants' opinion conflicted with the group rating, they changed their ratings
280 towards the group opinion in 46% of the trials (range from 33.5% to 61%, session 2). The
281 randomization procedure performed on the behavioral data revealed two groups of participants:
282 "conformists" (average conforming rating change = 0.66, std = 0.28) and "non-conformists"
283 (average conforming rating change = 0.42, std = 0.14).

284 The 3-way ANOVA revealed the significant main effect of *conflict direction* ($F(1,19) = 116.1, p$
285 $= 0.00001$) and significant interactions *conflict direction* x *conflict size* ($F(1,19)=22.7, p =$
286 0.00001) and *conflict direction* x *level of conformity* ($F(1,19) = 6.31, p = 0,014$). Therefore, the
287 conformity effects were stronger after large conflicts with the group opinion than after small
288 conflicts. Furthermore, the conformity effects were stronger for 'conformists' as compared to
289 'non-conformists'. To account for possible artificial correlations between the group ratings and
290 subsequent rating changes caused by repeated measurements we performed additional analysis
291 using a subset of faces with intermediate initial ratings (4 and 5). The 3-way ANOVA also
292 showed a significant main effect of *conflict direction* ($F(1,19) = 12.54, p = 0.0007$) and an
293 interaction *conflict direction* x *level of conformity* ($F(1,19) = 16.99, p = 0.001$).

294 To probe the duration of the conformity-related effects, we asked participants to rate the
295 trustworthiness of the same faces again three months after the MEG experiment (session 3). The
296 3-way ANOVA of conformity effects revealed the significant main effect of *conflict direction*
297 ($F(1,14) = 101.2, p = 0.00001$) and interaction *conflict direction* x *level of conformity* ($F(1,14)$
298 $= 14.57, p=0.0004$). The conformity scores computed for the sessions 2 and 3 showed a
299 significant positive correlation ($r=0.68, p = 0.0051$). Similarly to short-term conformity effects in
300 session 2, we analyzed a subset of trials with the intermediate initial ratings (4 and 5). A 3-way
301 ANOVA showed the significant main effect of *conflict direction* which occurred 3 months after

302 the MEG experiment ($F(1, 14) = 5.88, p = 0.0188$), this observation was also supported by the
303 interaction *conflict direction* x *conflict size* x *level of conformity* ($F(1,14) = 6.29, p = 0.015$)
304 indicating that long-term conformity effects were observed only for large conflicts and only for
305 ‘conformists’. Thus, in our study group opinion effectively modulated individuals’ judgments of
306 trustworthiness.

307

308 **ERF results**

309 ***GFP analysis of conflict-related activity.*** To determine time-windows with the strongest
310 conflict-related activity (conflict trials vs. no-conflict trials, duration greater than 20 ms) we
311 analyzed evoked (GFP) activity for the magnetometers data using the permutation test (Fig. 2A).
312 The test signified three time-windows: 204-240 ms, 414-440 ms and 496-518 ms after the onset
313 of group ratings where the activity in conflict trials was stronger than the activity in no-conflict
314 trials. Similar results were obtained with analysis of the gradiometer data (data not shown).

315 ***Source-space analysis of conflict-related activity.*** To identify the brain regions generating
316 conflict-related activity we conducted a cluster-based permutation test in the MNE source space
317 around the time-windows identified by the GFP analysis (150-250 ms, 350-450ms and 450-550
318 ms) and compared the activations between *conflict* and *no-conflict* trials. The test revealed four
319 statistically significant clusters of activations (Fig 3A, Table 1) occurring only in the earliest
320 time-window (150-250 ms): the bilateral pMPFC, left anterior medial prefrontal cortex
321 (aMPFC), and left orbitofrontal cortex (left OFC). The right orbitofrontal cortex (right OFC)
322 cluster approached significance (mass = 366.0, cluster p-value = 0.063). The four clusters that
323 showed statistical significance were further used as ROI’s for the between-group analysis
324 (‘conformists’ vs. ‘non-conformists’).

325 In the second (350-450ms), and third (450-550ms) time-windows no significant conflict-related
326 clusters were identified, however three clusters approached statistical significance (left pMPFC,

327 left precentral gyrus and frontal superior sulcus, see Table 1 for details).

328 **ROI analysis of the conformity-related activity.** To identify whether the conflict-related
329 activity differed between subjects with higher or lower tendency to conform to the group opinion
330 we compared the amplitudes of difference activations (conflict minus no-conflict trial) between
331 subjects that were assigned to the 'conformists' and 'non-conformists' within preselected ROIs.
332 The permutation test indicated a larger conflict-related activity (cluster p -value = 0.031) for
333 'non-conformists' than for 'conformists' in the right pMPFC (Fig.3B).

334 **Time-frequency analysis of conflict- and conformity-related effects.** The ERS analysis of the
335 induced oscillatory activity at the frontal sensors (Fig.4A.) revealed that both in *conflict* (mean
336 magnitude increase = 17.3 percent, SD = 10.9) and *no-conflict* (mean magnitude increase = 7.2
337 percent, SD = 6.7) trials, the magnitude of the frontal theta activity (4-8Hz) increased relative to
338 the prestimulus baseline (Fig. 4B). As expected, this increase was more pronounced for *conflict*
339 trials, than for *no-conflict* trials (mean magnitude difference = 10, SD. = 7.7). This observation
340 was supported by the two-way ANOVA performed for theta ERS coefficients with the *conflict*
341 (conflict vs. no-conflict trials) as a within-group factor, and the *level of conformity* (conformists
342 vs. non-conformist) as a between-group. The significant main effects of *conflict* ($F(1,19) = 5.84$,
343 $p = 0.022$) and *level of conformity* ($F(1,19) = 5.17$, $p = 0.03$) indicate that 'non-conformists'
344 showed a stronger increase in theta power than 'conformists'. The interaction *conflict x level of*
345 *conformity* was not significant ($p = 0.16$). Overall, we found a stronger synchronization of the
346 theta band activity at the frontal sensors for 'non-conformists' than for 'non-conformists'.

