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TITLE PAGE

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Title: Predictive Activity in Macaque Frontal Eye Field Neurons During
Natural Scene Searching

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Running Head: FEF Predictive Activity

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ABSTRACT

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Generating sequences of multiple saccadic eye movements allows us to search our environment quickly and efficiently. Although the frontal eye field cortex (FEF) has been linked to target selection and making saccades, little is known about its role in the control and performance of the sequences of saccades made during self-guided visual search. We recorded from FEF cells while monkeys searched for a target embedded in natural scenes, and examined the degree to which cells with visual and visuo-movement activity showed evidence of target selection for future saccades. We found that for about half of these cells, activity during the fixation period between saccades predicted the next saccade in a sequence at an early time that precluded selection based upon current visual input to a cell's response field. In addition to predicting the next saccade, activity during the fixation prior to two successive saccades also predicted the direction and goal of the second saccade in the sequence. We refer to this as advanced predictive activity. Unlike activity indicating the upcoming saccade, advanced predictive activity occurred later in the fixation period, mirroring the order of the saccade sequence itself. The remaining cells without advanced predictive activity did not predict future saccades, but reintroduced the signal for the upcoming saccade at an intermediate time in the fixation period. Together, these findings suggest that during natural visual search the timing of FEF cell activity is consistent with a role in specifying targets for one or more future saccades in a search sequence.

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INTRODUCTION

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Searching our visual environment is an essential skill, and is most effective when the targets for successive saccades are not chosen at random, but follow an internally generated plan (Aivar et al. 2005; Findlay and Brown 2006; Zingale and Kowler 1987). Although it is established that the frontal eye field (FEF) contributes to the control of voluntary saccadic eye movements in both humans and monkeys (for reviews see Goldberg and Segraves 1989; Schall 1997), little is known about the FEF's role in the control of the series of multiple saccades made during visual search. Bruce and Goldberg (1985) demonstrated that the activity of about one-third of FEF cells is closely tied to saccadic eye movements, leaving a majority of cells which do not play a direct role in saccade production. Many studies support a role for these cells in visual selection to guide both covert and overt orienting responses (Sato et al. 2001; Sato et al. 2003; Schall 2001; Schall and Hanes 1993; 1998; Schall et al. 1995; Thompson et al. 1996). In addition, there is increasing evidence that the FEF plays a role in the top-down control of visual attention (Buschman and Miller 2007; Moore and Armstrong 2003; Moore and Fallah 2001; 2004; Wardak et al. 2006), but see also Khan and colleagues (2009). Early human and monkey behavioral studies suggested that the FEF is involved in the generation of sequences of saccades (Collin et al. 1982; Luria et al. 1966). However, with a few notable exceptions (e.g. Balan and Ferrera 2003; Murthy et al. 2007; Tian et al. 2000; Umeno and Goldberg 1997), the single saccade trial structure of most FEF neurophysiological studies was not intended to test the FEF's role in generating multiple saccades.

76 In this study, we looked for evidence of FEF cell involvement in selecting future
77 targets for the sequences of saccades made during self-guided search of two-dimensional
78 images. Previously we have shown that while freely viewing natural scenes, FEF visual
79 cell activity was modulated by the target of the upcoming saccade (Burman and Segraves
80 1994b), and preliminary work done at that time suggested that the FEF was involved in
81 selecting targets for future saccades (Burman and Segraves 1994a). Here we recorded
82 FEF cell activity while monkeys searched scenes for an embedded target. This task
83 allowed monkeys the freedom to direct saccades at will, but also forced them to assess
84 the content of the scenes, thus providing a more realistic environment in which both top-
85 down and bottom-up forces were at work (Chen and Zelinsky 2006; Itti and Koch 2000;
86 Pomplun 2006). Preliminary reports of these experiments have been published in abstract
87 form (Phillips and Segraves 2007; Phillips and Segraves 2008).

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MATERIALS AND METHODS

90 ANIMALS AND SURGERY

91 Two female adult rhesus monkeys (*Macaca mulatta*) were used for these
92 experiments and are identified in this report as MAS14 and MAS15. Northwestern
93 University's Animal Care and Use Committee approved all procedures for training,
94 surgery, and experiments performed. Each monkey received preoperative training
95 followed by an aseptic surgery to implant a subconjunctival wire search coil, a Cilux
96 plastic recording cylinder aimed at the frontal eye field (FEF), and a titanium receptacle
97 to allow the head to be held stationary during behavioral and neuronal recordings. All of
98 these methods have been described in detail elsewhere (Dias and Segraves 1999;
99 Helminski and Segraves 2003). Surgical anesthesia was induced with the short-acting
100 barbituate thiopental (5-7 mg/kg IV), and maintained using isoflurane (1.0-2.5%) inhaled
101 through an endotracheal tube. The FEF cylinder was centered at stereotaxic coordinates
102 anterior 25 mm and lateral 20 mm. The location of the arcuate sulcus was then visualized
103 through the exposed dura and the orientation of the cylinder adjusted to allow
104 penetrations that were roughly parallel to the bank of the arcuate sulcus. Both monkeys
105 had an initial cylinder placed over the left FEF. Monkey MAS14 later had a second
106 cylinder placed over the right FEF.

