

1 Running head: DIMENSION-BASED ATTENTION

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3 Dimension-based attention in the recognition of facial identity and facial
4 expression

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21 Abstract

22 Although the human visual system is constantly flooded with sensory information, the brain is
23 remarkable in inferring structures from the massive inputs and selectively attending to
24 behaviorally relevant information. However, how the two processes interact remains largely
25 unknown. Can top-down attention efficiently select the task-relevant dimension (e.g. gender)
26 during face recognition to override interference in the task-irrelevant dimension (e.g.
27 expression)? To address this issue, participants were asked to classify real face images according
28 to gender or expression, which were preceded by other faces (masked priming task) or words
29 (face-word Stroop task). Results show that face classification was 1) affected by the task-relevant
30 but not the task-irrelevant dimension of the preceding faces, and 2) modulated by words
31 depicting the task-relevant but not the task-irrelevant dimension of the face. These results
32 suggest that high level dimensions such as facial expression and facial identity can serve as units
33 of attentional selection, possibly due to the late binding of the two dimensions.

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44 We are constantly bombarded by huge amounts of visual inputs. How does the brain
45 translate such overwhelming inputs into fine-tuned decisions and actions in everyday life? The
46 computational principles underlying such adaptive behaviors must rely on a divide and conquer
47 strategy to organize and interpret selective visual inputs in order to guide actions (Neisser, 1967).
48 This strategy is subserved by at least two critical processes: a perceptual grouping process to
49 parse the visual scene into elementary units (Roelfsema, 2006; Wertheimer, 1923) and a
50 selective attention process to amplify task-relevant information for further processing while
51 suppress distracting information (Desimone & Duncan, 1995; Egeth & Yantis, 1997). A
52 fundamental question in cognitive psychology is to understand the link between the two
53 processes; in other words, how efficiently can humans deploy visual attention based on different
54 organization strategies in segmenting visual scenes (e.g. organization by space, object, and
55 dimension)?

56 Organization by dimension is a ubiquitous grouping principle. For example, objects in the
57 visual environment can be represented in terms of featural dimensions such as orientation, color,
58 motion, and depth; a special category of objects—faces—can be represented in terms of semantic
59 dimensions such as identity and expression. Here I ask whether top-down attention can
60 efficiently select the task-relevant dimension (e.g. gender) during face recognition to override
61 interference in the task-irrelevant dimension (e.g. expression). This question is important for
62 theoretical and practical reasons. First, given the constraint of cognitive capacity limits,
63 characterizing the efficiency of attentional selection based on different units (e.g. space, object,
64 and dimension) is crucial to understanding the bottleneck of information processing. Second,
65 understanding the efficiency of attentional selection will provide clues as how different
66 dimensions interact (e.g. whether attentional selection of one dimension will inevitably select

67 another dimension), which is fundamental to perception and performance (Garner, 1974). Third,
68 since successful communication largely depends on the ability to reason about others' mental
69 states and act accordingly (Apperly, Samson, & Humphreys, 2005), monitoring the changes of
70 facial expression of different individuals plays a major adaptive role (Haxby, Hoffman, &
71 Gobbini, 2002). For instance, the extent to which we can attend to variation in a relevant
72 dimension (e.g. monitoring potential changes of expressions) while filtering out concurrent
73 interference within an irrelevant dimension (e.g. ignoring gender information) may be essential
74 for the survival of humans. Forth, practically, understanding the efficiency of attentional
75 selection will shed light on how to cope with distraction, which is known to be associated with
76 various types of accidents such as car and workplace accidents.

77 Despite its importance, little is known about the efficiency of top-down selection towards
78 facial identity and expression. Although units of attentional selection are known to include
79 locations (Eriksen & Eriksen, 1974; Eriksen & St. James, 1986; Eriksen & Yeh, 1985; Posner,
80 1980; Posner, Snyder, & Davidson, 1980), objects (Baylis & Driver, 1993; Duncan, 1984; Egly,
81 Driver, & Rafal, 1994), and featural dimensions such as motion and color (Chawla, Rees, &
82 Friston, 1999; Corbetta, Miezin, Dobmeyer, Shulman, & Petersen, 1990; Liu, Slotnick, Serences,
83 & Yantis, 2003; Maunsell & Treue, 2006; O'Craven, Rosen, Kwong, Treisman, & Savoy, 1997;
84 Treue & Martinez Trujillo, 1999), it remains elusive regarding the efficiency of semantic
85 dimension-based attention. First, semantic dimension-based attention cannot be explained by
86 space-based attention. This is because the configuration nature of the face determines the two
87 dimensions being *integral* in physical space and mental representation (e.g. when expression is
88 manipulated, the information that gives rise to gender is also affected). For spatially *separable*
89 dimensions, which can be manipulated independently (e.g. the nose can be edited with the eyes

90 exactly the same), the efficiency in suppressing concurrent variation and interference at other
91 locations (e.g. Hoffman & Haxby, 2000) is space-based (Posner, 1980). Second, whether
92 conclusions regarding other units of attentional selection can generalize to the recognition of real
93 facial expression and identity remains unclear. Of particular relevance here are featural
94 dimensions. For featural dimensions, previous studies suggest asymmetric selection efficiency
95 for different dimensions. For instance, while attention to the relevant dimension of either hue
96 (what we commonly referred to by the color names) or shape is effective (i.e. variation in one
97 dimension does not affect the performance on the other dimension), attention to either hue or
98 brightness is not (Garner & Felfoldy, 1970). Similarly, in a typical attention capture study, when
99 searching multidimensional displays for a salient color, the presence of an element with a unique
100 form (i.e. singleton) did *not* interfere; yet the presence of an element with a unique color did
101 interfere with visual search for a salient form (Theeuwes, 1991).

102 Object-based attention theories (Baylis & Driver, 1993; Duncan, 1984; Egly et al., 1994)
103 would predict that processing of facial expression and identity are strongly coupled and thus
104 selection based on dimension would be difficult (e.g. paying attention to identity would
105 inevitably process information from the whole face including expression). Dimension-based
106 attention accounts would predict that processing of a single dimension within an object can be
107 efficient to override interference within another dimension, even when the two dimensions are
108 spatially intertwined, analogical to low level featural dimension-based attention (Maunsell &
109 Treue, 2006). In this study, I investigate dimension-based attention in the recognition of facial
110 expression and facial identity using masked priming paradigm (Experiment 1A and 1B) and
111 face-word Stroop task (Experiment 2A and 2B). In the masked priming paradigm, in each trial
112 participants were asked to classify a face image according to either gender (male vs. female) or

113 expression (positive vs. negative in Experiment 1A; more specifically, happy vs. angry in
114 Experiment 1B), which was preceded by another brief face image. Critically, the relationship
115 between the two images in both the task-relevant and the task-irrelevant dimensions were
116 orthogonally manipulated. In the face-word Stroop task, instead of congruency effect induced
117 from a briefly exposed face image, a word depicting either the task-relevant dimension or the
118 task-irrelevant dimension of the face was used. Finding a strong congruency effect in the task-
119 relevant dimension but not the task-irrelevant dimension will support the dimension-based
120 attention hypothesis, whereas finding a strong congruency effect in both the task-relevant
121 dimension and the task-irrelevant dimension will lend support to the object-based attention
122 hypothesis.