347 **Source analysis of conflict--related theta band effects.** To investigate brain regions generating
348 the conflict-related induced theta activity we first computed the components accounting for most
349 variance between conflict and no-conflict trials in the theta frequency band. Resulting CSP
350 components explained on average 22.8% variance of the original data (SD = 6.25%, time-
351 window = 0-600 ms). We then used the MNE inverse solution to localize the sources of these

352 components. The localization of CSP components of the theta activity indicated multiple frontal
353 sources of activations including the bilateral MPFC (ventral and dorsal), OFC, bilateral temporal
354 poles, lingual gyrus and left dorsolateral prefrontal cortex (DLPFC) (Fig. 4C).

355

356 **Discussion**

357 The goal of this study was to elucidate temporal and spatial characteristics of electromagnetic
358 brain responses to the visual cues signaling that participants' individual ratings of face
359 trustworthiness conflict with the group opinion. The GFP analysis revealed a stronger activation
360 around 204-240 ms in *conflict* trials where individual ratings differed from the group rating than
361 in *no-conflict* trials where individual ratings matched with the normative group ratings. The
362 timing of the activation in our study corresponds to the timing of the FRN, an evoked-response
363 component often associated with reward prediction error processing and adjustments of behavior
364 (Holroyd and Coles, 2002; Cohen et al., 2011a; Walsh and Anderson, 2012). The source analysis
365 revealed significant conflict-related activations in the bilateral pMPFC and left OFC.
366 Interestingly, the activation in the right pMPFC overlapped with the results of the previous fMRI
367 study (Klucharev et al., 2009) and occurred approximately within the same time-window as
368 conflict-related evoked responses reported in the previous EEG studies of social conformity (e.g.
369 Shestakova et al., 2012).

370 We also found that the conflict with the group opinion triggers an induced frontal theta activity
371 that has been implicated into performance monitoring and reinforcement learning (Cavanagh et
372 al., 2010, 2012; Cohen et al., 2011b; van de Vijver et al., 2011). Frontal theta dynamics observed
373 in our study was consistent with corresponding evoked responses: we observed a more
374 pronounced increase in the induced theta power in *conflict* as compared to *no-conflict* trials.
375 These results are in line with several recent studies suggesting that FRN can be a time-domain
376 manifestation of theta oscillatory perturbations in the MPFC (Cohen et al., 2008; Cavanagh et al.,

2010; van de Vijver et al., 2011). Source modeling of our results indicated that the conflict-related induced oscillatory activity in the theta band was generated in multiple regions including the MPFC, OFC, lateral PFC, supplementary motor area and the visual cortex, significantly overlapping with brain sources of the conflict-related evoked responses.

We further estimated individual proneness to social influence using a randomization approach and divided subjects in two groups: ‘conformists’ and ‘non-conformists’ based on their behavioral results. The ‘non-conformists’ group showed significantly smaller conformity (conformal changes of ratings), than the ‘conformists’ group. Furthermore, long-term conformity effects, measured 3 months after the MEG session, were significantly stronger in the ‘conformists’ group than in the ‘non-conformists’ group. We also found that the magnitude of both evoked and induced MEG responses differed significantly between ‘conformists’ and ‘non-conformists’. ROI analysis revealed that ‘non-conformists’ demonstrated a significantly stronger conflict-related evoked and theta synchronization responses than ‘conformists’.

Previous fMRI studies consistently reported that the magnitude of the conflict-related BOLD signals in the pMPFC correlated with individual differences in the proneness to conformity, with conformists demonstrating higher BOLD activations (see (Izuma and Adolphs, 2013), for a review). On a contrary, our results demonstrated a relative theta power increase and a larger evoked magnetic response in the pMPFC of ‘non-conformists’ than in the pMPFC of ‘conformists’. Several previous studies demonstrated a negative correlation between the theta power increase (ERS) localized in the MPFC and the amplitude of the BOLD in the same region (Meltzer et al. 2007; Hoffmann et al. 2013). It has been noted that “‘activations’” of the MPFC as indicated by a BOLD signal increase may correspond to a deactivation of the so called “default mode network” (Raichle and Snyder, 2007) and vary with the degrees of engagement in the task (Rushworth et al., 2011). Thus, the frontal theta dynamics and its’ putative time-domain representations (FRN) may well co-localize with the decrease in the BOLD response (Winterer et al., 2007; Singh, 2012). Thus, our results add to the discussion of the relationship between the

403 BOLD and MEG signals (Winterer et al., 2007; Singh, 2012)

404 Our MEG results support an important role of the pMPFC in the brain mechanisms of social
405 influence. The activity of the ventral striatum also has been previously associated with social
406 conformity (Klucharev et al., 2009; Berns et al., 2010; Campbell-Meiklejohn et al., 2010; Zaki et
407 al., 2011; Izuma, 2013b). Since the ventral striatum was implicated in reinforcement learning
408 (Delgado, 2007; O’Doherty et al., 2007; Niv, 2009), this region can contribute to the automatic
409 learning mechanism underlying conformity, while the activity of the pMPFC may underlie a
410 distinct cognitively demanding process of a ‘control state’ evaluating whether to follow the
411 group opinion or stick to the initial opinion. This hypothesis is consistent with recent accounts of
412 the pMPFC role highlighting its function in cost computation, representing best alternative
413 action and executive control functions (Folstein and Van Petten, 2008; Rushworth et al., 2012;
414 Shenhav et al., 2013). Since the pMPFC is a part of the “default mode network”, the greater
415 magnitude of biomagnetic conflict-related responses in the ‘non-conformist’ group may indicate
416 the allocation of larger cognitive resources during the conflict with group norms as compared to
417 the ‘conformist group’, where a more general reinforcement learning-like process engaging the
418 ventral striatum could dominate over cortical activity of the pMPFC.

