

1 **Integration of motion energy from overlapping random background noise increases**
2 **perceived speed of coherently moving stimuli**

3
4
5 Jason Chuang, Emily C. Ausloos, Courtney A. Schwebach and Xin Huang

6
7 Department of Neuroscience, School of Medical and Public Health, McPherson Eye
8 Research Institute, University of Wisconsin-Madison, Madison, WI 53705, USA.

9
10
11
12 *Key words:* speed perception, visual motion processing, neural coding, segmentation,
13 spatiotemporal frequency, center-surround interaction, stereoscopic depth, color cue

14
15 *Running title:* Effects of random motion noise on perceived speed

16
17 *Correspondence should be addressed to:*

18 Xin Huang

19 Department of Neuroscience

20 University of Wisconsin - Madison

21 1111 Highland Ave.

22 Room 5505, WIMR-II

23 Madison, WI 53705, USA

24 Email: Xin.Huang@wisc.edu

25
Number of pages: 24

Number of Figures: 12

Number of words: Abstract (248), New & Noteworthy (75), Introduction (662),
Discussion (1,973)

Conflict of interest: The authors declare no competing financial interests.

26

Acknowledgement:

We thank Jennifer Gaudio Carson and Yingjie Zhou for technical assistance, Jianbo Xiao for assistance with data analysis, Dan Yee and David Markovitch for electronics. This research was supported by National Institutes of Health Grant R01EY022443.

27

28

29

30
31
32
33
34
35
36
37
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60
61
62
63
64
65
66
67
68
69
70
71
72
73
74
75

Abstract

The perception of visual motion can be profoundly influenced by visual context. To gain insight into how the visual system represents motion speed, we investigated how a background-stimulus that did not move in a net direction influenced the perceived speed of a center-stimulus. Visual stimuli were two overlapping random-dot patterns. The center-stimulus moved coherently in a fixed direction, whereas the background-stimulus moved randomly. We found that human subjects perceived the speed of the center-stimulus to be significantly faster than its veridical speed when the background contained motion noise. Interestingly, the perceived speed was tuned to the noise level of the background. When the speed of the center-stimulus was low, the highest perceived speed was reached when the background had a low level of motion noise. As the center speed increased, the peak perceived speed was reached at a progressively higher background noise level. The effect of speed overestimation required the center-stimulus to overlap with the background. Increasing the background size within a certain range enhanced the effect, suggesting spatial integration. The speed overestimation was significantly reduced or abolished when the center-stimulus and the background-stimulus had different colors, or when they were placed at different depths. When the center- and background-stimuli were perceptually separable, speed overestimation was correlated with perceptual similarity between the center- and background-stimuli. These results suggest that integration of motion energy from random motion noise has a significant impact on speed perception. Our findings put new constraints on models regarding the neural basis of speed perception.

New & Noteworthy

We found that random motion noise in a background-stimulus significantly increased the perceived speed of an overlapping center-stimulus, and the speed overestimation was tuned to the background noise level. Experimental characterizations suggest that the speed overestimation is due to integration of motion energies from center-stimulus and random background noise, and is reduced by visual segmentation cues. Our results reveal a new speed illusion and have implications on neural mechanisms underlying the perception of motion speed.

76 **Introduction**

77

78 The perception of visual motion is crucial for humans to interpret visual scenes
79 and to interact with our environment. The neural substrates underlying visual motion
80 processing have been studied extensively in primates. The velocity of a moving stimulus
81 contains a direction vector and a speed scalar. The neural mechanisms underlying
82 direction perception and the neural code for direction are fairly well understood (e.g.
83 Salzman et al., 1990; Kohn and Movshon, 2004). However, the neural mechanisms
84 underlying speed perception are less clear. To gain a better understanding of the neural
85 mechanisms underlying speed perception, we conducted human psychophysics
86 experiments to investigate how the perception of motion speed is influenced by visual
87 context.

88

89 The perceived speed of a moving stimulus can be profoundly influenced by the
90 context of visual scenes (Walker and Powell, 1974; Tynan and Sekuler, 1975). For
91 example, when two target dots move at the same speed against a background of smaller
92 dots which have a speed gradient and move in the same direction as the target dots, the
93 two target dots appear to move at different speeds. The target dot that is moving faster
94 than its surrounding background dots is perceived to be faster than the target dot that is
95 moving slower than its surrounding dots (Loomis and Nakayama, 1973). In another
96 example, when two overlapping random-dot patterns moving transparently in opposite
97 directions, the perceived speed of one motion component is significantly faster than its
98 veridical speed (De Bruyn and Orban, 1999; Krekelberg and van Wezel, 2013).
99 Moreover, the perceived speed of a random-dot pattern moving within a circular aperture
100 is influenced by motions in the surrounding region. When the speed of motion in the
101 surround was increased, the perceived speed of the center stimulus was decreased
102 regardless of the motion direction of the surround (Norman et al., 1996). In these studies,
103 the visual context also moved in a specific direction and at a specific speed. These effects
104 of visual context on the perceived speed may be explained as the results of interactions
105 between different neural channels that are tuned to different motion directions and/or
106 speeds. The effect of visual context on the perceived speed of a target stimulus is still
107 unclear if the visual context only contains motion noise and does not move in a specific
108 direction, nor at a specific speed.

109

110 It has been suggested that the motion coherence of a random-dot stimulus can
111 influence the perceived speed of the visual stimulus (Edwards and Grainger, 2006;
112 Benton and Curran, 2009). However, the previous results regarding the effects of motion
113 coherence, in other words "motion noise", on perceived speed are mixed. A reduction of
114 motion coherence (i.e. an increase in motion noise) has been shown to reduce (Freeman
115 and Sumnall, 2002; Benton and Curran, 2009), to increase (Edwards and Grainger, 2006),
116 or to have no effect (Zanker and Braddick, 1999) on the perceived speed. In these
117 previous studies, the change of motion coherence simultaneously increased the noise
118 level and reduced the signal strength of the same visual stimulus. It remains to be
119 determined whether, and if so, how the noise level of visual context influences the
120 perceived speed of a target stimulus.

121

122 In this study, we characterized how random motion noise in a background-
123 stimulus influenced the perceived speed of an overlapping center-stimulus that moved
124 coherently. We found that the perceived speed of the center stimulus increased
125 significantly when the background contained random motion noise. We also showed for
126 the first time that the perceived speed of a center-stimulus is *tuned to* the level of the
127 background noise, and the tuning changed systematically with the speed of the center-
128 stimulus. We conducted a series of experiments to characterize factors that influenced the
129 speed overestimation. Our findings suggest that the speed overestimation is caused by
130 integration of motion energies from overlapping center- and background-stimuli. Our
131 results provide new constraints on models regarding the neural mechanisms underlying
132 speed perception, and motivate future neurophysiological experiments to elucidate the
133 nature of the neural code for speed.

134

135

136

137 **Materials and Methods**

138

139 *Apparatus*

140

Visual stimuli were generated by a Linux workstation using an OpenGL application and displayed on a 19" CRT monitor. The monitor had a resolution of 1,024 x 768 pixels and a refresh rate of 100 Hz. The output of the video monitor was measured with a photometer (LS-110, Minolta) and was gamma corrected. Stimulus presentation was controlled by a data acquisition and stimulus control program called "Maestro" (<https://sites.google.com/a/srscicomp.com/maestro>). The experimental control computer communicated with the stimulus presentation computer via a dedicated Ethernet link. Subjects viewed the visual stimuli in a dark room with a dim background illumination. The viewing distance was 57 cm. A chin rest and a forehead support were used to restrict head movements of the observers.