123 Experiment 1A

124 Participants were asked to classify each probe face image (hereafter probe) according to
125 either gender (male vs. female) or expression (positive vs. negative) in different blocks by
126 pressing buttons. The probe was preceded by a brief prime face image (hereafter prime). The
127 prime and the probe were congruent in the task-relevant dimension on half of the trials (e.g. in
128 the gender task, both the prime and the probe could be male faces) and incongruent on the other
129 half (e.g. in the gender task, the prime and the probe could be a male face and a female face,
130 respectively). Congruency in the task-irrelevant dimension was orthogonally manipulated such
131 that the prime and the probe were congruent in the task-irrelevant dimension on half of the trials
132 (e.g. in the gender task, both the prime and the probe could be happy faces) and incongruent on
133 the other half (e.g. in the gender task, the prime and the probe could be a happy face and an
134 angry face, respectively).

135 Method

136 Participants. Thirty-two volunteers (16 men, 16 women) between 18 and 35 years old
137 from the University of Minnesota community participated in the experiment for course credit or
138 money. All participants in this and subsequent experiments had normal or corrected-to-normal
139 vision, and signed an Institutional Review Board approved consent form.

140 Apparatus and Stimuli. The stimuli were presented on a SONY Trinitron cathode ray tube
141 (CRT) monitor (model: CPD-G200; refresh rate: 100 Hz; resolution: 1024 × 768 pixels) using
142 the MATLAB (The Math Works Inc., Natick, MA) Psychophysics Toolbox (Brainard, 1997;
143 Pelli, 1997). Participants sat approximately 60 cm from the monitor with their heads positioned
144 in a chin rest in a dimly lit room while an experimenter was present.

145 The face images consisted of 16 grayscale frontal-view images drawn from a standard set
146 of pictures of facial affect (Ekman & Friesen, 1976). These included 8 Caucasian individuals,
147 half women and half men, depicting happy or angry expression. All images were edited using
148 Adobe Photoshop CS3 (Adobe Systems, San Jose, CA) to achieve uniform luminance and
149 contrast. To ensure that gender discrimination was done based on facial features alone, they were
150 further cropped by a uniform oval (130 by 180 pixels) that removed both the hair and the face
151 contour information while preserving the internal features of the face. Moreover, all the face
152 images were edited to be as symmetrical as possible (e.g. the two eyes were placed at proximally
153 the same distance to the nearest edge of each image), and the positions of the facial features were
154 edited to be consistent across images. Although certain facial features (e.g. the shape of the
155 mouth; happy faces tend to have open mouths while angry faces tend to have closed mouths) are
156 of particular importance for the recognition of expression, this was not controlled in experiment
157 1A and 2B (but it was controlled in 1B and 2A); such salient differences of local features in
158 different expressions should afford me a better chance to detect modulation effect of expression

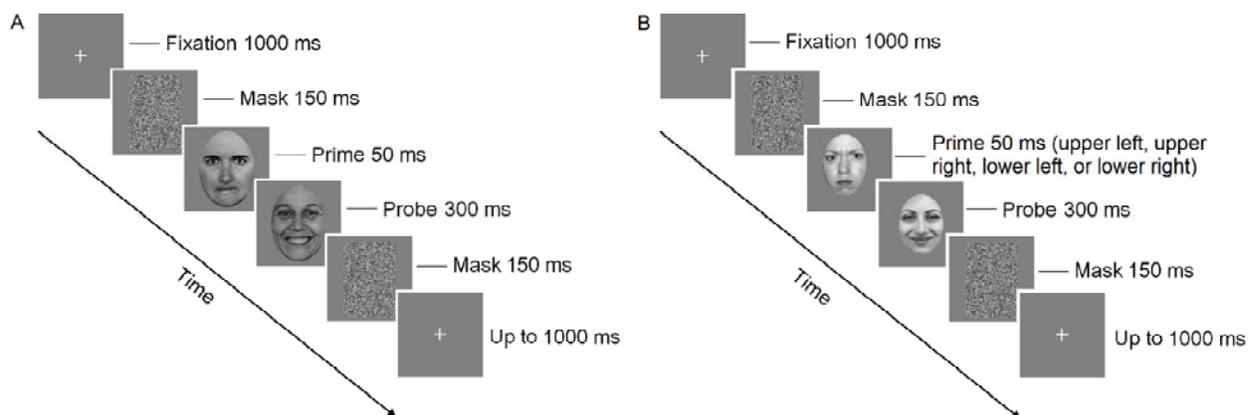
159 on gender priming, and expression priming itself. Each face image subtended roughly 5.8° high
160 and 4.1° wide at a viewing distance of 60 cm and was displayed on a uniform grey background.
161 Grayscale masks with the same size as the face image were arrangement of pixels with intensity
162 randomly varying from black to white.

163 Design and Procedure. Participants were tested in a $2 \times 2 \times 2$ within-subjects design: task
164 dimension (gender vs. expression), task-relevant congruency (congruency of the task-relevant
165 dimension between the prime and the probe: congruent vs. incongruent), and task-irrelevant
166 congruency (congruency of the task-irrelevant dimension between the prime and the probe:
167 congruent vs. incongruent). All factors were fully crossed, yielding 8 experimental conditions.
168 Task dimension was blocked (4 consecutive blocks for the gender condition and 4 for the
169 expression condition; the order was counterbalanced between participants) while task-relevant
170 congruency and task-irrelevant congruency were randomized within each block. There were four
171 images in each of the four trial types defined by the factorial combination of gender (male or
172 female) and expression (happy or angry); each prime and probe was randomly selected from one
173 of these four images with the only constraint that the prime and the probe were of different
174 individuals. Before initiating the experiment, participants viewed all the images to indicate that
175 they were able to differentiate the male part from the female part, and the happy part from the
176 angry part (this generally took around 1 to 2 minutes).