419 Our results suggest that a perceived conflict with a normative group opinion triggers the pMPFC
420 activity similar to the FRN. To date, few studies have investigated MEG signatures of the FRN
421 (Doñamayor et al., 2012; Thomas et al., 2013), closely-related error-related negativity (ERN)
422 (Keil et al., 2010; Charles et al., 2013) and model-derived prediction error signal (Talmi et al.,
423 2012). Although only partly consistent to each other, these studies registered the error and
424 feedback-related activity at the ACC and MPFC (Thomas et al. 2013 Keil et al. 2010; Charles et
425 al. 2013; Thomas et al. 2013) as well as at the posterior cingulate cortex (Doñamayor et al. 2012).
426 Differences in FRN localization in various studies can be due to the fact that this component may
427 consist of two or more subcomponents. Previous EEG studies suggested that the FRN is
428 produced by a superposition of two separate (negative and positive) subcomponents associated

429 with feedback processing (Holroyd et al., 2008; Baker and Holroyd, 2011; Krigolson et al.,
430 2014). The negative subcomponent ('N2' component in EEG literature) is associated with
431 processing of conflicting or unexpected events including unexpected negative and positive
432 feedbacks. The N2 subcomponent has been also associated with high-order conflict processing
433 and control state (Folstein and Van Petten, 2008) or with a state of enhanced control redirecting
434 future behavior away from tasks and strategies that result in a conflict (Botvinick, 2007; Fritz
435 and Dreisbach, 2013). While the second positive subcomponent ('reward positivity') is elicited
436 specifically by unexpected positive events along with N2 and cancels out the negative
437 subcomponent, resulting in a more positive waveform in EEG (Holroyd et al., 2008; Krigolson et
438 al., 2014), but, presumably, not in MEG due to different source cancellation profiles (Irimia et
439 al., 2012). Our results suggest that the observed MEG activity of the pMPFC may represent only
440 the negative FRN subcomponent. Overall, we can speculate that the observed pMPFC activations
441 may represent the processing of the conflict with descriptive social norms in terms of a self-
442 control (a 'lose-stay', but not 'lose-switch' strategy), a process complimentary to reinforcement
443 learning-related activity of the ventral striatum.

444 Alternatively, the weaker conflict-related activity of the pMPFC in 'conformists' group could be
445 associated with a relatively weaker individual opinion about the trustworthiness of the faces
446 resulting in a lower internal conflict (and smaller pMPFC activity) evoked by observed mismatch
447 with group ratings. Consistent with this interpretation of our findings, Achziger and colleagues
448 demonstrated that people who tend to overweight new information display lower evoked activity
449 upon receiving one that conflicts with prior information (Achziger et al., 2014). Additional
450 studies are clearly needed to clarify the function of the pMPFC activity during social conformity.

451 Our results also show the conflict-related activity in the OFC following the conflicts with the
452 group opinion. The conflict-related activity in the OFC did not differ between conformists and
453 non-conformists, probably reflecting a more general decision making (e.g. valuation) process.
454 Additional analysis revealed a stronger activation of the OFC in conformists than non-

455 conformists, but only when the group agreed with the participants' rating (196-226ms). Since the
456 OFC has been robustly implicated in encoding stimulus value (e.g. Rushworth et al. 2007;
457 Walton et al. 2011; Rushworth et al. 2012), the observed differential activity may also be related
458 to a higher value of matching the group opinion for conformists.

459 **Conclusions**

460 Taken together our results suggest the involvement of the performance monitoring neural
461 circuitry into the mechanisms underlying social influence. The evoked and induced activity of
462 the pMPFC detected by MEG may underlie a control state following perceived conflicts with
463 social norms. Additionally, the activity of the OFC to a perceived match with social norms can
464 contribute to social conformity by assigning a value of being similar with the social group.
465 Overall, our results further contribute to the growing literature investigating the neural
466 mechanisms of social influence and support a profound role of the medial and orbital regions of
467 the frontal cortex in conformity-related adjustments to social norms..

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469 **References**

470 Achtziger A, Alós-Ferrer C, Hügelschäfer S, Steinhauser M (2014) The neural basis of belief
471 updating and rational decision making. *Soc Cogn Affect Neurosci* 9:55–62 Available at:
472 <http://www.ncbi.nlm.nih.gov/pubmed/22956673> [Accessed February 20, 2014].

473 Aluja A, Kuhlman M, Zuckerman M (2010) Development of the Zuckerman-Kuhlman-Aluja
474 Personality Questionnaire (ZKA-PQ): a factor/facet version of the Zuckerman-Kuhlman
475 Personality Questionnaire (ZKPQ). *J Pers Assess* 92:416–431.

476 Baker TE, Holroyd CB (2011) Dissociated roles of the anterior cingulate cortex in reward and
477 conflict processing as revealed by the feedback error-related negativity and N200. *Biol*
478 *Psychol* 87:25–34 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/21295109> [Accessed

479 June 1, 2013].

480 Berns GS, Capra CM, Moore S, Noussair C (2010) Neural mechanisms of the influence of
481 popularity on adolescent ratings of music. *Neuroimage* 49:2687–2696 Available at:
482 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2818406&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2818406&tool=pmcentrez&rendertype=abstract)
483 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2818406&tool=pmcentrez&rendertype=abstract) [Accessed February 3, 2014].

484 Blankertz B, Tomioka R, Lemm S, Kawanabe M, Müller K (2008) Optimizing Spatial Filters for
485 Robust EEG Single-Trial Analysis. *XX*:1–12.

486 Botvinick MM (2007) Conflict monitoring and decision making: reconciling two perspectives on
487 anterior cingulate function. *Cogn Affect Behav Neurosci* 7:356–366 Available at:
488 <http://www.ncbi.nlm.nih.gov/pubmed/18189009> [Accessed February 19, 2014].

489 Campbell-Meiklejohn DK, Bach DR, Roepstorff A, Dolan RJ, Frith CD (2010) How the opinion
490 of others affects our valuation of objects. *Curr Biol* 20:1165–1170 Available at:
491 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2908235&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2908235&tool=pmcentrez&rendertype=abstract)
492 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2908235&tool=pmcentrez&rendertype=abstract) [Accessed January 23, 2014].

493 Cavanagh JF, Frank MJ, Klein TJ, Allen JJB (2010) Frontal theta links prediction errors to
494 behavioral adaptation in reinforcement learning. *Neuroimage* 49:3198–3209 Available at:
495 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2818688&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2818688&tool=pmcentrez&rendertype=abstract)
496 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2818688&tool=pmcentrez&rendertype=abstract) [Accessed November 5, 2012].