107 BEHAVIORAL PARADIGMS

108 We used the REX system (Hays et al. 1982) based on a PC computer running
109 QNX (QNX Software Systems, Ottawa, Ontario, Ca), a real-time UNIX operating
110 system, for behavioral control and eye position monitoring. Visual stimuli were generated

111 by a second, independent graphics process (QNX – Photon) running on the same PC and
112 rear-projected onto a tangent screen in front of the monkey by a CRT video projector
113 (Sony VPH-D50, 75Hz non-interlaced vertical scan rate, 1024×768 resolution).

114 *Visually guided and memory-guided delayed saccade tasks*

115 Monkeys fixated a central red dot for a period of 500-1000 ms. At the end of this
116 period, a target stimulus appeared at a peripheral location. On visually guided trials, the
117 target remained visible for the duration of the trial. On memory-guided trials, the target
118 disappeared after 350 ms. After the onset of the target, monkeys were required to
119 maintain central fixation for an additional 700-1000 ms until the central red dot
120 disappeared, signaling the monkey to make a single saccade to the target (visually
121 guided) or the location at which the target had appeared (memory-guided). The delay
122 period refers to the period of time between the target onset and the disappearance of the
123 fixation spot. These two tasks were used to characterize the FEF cells by comparing
124 neural activity during four critical epochs. An FEF cell could be categorized by any
125 combination of visual, delay, or pre-motor activity (see *Data Analysis*). Typically, trials
126 of these types were interleaved with each other, and with the scene search tasks described
127 below. However, in some cases there was only enough data for statistical analysis from
128 one of the delayed saccade tasks. The visually guided task was also used initially to
129 determine the response-field of the cell.

130 *Scene search task*

131 This task was designed to generate large numbers of purposeful, self-guided,
132 saccades. Monkeys were trained to find a picture of a small fly embedded in photographs

133 of natural scenes (Figure 1A). After monkeys learned the standard visually guided and
134 memory-guided search tasks, the target spot was replaced with the image of the fly. After
135 30 minutes the scene task was introduced. Both monkeys used in this experiment
136 immediately and successfully sought out the fly. The photographs were taken using a
137 digital camera, and included scenes with engaging objects such as animals, people,
138 plants, or food. After a few sessions performing this task, it became obvious that
139 monkeys were finding the target after only one or two saccades. We therefore used a
140 standard alpha blending technique to superimpose the target onto the scene. This method
141 allows for varying the proportions of the source (target) and destination (the background
142 scene) for each pixel, and was used to create a semi-transparent target. Even after
143 extensive training, we found that the task was reasonably difficult with a 65% transparent
144 target, requiring the production of multiple saccades while the monkeys searched for the
145 target. Monkeys began each trial by fixating a central red dot for 500-1000 ms, then the
146 scene and embedded target appeared simultaneously with the disappearance of the
147 fixation spot, allowing monkeys to begin searching immediately. The fly was placed
148 pseudo-randomly such that its appearance in one of eight 45° sectors of the screen was
149 balanced. Within each sector its placement was random between 3 and 30 degrees of
150 visual angle from the center of the screen. Trials ended when the monkeys fixated the
151 target for 300 ms, or failed to find the target after 25 saccades. Images of natural scenes
152 were pseudo-randomly chosen from a library of >500 images, such that individual images
153 were repeated only after all images were displayed. An essential feature of this task is
154 that, although they searched for a predefined target, the monkeys themselves decided
155 where to look. The location where the target was placed on the image did not predict the

156 amplitudes and directions of the saccades that would be made while searching for it nor
157 the vector of the final saccade that captured it.

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159 Insert Figure 1 about here.

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161 NEURONAL RECORDINGS

162 The recording of single neuron activity was done with tungsten microelectrodes
163 (A-M Systems, Inc., Carlsborg, WA). Electrode penetrations were made through stainless
164 steel guide tubes that just pierced the dura. Guide tubes were positioned using a Crist grid
165 system (Crist et al. 1988, Crist Instrument Co., Hagerstown, MD). Recordings were made
166 using a single electrode advanced by a hydraulic microdrive (Narashige Scientific
167 Instrument Lab, Tokyo, Japan). On-line spike discrimination and the generation of pulses
168 marking action potentials were accomplished using a multi-channel spike acquisition
169 system (Plexon, Inc., Dallas, TX). This system isolated a maximum of 2 neuron
170 waveforms from a single FEF electrode. Pulses marking the time of isolated spikes were
171 transferred to and stored by the REX system. During the experiment, a real-time display
172 generated by the REX system showed the timing of spike pulses in relationship to
173 selected behavioral events.