141 *Subjects*

142

143

144

145

146

147

148

149

150

151

152

153

154

155

156

157

158

Visual Stimuli

Visual stimuli used in the first (i.e. the main) experiment are described below. Visual stimuli used in other experiments were variations of those used in the main experiment and are described together with the experimental procedures in the next section and in Results. In the main experiment, the "Test" stimulus was composed of two

159 circular and concentric random-dot patches. The "center-patch" had a diameter of 5° ,
160 whereas the "background-patch" had a diameter of 7° . The center-patch overlapped with
161 the center region of the background-patch (Fig. 1A). The random-dots were achromatic.
162 Each random dot was 3-pixel (i.e. 0.114°) at a side and had a luminance of 4.5 cd/m^2 . The
163 background luminance was 0.05 cd/m^2 . The dot density of the center- and background-
164 patch was 2.7 dots/deg^2 , respectively. The summed area of the random dots within either
165 the center-patch or the background-patch occupied roughly 3% of the total area of the
166 corresponding patch.

167
168 The random dots in the center-patch moved coherently (i.e. at 100% motion
169 coherence) within a stationary aperture. The dots moved rightward at one of four stimulus
170 speeds of 5, 10, 15, $20^\circ/\text{s}$. The lifetime of each dot was as long as the presentation
171 duration. When a dot reached the boundary of the circular aperture, it would reappear on
172 the other side of the aperture in the next monitor frame.

173
174 The dots in the background-patch moved randomly in all possible directions. The
175 coherence level was varied between 0% and 100%. To generate a random-dot patch
176 moving at N% motion coherence (after Newsome and Pare, 1988; Britten et al., 1992),
177 N% of the dots were selected to move coherently at an assigned direction and speed,
178 whereas the rest of the dots were repositioned randomly within the boundary of the
179 stimulus. In this study, we assigned the speed of the random dots in the background-patch
180 to $0^\circ/\text{s}$, such that the background dots did not move in any net direction. At N%
181 coherence, N% of the dots in the background-patch were stationary, whereas the rest of
182 the dots were repositioned randomly. The total number of background dots remained
183 constant across different levels of motion coherence. The assignment of the stationary
184 and randomly moving dots occurred at each monitor frame of 10 ms. At 100% coherence,
185 all dots in the background-patch were stationary and therefore there was no noise. At 0%
186 coherence, all dots in the background-patch were repositioned randomly at each monitor
187 frame and therefore the noise level of the background was at its maximum. We defined
188 the "noise level" of the background dots as 100% minus the coherence level. As the
189 motion coherence of the background dots decreased from 100% to 0%, the noise level
190 increased from 0% to 100%. We referred to the dots in the center-patch as the "signal
191 dots" and the dots in the background-patch as the "noise dots".

192
193 The "Comparison" stimulus (Fig. 1B) was the same as the center-patch in the "Test"
194 stimulus, except that the stimulus speed of the Comparison stimulus was varied from
195 trial-to-trial in a staircase procedure.

196 197 *Procedures*

198
199 Each experiment trial started with a subject fixated on a red spot on the video
200 monitor. The fixation spot was shown in the center of visual stimuli throughout the
201 stimulus presentation period. In Experiments 1, 2, 3, 4 and 6, subjects performed a
202 temporal two-alternative forced choice (2AFC) task to discriminate the motion speeds of
203 the Test and Comparison stimuli presented in two sequential intervals. The Test stimulus
204 was presented for 800 milliseconds (ms), followed by an inter-stimulus interval (ISI) of
205 450 ms, and then the Comparison stimulus was presented for 800 ms (Fig. 1C). The red

206 fixation spot then turned to white for 1.3 seconds, during which the subject was required
207 to press one of two buttons to indicate whether the speed at the center region of the Test
208 stimulus was faster or slower than the speed of the Comparison stimulus. The next
209 experimental trial started after an inter-trial-interval of 1.5 seconds.

210
211 Except in Experiments 5 and 7, we used a staircase method to determine the
212 perceived speed of the center-patch of the Test stimulus. In each staircase, the speed of
213 the signal dots in the Test stimulus was fixed and the speed of the Comparison stimulus
214 was varied adaptively at a step of 1°/s. The initial speed of the Comparison stimulus was
215 set randomly within the range from 1°/s to twice of the veridical speed of the signal dots
216 in the Test stimulus. When the subject reported that the comparison speed was faster (or
217 slower) than the test speed in a given trial, the speed of the comparison stimulus was
218 decreased (or increased) in the following trial. A “reversal” speed was reached when the
219 subject switched from reporting the Comparison stimulus as faster to slower, or vice
220 versa. The staircase was stopped after seven reversals and we determined the matching
221 speed as the mean of the last four reversals. After a subject’s performance was stabilized
222 via practice, we conducted four staircases for each stimulus condition and calculated the
223 mean matching speed.

224
225 In the first (i.e. the main) experiment, we measured the perceived speed of the
226 center-patch as a function of the noise level of the background dots. We tested four
227 speeds of 5, 10, 15, and 20°/s of the center-patch. For each of these test speeds, we varied
228 the noise level of the background from 0% to 100%.

229
230 In the second experiment, we manipulated the configuration of the background-
231 patch and examined its impact on the perceived speed of the center-patch. The
232 “background” patch in this experiment 1) had a larger diameter than the center-patch as
233 in the first experiment, 2) was an annulus and therefore did not overlap with the center-
234 patch, or 3) had the same diameter as the center-patch.

235
236 In the third experiment, the center-patch overlapped with the background-patch as
237 in the first experiment. We varied the diameter of the background-patch, while we kept
238 the diameter of the center-patch at 5° as in the first experiment. Five background
239 diameters of 7°, 8.5°, 10°, 13° and 16° were used. The speed of the signal dots in the
240 center-patch was 10°/s.

241
242 In the fourth experiment, we placed the center- and background-patch either at the
243 same depth (2-D condition) or different depths (3-D condition), and measured the
244 perceived speed of the center-patch. Subjects wore anaglyph glasses made of red- and
245 green-light filters (Wratten 2 Filters, #25, 58, Kodak). In the 2-D condition, the random
246 dots of the center- and background-patch were shown in yellow and placed at the same
247 depth of the fixation spot (i.e. zero disparity). In the 3-D condition, the center-patch was
248 shown at the zero disparity, whereas the background patch was placed at a far disparity of
249 0.4°. Random dots of the background-patch were shown in red and green. All dots of the
250 center- and background-patch had the same luminance of 4.5 cd/m², measured via the red
251 and green filter respectively. As in the main experiment, the background luminance was

252 0.05 cd/m². In this experiment, the signal dots of the center-patch moved at one of three
253 speeds of 10, 15, and 20°/s. The noise level of the background dots was set to 30%.

254

255 In the fifth experiment, subjects reported perceptual separability between the
256 center-patch and the center region of the overlapping background. In each experimental
257 trial, only one stimulus interval was used. The visual stimulus was the same as the Test
258 stimulus used in the first experiment. Subjects reported whether they perceived two
259 separate surfaces, or alternatively a single, integrated surface in the center region of the
260 visual stimulus. The combination of four different center speeds and six different
261 background noise levels at each center speed constituted a total of 24 randomly
262 interleaved conditions. Each stimulus condition was repeated at least 10 times.

263

264 In the sixth experiment, we manipulated color difference between the center-patch
265 and the background-patch. In the *chromatic condition*, the color of the random dots in the
266 center-patch of the Test stimulus was red, whereas the color of the background random
267 dots was green. The color of the Comparison stimulus was also red. Random dots in the
268 center- and background-patch of the Test stimuli, and in the Comparison stimulus had the
269 same luminance of 4.5 cd/m². In the *achromatic condition*, all dots were achromatic with
270 a luminance level of 4.5 cd/m². Other aspects of this experiment were identical to
271 Experiment 1. In a staircase procedure, subjects performed a temporal 2AFC task to
272 discriminate the speeds of the Test stimulus and the Comparison stimulus.