497 Cavanagh JF, Zambrano-Vazquez L, Allen JJB (2012) Theta lingua franca: a common mid-
498 frontal substrate for action monitoring processes. *Psychophysiology* 49:220–238 Available
499 at:
500 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3262926&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3262926&tool=pmcentrez&rendertype=abstract)
501 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3262926&tool=pmcentrez&rendertype=abstract) [Accessed March 9, 2014].

502 Charles L, Van Opstal F, Marti S, Dehaene S (2013) Distinct brain mechanisms for conscious
503 versus subliminal error detection. *Neuroimage* 73:80–94 Available at:
504 <http://www.ncbi.nlm.nih.gov/pubmed/23380166> [Accessed January 21, 2014].

505 Chen MK, Risen JL (2010) How choice affects and reflects preferences: revisiting the free-
506 choice paradigm. *J Pers Soc Psychol* 99:573–594 Available at:
507 <http://www.ncbi.nlm.nih.gov/pubmed/20658837> [Accessed February 24, 2014].

508 Cialdini RB, Goldstein NJ (2004) Social influence: compliance and conformity. *Annu Rev*
509 *Psychol* 55:591–621 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/14744228>
510 [Accessed January 21, 2014].

511 Cohen MX, Elger CE, Ranganath C (2007) Reward expectation modulates feedback-related
512 negativity and EEG spectra. *Neuroimage* 35:968–978 Available at:
513 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=1868547&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=1868547&tool=pmcentrez&rendertype=abstract)
514 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=1868547&tool=pmcentrez&rendertype=abstract) [Accessed November 4, 2012].

515 Cohen MX, Ranganath C (2007) Reinforcement learning signals predict future decisions. *J*
516 *Neurosci* 27:371–378 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/17215398>
517 [Accessed May 29, 2013].

518 Cohen MX, Ridderinkhof KR, Haupt S, Elger CE, Fell J (2008) Medial frontal cortex and
519 response conflict: evidence from human intracranial EEG and medial frontal cortex lesion.
520 *Brain Res* 1238:127–142 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/18760262>
521 [Accessed March 8, 2014].

522 Cohen MX, Wilmes K, Vijver I Van De (2011a) Cortical electrophysiological network dynamics
523 of feedback learning. *Trends Cogn Sci* 15:558–566 Available at:
524 <http://www.ncbi.nlm.nih.gov/pubmed/22078930> [Accessed November 5, 2012].

525 Cohen MX, Wilmes K, Vijver I Van De (2011b) Cortical electrophysiological network dynamics
526 of feedback learning. *Trends Cogn Sci* 15:558–566 Available at:
527 <http://www.ncbi.nlm.nih.gov/pubmed/22078930> [Accessed January 21, 2014].

528 Delgado MR (2007) Reward-related responses in the human striatum. *Ann N Y Acad Sci*
529 1104:70–88 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/17344522> [Accessed July
530 11, 2014].

531 Doñamayor N, Schoenfeld MA, Münte TF (2012) Magneto- and electroencephalographic
532 manifestations of reward anticipation and delivery. *Neuroimage* 62:17–29 Available at:
533 <http://www.ncbi.nlm.nih.gov/pubmed/22561022> [Accessed February 10, 2014].

534 Eysenck HJ, Eysenck SBG (1994) Manual for the Eysenck Personality Questionnaire. (EPQ-R
535 Adult):21 Available at:
536 [http://books.google.com/books?id=dYQ8HAAACAAJ&dq=intitle:Manual+for+the+Eysenck+Personality+Inventory&hl=&cd=2&source=gbs_api\papers3://publication/uuid/BEEE6
537 DC8-7B1A-47A6-8B66-3F028BFA6370](http://books.google.com/books?id=dYQ8HAAACAAJ&dq=intitle:Manual+for+the+Eysenck+Personality+Inventory&hl=&cd=2&source=gbs_api\papers3://publication/uuid/BEEE6DC8-7B1A-47A6-8B66-3F028BFA6370).

538

539 Folstein JR, Van Petten C (2008) Influence of cognitive control and mismatch on the N2
540 component of the ERP: a review. *Psychophysiology* 45:152–170 Available at:
541 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2365910&tool=pmcentrez&ren
542 dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2365910&tool=pmcentrez&rendertype=abstract) [Accessed February 20, 2014].

543 Fritz J, Dreisbach G (2013) Conflicts as aversive signals: conflict priming increases negative
544 judgments for neutral stimuli. *Cogn Affect Behav Neurosci* 13:311–317 Available at:
545 <http://www.ncbi.nlm.nih.gov/pubmed/23307475> [Accessed February 20, 2014].

546 Gosling SD, Rentfrow PJ, Swann WB (2003) A very brief measure of the Big-Five personality
547 domains. *J Res Pers* 37:504–528.

548 Gross J, Baillet S, Barnes GR, Henson RN, Hillebrand A, Jensen O, Jerbi K, Litvak V, Maess B,
549 Oostenveld R, Parkkonen L, Taylor JR, van Wassenhove V, Wibral M, Schoffelen J-M
550 (2013) Good practice for conducting and reporting MEG research. *Neuroimage* 65:349–363
551 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/23046981> [Accessed May 27, 2013].

552 Gu R, Huang YX, Luo YJ (2010) Anxiety and feedback negativity. *Psychophysiology* 47:961–
553 967.

554 Hajcak G, McDonald N, Simons RF (2003) Anxiety and error-related brain activity. *Biol*
555 *Psychol* 64:77–90.

556 Hämäläinen MS, Ilmoniemi RJ (1994) Interpreting magnetic fields of the brain: minimum norm
557 estimates. *Med Biol Eng Comput* 32:35–42 Available at:
558 <http://www.ncbi.nlm.nih.gov/pubmed/8182960> [Accessed August 13, 2014].

559 Hoffmann S, Labrenz F, Themann M, Wascher E, Beste C (2013) Crosslinking EEG time-
560 frequency decomposition and fMRI in error monitoring. *Brain Struct Funct* Available at:
561 <http://www.ncbi.nlm.nih.gov/pubmed/23443964> [Accessed January 23, 2014].