174 The location of the FEF was confirmed by our ability to evoke low-threshold
175 saccades from the recording sites with current intensities of $\leq 50 \mu\text{A}$, and the match of
176 recorded activity to established cell activity types (Bruce and Goldberg 1985). To

177 stimulate electrically, we generated 70 ms trains of biphasic pulses, negative first, 0.2 ms
178 width per pulse phase delivered at a frequency of 330 Hz.

179 DATA ANALYSIS

180 *FEF cell characterization*

181 We examined average cell activity during four critical epochs while the monkey
182 performed the memory-guided delayed saccade task to determine if the cell displayed
183 visual, delay, or pre-motor activity. If not enough data was available from this task, data
184 from the visually guided delayed saccade task was used. The baseline epoch was the 200
185 ms preceding target onset, the visual epoch was 50-200 ms after target onset, the delay
186 epoch was the 150 ms preceding the disappearance of the fixation spot, and the pre-
187 saccade epoch was the 50 ms preceding the saccade onset. FEF cells were characterized
188 by comparing epochs in the following manner using the Wilcoxon sign-rank test. If
189 average firing rates during the visual or delay epochs was significantly higher than the
190 baseline rate, the cell was considered to have visual or delay activity respectively. If the
191 activity during the pre-saccade epoch was significantly greater than the delay epoch, the
192 cell was considered to have pre-motor activity. We found that FEF cells could exhibit the
193 entire range of these activities, from having no significant levels of visual, delay, or
194 motor activity to having significant levels of all three. These criteria are similar to those
195 used by Sommer and Wurtz (2000).

196 *FEF cell response latency*

197 To determine the response latency of each FEF cell to a visual stimulus, we
198 combined data from the visually guided and memory-guided saccade tasks. We

199 calculated a threshold level as 2SDs above the mean firing rate during the baseline epoch.
200 Then mean firing rates were calculated by using a sliding 50 ms window incremented in
201 1 ms steps starting from target onset. The midpoint of the 50 ms epoch in which the mean
202 firing rate reached threshold was determined to be the response latency of the cell.
203 Similar methods have been used to determine response latencies of neurons in other brain
204 regions such as area MT (Bisley et al. 2004).

205 *Determining the response-field (RF) size*

206 The initial RF for a cell was determined using a joystick to position the target on
207 the screen as the monkeys performed the delayed saccade tasks. As locations were
208 sampled, a combination of real-time rasters and spike density functions, accompanied
209 with audio monitoring of multi-unit activity, allowed us to find a good approximation of
210 the center of the RF. This location and its 180° opposite were typically used to collect
211 data for the cell characterization analysis described above. For the scene search tasks
212 however, it was essential to define the RF more rigorously in order to group the wide
213 ranging saccade vectors obtained while monkeys were searching freely for the target.
214 First, we took all saccades made during the scene search tasks, and removed the first
215 saccade of each trial as well as the last saccade made to the target. This was to eliminate
216 any interference from the onset of the scene, or the effect of the alpha-blended target on
217 the cell's activity. The remaining saccades were grouped by saccade angle into 18
218 groups, each comprising a range of 20°. Average spike rates were calculated for each
219 group from a period of 50-200 ms following the beginning of the fixation before the
220 saccade. The average spike rate of each group was then compared to the group 180°
221 away. If the difference between these two spike rates was greater than 2.5 times the

222 standard deviation of the activity obtained from all 18 groups, then the group with the
223 higher rate was considered part of the cell's RF. In this manner, we found cells with RF
224 sizes with directions ranging from 20-60° across. For no cell did we find an RF
225 comprised of multiple groups that were not spatially continuous. For the sequence
226 analysis (see below), we also designated exclusion zones for the 20° sector bordering
227 both the RF and the anti RF, the remaining areas are referred to as neutral zones (Figure
228 1B and 1C).

229 For our analyses, we did not take into consideration the amplitude of the saccades,
230 although we did exclude saccades with amplitudes less than 2° of visual angle and greater
231 than 40°. There were several reasons for this. First, the response-fields of FEF cells are
232 not simply round, with a hot spot in the center (Gaussian). Most FEF cells have response
233 fields that are log-Gaussian, meaning that after a certain amplitude the response of the
234 cell does not change appreciably (Bruce and Goldberg 1985). Second, taking amplitude
235 into consideration unnecessarily reduces the data set of saccades available for analysis. A
236 subset of data for several cells was analyzed taking amplitude into account, and the
237 results were not noticeably different.