177 The experiment began with 48 practice trials in 8 blocks followed by 784 experimental
178 trials in 8 blocks, 96 trials each. As illustrated in Figure 1A, each trial began with a white
179 fixation cross (1000 ms) followed by a forward mask (150 ms), a prime (50 ms), a probe (300
180 ms), a backward mask (150 ms), and another fixation cross (until response but up to 1000 ms),
181 all at the center of the screen. To warn the upcoming of the target, a brief tone began after 500

182 ms of the first fixation cross. The trial ended as soon as a response was made, up to a limit of
 183 1450 ms after the onset of the target. A warning beep (with a 1 s pause) was given only on each
 184 incorrect response. In gender blocks, participants were asked to determine as quickly and
 185 accurately as possible whether the target was male or female (in expression blocks: positive or
 186 negative); they responded by pressing either the “q” key with one index finger or the “j” key
 187 with the other index finger (in expression blocks: either the “h” key with the index finger or the
 188 “space” key with the thumb of the dominant hand) on a standard keyboard, which terminated the
 189 display and initiated the next trial immediately. Response keys were fully counterbalanced
 190 between participants. Note that different keys and response manner were used in gender blocks
 191 (“q” key and “j” key with two hands) and expression blocks (“h” key and “space” key with the
 192 dominant hand) to minimize motor or response priming effect between tasks. The whole
 193 experiment took about 40 min.

194 In short, participants performed gender and expression tasks in different blocks, with
 195 congruency between the prime and the probe manipulated such that the prime and the probe can
 196 be congruent or incongruent in the task-relevant dimension and the task-irrelevant dimension.



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 198 Figure 1. Temporal structure of a trial in Experiment 1. (A) In Experiment 1A, at the beginning of each trial,
 199 a white fixation appeared on the screen, followed by a forward pattern mask. Then a prime face was

200 briefly presented and followed by a target probe face. The prime and probe could be of same or different
 201 gender or expression, with all the possibilities randomized across trials. Participants were asked to
 202 discriminate the probe according to either gender or expression, followed by a backward mask and a
 203 white fixation. The fixation was displayed until response or up to 1000 ms, whichever was shorter. (B) In
 204 Experiment 1B, all aspects were the same as Experiment 1A except 1) that the prime was presented
 205 randomly in the upper left, upper right, lower left, or lower right corner to prevent sensory summation; and
 206 2) that both happy faces and angry faces have closed mouths to minimize the contributions of local
 207 features. The stimuli in this illustration are not drawn to scale.

208 Results and Discussion

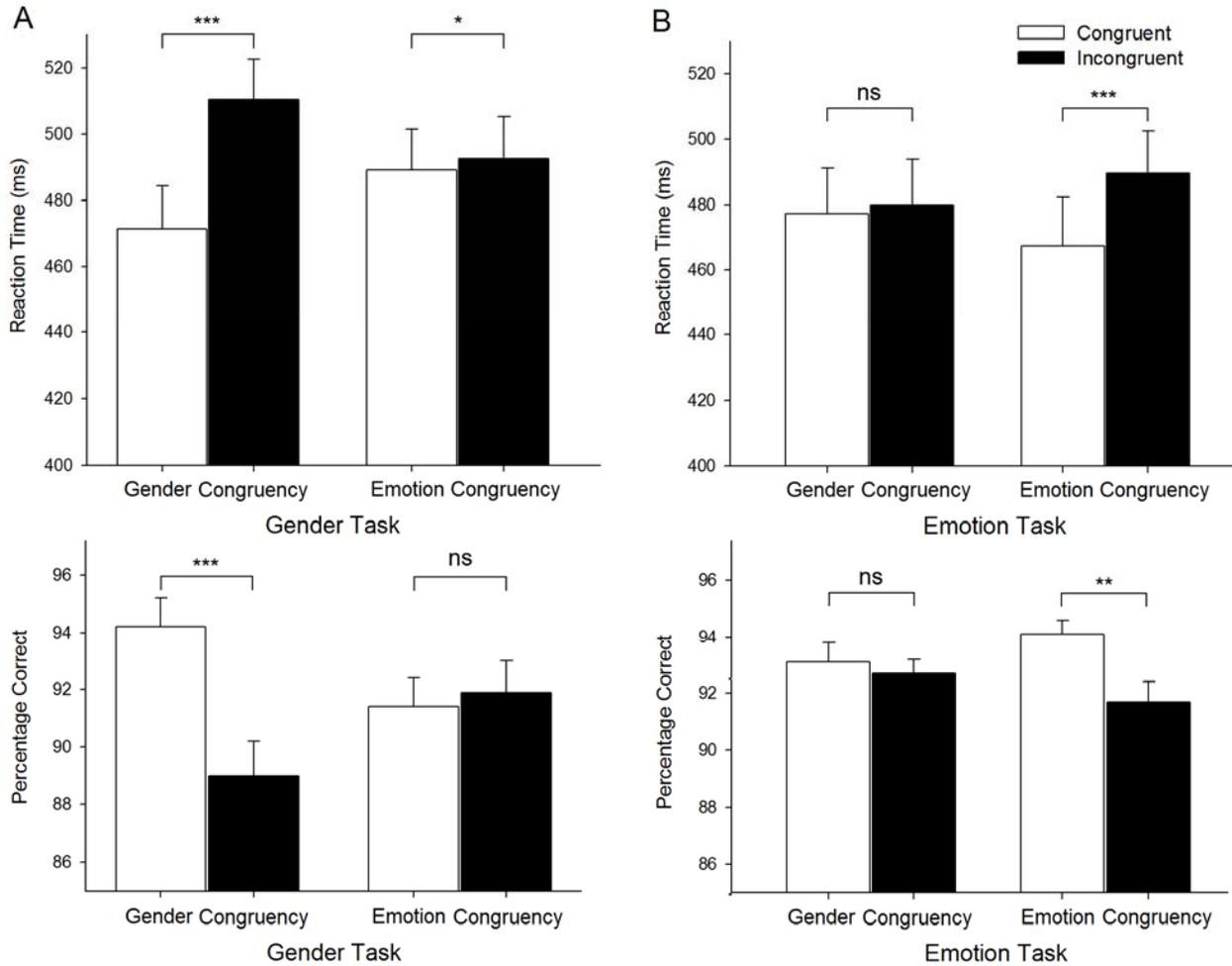
209 I ask whether gender and expression congruency between the prime and the probe affect
 210 face classification based on either the gender or expression dimension. Values with response
 211 errors or exceeding three standard deviations from the mean reaction time (RT) for each
 212 participant within each congruency condition were excluded from analysis¹. RTs and accuracies
 213 were analyzed by a $2 \times 2 \times 2$ repeated measures analysis of variance (ANOVA) on task (gender
 214 vs. expression), task-relevant congruency (congruent vs. incongruent), and task-irrelevant
 215 congruency (congruent vs. incongruent). Figure 2 shows the mean RTs and accuracy for the
 216 gender task (Figure 2A) and the expression task (Figure 2B).