562 Holroyd CB, Coles MGH (2002) The neural basis of human error processing: Reinforcement
563 learning, dopamine, and the error-related negativity. *Psychol Rev* 109:679–709 Available
564 at: <http://doi.apa.org/getdoi.cfm?doi=10.1037/0033-295X.109.4.679> [Accessed November
565 5, 2012].

566 Holroyd CB, Pakzad-Vaezi KL, Krigolson OE (2008) The feedback correct-related positivity:
567 sensitivity of the event-related brain potential to unexpected positive feedback.
568 *Psychophysiology* 45:688–697 Available at:
569 <http://www.ncbi.nlm.nih.gov/pubmed/18513364> [Accessed January 25, 2014].

570 Huang MX, Mosher JC, Leahy RM (1999) A sensor-weighted overlapping-sphere head model

571 and exhaustive head model comparison for MEG. *Phys Med Biol* 44:423–440 Available at:
572 <http://www.ncbi.nlm.nih.gov/pubmed/10070792>.

573 Irimia A, Van Horn JD, Halgren E (2012) Source cancellation profiles of
574 electroencephalography and magnetoencephalography. *Neuroimage* 59:2464–2474
575 Available at:
576 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3254784&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3254784&tool=pmcentrez&rendertype=abstract)
577 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3254784&tool=pmcentrez&rendertype=abstract) [Accessed January 23, 2014].

578 Izuma K (2013a) The neural basis of social influence and attitude change. *Curr Opin Neurobiol*
579 23:456–462 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/23608704> [Accessed
580 September 18, 2013].

581 Izuma K (2013b) The neural basis of social influence and attitude change. *Curr Opin Neurobiol*
582 23:456–462 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/23608704> [Accessed June
583 8, 2013].

584 Izuma K, Adolphs R (2013) Social manipulation of preference in the human brain. *Neuron*
585 78:563–573 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/23664619>.

586 Keil J, Weisz N, Paul-Jordanov I, Wienbruch C (2010) Localization of the magnetic equivalent
587 of the ERN and induced oscillatory brain activity. *Neuroimage* 51:404–411 Available at:
588 <http://www.ncbi.nlm.nih.gov/pubmed/20149884> [Accessed November 12, 2012].

589 Kim B-R, Liss A, Rao M, Singer Z, Compton RJ (2012) Social deviance activates the brain's
590 error-monitoring system. *Cogn Affect Behav Neurosci* 12:65–73 Available at:
591 <http://www.ncbi.nlm.nih.gov/pubmed/22038705> [Accessed June 1, 2013].

592 Klucharev V, Hytönen K, Rijpkema M, Smidts A, Fernández G (2009) Reinforcement learning
593 signal predicts social conformity. *Neuron* 61:140–151 Available at:

594 <http://www.ncbi.nlm.nih.gov/pubmed/19146819> [Accessed September 21, 2013].

595 Klucharev V, Munneke M a M, Smidts A, Fernández G (2011) Downregulation of the posterior
596 medial frontal cortex prevents social conformity. *J Neurosci* 31:11934–11940 Available at:
597 <http://www.ncbi.nlm.nih.gov/pubmed/21849554> [Accessed January 23, 2014].

598 Krigolson OE, Hassall CD, Handy TC (2014) How We Learn to Make Decisions : Rapid
599 Propagation of Reinforcement Learning Prediction Errors in Humans. :1–10.

600 Lin F-H, Witzel T, Ahlfors SP, Stufflebeam SM, Belliveau JW, Hämäläinen MS (2006)
601 Assessing and improving the spatial accuracy in MEG source localization by depth-
602 weighted minimum-norm estimates. *Neuroimage* 31:160–171 Available at:
603 <http://www.ncbi.nlm.nih.gov/pubmed/16520063> [Accessed September 28, 2013].

604 Maris E, Oostenveld R (2007) Nonparametric statistical testing of EEG- and MEG-data. *J*
605 *Neurosci Methods* 164:177–190 Available at:
606 <http://www.ncbi.nlm.nih.gov/pubmed/17517438> [Accessed September 20, 2013].

607 Mehrabian A (1997) Analysis of affiliation-related traits in terms of the PAD Temperament
608 Model. *J Psychol* 131:101–117.

609 Meltzer J a, Negishi M, Mayes LC, Constable RT (2007) Individual differences in EEG theta and
610 alpha dynamics during working memory correlate with fMRI responses across subjects.
611 *Clin Neurophysiol* 118:2419–2436 Available at:
612 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2080790&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2080790&tool=pmcentrez&rendertype=abstract)
613 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=2080790&tool=pmcentrez&rendertype=abstract) [Accessed January 21, 2014].

614 Nieuwenhuis S, Holroyd CB, Mol N, Coles MGH (2004) Reinforcement-related brain potentials
615 from medial frontal cortex: origins and functional significance. *Neurosci Biobehav Rev*

616 28:441–448 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/15289008> [Accessed
617 November 5, 2012].

618 Niv Y (2009) Reinforcement learning in the brain. *J Math Psychol* 53:139–154 Available at:
619 <http://www.sciencedirect.com/science/article/pii/S0022249608001181> [Accessed July 19,
620 2014].

621 O’Doherty JP, Hampton A, Kim H (2007) Model-based fMRI and its application to reward
622 learning and decision making. *Ann N Y Acad Sci* 1104:35–53 Available at:
623 <http://www.ncbi.nlm.nih.gov/pubmed/17416921> [Accessed July 15, 2014].

624 Raichle ME, Snyder AZ (2007) A default mode of brain function: a brief history of an evolving
625 idea. *Neuroimage* 37:1083–90; discussion 1097–9 Available at:
626 <http://www.ncbi.nlm.nih.gov/pubmed/17719799> [Accessed January 20, 2014].

627 Rotter JB (1966) Generalized expectancies for internal versus external control of reinforcement.
628 *Psychol Monogr* 80:1–28.

629 Rushworth MFS, Behrens TEJ, Rudebeck PH, Walton ME (2007a) Contrasting roles for
630 cingulate and orbitofrontal cortex in decisions and social behaviour. *Trends Cogn Sci*
631 11:168–176 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/17337237> [Accessed
632 January 27, 2014].