238 *ROC discrimination time*

239 Receiver Operator Characteristic (ROC) analyses are often used in decision-
240 making and target-selection studies to determine the time at which a neuron's activity
241 differentiates to reflect a decision, or the presence of a target (Horwitz and Newsome
242 2001; Kim and Shadlen 1999; McPeck and Keller 2002a; Sato et al. 2001; Thompson et
243 al. 1996). We generated ROC curves from spike trains produced during the fixation
244 period before saccades made into and away from the cell's RF. Data was excluded from

245 analysis if the previous saccade was made within 20° of the RF or its opposite (Figure
246 1C). Figure 2A shows a saccade that was excluded for this reason.

247 The area under the ROC curve (AUC) is a measure of the degree to which the
248 spike rates at a given time differ depending on the direction of the upcoming saccade. In
249 order to determine the earliest time at which this differentiation occurred, the AUC was
250 obtained for every 5 ms starting from 15 ms before the beginning of a fixation period
251 until the onset of the saccade. We then used a bootstrap analysis similar to Horwitz and
252 Newsome (2001) in order to evaluate the significance of the AUC values. The above
253 analysis was repeated 2000 times, with random assignment of each saccade to one of two
254 saccade direction groups before each repetition. Next, at each time point we compared
255 the ‘true’ AUC to the 2000 AUCs obtained from shuffling saccades between the groups.
256 If the ‘true’ AUC was greater than 1900 (95% confidence level) of the ‘false’ AUCs for
257 10 consecutive intervals (50 ms) we assigned the time of the 1st of those 10 AUCs as the
258 ROC prediction time (PT).

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260 Insert Figure 2 about here.

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RESULTS

264 FEF CELL PREDICTIVE ACTIVITY FOR THE UPCOMING SACCADE DURING A SCENE SEARCH

265 We recorded from 52 FEF visual ($n = 37$) and visuomovement ($n = 15$) neurons
266 from 2 rhesus monkeys (M14, $n = 31$; M15, $n = 21$) as they searched natural scenes for
267 an embedded target. ROC analysis determined that the vast majority of cells (49/52,
268 94%) strongly modulated their activity during the scene search task depending on the
269 direction of the upcoming saccade. The remaining analyses consider these, or a subset of
270 these 49 cells. The ROC analysis allowed us to determine when the cell's activity
271 predicted the direction of the upcoming saccade. Figure 3 shows results from
272 representative FEF visual and visuomovement cells. Both cells predicted the direction of
273 the upcoming saccade at the beginning of the fixation period as indicated by the vertical
274 green line. Overall, the ROC prediction time for both visual (mean = 40 ms after the
275 beginning of fixation, SD = 49 ms), and visuomovement cells (mean = 33 ms, SD = 43
276 ms) occurred early in the fixation period. A t-test revealed no significant difference in
277 these discrimination times (p -value = .62), and as a result, unless otherwise noted,
278 subsequent analyses combine data from both visual and visuomovement cells. The mean
279 prediction time for all 49 cells was 38 ms after the start of fixation, with an SD of 47 ms.
280 For the ROC analysis of individual neurons with predictive activity, the minimum
281 number of combined on- and off-direction saccades was 27, the maximum was 532.

282 The mean prediction time was earlier than expected. In fact, it was less than most
283 reported visual latencies for FEF activity (92 ms- Bruce and Goldberg 1985; 40-80 ms-
284 Schall 2001; Thompson et al. 1996; 75 ms- Schmolesky et al. 1998). In order to make our
285 own direct comparison between saccade prediction times in the Scene Search Task and

286 the visual latencies for the same FEF neurons, we employed a sliding 50 ms window on
287 activity obtained from both visually and memory-guided delayed saccade tasks, and
288 compared mean firing rates during successive periods to the baseline firing rate before
289 target onset (see Methods). The results can be seen in Figure 3C. The mean response
290 latency was significantly longer than the timing of the predictive activity reported above
291 (mean = 58 ms; t-test, p-value = .0141), but within the range of previously reported FEF
292 cell visual latencies. In fact, during the scene search task, nearly a quarter of cells (12/49)
293 discriminated the direction of the upcoming saccade before the beginning of the fixation
294 period that preceded it. Our ROC analysis began 15 ms before the start of fixation periods
295 because we didn't want to include activity generated when the eye was at a prior fixation
296 location. The outcome of this was that the earliest statistically detectable prediction time
297 was -15 ms. However, it was clear from looking at the spike density plots similar to
298 Figure 3 that many of the 12 cells with pre-fixation prediction times began their
299 discrimination much earlier than 15 ms prior to fixation. Thus, our calculated mean
300 prediction time might in fact be later than it actually is. We consider predictive activity
301 during prior fixation periods separately below.

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Insert Figure 3 about here.