217 As predicted by the dimension-based attention hypothesis, gender congruency between
 218 the prime and the probe only affected performance in the gender task (Figure 2A, upper panel,
 219 left; congruent vs. incongruent: 471.3 ms vs. 510.4 ms, $F(1,31) = 174.91$, $MSE = 48986.07$, $p <$
 220 $.001$) but not the expression task (Figure 2B, upper panel, left; congruent vs. incongruent: 477.2
 221 ms vs. 479.8 ms, $F(1,31) = 0.62$, $MSE = 224.46$, $p = .44$), resulting in a task \times gender congruency
 222 interaction ($F(1,31) = 73.33$, $MSE = 21289.36$, $p < .001$). Similarly, expression congruency
 223 affected performance in the expression task (Figure 2B, upper panel, right; congruent vs.

¹ Excluding outliers did not change the statistical patterns reported below.

224 incongruent: 467.4 ms vs. 489.6 ms, $F(1,31) = 41.03$, $MSE = 15782.43$, $p < .001$) much more
225 than the gender task (Figure 2A, upper panel, right; congruent vs. incongruent: 489.2 ms vs.
226 492.5 ms, $F(1,31) = 4.87$, $MSE = 356.65$, $p = .035$), resulting in a task \times expression congruency
227 interaction ($F(1,31) = 27.11$, $MSE = 5697.04$, $p < .001$).

228 Analysis performed on accuracy indicated similar patterns. Gender congruency between
229 the prime and the probe only affected performance in the gender task (Figure 2A, lower panel,
230 left; congruent vs. incongruent: 94.2% vs. 89.0%, $F(1,31) = 34.33$, $MSE = 862.42$, $p < .001$) but
231 not the expression task (Figure 2B, lower panel, left; congruent vs. incongruent: 93.1% vs.
232 92.7%, $F(1,31) = 0.39$, $MSE = 4.86$, $p = .54$), resulting in a task \times gender congruency interaction
233 ($F(1,31) = 22.83$, $MSE = 368.93$, $p < .001$). Similarly, expression congruency between the prime
234 and the probe affected performance in the expression task (Figure 2B, lower panel, right;
235 congruent vs. incongruent: 94.1% vs. 91.7%, $F(1,31) = 10.34$, $MSE = 180.57$, $p = .003$) but not
236 the gender task (Figure 2A, lower panel, right; congruent vs. incongruent: 91.4% vs. 91.9%,
237 $F(1,31) = 0.79$, $MSE = 6.18$, $p = .380$), resulting in a task \times expression congruency interaction
238 ($F(1,31) = 7.74$, $MSE = 126.79$, $p = .009$).



239

240 Figure 2. Mean reaction time (RT) and percentage correct as a function of congruency between the prime

241 and the probe faces in Experiment 1A. (A) Gender task: RT (upper panel, left) was significantly shorter

242 and accuracy (lower panel, left) was much higher when the prime and the probe were of same gender

243 than different genders. Although expression congruency had similar effect, the RT effect (upper panel,

244 right) was much smaller, and might be partly due to tradeoff between RT and accuracy (lower panel, right).

245 (B) Expression task: RT (upper panel, right) was significantly shorter and accuracy (lower panel, right)

246 was much higher when the prime and the probe were of same expression than different expressions.

247 There was no corresponding effect in the gender dimension either in terms of RT (upper panel, left) or

248 accuracy (lower panel, left). Error bars correspond to standard errors of means over participants. *** p

249 < .001; ** p < .005; * p < .05; ns, not significant. N = 32.

250 Overall, the present experiment showed that expression classification was affected by the
251 expression congruency effect between the prime and the probe but not affected by the gender
252 congruency between the two. Similarly, gender classification was affected much more strongly
253 by the gender congruency effect between the prime and the probe than by the emotion
254 congruency between the two. These data from masked priming provide strong support to the
255 notion that attention can efficiently select the task-relevant dimension of faces and ignore the
256 congruency effect in the task-irrelevant dimension.

257 However, note that in the gender task, expression congruency still affected gender
258 classification (Figure 2A, upper panel, right). The effect was small (3.3 ms) yet statistically
259 significant. Although such effect seems to challenge interpretation in terms of dimension-based
260 attention, this effect can be owing to the images used. In particular, since the happy and angry
261 faces in this experiment contained open and closed mouths, respectively, the effect might be due
262 to feature priming rather than expression priming. This hypothesis was tested in Experiment 1B.

263 Experiment 1B

264 Since the happy face images used in Experiment 1A contained open mouths while the
265 angry face images possessed closed mouths, it remains possible that in the expression task
266 participants relied on the shape of the mouths rather than the expression itself. Moreover, given
267 that the prime and the probe were shown on the same position on the screen, critical local
268 features such as the mouths might generate sensory summation between the prime and the probe.
269 To rule out these factors, in Experiment 1B, I used face images with closed mouths while
270 randomly presented the prime in four different corners.

271 Method

272 Thirty two volunteers (12 men, 20 women) participated in the experiment. The same
273 apparatus and stimuli were used as in Experiment 1A except as follows. To tap into processing
274 of the face itself rather than other features, as illustrated in Figure 1B, I tried to 1) reduce the
275 contributions of sensory summation in the priming effect, by displaying the prime randomly in
276 the upper left, upper right, lower left, or lower right corner of the screen, with the same center-to-
277 fixation distance of 0.5° ; 2) reduce the chances that participants performed the expression task
278 based on the shape of the mouth (e.g. discriminate whether the mouth is open or closed) rather
279 than expression itself, by including only faces with closed mouths for both happy and angry
280 expressions; and 3) make the expression task more specific by asking the participants to
281 discriminate whether the face was happy or angry (rather than positive or negative). Since some
282 of these changes could potentially decrease the priming effect, I tried to compensate in two ways:
283 1) I increased the size of the faces from 5.8° high and 4.1° wide as in Experiment 1A to 8.4° high
284 and 6.0° wide and decreased the viewing distance from 60 cm as in Experiment 1A to 40 cm to
285 make the faces more salient; and 2) I decreased the total number of trials from 48 practice and
286 784 experimental trials as in Experiment 1A to 32 practice trials (in 8 blocks) and 512
287 experimental trials (in 8 blocks).