633 Rushworth MFS, Buckley MJ, Behrens TEJ, Walton ME, Bannerman DM (2007b) Functional
634 organization of the medial frontal cortex. *Curr Opin Neurobiol* 17:220–227 Available at:
635 <http://www.ncbi.nlm.nih.gov/pubmed/17350820> [Accessed January 21, 2014].

636 Rushworth MFS, Kolling N, Sallet J, Mars RB (2012) Valuation and decision-making in frontal
637 cortex: one or many serial or parallel systems? *Curr Opin Neurobiol* 22:946–955 Available
638 at: <http://www.sciencedirect.com/science/article/pii/S0959438812000694> [Accessed July

639 10, 2014].

640 Rushworth MFS, Noonan MP, Boorman ED, Walton ME, Behrens TE (2011) Frontal cortex and
641 reward-guided learning and decision-making. *Neuron* 70:1054–1069 Available at:
642 <http://www.ncbi.nlm.nih.gov/pubmed/21689594> [Accessed February 20, 2014].

643 Shenhav A, Botvinick MM, Cohen JD (2013) The expected value of control: an integrative
644 theory of anterior cingulate cortex function. *Neuron* 79:217–240 Available at:
645 <http://www.sciencedirect.com/science/article/pii/S0896627313006077> [Accessed July 9,
646 2014].

647 Shestakova A, Rieskamp J, Tugin S, Ossadtchi A, Krutitskaya J, Klucharev V (2013)
648 Electrophysiological precursors of social conformity. *Soc Cogn Affect Neurosci* 8:756–763
649 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/22683703> [Accessed February 25,
650 2014].

651 Singh KD (2012) Which “neural activity” do you mean? fMRI, MEG, oscillations and
652 neurotransmitters. *Neuroimage* 62:1121–1130 Available at:
653 <http://www.ncbi.nlm.nih.gov/pubmed/22248578> [Accessed May 22, 2013].

654 Spielberger CD, Gorsuch RL, Lushene RE (1970) *The State-Trait Anxiety Inventory.*
655 *MANUAL*:1–23.

656 Tadel F, Baillet S, Mosher JC, Pantazis D, Leahy RM (2011) Brainstorm: a user-friendly
657 application for MEG/EEG analysis. *Comput Intell Neurosci* 2011:879716 Available at:
658 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3090754&tool=pmcentrez&ren
659 dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3090754&tool=pmcentrez&rendertype=abstract) [Accessed September 16, 2013].

660 Talmi D, Fuentemilla L, Litvak V, Duzel E, Dolan RJ (2012) An MEG signature corresponding
661 to an axiomatic model of reward prediction error. *Neuroimage* 59:635–645 Available at:

662 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3200436&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3200436&tool=pmcentrez&rendertype=abstract)
663 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3200436&tool=pmcentrez&rendertype=abstract) [Accessed November 5, 2012].

664 Taulu S, Hari R (2009) Removal of magnetoencephalographic artifacts with temporal signal-
665 space separation: demonstration with single-trial auditory-evoked responses. *Hum Brain*
666 *Mapp* 30:1524–1534 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/18661502>
667 [Accessed October 7, 2013].

668 Thomas J, Vanni-Mercier G, Dreher J-C (2013) Neural dynamics of reward probability coding: a
669 Magnetoencephalographic study in humans. *Front Neurosci* 7:214 Available at:
670 [http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3831091&tool=pmcentrez&ren](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3831091&tool=pmcentrez&rendertype=abstract)
671 [dertype=abstract](http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=3831091&tool=pmcentrez&rendertype=abstract) [Accessed January 23, 2014].

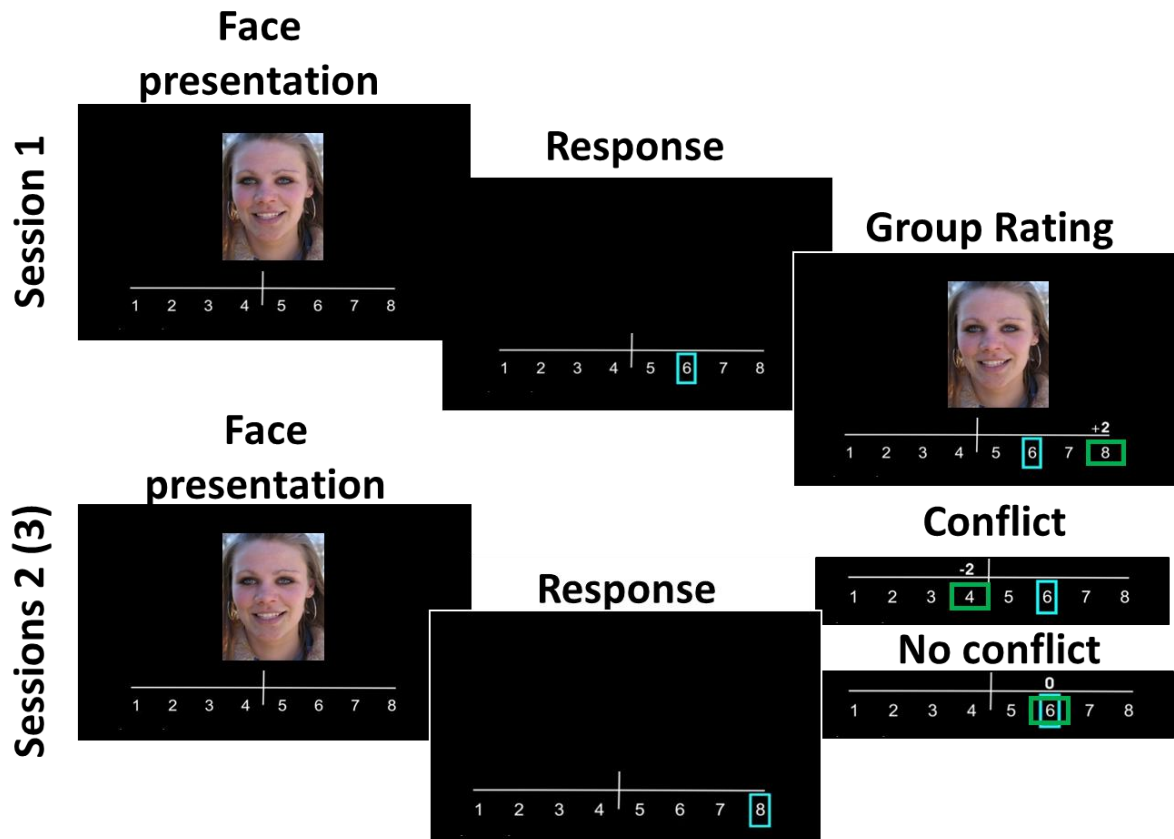
672 Van de Vijver I, Ridderinkhof KR, Cohen MX (2011) Frontal oscillatory dynamics predict
673 feedback learning and action adjustment. *J Cogn Neurosci* 23:4106–4121 Available at:
674 <http://www.ncbi.nlm.nih.gov/pubmed/21812570>.