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One explanation for this finding is that owing to the large size of FEF receptive fields, objects may stay in a cell's receptive field for two successive fixation periods. If, in this situation, a saccade is made into the response-field after the second fixation period, early increases in activity could be due to visual responses to the content of the response-

309 field during the first fixation period. To avoid this, we performed the same ROC analysis
310 after removing all eye movement sequences that included saccades into the response-field
311 where the endpoint of the saccade initiated from the previous fixation location also fell
312 within the cell's response field. An example of a saccade removed for this reason can be
313 seen in Figure 2B. With these saccades removed, the mean prediction time for all cells
314 increased to 56 ms (SD = 53 ms), and was significantly greater than the original
315 prediction time determined without this control (paired t-test, $p < .001$), but did not differ
316 from the visual response latency of the cells (t-test, $p\text{-value}=.935$). For the visual and
317 visuomovement cell types, the mean prediction times were 56 ms (SD = 56) and 57 ms
318 (SD = 50). Thus, despite removing the contaminating factor, activity predicting the vector
319 of the next saccade exists coincident with the earliest FEF visual responses. These results
320 strongly suggest that activity of these FEF cells is driven by extra-retinal components that
321 begin to differentiate before information in the cells' response-fields reaches the FEF,
322 and precludes a selection process based solely upon that visual information.

323 ADVANCED FEF CELL PREDICTIVE ACTIVITY BEFORE 2 SUCCESSIVE SACCADES

324 Perhaps of equal importance to the first finding of early predictive activity for the
325 upcoming saccade, was that the extremely early prediction times initially observed were
326 in part driven by activity during a prior fixation (note that the preceding saccade was
327 *NOT* towards the RF, *see METHODS and FIGURE 2A*). This led us to examine the ways in
328 which activity during fixations might predict the outcome of future saccades. We looked
329 for two types of predictive activity during the fixation period prior to two successive
330 saccades during the scene search task. First, we determined if the activity during fixation
331 could predict the vector of the second saccade of a pair of successive saccades. This is

332 referred to as 2^{nd} saccade predictive activity. Gray circles in Figure 4A depict fixation
333 periods preceding pairs of successive saccades used in this analysis. We compared cases
334 in which the second saccade of a pair was either into or away from the cell's response-
335 field. Next, we determined if the activity during fixation could predict the spatial
336 location, or goal of the second saccade. The position of the endpoint of the second
337 saccade is referred to as the goal of the 2-saccade sequence. Cells that predicted the goal
338 of the sequence were said to have 2^{nd} goal predictive activity. Gray circles in Figure 4B
339 identify fixation periods preceding 2^{nd} goals into and away from the cell's response-field.
340 Together, 2^{nd} saccade and 2^{nd} goal activity are referred to as advanced predictive activity.
341 In many cases, both the 2^{nd} saccade and the 2^{nd} goal had similar vectors, and those pairs
342 of saccades were not included in the analysis. Only sequences in which both the first
343 saccade in the sequence and the goal of the sequence fell in neutral fields (green areas in
344 Figure 1B and C) were included in the 2^{nd} saccade analysis (Figure 4A – solid blue and
345 red arrows), while only sequences in which both saccades landed in neutral fields were
346 included in the 2^{nd} goal analysis (Figure 4B – dashed blue and red arrows). An excluded
347 saccade pair that did not meet these criteria can be seen in Figure 2C. Also excluded from
348 the analysis were sequences that included the first or last saccade of a trial. For the ROC
349 analysis of cells with 2^{nd} saccade activity, the minimum number of combined sequences
350 with on- or off-direction 2^{nd} saccades was 12, the maximum was 131. For the analysis of
351 cells with 2^{nd} goal activity, the range of sequences used was 10-72.

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Insert Figure 4 about here.

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356 Figure 5 shows representatives of four types of cells we encountered, each
357 displaying a different pattern of predictive activity. The top row depicts a cell that
358 exhibited 2nd saccade, but not 2nd goal predictive activity. Overall, 12% (6/49) of cells
359 followed this pattern. The second row shows a cell that predicted the spatial location of
360 2nd goals, but not the vector of 2nd saccades. This type of cell comprised 22% (11/49) of
361 the cells we tested. Another 20% (10/49) of cells were similar to the profile of the cell
362 shown in row three, and modulated their activity to indicate the direction of both 2nd
363 saccades and 2nd goals. The remaining cells (22/49, 45%) did not have activity predictive
364 of the 2nd saccade or goal (Figure 5, fourth row). It is clear from these data that at least
365 two sub-populations of cells exist, those that predict the future 2nd goal and/or 2nd
366 saccade (27/49, 55%), and those without any type of advanced predictive ability (22/49,
367 45%). Considering all cells that included one or both types of advanced predictive
368 activity, we found a slightly higher prevalence of 2nd goal over 2nd saccade activity
369 (21/49, 43% versus 16/49, 33%).