273

274 In the seventh experiment, subjects performed a temporal 2AFC task to judge the
275 perceptual similarity between the center- and background-stimuli. Each trial contained
276 two stimulus intervals. The duration of each stimulus interval and the ISI were identical
277 to those in the first experiment. The visual stimulus presented in each of the two time
278 intervals was the same as the Test stimulus in the first experiment (Fig. 1B), and
279 contained a center-patch and an overlapping background-patch. Visual stimuli in the two
280 time intervals had the same center speed of 5°/s, but different background noise levels.
281 Subjects were instructed to choose one of the two time intervals, in which the background
282 stimulus appeared to be more similar to the center stimulus (see Results).

283

284 In each trial, two different background noise levels were picked for the two
285 stimulus intervals from six noise levels of 0, 30, 45, 60, 80 and 100%. There were a total
286 of 15 pair-wise comparisons (i.e. C_6^2). These trials were blocked together and repeated at
287 least ten times. The results of two given background noise levels presented at different
288 temporal sequences (i.e. which noise level was presented first) were pooled together. To
289 quantify perceptual similarity between the center- and background-stimuli, we calculated
290 the *relative similarity (RS)* at a given background noise level i :

291

$$292 \quad RS_i = \frac{\sum_{j=1}^n P_{ij}}{n-1}, \quad j \neq i \text{ and } i = 1 \text{ to } n \quad (1)$$

293

294 in which P_{ij} is the probability of a subject choosing a stimulus interval that had a
295 background noise level of i when comparing with noise level j . n is the total number of
296 background noise levels ($n = 6$). In other words, RS_i is the cumulated probability of a
297 subject choosing background noise level i when comparing noise level i with all other

298 noise levels, normalized by the total number of comparisons. The index RS is similar to
299 the cumulated score of a soccer team in the world cup group-stage competition. Based on
300 the team's cumulative scores in competing with all other teams in the same group, the
301 team's relative strength in the group can be determined.

302
303 We also measured the “relative” perceived speed of the center-patch using the same
304 approach that was used to measure relative perceptual similarity. The visual stimuli were
305 identical to the experiment measuring perceptual similarity. Subjects were asked to
306 report which stimulus interval contained a center-stimulus that appeared to move faster.
307 A relative speed score was calculated using Eq. 1 for each background noise level. A
308 higher score indicates that the center-patch of a given stimulus appears to move faster.

309
310
311
312

313 **Results**

314
315
316

Effects of background noise on the perceived speed of a center stimulus (Experiment 1)

317 We set out to test the hypothesis that the perceived speed of a coherently moving
318 random-dot stimulus can be influenced by random motion noise of a background stimulus
319 that did not move in a net direction, nor at a specific speed. *In the first experiment*, the
320 visual stimuli contained a center-patch and a larger background-patch (Fig. 1A). The
321 diameter of the center-patch was 5° and the diameter of the background patch was 7° .
322 The signal dots in the center-patch overlapped with the noise dots in the same region of
323 the background-patch. We found that, when the signal dots moved at $10^\circ/s$, the perceived
324 speed was faster than their veridical speed (Fig. 2). The highest perceived speed averaged
325 across four subjects was $14.5^\circ/s$, 45% faster than the veridical speed.

326

327 The perceived speed of the signal dots was *tuned* to the noise level of the
328 background. When the signal dots moved at $10^\circ/s$, for all four subjects, the highest
329 perceived speed was reached when the noise level of the background was at 60% (Fig. 2).
330 At this noise level, 60% of the background dots were randomly selected and repositioned
331 to random locations within the aperture of the background-patch at each monitor frame,
332 and the remaining 40% of the background dots were stationary. When the background
333 noise level was higher or lower than 60%, the perceived speed of the signal dots was
334 reduced, but still higher than the veridical speed (Fig. 2). The perceived speed of the
335 signal dots was the lowest when the background noise level was at 0% (i.e. when all the
336 background dots were stationary). We referred to the background noise level at which the
337 perceived speed of the signal dots was the highest as the “noise level at the peak-speed”.

338

339 The tuning of the perceived speed of the center-patch as a function of the
340 background noise level varied with the speed of the signal dots in the center-patch (Fig.
341 3). When the speed of the signal dots was low, the peak perceived speed was reached at a
342 low noise level of the background. As the speed of the signal dots increased, the noise
343 level at the peak-speed increased progressively (Fig. 3 and Fig. 4A). We performed a

344 two-factor repeated measure ANOVA, in which the two factors were the background
345 noise level and the veridical speed of the signal dots, and the dependent variable was the
346 perceived speed of the center-patch. The main effect of the background noise level on the
347 perceived speed was highly significant $[(F(4, 12) = 71.8, p = 2.8 \times 10^{-8})]$. The interaction
348 between the background noise level and the veridical speed of the signal dots was also
349 significant $[F(12, 36) = 4.5, p = 2.0 \times 10^{-4}]$.

350
351 Across the four speeds of 5, 10, 15 and 20°/s, the peak perceived speed was on
352 average ~40% faster than the veridical speeds of the signal dots (Fig. 4B). In our
353 temporal 2AFC task, the Test stimulus was always shown first, followed by the
354 Comparison stimulus. To determine whether the overestimation of the speed might be
355 due to an adaptation effect related to the presentation sequence of the visual stimuli, we
356 did a control experiment using a Test stimulus without the noisy background. We found
357 that, given the same temporal sequence of the Test and Comparison stimuli, the perceived
358 speed of the Test stimulus without the background patch was nearly identical to the
359 veridical speed (see the open squares in Fig. 4B). This ruled out the possibility that the
360 speed overestimation was caused by an adaption effect induced by the center-patch of the
361 Test stimulus.

362 363 *Effects of stimulus configuration on speed overestimation (Experiment 2)*

364
365 To provide insight into the possible mechanism underlying the speed
366 overestimation, we manipulated the configuration of the Test stimulus *in the second*
367 *experiment*. We first asked, for the speed overestimation to occur, whether it was
368 necessary for the signal dots of the center-patch to overlap with the noise dots of the
369 background-patch. We removed the center region of the background patch and kept only
370 the noise dots in the remaining annulus region surrounding the center-patch (Fig. 5A2).
371 When the signal dots and the noise dots did not overlap, the signal dots no longer
372 appeared to move faster than the veridical speed. This was the case across different
373 background noise levels when the speed of the signal dots was 10°/s (the red curve in Fig.
374 5B), and across different speeds of the signal dots (the red curve in Fig. 5C). These
375 results indicate the necessity for the signal dots to overlap with the noise dots for the
376 speed overestimation to occur.

377
378 When the background-patch had the same diameter as the center-patch and
379 therefore the center- and background-patch overlapped completely (Fig. 5A3), the speed
380 overestimation of the signal dots still occurred, but to a lesser extent in comparison with
381 the situation when the background was larger (the blue curves in Fig. 5B, 5C). The effect
382 of the stimulus configuration on the perceived speed was significant (one-way ANOVA,
383 $F(2, 9) \geq 6, p < 0.05$). Although the background annulus by itself cannot make the speed
384 overestimation to occur, in combination with the center region of the background-patch,
385 the noise dots in the annulus can enhance the effect of the speed overestimation,
386 suggesting spatial integration.