675 Walsh MM, Anderson JR (2012) Learning from experience: event-related potential correlates of
676 reward processing, neural adaptation, and behavioral choice. *Neurosci Biobehav Rev*
677 36:1870–1884 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/22683741> [Accessed
678 November 4, 2012].

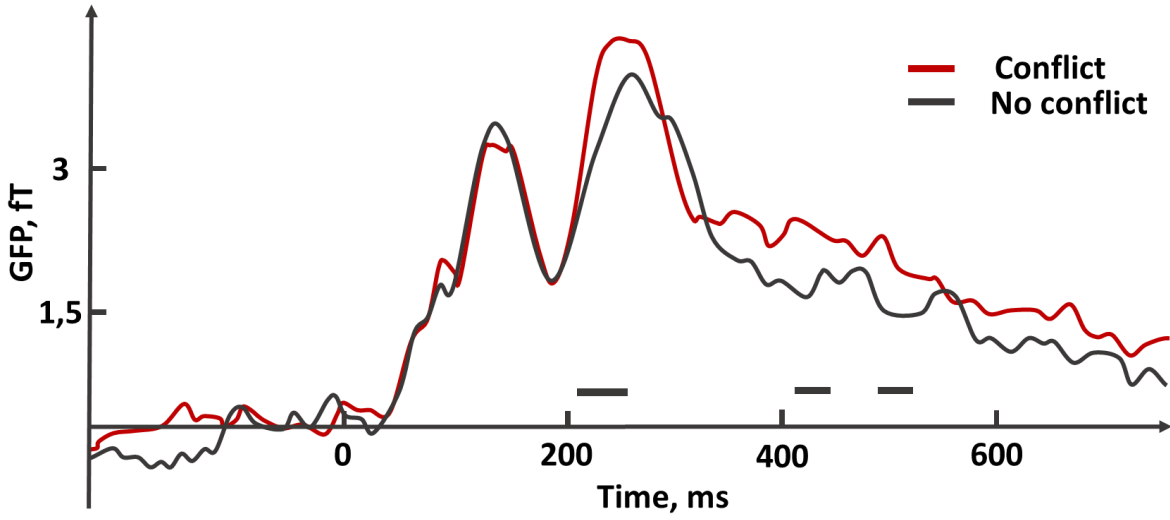
679 Walton ME, Behrens TEJ, Noonan MP, Rushworth MFS (2011) Giving credit where credit is
680 due: orbitofrontal cortex and valuation in an uncertain world. *Ann N Y Acad Sci* 1239:14–
681 24 Available at: <http://www.ncbi.nlm.nih.gov/pubmed/22145871> [Accessed February 3,
682 2014].

683 Winterer G, Carver FW, Musso F, Mattay V, Weinberger DR, Coppola R (2007) Complex
684 relationship between BOLD signal and synchronization/desynchronization of human brain

685 MEG oscillations. Hum Brain Mapp 28:805–816 Available at:
 686 <http://www.ncbi.nlm.nih.gov/pubmed/17133396> [Accessed January 23, 2014].
 687 Zaki J, Schirmer J, Mitchell JP (2011) Social influence modulates the neural computation of
 688 value. Psychol Sci 22:894–900 Available at:
 689 <http://www.ncbi.nlm.nih.gov/pubmed/21653908> [Accessed January 21, 2014].



690
 691 **Figure 1.** Behavioral task and behavioral results. **A.** The sequence of the events within a trial is
 692 shown. During the first session, subjects rated the trustworthiness of female faces and were
 693 subsequently presented with the group ratings that could be similar (no-conflict with group
 694 ratings), below or above (as is shown in the figure) subjects' rating (conflict with group ratings).
 695 Thirty minutes after the first session subjects rated again the same faces during the second
 696 session. During the third session three months later 15 out of 20 original rated the same set of
 697 faces one more time.