370

371 Insert Figure 5 about here.

372

373 While these results are intriguing, they pose an interesting problem. If activity
374 during a fixation period evolves to predict the next saccade as well as the saccade vector
375 or goal that will follow the next saccade, how does the system ‘know’ which saccade to
376 make? To address this issue, for those cells with 2nd saccade and/or 2nd goal activity, we

377 examined the time at which advanced predictive activity occurred during the fixation
378 period, and compared it to the prediction time observed before the upcoming saccade. As
379 noted above (page 14), when all 49 cells were included in the analysis, the mean
380 prediction time for the upcoming saccade was 56 ms into the fixation period. However,
381 when we only include the sub-population of cells with advanced predictive activity for
382 2nd saccade and/or goal, the mean prediction time before the upcoming saccade drops to
383 34 ms. On average, the activity of this same sub-population of cells predicted the 2nd
384 saccade or goal later in the fixation period at 85 ms for 2nd saccade and 86 ms for 2nd
385 goal (Figure 6A). A one-way ANOVA revealed a significant difference between these
386 three means ($F = 6.09$, $p = .004$). *Post-hoc* analysis revealed that both 2nd saccade and 2nd
387 goal activity occurred significantly later in the fixation period than activity predicting the
388 upcoming saccade but were not different from each other. These results indicate that FEF
389 vector and goal related activity is modulated sequentially during fixation periods. Early
390 during the fixation period, activity of advanced predictive cells reflects the vector and
391 spatial goal of the upcoming saccade (for the upcoming saccade, these are the same),
392 while later in the fixation period, activity evolves to indicate the vector and/or spatial
393 goal for the 2nd saccade in the sequence. Thus, the timing of differential activity might be
394 used to determine the order of successive saccade vectors and goals.

395 The lower mean prediction time of 34 ms for advanced predictive cells suggests
396 that the remaining cells that did not have advanced predictive activity signal the target for
397 the upcoming saccade later in the fixation period. To confirm this, we compared the
398 prediction time before upcoming saccades for FEF cells with and without advanced
399 predictive activity. FEF cells with advanced predictive activity did indeed differentiate

400 activity much earlier than other FEF cells (means = 34 ms and 69 ms respectively, t-test
401 p-value = .013). Thus, the original prediction time of 56 ms was actually an average
402 derived from two sub-populations of cells that increase their activity at different times
403 during the fixation period to indicate the direction of the upcoming saccade. When the
404 prediction times from the different cell types depicted in Figure 5 were compared
405 separately with a one-way ANOVA, *post-hoc* analysis showed cells that exhibited both
406 types of predictive activity discriminated the upcoming saccade much earlier than cells
407 without advanced predictive activity (Figure 6B; mean = 23 ms; $F = 4.29$, p-value = .02).
408 Cells showing only 2nd goal activity tended to indicate the upcoming saccade earlier
409 (mean = 40 ms), but this difference was not significant. Although the 2nd saccade group
410 also showed an early mean prediction time (mean = 46 ms), it was not included in the
411 analysis due to the small sample size. These results indicate that cells that predict the
412 outcome of two successive saccades begin to indicate the outcome of the 1st saccade
413 earlier than those cells that can only predict the next saccade.

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Insert Figure 6 about here.

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417 BEHAVIORAL EVIDENCE FOR SEARCH STRATEGY

418 In order to better understand the underlying function of the neuron activities we
419 observed, it is necessary to evaluate the strategies the monkeys used to perform the scene
420 search task. The design of the task insured that the monkeys' saccades were self-guided,
421 but this did not guarantee that the movements were part of an active visual search versus

422 being made to locations chosen at random. In addition, we could not assume that the
423 monkey identified the target when it appeared in the peripheral field of vision or if the
424 target needed to be foveated to be identified. To distinguish between these possibilities,
425 we examined the latency distributions of saccades made during this task. The purpose
426 was 1) to look for evidence suggesting that the monkey identified the target before a
427 saccade was made to it, and 2) to look for variations in saccade latency during the trial
428 that would be consistent with latency patterns seen in active visual search.

429 We looked first at the latencies of the final saccades of each sequence that landed
430 on the target. These saccades consistently occurred at shorter latencies than those made
431 while the monkey was searching the scene before the final saccade was made. This
432 difference was statistically significant with saccades towards the target having an overall
433 mean saccade latency of 207 ms, while other saccades had a mean latency of 241 ms. (p-
434 value < .001). Although saccade latencies tended to vary slightly day-by-day depending
435 on the monkeys' motivation, we observed only one instance in which the mean latencies
436 of a given session did not follow this pattern. Figure 7 shows the mean latencies
437 calculated for each recording session. Regression analysis shows a clear linear
438 relationship such that as saccades towards the target increase in latency, so do those
439 landing on other of portions of the scene ($R^2 = .84$). The slope of the regression line was
440 0.61, and all but 1 point lies below the dotted $x=y$ line indicating that saccades to the
441 target fly had shorter latencies. This finding suggests that the monkeys identified the
442 location of the target before initiating the final saccade to fixate it.

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444 Insert Figure 7 about here.