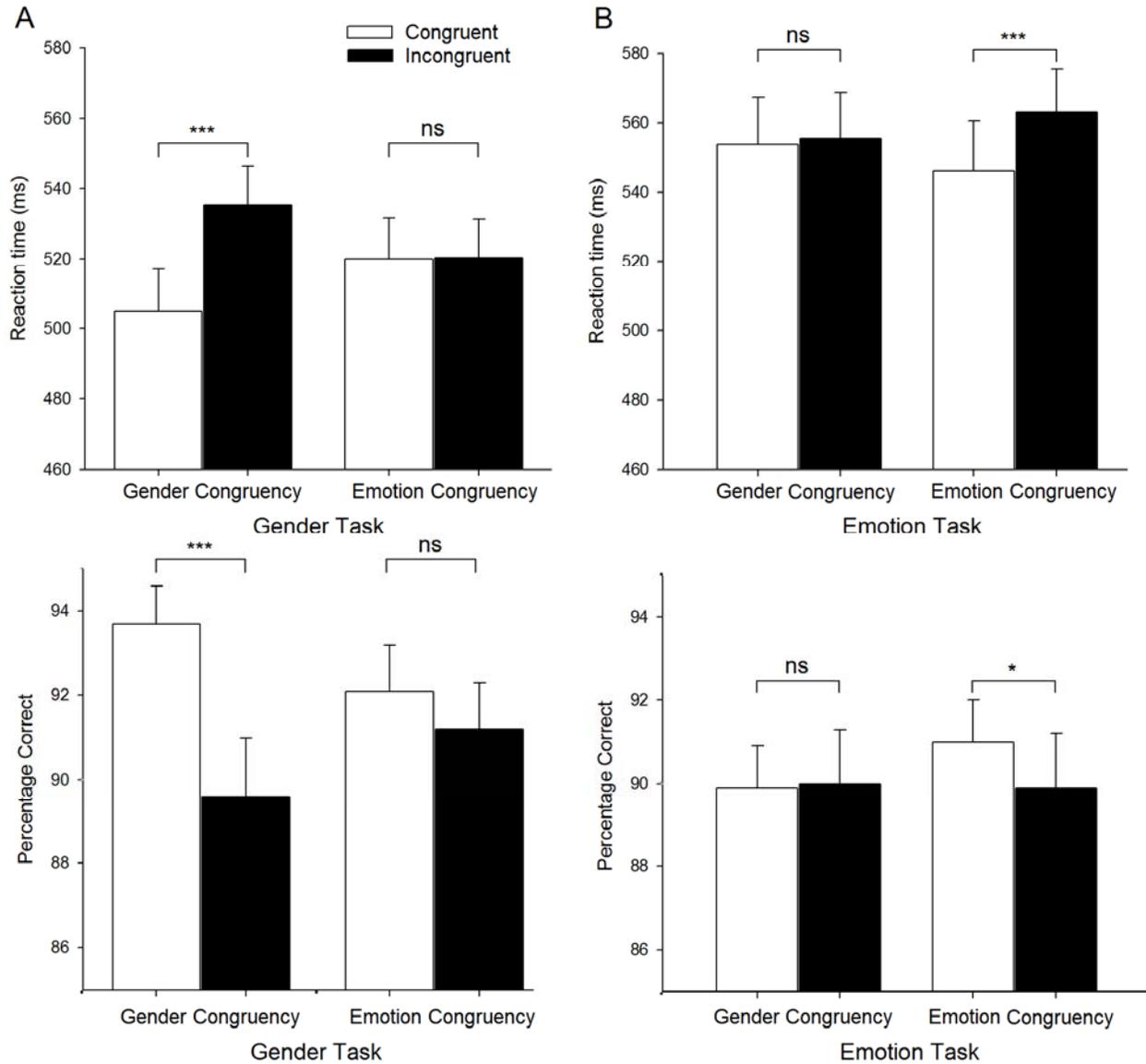
288 Results and Discussion

289 Supporting the dimension-based attention hypothesis, gender congruency between the
290 prime and the probe only affected performance in the gender task (Figure 3A, upper panel, left;
291 congruent vs. incongruent: 504.9 ms vs. 535.5 ms, $F(1,31) = 155.91$, $MSE = 29973.02$, $p < .001$)
292 but not the expression task (Figure 3B, upper panel, left; congruent vs. incongruent: 553.8 ms vs.
293 555.5 ms, $F(1,31) = 0.25$, $MSE = 98.58$, $p = .62$), resulting in a task \times gender congruency
294 interaction ($F(1,31) = 63.05$, $MSE = 13316.84$, $p < .001$). Similarly, expression congruency

295 between the prime and the probe affected performance in the expression task (Figure 3B, upper
296 panel, right; congruent vs. incongruent: 546.2 ms vs. 463.1 ms, $F(1,31) = 15.49$, $MSE = 9065.21$,
297 $p < .001$) but not the gender task (Figure 3A, upper panel, right; congruent vs. incongruent: 520.0
298 ms vs. 520.3 ms, $F(1,31) = 0.01$, $MSE = 2.56$, $p = .92$), resulting in a task \times expression
299 congruency interaction ($F(1,31) = 10.95$, $MSE = 4381.60$, $p = .002$). Thus, by reducing sensory
300 featural contributions (e.g. using faces with closed mouths and presenting the primes at four
301 different corners), the significant expression congruency effect in the gender task was now
302 nullified.

303 Analysis performed on accuracy indicated similar patterns. Gender congruency between
304 the prime and the probe only affected performance in the gender task (Figure 3A, lower panel,
305 left; congruent vs. incongruent: 93.7% vs. 89.6%, $F(1,31) = 17.58$, $MSE = 524.37$, $p < .001$) but
306 not the expression task (Figure 3A, lower panel, left; congruent vs. incongruent: 89.9% vs.
307 90.0%, $F(1,31) = 0.02$, $MSE = 0.31$, $p = .88$), resulting in a task \times gender congruency interaction
308 ($F(1,31) = 33.51$, $MSE = 275.17$, $p < .001$). Similarly, expression congruency between the prime
309 and the probe affected performance in the expression task (Figure 3A, lower panel, right;
310 congruent vs. incongruent: 91.0% vs. 88.9%, $t(31) = 1.55$, $p = .16$) but not the gender task
311 (Figure 3A, lower panel, right; congruent vs. incongruent: 92.1% vs. 91.2%, $t(31) = 1.55$, p
312 $= .13$), although the interaction between task and expression congruency was not significant
313 ($F(1,31) = 1.09$, $MSE = 18.30$, $p = .31$).