387 388 *Spatial integration and speed overestimation (Experiment 3)*

389

390 To characterize the extent of spatial integration, *in the third experiment*, we varied
391 the size of the background-patch while we maintained the diameter of the center-patch at
392 5° . As in the first experiment, the center-patch overlapped with the center region of the
393 background-patch. The speed of the signal dots in the center-patch was $10^\circ/\text{s}$. We set the
394 background noise level to 60%, at which the peak perceived speed was achieved in the
395 first experiment. Four new subjects participated in this experiment. One of them was
396 excluded because this subject did not perceive the speed of the center-patch to be
397 significantly faster than the veridical speed at the background diameter of 7° . Across the
398 remaining three subjects, the speed overestimation was the largest when the background
399 diameter was 8.5° . As the background diameter further increased, the speed
400 overestimation declined (Fig. 6). These perceptual properties mirror the size tuning of
401 neurons in the motion-sensitive, middle-temporal cortex (i.e. area MT) of primates. As
402 the size of a visual stimulus increases, the response of a MT neuron initially increases as
403 more excitatory region of the neuron's receptive field (RF) is stimulated and spatially
404 integrated, and then the neuronal response starts to decline when the visual stimulus
405 covers the suppressive surround of the RF (e.g. see Pack et al., 2005).

406
407 *Effects of depth cues on speed overestimation (Experiment 4)*

408
409 In the experiments described above, the center-patch and the background-patch
410 were displayed in the same depth plane, which potentially allows integration of motion
411 energies from the center-patch and the noisy background to occur. At the neuronal level,
412 such integration is likely to occur within the RFs of motion sensitive neurons in the visual
413 cortex. It has been shown previously that neural interactions between multiple motion
414 signals located at different depths are weakened, in comparison to the situation when the
415 motion signals are present in the same depth (Bradley et al., 1995). At the perceptual
416 level, stimuli placed at different depths are easily segregated by the visual system and
417 therefore are more difficult to be integrated than when stimuli are placed at the same
418 depth. If the speed overestimation was caused by integration of motion energies from
419 overlapping signal dots and noise dots, placing the center-patch and the background-
420 patch at different stereoscopic depths should reduce the effect of speed overestimation
421 due to potentially weakened integration across different depths. To test this prediction,
422 we manipulated the stereoscopic depths of the visual stimuli *in the fourth experiment*.
423 Subjects wore red/green anaglyph glasses to view the visual stimuli. We placed the signal
424 dots of the center-patch at zero disparity (i.e. the same depth as the fixation spot) and the
425 noise dots of the background-patch either at a far disparity of 0.4° (3-D condition) or at
426 the same depth as the center-patch (2-D condition). The spatial extent of the background-
427 patch and the center-patch were the same as in the first experiment, in which the diameter
428 of the background-patch was 2° larger than the center-patch. In the 2-D projection of the
429 visual stimuli, the signal dots overlapped with the noise dots at the center region of the
430 background-patch. Under the 3-D condition, the subjects could reliably segregate the
431 center-patch and the background-patch to different depths, when the signal dots moved at
432 the speeds of 10, 15 and $20^\circ/\text{s}$, but not at the speed of $5^\circ/\text{s}$. We therefore used the speeds
433 of 10, 15 and $20^\circ/\text{s}$ for the signal dots in this experiment.
434

435 Under the 2-D condition, we found that the subjects perceived the signal dots to
436 be faster than the veridical speed, as in the first experiment. However, when the center-
437 patch and the background-patch were positioned at different depths, the speed
438 overestimation of the signal dots was essentially abolished (Fig. 7). Under the 3-D
439 condition, the signal dots of the center-patch and the noise dots of the background-patch
440 were perceived as belonging to two separate surfaces at different depths. For each of the
441 three speeds tested, the perceived speed under the 3-D condition was significantly slower
442 than that under the 2-D condition (one-tailed t-test, $p < 0.01$, after Bonferonni correction
443 for multiple comparisons). This effect can be conveniently demonstrated by having
444 subjects first view the visual stimuli under the 3-D condition to establish the stereoscopic
445 depths, and then quickly close one eye to view the visual stimuli monocularly. We tested
446 four subjects with this simple demonstration. All of them reported that, when they closed
447 one eye and hence lose the stereoscopic perception of the visual stimuli, the perceived
448 speed of the center-patch suddenly increased. Together, the results of this experiment
449 suggest that the speed overestimation was caused by interactions between overlapping
450 signal dots and noise dots presented at the same stereoscopic depth.

451
452 *Perceptual separability between the center-patch and the overlapping background*
453 *(Experiment 5)*

454
455 The abovementioned results are consistent with the idea that the overestimation of
456 the center speed is related to integration of motion energies of the center- and
457 background-stimuli. As alluded to above, it is likely that motion integration is influenced
458 by perceptual separability between the center-stimulus and the background. We therefore
459 measured perceptual separability of our visual stimuli in the 2-D condition to evaluate the
460 relationship between perceptual separability and the speed overestimation.

461
462 The visual stimulus was the same as the Test stimulus used in the first
463 experiment. Each experimental trial contained only one stimulus interval (see Methods).
464 Following each trial, subjects indicated whether they perceived the center-patch and the
465 background-patch as two separate surfaces, or alternatively as a single, integrated surface.

466
467 Figure 8 shows results from four subjects. These subjects also participated in
468 Experiments 6 and 7 (see below). When the speed of the center patch was $5^\circ/s$, subjects
469 could always segregate the center-patch from the overlapping background, regardless of
470 the background noise level (Fig. 8, black curve). As the speed of the center-patch
471 increased, it became harder to segregate the center-patch from the overlapping
472 background. When the center speed was equal to or greater than $10^\circ/s$, the perceptual
473 separability decreased as the background noise level increased (Fig. 8). These trends were
474 consistent across subjects, despite individual differences in the background noise level at
475 which subjects started to have difficulty segregating the center-patch from the
476 overlapping background.

477
478 These results show that it is not necessary for the center-patch and the
479 overlapping background to be perceived as a single, integrated surface for the speed
480 overestimation of the center-stimulus to occur. For example, the center- and background

481 patches were perceptually separable at the center speed of 5°/s, yet speed overestimation
482 occurred at this speed (Fig. 3A). Furthermore, although the perceptual separability
483 decreased monotonically with the background noise level (Fig. 8), the speed
484 overestimation did not increase monotonically, but peaked at an intermediate noise level
485 (Fig. 3). Together, these results provided two insights: First, motion integration pertinent
486 to speed perception is not an all-or-none process, but rather occurs in a graded manner.
487 Among a set of conditions in which the center-patch and background-patch are
488 perceptually separable, some of the conditions are easier to separate than others, which
489 may be linked to different levels of motion integration. Similarly, among a set of
490 conditions in which the center-patch and background-patch are perceived as a single,
491 integrated surface, some of the conditions appear to be more uniform and integrated than
492 others, which again may be linked to different levels of motion integration. Second,
493 perceptual separability may not be the only factor that determines speed overestimation.
494 We further investigated the first point in Experiment 6, and the second point in
495 Experiment 7.

496

497 *Impact of color cues on speed overestimation (Experiment 6)*

498

499 In this experiment, we investigated whether increasing perceptual separability by
500 introducing a color difference between the center-patch and the background-patch had an
501 impact on the speed overestimation. We hypothesized that introducing a color difference
502 between the center-patch and the background would increase perceptual separability and
503 reduce motion integration, and therefore reduce speed overestimation.

504

505 We manipulated the color difference between the center-patch and the
506 background-patch. In the *chromatic condition*, the random dots in the center-patch of the
507 Test stimulus were red, whereas the random dots in the background-patch were green. In
508 the *achromatic condition*, all dots were achromatic. Other aspects of this experiment were
509 identical to Experiment 1. In the chromatic condition, subjects could easily segregate the
510 center-patch from the background-patch, regardless of the center speed and the
511 background noise level.