445

446 This overall latency trend does not preclude the possibility that some
447 additional factor such as the ordinal number within a trial sequence, or the amplitude of
448 the final saccade to the target is responsible for the shortened latency of saccades to the
449 target. Therefore we compared target-saccade latencies to scene-saccade latencies
450 according to the saccade number within a trial (Figure 8A). We found that while saccade
451 latencies to the scene increased throughout the trial, those to the target remained
452 relatively the same, and after the initial first 5 saccades, were consistently significantly
453 shorter than those saccades made to portions of the scene without the target (t-test, $\alpha =$
454 $.01$). While the monkeys may have increased the amount of time fixating between
455 saccades in an effort to examine the scene more carefully when they could not quickly
456 find the target, it is clear that when they did find the target, saccades were made rapidly.
457 The increase in latency for scene-directed saccades as the trial progresses could represent
458 a gradual change in strategy to increase time spent inspecting portions of the image, as
459 well as an increase in the number of re-fixations of locations that had been fixated earlier
460 in the trial. For human subjects viewing natural images, these re-fixations have been
461 shown to have longer durations (Hooge et al. 2005).

462 A comparison of saccade amplitudes revealed that short latency saccades to the
463 target were not simply due to a limited distribution of amplitudes for saccades to target
464 versus saccades to the scene. Figure 8B shows that while saccades with amplitudes of 3
465 to 5 degrees have shorter latencies when directed towards the target (t-test, $\alpha = .01$),
466 this was also the case for much larger saccades between 17 and 33 degrees (significance
467 was only reached up to saccades 25 degrees in amplitude). Interestingly, middle ranged

468 saccades between 7 and 17 degrees appeared to have a fairly constant latency irrespective
469 of amplitude or target of the saccade. Larger saccades between 17 and 31 degrees appear
470 to get longer in latency if directed towards the scene, and shorter in latency when directed
471 towards the target. The number of saccades greater than 31 degrees, both to the scene and
472 to the target, was significantly much less, accounting for greater variability, and statistical
473 analysis was unable to determine any trends. It is clear from these results that the
474 reduced latency of saccades directed towards the target was not simply the result of a
475 limited range of saccade amplitudes or chance landings near the target. We also looked
476 for a possible gradation of saccade amplitude across the duration of the trial, but did not
477 find any correlation between amplitude and ordinal number in the trial. The tendency
478 towards shorter latency for saccades made to the target may be analogous to the findings
479 of Harwood and colleagues (2008) who found that human saccade latencies were shorter
480 when attention was directed to a smaller stimulus feature, regardless of the distance of the
481 feature from the fovea. This may be similar to the search behavior in our paradigm where
482 the final saccade is made to a relatively small target, versus earlier saccades that are
483 directed to larger portions of the scene so that they may be examined. Together, these
484 analyses indicate that the monkeys identified the search target before a final saccade was
485 made to foveate it, and that the distributions of latencies observed were consistent with
486 those seen in human subjects during active visual search.

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Insert Figure 8 about here.

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DISCUSSION

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We examined the changes in activity in FEF visual and visuomovement cells during a scene search task that embedded a target in a natural image. Virtually all of these cells modulated their activity during scene search to predict the direction of upcoming saccades at latencies equal to or less than visual latencies determined in visually and memory-guided saccade tasks. In addition, the activities of a sub-population of slightly more than half of these cells predicted the saccade vector or spatial goal of the saccade that would follow the upcoming saccade. A unique aspect of these findings is that they were observed while monkeys made self-guided eye movements during the search of a natural image. Earlier studies, where one or more saccades were directed to target light spots or simple geometric shapes, established the involvement of FEF cells in predictive remapping of visual stimuli, the maintenance of a map of target salience or saccade probability, and the rapid early selection of saccade targets for corrective saccades (Balan and Ferrera 2003; Goldberg and Bruce 1990; Murthy et al. 2007; Thompson and Bichot 2005; Thompson et al. 2005a; Tian et al. 2000; Umeno and Goldberg 1997). This report extends these findings to a more natural behavior where choice of saccade targets is directly motivated and controlled by the subject. Our findings will be discussed in light of these earlier reports.

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PREDICTIVE REMAPPING OF VISUAL ACTIVITY

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Only a limited number of studies have examined monkey oculomotor system activity during the performance of tasks where multiple saccades are made. One of the classic examples of these tasks is the double-step task where, while a monkey maintains fixation, 2 target lights are flashed in quick succession. Both target lights are