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Figure 3. Mean reaction time (RT) and percentage correct as a function of congruency between the prime face and the probe face in Experiment 1B. (A) Gender task: RT (upper panel, left) was significantly shorter and accuracy (lower panel, left) was much higher when the prime and the probe were of same gender than different genders. There was no such effect in the expression dimension either in terms of RT (upper panel, right) or accuracy (lower panel, right). (B) Expression task: RT (upper panel, right) was significantly shorter and accuracy (lower panel, right) was much higher when the prime and the probe were of same expression than different expressions. There was no corresponding effect in the gender dimension either in terms of RT (upper panel, left) or accuracy (lower panel, left). Error bars correspond to standard errors of means over participants. *** $p < .001$; ** $p < .005$; * $p < .05$; ns, not significant. $N = 32$.

325 Consistent with Experiment 1A, the present experiment confirmed that performance in
326 the expression dimension was modulated by the expression congruency but not the gender
327 congruency between the prime and the probe. Using faces with closed mouths, this experiment
328 strengthened the conclusion of Experiment 1A by further revealing that performance in the
329 gender classification depended only on the gender congruency effect between the prime and the
330 probe but not on the expression congruency between the two. Moreover, since the prime and the
331 probe in this experiment were always presented on different locations on the screen, the priming
332 effect observed could not be explained by sensory summation between two consecutive images.
333 Rather, together with Experiment 1A, these findings firmly establish the power of dimension-
334 based attention in face recognition—attention can efficiently select the task-relevant dimension
335 of faces such as gender and inhibit the congruency effect in the task-irrelevant dimension such as
336 expression. To generalize this notion, in Experiment 2A and 2B, I used a widely-used
337 paradigm—the Stroop task (Stroop, 1935).

338 Experiment 2A

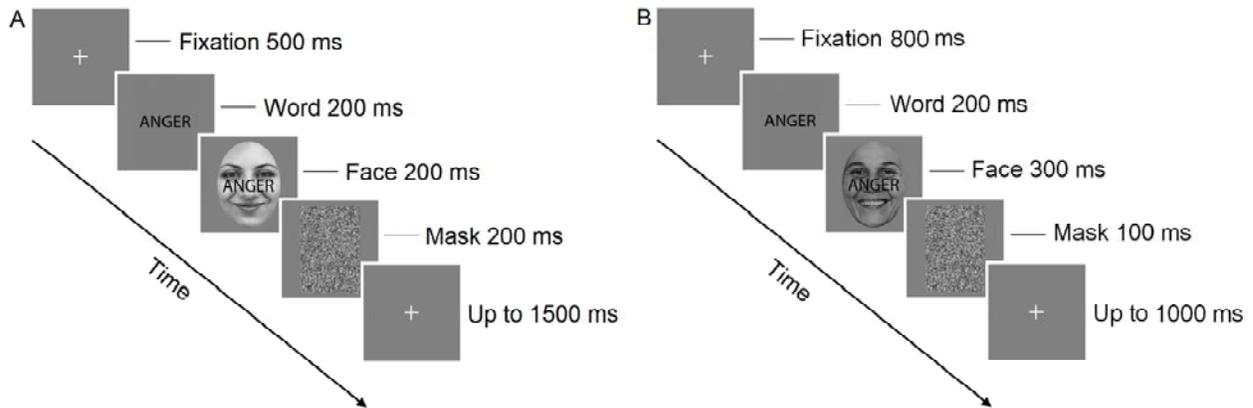
339 To generalize the conclusions of Experiment 1, I devised a face-word Stroop task based
340 on the original word-face Stroop task (Stroop, 1935), as illustrated in Figure 4. The task was
341 identical to that of Experiment 1 except that the target face was now preceded and accompanied
342 by a salient word depicting either the task-relevant dimension (i.e. “HAPPY” or “ANGER” in
343 the expression task; “MALE” or “FEMALE” in the gender task) or the task-irrelevant
344 dimension (i.e. “MALE” or “FEMALE” in the expression task; “HAPPY” or “ANGER” in the
345 gender task) without the prime.

346 Method

347 Thirty two volunteers (12 men, 20 women) participated in this experiment. The same
348 apparatus and stimuli were used as in Experiment 1B except as follows, as shown in Figure 4A:
349 1) instead of a prime face, a word, equally likely to be “HAPPY”, “ANGER”, “MALE”, or
350 “FEMALE” in 32-point red bold Arial font, led the target face; 2) the same word stayed with
351 the face and disappeared at the same time.

352 Participants were tested in a 2×4 within-subjects design: task dimension (gender vs.
353 expression) and congruency (word and task-irrelevant dimension: congruent vs. incongruent;
354 word and task-relevant dimension: congruent vs. incongruent). All factors were fully crossed,
355 yielding 8 experimental conditions. Task dimension was blocked (2 consecutive blocks for
356 gender condition and 2 for expression condition; the order was counterbalanced between
357 participants); congruency was randomized within each block (64 trials each). There were four
358 images in each of sixteen trial types defined by the factorial combination of gender (male or
359 female), expression (happy or angry), and word (“HAPPY”, “ANGER”, “MALE”, or
360 “FEMALE”); each face was randomly selected from one of the four images.

361 The experiment began with 16 practice trials (in 4 blocks) followed by 256 experimental
362 trials (in 4 blocks). Each trial began with a white fixation cross (500 ms) followed by a word
363 (200 ms), a target face with a word (the same as the preceding word) superimposed on it (200
364 ms), a backward mask (200 ms), and another fixation cross (until response but up to 1500 ms),
365 all of which were presented at the center of the screen. Participants were asked to discriminate
366 the faces only; the words were always task-irrelevant. Other aspects of the procedure including
367 response mappings were exactly the same as used in Experiment 1B.



368

369 Figure 4. Temporal structure of a trial in Experiment 2. (A) In Experiment 2A, participants were asked to
 370 discriminate the face according to either gender or expression. The word preceding the face was always
 371 the same as the word on the face, which could be the same as or different from the face in either the
 372 task-irrelevant or the task-relevant dimension (i.e. in both the gender and expression tasks, the word
 373 could equally be “HAPPY”, “ANGER”, “MALE” or “FEMALE”); (2) In Experiment 2B, all aspects were the
 374 same as Experiment 2A except that 1) the word could be the same as or different from the face in the
 375 task-irrelevant dimension only (e.g. in the gender task, the word was either “HAPPY” or “ANGER”; in the
 376 expression task, the word was either “MALE” or “FEMALE”); and that 2) temporal parameters were
 377 changed. The stimuli in this illustration are not drawn to scale; in the experiments, the word was in red
 378 rather than in black.