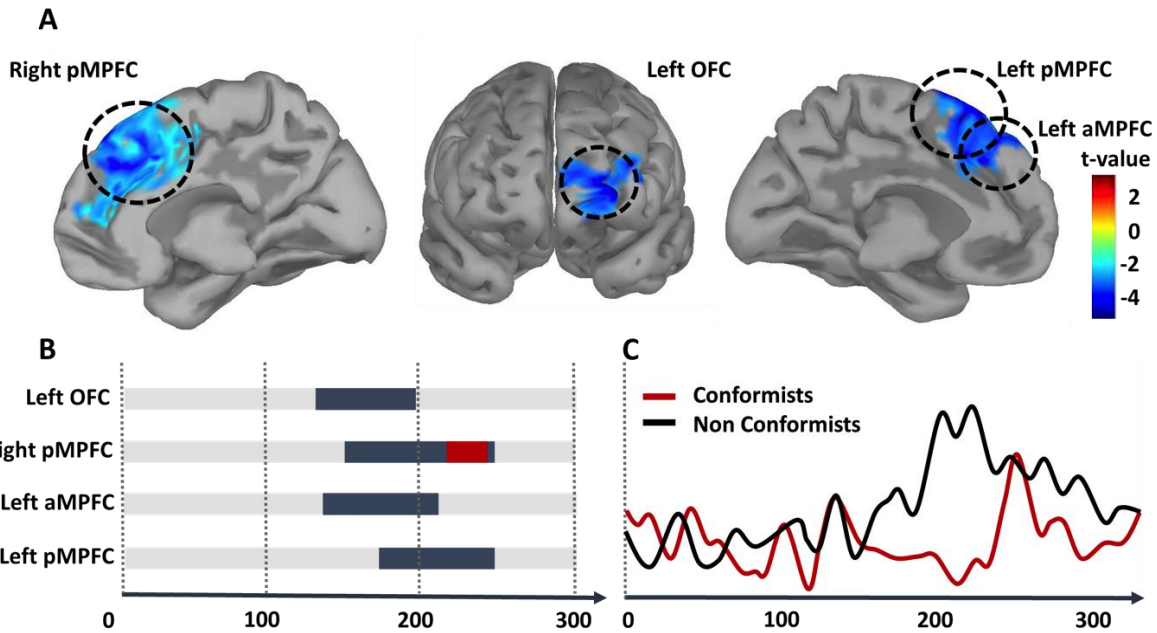
699

700 **Figure 2. A.** The GFP-RMS representation of conflict-related effects (magnetometers only).

701 Underlined areas represent time-windows, where statistically significant differences of conflict

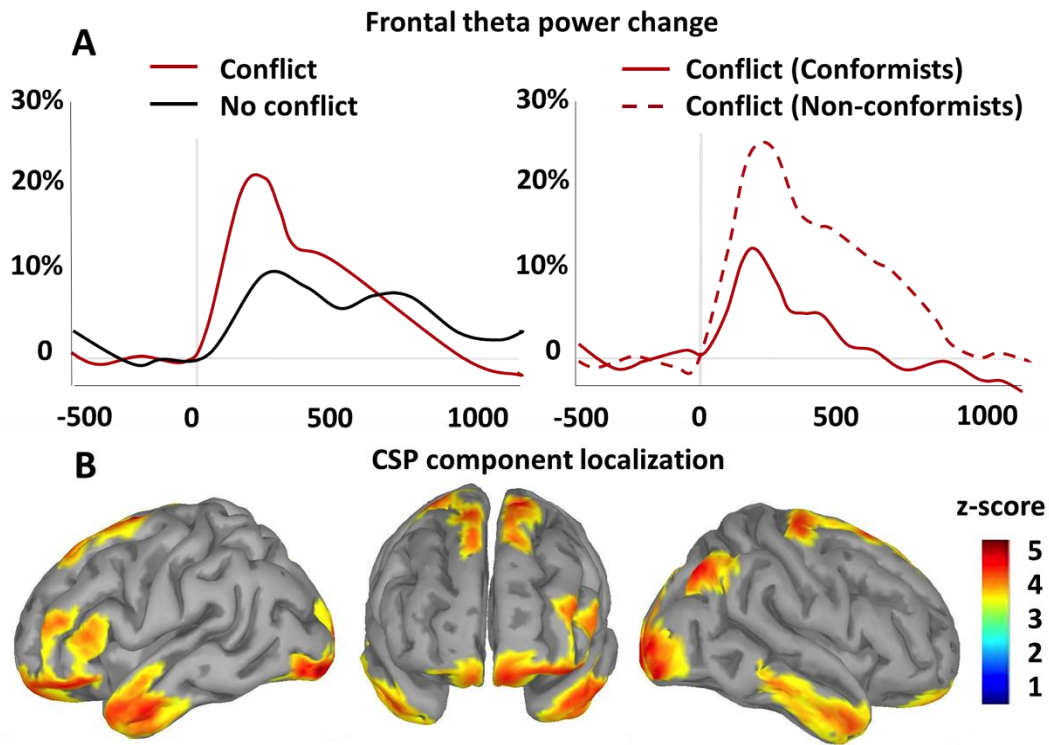
702 and no-conflict trials lasted for more than 20 ms.

703



704

705 **Figure 3.** Conflict-related effects (conflict trials vs. no-conflict trails). **A.**Results of the cluster
 706 level permutation test in MNE source space. aMPFC – anterior part of medial prefrontal cortex,
 707 pMPFC - posterior medial prefrontal cortex; OFC - orbitofrontal cortex. **B.**Time span of conflict-
 708 related activations (left). The time course of the right pMPFC activity for ‘conformist’ vs ‘non-
 709 conformist’ groups (right). *Black blocks* represent the duration of significant spatiotemporal
 710 clusters (see Table 1 for details). *Red block* overlaid over the *black block* indicate the time-
 711 window, of the significant *conformity effect* (‘conformists’ vs. ‘non-conformist’, see Table 2 for
 712 details).



713

714 **Figure 4.** Analysis of induced theta activity. **A.** Grand averaged Event-Related Synchronization
 715 (ERS) of theta activity in conflict and no-conflict trials (left) and in conflict trials between
 716 ‘conformist’ and ‘non-conformist’ groups (right) **B.** Source localization for the CSP components
 717 of induced theta conflict-related activity (conflict vs no-conflict trials) for all subjects.

718

719 Table1. The localization of the conflict-related activity (conflict trials vs. no-conflict trials) .

GFP	L/R	Structure	Cluster time window, ms	Number of vertices (unique)	Cluster mass, (t-score)	Cluster p-value , FWER
150-250 ms	Right	MPFC	152-250	246	-491	0.042*
	Right	OFC	150-194	194	366	0.063
	Left	OFC	158-196	140	-288,9	0.019*
	Left	aMPFC	160-218	74	-179,4	0.048*
	Left	pMPFC	186-248	157	-314.1	0.016*
350-500 ms	Left	pMPFC	414-442	99	212	0.082
	Left	Precentral Gyrus.	438-482	79	210	0.083
450-550 ms	Left	Frontal Superior Sulc.	482-532	94	291	0.053

720

721 Table 2 Time-windows of the conformity-related activity (within ROI determined during the
722 localization of the conflict-related activity)

L\R	ROI	Cluster time window, ms	Cluster mass (t-score)	Cluster p-value
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(FWER)

Conflict-No-conflict (difference waveform)

Left	OFC	210-224	-20.9	0.11
Right	pMPFC	216-240	-43	0.031*
Left	aMPFC	308-316	-19.25	0.14