512

513 We found that introducing color cues significantly reduced speed overestimation.
514 Four subjects participated in this experiment. These subjects also participated in
515 Experiments 5 and 7. We first tested the subjects using a center speed of 10°/s. In the
516 achromatic condition, all four subjects overestimated the speed of the center-stimulus and
517 the perceived speed was tuned to the background noise level and peaked at the noise level
518 of 60%, consistent with the results from Experiment 1 (black curves in Fig. 9). In
519 contrast, the speed overestimation was reduced, if not abolished, for all subjects in the
520 chromatic condition (red curves in Fig. 9). We performed a two-way ANOVA, in which
521 the two factors were the presence or absence of color cues, and the background noise
522 level, and the dependent variable was the perceived speed of the center-stimulus. The
523 main effect of color cues on the perceived speed was significant for all subjects [(F(1, 36)
524 > 6.8, $p < 0.013$]. The interaction between color cues and the background noise level was
525 also significant for all subjects [F(5, 36) > 5.8, $p < 0.001$].

526

527 In the chromatic condition, the speed overestimation was also reduced in
528 comparison to the achromatic condition across different speeds of the center-patch (Fig.
529 10), at noise levels of peak perceived speed as measured in Experiment 1. The main
530 effect of color cues on the perceived speed was significant for all subjects [two-way
531 ANOVA, $(F(1, 24) > 22, p < 10^{-4})$]. The interaction between color cues and the speed of
532 center-patch was also significant [$F(3, 24) > 5.9, p < 0.005$]. These results confirmed our
533 hypothesis.

534
535 Note that when the center speed was 5°/s, introducing color cues had minimum
536 effect on the speed overestimation for three of four subjects (Fig. 10). A possible
537 explanation is that, because at center speed of 5°/s it was already easy for subjects to
538 segregate the center patch from the background, in other words separability may nearly
539 asymptote, introducing color cues may therefore provide little extra benefit on
540 separability at this speed.

541 *Perceptual similarity between the center- and background-stimuli (Experiment 7)*

542
543
544 Our working hypothesis is that the speed overestimation of the center-stimulus is
545 caused by integration of motion energy from random noise in the background. Can the
546 idea of motion integration explain our finding that the speed overestimation is tuned to
547 the level of background noise? We reasoned that motion integration was more likely to
548 occur when the perceptual appearances of the background-patch and the center-patch
549 were similar. If the speed overestimation were caused by motion integration, perceptual
550 similarity should also be tuned to the level of background noise. To test this prediction,
551 we measured perceptual similarity between the center-patch and the background-patch at
552 different background noise level. To avoid having perceptual separability confound the
553 measurement of perceptual similarity across background noise levels, we performed this
554 experiment using a speed of 5°/s, at which the center-patch and the background-patch
555 were separable at all background noise levels (Fig. 8).

556
557 Subjects performed a temporal 2AFC task similar to that in Experiment 1. In this
558 experiment, however, the Comparison stimulus had the same configuration as the Test
559 stimulus, containing a center-patch and a larger, overlapping background-patch. The only
560 difference between the Test stimulus and the Comparison stimulus was the background
561 noise level. Subjects were instructed to choose one of the two temporal intervals in
562 which the background stimulus was more similar to the center stimulus than that in the
563 other temporal interval. Subjects were instructed to judge similarity based on the apparent
564 appearance of the center-patch and background-patch. Factors such as the apparent (i.e.
565 perceived) dot density, dot size, brightness of individual random dots, brightness of the
566 background surface as a whole, apparent update rate of the random dots and the
567 appearance of motion can all influence the perceived similarity. Subjects were instructed
568 to evaluate similarity based on the overall appearance of the center-patch and the
569 background-patch, taking these factors into consideration.

570
571 Figure 11 shows the results from four subjects. The perceived similarity between
572 the center- and background-stimuli varied with the background noise level. With the

573 center-patch moved at 5°/s, the background-patch appeared to be most similar to the
574 center-patch at a noise level of 30%. This result was highly consistent across subjects
575 (Fig. 11A). On average, the tuning of the perceptual similarity between the center-patch
576 and the background-patch as a function of the background noise level (Fig. 11B) matched
577 well with the tuning of the perceived speed (Fig. 3A).
578

579 Because the four subjects participated in this experiment did not participate in
580 Experiment 1 and the methods employed to determine perceptual similarity (Experiment
581 7) and the perceived speed (Experiment 1) were different, we therefore measured the
582 relative perceived speed of the center-patch for the four new subjects using the same
583 approach as in Experiment 7. In this task, the visual stimuli were identical to the
584 experiment measuring perceptual similarity. Subjects were asked to report which
585 stimulus interval contained a center-stimulus that appeared to move faster than that in the
586 other stimulus interval. Figure 12 shows consistent results from the four subjects. The
587 tuning of the relative perceived speed (Fig. 12B) matched well with the tuning of the
588 perceptual similarity (Fig. 11B), and with the tuning of the perceived speed measured in
589 Experiment 1 (Fig. 3A). These results confirmed our prediction and are supportive of the
590 idea that the speed overestimation is the result of motion integration.
591
592
593

594 Discussion 595

596 We found that a background-stimulus that contained random motion noise could
597 increase the perceived speed of an overlapping center-stimulus that moved coherently.
598 We also discovered that the perceived speed of the center-stimulus was tuned to the
599 background noise level. The faster a center-stimulus moved, a noisier background was
600 needed to give rise to the largest overestimation of the perceived speed. We found that
601 the speed overestimation was significantly reduced or abolished when the center- and
602 background-stimuli had different colors, or when they were placed at different depths.
603 Our results suggest that integration of motion energies across overlapping stimuli in the
604 same depth has a significant impact on speed perception, and that such integration is
605 more likely to occur when the overlapping stimuli are perceptually similar.
606

607 *Possible impact of integration and segmentation* 608

609 The processes of integration and segmentation can influence motion perception
610 considerably (Stoner et al., 1990; Murakami and Shimojo, 1993; Braddick, 1993;
611 Nishida, 2011; Gaudio and Huang, 2012). One candidate explanation for our finding of
612 the speed overestimation is related to image segmentation - the presence of a larger,
613 noisy background may make the signal dots "stand out" and the speed overestimation
614 occurs due to the apparent "contrast" between the *segmented* center and background
615 stimuli. Alternatively, the visual system may *integrate* the motion energies of the signal
616 dots from the center-patch and the non-directional noise dots from the background, and
617 tag the greater motion energy to the signal dots, making them appear to move faster.
618 When all the dots in the background-patch were stationary (i.e. at 0% noise level), the
619 center-patch can be segmented from the background-patch. Our finding of a slight
620 overestimation of the perceived speed at the 0% noise level is consistent with the

621 previous finding that increasing the number of stationary reference markers leads to an
622 increase of the perceived speed (Gogel and McNulty, 1983). However, when the noise
623 level of the background-patch was greater than 0%, our results suggest that it was motion
624 integration, rather than segmentation, that caused the speed overestimation. Edwards and
625 Grainger (2006) have shown that an increase in motion noise gives rise to an increase in
626 the perceived speed and interpreted their results as due to the amount of relative motion
627 in the stimulus. If the speed overestimation found in our experiments was also caused by
628 perceptual segmentation, one may expect to find less speed overestimation when the
629 signal dots and the noise dots are more similar perceptually. However, our result is
630 opposite to this prediction. Furthermore, we found that the speed overestimation still
631 occurred when subjects could not segregate the center-stimulus from the background at
632 high center-speeds and high background noise levels. It is worth noting that our visual
633 stimulus was different from that used by Edwards and Grainger (2006). We kept the
634 motion coherence of the center-stimulus unchanged, but varied the noise level of the
635 background-stimulus by randomly repositioning the background dots. Edwards and
636 Grainger (2006) used a random-walk stimulus and varied the proportion of signal dots
637 and noise dots. These differences in visual stimuli make it difficult to directly compare
638 our results with the previous study.