379 Results and Discussion

380 Performance of face classification was expected to be modulated by the word only when
 381 the word depicted the task-relevant dimension of the face. Table 1 confirms this. In the gender
 382 task, as shown in the upper left of Table 1, RTs in the gender congruent condition was
 383 significantly faster than those in the gender incongruent condition (congruent, 523.4 ms;
 384 incongruent, 544.2 ms; $t(15) = -2.71, p = .01$); however, there was no difference between the
 385 expression congruent condition and the expression incongruent condition (lower left: congruent,
 386 528.8 ms; incongruent, 531.8 ms; $t(15) = -0.42, p = .68$). Similarly, in the expression task, as
 387 shown in the lower right of Table 1, RTs in the expression congruent condition was much faster

388 than those in the expression incongruent condition (congruent, 585.8 ms; incongruent, 604.6 ms;
 389 $t(15) = -2.40, p = .02$); however, RTs in the gender congruent condition was similar to those in
 390 the gender incongruent condition (upper right: congruent, 613.2 ms; incongruent, 616.0 ms; $t(15)$
 391 $= -0.38, p = .71$). Analysis performed on accuracy reveals similar conclusions: in the gender task,
 392 accuracy was higher in the gender congruent condition than that in the gender incongruent
 393 condition (upper left: congruent, 93.5%; incongruent, 87.7%; $t(15) = 3.71, p = .001$), consistent
 394 with the RTs data in the gender task. However, accuracy was even lower in the expression
 395 congruent condition than that in the expression incongruent condition (lower left: congruent,
 396 92.2%; incongruent, 94.5%; $t(15) = -2.06, p = .048$), indicating that the insignificant expression
 397 congruency effect in the gender task was not due to RT-accuracy trade-off. Other contrasts were
 398 not significant. Taken together, face classification was modulated by words depicting the task-
 399 relevant dimension but not by words depicting the task-irrelevant dimension.

400

401 Table 1. Mean reaction times (RT) and percentage correct rates (% C) for gender and expression
 402 tasks as a function of congruency in the task-relevant and the task-irrelevant dimensions in
 403 Experiment 2A (standard errors of means in parentheses; t tests two-tailed; N = 32)

Congruency	Task			
	Gender		Emotion	
	RT (ms)	C %	RT (ms)	C %
Gender				
Congruent	523.4 (23.6)	93.5 (1.2)	613.2 (23.5)	87.0 (1.3)
Incongruent	544.2 (22.1)	87.7 (1.7)	616.0 (22.5)	89.2 (1.4)
$t(15)$	-2.71	3.71	-0.38	-1.27

p	.01	.001	.71	.22
Emotion				
Congruent	528.8 (20.4)	92.2 (1.4)	585.8 (24.0)	89.5 (1.2)
Incongruent	531.8 (20.8)	94.5 (1.1)	604.6 (23.5)	89.3 (1.3)
t(15)	-0.42	-2.06	-2.40	0.13
p	.68	.048	.02	.90

404

405 These findings thus extend evidence from masked priming task to Stroop task. In
406 particular, by using salient words presented ahead of the target face, this experiment assures that
407 the word was fully processed; yet similar null effect of cross-dimensional interference was found
408 as in Experiment 1. Together with Experiment 1, these results further confirm the dimension-
409 based attention hypothesis: humans are able to focus their attention on one particular dimension
410 of faces such that concurrent conflict in other dimensions won't affect the processing of that
411 particular dimension. Since the words could predict the wrong motor response (e.g. in the gender
412 task, a "MALE" word with a female face), participants might develop a mindset to actively
413 inhibit the words. Thus, one might argue that such inhibition strategy may explain why the task-
414 irrelevant words did not influence the classification of the face. To provide a stronger test of the
415 dimension-based attention hypothesis, in Experiment 2B the words were totally task-irrelevant.

416

Experiment 2B

417 To generalize the conclusions of Experiment 2A, I created a situation where the words
418 were not actively inhibited by using words that depict only the task-irrelevant dimension (i.e.
419 "HAPPY" or "ANGER" in the gender task; "MALE" or "FEMALE" in the expression task), as

420 illustrated in Figure 4B. This afforded me a better chance to detect the influence of the word on
421 the face, if such effect did exist.

422 Method

423 Sixteen volunteers (7 men, 9 women) participated in this experiment. The same apparatus
424 and stimuli were used as in Experiment 2A except as follows, as illustrated in Figure 4B: 1)
425 within each block, the word (in prominent red letters in 27-point Arial font) depicted only the
426 task-irrelevant dimension of the face (i.e. ‘‘HAPPY’’ or ‘‘ANGER’’ in the gender task; ‘‘MALE’’
427 or ‘‘FEMALE’’ in the expression task); 2) trial number was increased to 48 practice trials (in 8
428 blocks) and 784 experimental trials (in 8 blocks); 3) temporal parameters were changed using
429 800 ms fixation, 200 ms word, 300 ms face, 100 ms mask, and up to 1000 ms response time. In
430 short, the main difference is that now participants were tested in a 2×2 within-subjects design:
431 task dimension (gender vs. expression) and congruency (word and task-irrelevant dimension:
432 congruent vs. incongruent).

433 Results and Discussion

434 Performance in face classification was expected not to be modulated by the congruency
435 effect between the face and the word depicting the task-irrelevant dimension of the face. Table 2
436 confirms this. In the gender task (Table 2 left), RTs in the expression congruent condition was
437 similar to those in the expression incongruent condition (congruent, 482.9 ms; incongruent,
438 483.8 ms; $t(15) = -0.29$, $p = .77$). Similarly, in the expression task (Table 2 right), RTs in the
439 gender congruent condition did not differ from those in the gender incongruent condition
440 (congruent, 467.8 ms; incongruent, 467.5 ms; $t(15) = 0.16$, $p = .88$). Analysis performed on
441 accuracy reveals no significant contrasts (gender task: $t(15) = 0.55$, $p = .59$; expression task: $t(15)$

442 = 0.83, $p = .42$), indicating that the insignificant RTs effects were not due to trade-off between
 443 RTs and accuracy.

444

445 Table 2. Mean reaction times (RT) and percentage correct rates (% C) for the gender and
 446 expression tasks as a function of congruency in the task-irrelevant dimensions in Experiment 2B
 447 (standard errors of means in parentheses; $N = 16$)

Measure	Gender task		Expression task	
	Expression congruent	Expression incongruent	Gender congruent	Gender incongruent
RT (ms)	482.9 (20.7)	483.8 (21.1)	467.8 (18.4)	467.5 (18.3)
% C	92.5 (1.1)	92.9 (1.1)	93.5 (0.7)	92.9 (0.9)

448

449 Strengthening the findings of Experiment 2A, the present experiment confirmed that face
 450 classification was not modulated by the task-irrelevant words, even when the words were 1)
 451 perceptually salient, 2) presented ahead of the face, and 3) totally task-irrelevant so that active
 452 inhibition is unnecessary. Results from the four experiments reveal the existence of dimension-
 453 based attention—attention can efficiently select the task-relevant dimension of faces such as
 454 gender and inhibit the congruency effect in the task-irrelevant dimension such as expression.