639

640 We found that the speed overestimation required the center-patch to overlap with
641 the background-patch. Perceptually, it was easier to segment the signal dots from the
642 noisy background when the signal dots and the noise dots were spatially separated in the
643 center and the annulus regions (Fig. 5A2), than when they overlapped (Fig. 5A3).
644 However, the speed overestimation occurred in the overlapping condition (Fig. 5A3), but
645 not in the annulus condition (Fig. 5A2). Moreover, when the center-stimulus and the
646 background-stimulus were shown in different colors or at different depths, under which
647 conditions perceptual segmentation of the center- and background-stimuli was enhanced,
648 the speed overestimation was significantly reduced or abolished (Figs. 7, 9 and 10).
649 These results are also consistent with the idea that the speed overestimation is due to
650 motion integration, rather than segmentation.

651

652 Our results emphasize a distinction between the neural process of motion
653 integration and the perception of a single, integrated stimulus/surface. Our measurements
654 of perceptual separability and similarity between the center- and background-stimuli
655 (Figs. 8 and 11), and their relationships with the speed overestimation suggest that the
656 neural integration of motion signals is a graded process and can occur even across
657 overlapping, perceptually separable stimuli.

658

659 *Possible impact of adaptation*

660

661 Adaptation effects in the primary visual cortex and cortical area MT are strongly
662 modulated by stimulus size (Wissig and Kohn, 2012; Patterson et al., 2014). Following
663 adaptation with a large stimulus, surround suppression may be reduced (i.e. causing
664 disinhibition) in a stimulus-specific manner. In most of our experiments, the background-
665 stimulus had a diameter of 7° , which is comparable to the size of the large stimulus (7.4°)

666 used by Patterson et al. (2014), and Wissig and Kohn (2012). May the size-dependent
667 effect of adaptation account for the speed overestimation that we have observed?
668

669 The following considerations suggest that the speed overestimation was not due to
670 interaction between the effects of adaptation and surround suppression. First, when the
671 background-patch had the same diameter as the center-patch, the speed overestimation
672 still occurred albeit smaller (Fig. 5). This indicates that the speed overestimation was not
673 caused by an adaptation effect induced by the stimulus surround. Second, in most of our
674 experiments (except in Experiment 7), the Comparison stimulus only contained the
675 center-patch presented on a black background, without an annulus surround. Since the
676 Comparison stimulus did not receive surround suppression from the annulus region to
677 begin with, any change in the adaptation state in the annulus region elicited by the stimulus
678 surround in the Test stimulus would likely have little effect on the neural responses to the
679 Comparison stimulus.

680

681 *Neural code of motion speed*

682

683 Visual information is encoded in the activity of populations of neurons (McIlwain
684 1991; Pouget et al. 2000). In one scheme of neural coding, referred to as the "labeled-line
685 code", the attribute of a visual stimulus is encoded by neuronal responses distributed
686 across a population of neurons that have different preferences for the visual attribute
687 (Groh, 2001). In a different coding scheme, referred to as the "rate code", a visual
688 attribute is encoded by the firing rate of a population of neurons. More sophisticated
689 coding schemes using Bayesian inference have also been suggested (Stocker and
690 Simoncelli, 2006; Jogan and Stocker, 2015).

691

692 Neuronal activity in area MT of macaque monkeys is linked to speed perception.
693 Many neurons in area MT are selective to motion speed (Dubner and Zeki, 1971;
694 Maunsell and van Essen, 1983; Mikami et al., 1986; Lagae et al., 1993; Perrone and
695 Thiele, 2001; Priebe et al., 2003). Trial-to-trial variations of neuronal responses in area
696 MT correlate with speed perception (Liu and Newsome, 2005), and lesions of area MT
697 impair speed discrimination (Pasternak and Perigan, 1994; Orban et al., 1995). Several
698 lines of evidence suggest that the neural code for speed is consistent with labeled-line
699 coding. MT neuron's response tuning to speed typically follows a log-normal function,
700 rather than changes monotonically with speed (Nover and DeAngelis, 2005).
701 Microstimulation of area MT biases speed perception toward the PS of the stimulated
702 neurons (Liu and Newsome, 2005). Importantly, several perceptual illusions of motion
703 speed can be explained by labeled-line coding (Churchland and Lisberger, 2001; Priebe
704 and Lisberger, 2004; Boyraz and Treue, 2011; Krekelberg and van Wezel, 2013).

705

706 However, other lines of evidence suggest that a rate code may be used to
707 represent motion speed. Krekelberg et al. (2006) showed that the underestimation of
708 speed at low luminance contrast cannot be explained by a labeled-line code based on
709 neuronal responses in area MT. Since the responses of MT neurons were weaker at lower
710 contrast, a rate code of speed can account for this illusion. Furthermore, Liu and
711 Newsome (2005) showed that, only when the stimulus speed was lower than the PS of a

712 neuron, meaning that at an interval of the speed tuning curve that the firing rate increased
713 monotonically with the stimulus speed, the choice probability was greater than 0.5; when
714 the stimulus speed was higher than the PS, the choice probability was no longer
715 significantly different from chance. In the medial superior temporal (MST) cortex, an
716 area that is downstream to area MT and is also important for processing visual motion
717 information, many neurons prefer fast speeds and their firing rates increase
718 monotonically with speed over a wide speed range (Kawano et al., 1994; Churchland and
719 Lisberger, 2005). It is possible that MST neurons use a rate code for representing motion
720 speed (Churchland et al., 2007). Komatsu and Wurtz (1989) reported that
721 microstimulation in areas MT and MST increased the speed of pursuit eye movement,
722 which can be explained by a rate code for speed, rather than a labeled-line code. The
723 nature of the neural code for motion speed remains to be understood.
724

725 Our finding that the tuning of the speed overestimation shifts with the speed of the
726 center-stimulus suggests that the interaction between the background motion noise and
727 the coherent motion of the center-stimulus is specific to the spatiotemporal frequency
728 contents of the visual stimuli. Although the background stimulus did not move in a net
729 direction, nor at a specific speed, the random noise contained motion energy distributed
730 in the spatiotemporal frequency domain (Adelson and Bergen, 1985; Watson and
731 Ahumada, 1985). As the noise level of the background stimulus increases, the motion
732 energy at higher spatiotemporal frequencies also increases. Supported by human
733 psychophysical studies (e.g. van der Smagt et al., 1999), neurons that prefer a fast (or
734 slow) speed are likely to be more sensitive to a high (or low) level of motion noise.
735 Integration of motion energies from the center-stimulus and overlapping background
736 noise would reshape the population neural responses and cause changes in perceived
737 speed. Importantly, whether such neural integration can occur may depend on the
738 perceptual similarity between the center-stimulus and the background noise, and is
739 subject to the influences of visual segmentation cues such as color and depth.
740

741 One possible neural explanation of our results is that, neurons that prefer the
742 speed of the center-stimulus would be strongly activated by the center-stimulus, and
743 further activated by a background-stimulus that has a noise level “matching” the speed of
744 the center-stimulus, in terms of perceptual similarity. As the result, the population neural
745 responses distributed across neurons with different PSs would be elevated by the
746 background noise, but the location of the peak response in the neuron population would
747 remain unchanged. If the visual system decodes the stimulus speed based on the firing
748 rates of the neuron population (i.e. a rate code), the perceived speed of a center-stimulus
749 would be faster at a matching background noise level than at a non-matching noise level
750 and the veridical speed.
751

752 An alternative neural explanation of our results is that, the background motion
753 noise at the peak perceived speed of a center-stimulus may be most effective in driving
754 the neurons that prefer speeds slightly higher than the speed of the center-stimulus. As
755 the result, the population neural responses elicited by the combination of the center-
756 stimulus and the background noise would be biased toward the neurons that have faster
757 PSs than the speed of the center-stimulus. If the visual system decodes the stimulus speed

758 based on a labeled-line code, the perceived speed would be faster than the veridical
759 speed.

760
761 Our psychophysical results reported in this study provide new insight and
762 guidance for the investigation of neural code for motion speed. The stimulus
763 manipulation used in our study may allow future neurophysiological experiments to
764 distinguish the abovementioned possibilities of coding motion speed. In future
765 neurophysiological studies, it would be important to characterize how population neural
766 responses elicited by a coherently moving center-stimulus in motion-sensitive cortical
767 areas are changed by different levels of background motion noise. Our psychophysical
768 results also indicate that the perceived speed of a coherently moving stimulus can vary
769 depending on the coherence level of an overlapping background.

770
771
772
773
774
775
776
777
778
779
780
781
782
783
784
785
786
787
788
789
790
791
792
793
794
795
796
797
798
799
800
801
802
803

804 **References**

805

806 Adelson EH, and Bergen JR. Spatiotemporal energy models for the perception of motion.
807 *J Opt Soc Am A* 2: 284-299, 1985.

808 Benton CP, and Curran W. The dependence of perceived speed upon signal intensity.
809 *Vision Res* 49: 284-286, 2009.

810 Boyraz P, and Treue S. Misperceptions of speed are accounted for by the responses of
811 neurons in macaque cortical area MT. *J Neurophysiol* 105: 1199-1211, 2011.

812 Braddick O. Segmentation versus integration in visual motion processing. *Trends*
813 *Neurosci* 16: 263-268, 1993.

814 Bradley DC, Qian N, and Andersen RA. Integration of motion and stereopsis in middle
815 temporal cortical area of macaques. *Nature* 373(6515): 609-611, 1995.

816 Britten KH, Shadlen MN, Newsome WT, and Movshon JA. The analysis of visual
817 motion: a comparison of neuronal and psychophysical performance. *J Neurosci* 12: 4745-
818 4765, 1992.

819 Churchland AK, Huang X, and Lisberger SG. Responses of neurons in the medial
820 superior temporal visual area to apparent motion stimuli in macaque monkeys. *J*
821 *Neurophysiol* 97: 272-282, 2007.

822 Churchland MM, and Lisberger SG. Shifts in the population response in the middle
823 temporal visual area parallel perceptual and motor illusions produced by apparent motion.
824 *J Neurosci* 21: 9387-9402, 2001.

825 De Bruyn B, and Orban GA. What is the speed to transparent and kinetic-boundary
826 displays? *Perception* 28: 703-709, 1999.

827 Dubner R, and Zeki SM. Response properties and receptive fields of cells in an
828 anatomically defined region of the superior temporal sulcus in the monkey. *Brain Res* 35:
829 528-532, 1971.

830 Edwards M, and Grainger L. Effect of signal intensity on perceived speed. *Vision Res* 46:
831 2728-2734, 2006.

832 Freeman TC, and Sumnall JH. Motion versus position in the perception of head-centred
833 movement. *Perception* 31: 603-615, 2002.

834 Gaudio JL, and Huang X. Motion noise changes directional interaction between
835 transparently moving stimuli from repulsion to attraction. *PLoS One* 7: e48649, 2012.

836 Gogel WC, and McNulty P. Perceived velocity as a function of reference mark density.
837 *Scand J Psychol* 24: 257-265, 1983.

838 Groh JM. Converting neural signals from place codes to rate codes. *Biol Cybern* 85: 159-
839 165, 2001.

840 Jogan M, and Stocker AA. Signal Integration in Human Visual Speed Perception. *J*
841 *Neurosci* 35: 9381-9390, 2015.

842 Kawano K, Shidara M, Watanabe Y, and Yamane S. Neural activity in cortical area MST
843 of alert monkey during ocular following responses. *J Neurophysiol* 71: 2305-2324, 1994.

844 Kohn A, and Movshon JA. Adaptation changes the direction tuning of macaque MT
845 neurons. *Nat Neurosci* 7: 764-772, 2004.

846 Komatsu H, and Wurtz RH. Modulation of pursuit eye movements by stimulation of
847 cortical areas MT and MST. *J Neurophysiol* 62: 31-47, 1989.

848 Krekelberg B, and van Wezel RJ. Neural mechanisms of speed perception: transparent
849 motion. *J Neurophysiol* 110: 2007-2018, 2013.

850 Krekelberg B, van Wezel RJ, and Albright TD. Interactions between speed and contrast
851 tuning in the middle temporal area: implications for the neural code for speed. *J Neurosci*
852 26: 8988-8998, 2006.

853 Lagae L, Raiguel S, and Orban GA. Speed and direction selectivity of macaque middle
854 temporal neurons. *J Neurophysiol* 69: 19-39, 1993.

855 Liu J, and Newsome WT. Correlation between speed perception and neural activity in the
856 middle temporal visual area. *J Neurosci* 25: 711-722, 2005.

857 Loomis JM, and Nakayama K. A velocity analogue of brightness contrast. *Perception* 2:
858 425-427, 1973.

859 Maunsell JH, and Van Essen DC. Functional properties of neurons in middle temporal
860 visual area of the macaque monkey. I. Selectivity for stimulus direction, speed, and
861 orientation. *J Neurophysiol* 49: 1127-1147, 1983.

862 McIlwain JT. Distributed spatial coding in the superior colliculus: a review. *Vis Neurosci*
863 6: 3-13, 1991.

864 Mikami A, Newsome WT, and Wurtz RH. Motion selectivity in macaque visual cortex. I.
865 Mechanisms of direction and speed selectivity in extrastriate area MT. *J Neurophysiol*
866 55: 1308-1327, 1986.

867 Murakami I, and Shimojo S. Motion capture changes to induced motion at higher
868 luminance contrasts, smaller eccentricities, and larger inducer sizes. *Vision Res* 33: 2091-
869 2107, 1993.

870 Newsome WT, and Pare EB. A selective impairment of motion perception following
871 lesions of the middle temporal visual area (MT). *J Neurosci* 8: 2201-2211, 1988.

872 Nishida S. Advancement of motion psychophysics: review 2001-2010. *J Vis* 11: 11,
873 2011.

874 Norman HP, Norman JF, Todd JT, and Lindsey DT. Spatial interactions in perceived
875 speed. *Perception* 25: 815-830, 1996.

876 Nover H, Anderson CH, and DeAngelis GC. A logarithmic, scale-invariant representation
877 of speed in macaque middle temporal area accounts for speed discrimination
878 performance. *J Neurosci* 25: 10049-10060, 2005.

879 Orban GA, Saunders RC, and Vandebussche E. Lesions of the superior temporal
880 cortical motion areas impair speed discrimination in the macaque monkey. *Eur J*
881 *Neurosci* 7: 2261-2276, 1995.

882 Pack CC, Hunter JN, and Born RT. Contrast dependence of suppressive influences in
883 cortical area MT of alert macaque. *J Neurophysiol* 93: 1809-1815, 2005.

884 Pasternak T, and Merigan WH. Motion perception following lesions of the superior
885 temporal sulcus in the monkey. *Cereb Cortex* 4: 247-259, 1994.

886 Patterson CA, Duijnhouwer J, Wissig SC, Kregelberg B, and Kohn A. Similar adaptation
887 effects in primary visual cortex and area MT of the macaque monkey under matched
888 stimulus conditions. *J Neurophysiol* 111: 1203-1213, 2014.

889 Perrone JA, and Thiele A. Speed skills: measuring the visual speed analyzing properties
890 of primate MT neurons. *Nat Neurosci* 4: 526-532, 2001.

891 Pouget A, Dayan P, and Zemel R. Information processing with population codes. *Nat Rev*
892 *Neurosci* 1: 125-132, 2000.

893 Priebe NJ, Cassanello CR, and Lisberger SG. The neural representation of speed in
894 macaque area MT/V5. *J Neurosci* 23: 5650-5661, 2003.

895 Priebe NJ, and Lisberger SG. Estimating target speed from the population response in
896 visual area MT. *J Neurosci* 24: 1907-1916, 2004.