455

General Discussion

456 This study sought to examine the efficiency of top-down attention in selecting the task-
 457 relevant dimension during face recognition to override interference in the task-irrelevant
 458 dimension. The current findings show that, in masked priming, gender classification and
 459 expression classification are affected by gender congruency and expression congruency between

460 the prime and the probe, respectively, but not the other way around (Experiment 1A and 1B).
461 Such dimension-based attention effect is not due to sensory summation between the prime and
462 the probe, nor is it owing to priming effect from local features such as mouths (Experiment 1B).
463 Moreover, this effect can be extended to word-face Stroop interference (Experiment 2A and 2B),
464 with performance of face classification modulated by words depicting the task-relevant
465 dimension but not the task-irrelevant dimension of the face (Experiment 2A), even when the
466 words are not actively inhibited (Experiment 2B). The present findings thus demonstrate that
467 attention selection towards a specific dimension in face images can be efficient even though task-
468 relevant and task-irrelevant dimensions are spatially intertwined within the same images.

469 This effect found in high-level dimensions (i.e. facial expression and facial identity) is in
470 line with feature-based attention theories, although these theories are advocated to deal with low-
471 level features such as motion and orientation (Maunsell & Treue, 2006; Treue & Katzner, 2007).
472 For example, a hallmark of feature-based attention is that attending to a feature (e.g. motion
473 direction) globally enhances the responsiveness of neurons that prefer that feature, including
474 even those whose respective fields are outside of the attentive locations. Such global spread of
475 feature-based attention has been established in monkey neurophysiological recordings (for a
476 review, see Maunsell & Treue, 2006), behavioral tests (Katzner, Busse, & Treue, 2006; Saenz,
477 Buracas, & Boynton, 2003; Tzvetanov, Womelsdorf, Niebergall, & Treue, 2006) and brain
478 imaging studies (Liu, Larsson, & Carrasco, 2007; Saenz, Buracas, & Boynton, 2002; Serences &
479 Boynton, 2007). Consistent with this line of research, the current study demonstrate a location-
480 independent property of dimension-based attention, as the two dimensions—facial identity and
481 facial expression—are spatially overlapping. More generally, in parallel with the spatial attention
482 tradition, with the spotlight metaphor and the zoom lens models suggesting locations as units of

483 attentional selection (Eriksen & Eriksen, 1974; Eriksen & St. James, 1986; Eriksen & Yeh, 1985;
484 Posner, 1980; Posner et al., 1980), and the object-based attention theories (Baylis & Driver, 1993;
485 Duncan, 1984; Egly et al., 1994; O'Craven, Downing, & Kanwisher, 1999; Roelfsema, Lamme,
486 & Spekreijse, 1998; Scholl, 2001), these findings make a strong case for the role of dimension in
487 selective attention.

488 Besides the implications for attentional selection, results from this study provide some
489 clues regarding the neural mechanisms of face recognition. In particular, although it is widely
490 accepted that recognition of facial identity and facial expression involves distinct functional
491 (Bruce & Young, 1986) and neural (Haxby, Hoffman, & Gobbini, 2000) routes, yet at what level
492 of analysis does the identity route bifurcate from the expression route remains strongly debated.
493 Specifically, on the one hand, dominant conceptualization and empirical investigations suggest
494 that the functional (Bruce & Young, 1986) and neural (Haxby et al., 2000) routes in the
495 recognition of facial identity and facial expression are distinct and parallel, with the dissociation
496 occurring immediately after the structural encoding stage with distinct visual representations
497 afterwards. On the other hand, such strong independence proposal has been recently challenged
498 by image-based analysis techniques such as principal components analysis (Calder & Young,
499 2005), which proposes that the dissociation between facial expression and identity is 1) late,
500 occurring after a common representation of both identity and expression, and 2) partial, with
501 some dimensions (principal components) coding both identity and expression. The current
502 findings favor the early dissociation account. In the masked priming tasks, significant priming
503 effect was observed in both the gender and expression tasks, but such priming effect was not
504 modulated by the congruency of the task-irrelevant dimension (i.e. expression congruency in the
505 gender task and gender congruency in the expression task).

506 That expression and identity can serve as units of attentional selection suggest that
507 binding of gender and expression occurs in a later stage of information processing because a
508 strong early coupling would lead to an object-based attentional selection, which is not the case in
509 this study. More generally, with 50 ms primes, these are unlikely to be subliminal (although
510 participants were not formally tested about the visibility of the primes, a majority of them
511 reported seeing “something” before the probe and some could even tell that the prime was a face),
512 suggesting that strong binding of facial identity and expression does not necessarily occur under
513 limited aware condition (for an argument of binding without awareness, see Lin & He,
514 submitted). More convincing evidence can be obtained by monkey neurophysiological
515 recordings using similar paradigms.

516 In this study, natural face images rather than schematic face images were used for two
517 reasons: 1) an ultimate goal of vision science is to understand how humans perform natural tasks
518 with natural images (Yuille & Kersten, 2006), and 2) knowledge gained from artificial,
519 parametric stimuli may not generalize to natural stimuli (Felsen & Dan, 2005). This study thus
520 bears strong ecological grounds in predicting face recognition in real life situations. In particular,
521 a high-level dimension-based attention would predict that in real life we can efficiently monitor
522 the changes of facial emotion, which is important for social interaction, while filtering out
523 concurrent interference within facial identity. It will be interesting to know the costs of such
524 dimension-based attention such as to miss important identity information while monitoring
525 expression information, which can be addressed using change blindness paradigms (Rensink,
526 O'Regan, & Clark, 1997; Simons & Levin, 1997; Simons & Rensink, 2005).

527 In sum, by using masked priming tasks and face-word Stroop tasks, I demonstrated that
528 high-level dimensions such as facial expression and facial identity can serve as units of

529 attentional selection, and that such selection can be so efficient that concurrent interference
530 within another spatially overlapping dimension can be filtered out. Together with studies from
531 feature-based attention, these results suggest that dimension is a useful concept in visual
532 attention research by unifying low level dimensions such as motion, color, and orientation, and
533 high level dimensions such as facial expression and facial identity in the framework of
534 dimension-based attention.

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