897 Salzman CD, Britten KH, and Newsome WT. Cortical microstimulation influences
898 perceptual judgements of motion direction. *Nature* 346: 174-177, 1990.

899 Stocker AA, and Simoncelli EP. Noise characteristics and prior expectations in human
900 visual speed perception. *Nat Neurosci* 9: 578-585, 2006.

901 Stoner GR, Albright TD, and Ramachandran VS. Transparency and coherence in human
902 motion perception. *Nature* 344: 153-155, 1990.

903 Tynan P, and Sekuler R. Simultaneous motion contrast: velocity, sensitivity and depth
904 response. *Vision Res* 15: 1231-1238, 1975.

905 van der Smagt MJ, Verstraten FA, and van de Grind WA. A new transparent motion
906 aftereffect. *Nature Neurosci.* 2(7): 595-596, 1999.

907 Walker P, and Powell DJ. Lateral interaction between neural channels sensitive to
908 velocity in the human visual system. *Nature* 252: 732-733, 1974.

909 Watson AB, and Ahumada AJ, Jr. Model of human visual-motion sensing. *J Opt Soc Am*
910 *A* 2: 322-341, 1985.

911 Wissig SC, and Kohn A. The influence of surround suppression on adaptation effects in
912 primary visual cortex. *J Neurophysiol* 107: 3370-3384, 2012.

913 Zanker JM, and Braddick OJ. How does noise influence the estimation of speed? *Vision*
914 *Res* 39: 2411-2420, 1999.

915
916
917
918
919
920
921
922
923
924

925 **Figures and Figure Legends**

926

927

928 **Figure 1.** Visual stimuli and the experimental paradigm. Visual stimuli were composed
929 of achromatic random dots. **A.** The "Test" stimulus was composed of a center-patch and a
930 larger, concentrically placed background-patch. Random dots in the center-patch moved
931 coherently to the right. Random dots in the background-patch did not move in a net
932 direction, nor at a specific speed and were randomly updated at each monitor frame. **B.**
933 The "Comparison" stimulus was the same as the center-patch of the Test stimulus, except
934 that the speed of the Comparison stimulus was varied from trial to trial according to a
935 staircase procedure. **C.** The temporal sequence of the experimental paradigm. The Test
936 stimulus was presented first for 800 ms, followed by a 450-ms inter-stimulus interval
937 (ISI) and the Comparison stimulus was presented for 800 ms. Subjects were instructed to
938 determine whether the motion speed of the center-patch of the Test stimulus was faster or
939 slower than the speed of the Comparison stimulus

940

941

942

943 **Figure 2.** The perceived speed of the center-patch speed was perceptually tuned to the
944 noise level of the background dots. Results were from four subjects. The speed of the
945 center-patch was 10°/s. A noise level of N% means that N% of the dots in the
946 background-patch were repositioned randomly within the aperture of the background-
947 patch at each monitor frame, whereas the remaining dots in the background were
948 stationary. Note the different vertical scales for different subjects. Error bars represent
949 standard deviations.

950

951

952

953 **Figure 3.** The tuning of the perceived speed of the signal dots to the background noise
954 level varied with the speed of the signal dots in the center-patch. The speed of the signal
955 dots: **A.** 5°/s, **B.** 10°/s, **C.** 15°/s, **D.** 20°/s. Results were averaged across four subjects.
956 Error bars represent standard deviations.

957

958

959

960 **Figure 4. A.** The relationship between the background noise-level at the peak perceived-
961 speed and the speed of the center-patch. **B.** The speed overestimation was due to the
962 presence of the background-patch and was not due to the temporal sequence of the Test
963 and Comparison stimuli. Error bars represent standard deviations. The solid circles in A
964 and B are data replotted from Figure 3.

965

966

967

968

969

970 **Figure 5.** The impact of stimulus configuration on the perceived speed of the center-
971 patch. **A.** Three stimulus configurations. **A1.** The "large-background" condition. The
972 diameter of the background-patch was 7° and the diameter of the center-patch was 5° .
973 The two patches overlapped in the center region of the background-patch. **A2.** The
974 "annulus" condition. The center- and the background-patch did not overlap. **A3.** The
975 "small-background" condition. The background-patch had the same diameter as the
976 center-patch and the two patches overlapped completely. **B.** The perceived speed as a
977 function of the background noise level. The speed of the center-patch was $10^\circ/s$. **C.** The
978 perceived speed as a function of the motion speed of the center-patch. The noise level of
979 the background-patch was 30%, 60%, 80% and 90% for the motion speed of $5^\circ/s$, $10^\circ/s$,
980 $15^\circ/s$ and $20^\circ/s$, respectively. At these motion speeds and noise levels, the peak speed
981 overestimation was achieved under the large-background condition, as shown in Figure 3.
982 Error bars represent standard deviations.

983

984

985

986 **Figure 6.** The impact of the background size on the perceived speed of the center-patch.
987 The diameter of the center-patch was 5° . The background-patch was larger than the
988 center-patch and the two patches overlapped in the center region of the background-
989 patch. **A-C.** Results from individual subjects. **D.** Averaged results across three subjects.
990 Note the different vertical scales for different panels. Error bars represent standard
991 deviations.

992

993

994

995 **Figure 7.** The impact of the stereoscopic depths of the visual stimuli on the perceived
996 speed of the center-patch. In the "2-D" condition, the center-patch and the background-
997 patch were presented at the same depth plane. In the "3-D" condition, the center-patch
998 was presented at the zero disparity, whereas the background-patch was presented at a far
999 disparity. Error bars represent standard deviations.

1000

1001

1002

1003 **Figure 8.** Perceptual separability between the center-patch and the overlapping
1004 background-patch as the background noise level and the speed of the center-patch varied.
1005 Ordinate indicates the ratio of experimental trials in which subjects perceived the center-
1006 patch and the overlapping background as two separate surfaces. Each panel shows results
1007 from one subject. Error bars represent standard deviations. Figure legends indicate speeds
1008 of the center-patch.

1009

1010

1011

1012

1013

1014

1015

1016 **Figure 9.** The impact of color cues on the perceived speed of the center-patch across
1017 different background noise levels. Black curves indicate results from achromatic
1018 condition. Red curves indicate results from chromatic condition. The speed of the center-
1019 patch was 10°/s. Each panel shows results from one subject. Note the different vertical
1020 scales for different subjects. Error bars represent standard deviations.

1021
1022
1023

1024 **Figure 10.** The impact of color cues on the perceived speed of the center-patch across
1025 different center speeds. Black curves indicate results from achromatic condition. Red
1026 curves indicate results from chromatic condition. The noise level of the background was
1027 30%, 60%, 80% and 90% for the center speed of 5°/s, 10°/s, 15°/s and 20°/s,
1028 respectively. Each panel shows results from one subject. Note the different vertical scales
1029 for different subjects. Error bars represent standard deviations.

1030
1031
1032

1033 **Figure 11.** Perceptual similarity between the center-patch and the background-patch.
1034 Ordinate indicates the relative similarity score (see Methods), shown as a function of the
1035 background noise level. The speed of the center-patch was 5°/s. **A.** Results from
1036 individual subjects. **B.** Similarity scores averaged across four subjects. Error bars
1037 represent standard deviations. Figure legends indicate different subjects.

1038
1039
1040

1041 **Figure 12.** Relative perceived speed of the center-patch. Ordinate indicates the relative
1042 speed score (see Methods), shown as a function of the background noise level. A higher
1043 score indicates that the center-patch of the stimulus appears to move faster. The speed of
1044 the center-patch was 5°/s. **A.** Results from individual subjects. **B.** The relative speed
1045 score averaged across four subjects. Error bars represent standard deviations. Figure
1046 legends indicate different subjects.