514 extinguished before the monkey can make a saccade, and the monkey is rewarded for
515 making a pair of accurate saccades to the target locations in the order they were
516 presented. Hallett and Lightstone (1976) demonstrated that human subjects are able to
517 make a sequence of spatially accurate saccades to briefly flashed targets, and monkeys
518 are also able to correctly perform the double-jump task (Mays and Sparks 1980). When
519 the subject completes the first saccade, the location where the second target landed on the
520 retina is no longer sufficient to make an accurate saccade to the target. The oculomotor
521 system must also take into account the eye movement made to the first target. By
522 subtracting the vector of the first saccade from the retinotopic location of the second
523 target the system can map the true spatial location of the second target. In a remarkable
524 discovery, Mays and Sparks (1980) described a class of cells in the SC they named
525 Quasi-Visual (QV) cells. Although it's unlikely that these cells performed the vector
526 subtraction themselves, their activity represented the outcome of this process and
527 provided a signal that coded the spatially correct location for the second target. The name
528 Quasi-Visual reflects the combination of both sensory visual and extra-retinal efference
529 copy (corollary discharge) input required to form the signal carried by these neurons.
530 Goldberg and Bruce (1990) demonstrated that FEF cells with visual activity exhibited
531 properties similar to the QV cells of the superior colliculus by signaling the correct
532 spatial location of the 2nd saccade target in the double jump task. Using a task similar to
533 the double-jump task with the main difference that it did not require that a saccade be
534 made to the second stimulus light, Goldberg and colleagues found that the Lateral
535 Intraparietal Cortex (LIP), the FEF, and the SC all show evidence for the remapping of
536 retinotopic location of the stimulus to produce a spatially accurate map of stimulus

537 location (Duhamel et al. 1992; Umeno and Goldberg 1997; Walker et al. 1995). These
538 results indicate that LIP, FEF, and SC are all capable of contributing to a process that is
539 essential to control a sequence of saccades where future target positions must be updated
540 after each movement in the sequence.

541 Tian and colleagues (2000) looked at the process of updating target position in the
542 FEF with a triple-step task where 3 target lights were flashed during the initial fixation
543 period and the monkey made a sequence of 3 saccades to the remembered locations of the
544 target flashes. This allowed them to test whether FEF QV cells coded exclusively for the
545 spatial location of the next saccade in the sequence, or whether separate populations of
546 QV cells coded for the locations of all of the targets remaining in the sequence – a map of
547 target positions that would require updating after each saccade. Their results supported
548 the latter possibility, suggesting that when the monkey makes a sequence of saccades,
549 distinct populations of FEF QV cells code for the targets of each saccade in the sequence.
550 The corollary of this is that for each saccade in the sequence, there must be a remapping
551 to account for the movement and an activation of new populations of QV cells that code
552 for the remaining targets.

553 The experiments we describe in this report have extended the investigation of FEF
554 activity during generation of multiple saccades to a natural image search task where the
555 selection of targets for a series of saccades is under the volitional control of the monkey.
556 All but a few of the visual and visuo-movement cells that we studied predicted the target
557 of the next saccade before new sensory visual input from the point of fixation could be
558 processed. About 25% of these cells predicted the target for the next saccade before the
559 end of the prior eye movement. Within our population of cells that predicted the target of

560 the next saccade, we found a sub-population of cells that display two forms of advanced
561 predictive activity for the saccade that will follow the upcoming saccade. Activity during
562 the fixation period before two successive saccades indicated the vector and/or spatial goal
563 of the second saccade. The goal-related activity is similar to that reported when monkeys
564 performed a triple-saccade task (Tian et al. 2000). A model for the generation of saccade
565 sequences predicts that within the FEF there are neurons that encode for target locations
566 in sequence, storing them in memory similar to the cells with 2nd goal activity that we
567 found (Mitchell and Zipser 2003). FEF activity related to the vector or goal of the second
568 saccade of a double-saccade task has been reported to begin immediately after the first
569 saccade (Goldberg and Bruce 1990), but, during our scene search task, we found many
570 cells actually began such activity before the beginning of the first saccade in the
571 sequence. The FEF has also been shown to predict the future presence of a spot of light in
572 a neuron's response field (Umeno and Goldberg 1997) or the memory trace of a prior cue
573 that will be the target for a future saccade (Balan and Ferrera 2003). In our paradigm,
574 every saccade brings a new visual stimulus into the receptive field of every visual and
575 visuomovement neuron in the FEF. Since all of the cells that showed predictive activity
576 had visual responses, it is reasonable to interpret this activity as the product of a shifting
577 receptive field effect. It's important to emphasize that in our experiments, the shifting
578 receptive fields are linked to making a saccade to the contents of the receptive field.
579 Although each saccade provided new visual input to a neuron's response field, the
580 increases in activity were predictive of future saccade vectors and spatial goals, and thus
581 were a part of a saccade planning process.

582 The sub-population of cells with advanced predictive activity differed from other
583 FEF cells not only in their predictive ability, but also in the timing in which they
584 indicated the upcoming saccade. This difference, and the existence of the two sub-
585 populations, may account for some of the FEF's involvement in the control of both
586 upcoming saccades and future ones. Cells without advanced predictive activity
587 modulated their activity to indicate the upcoming saccade later during the fixation period
588 than those cells with advanced predictive activity (69 vs 34 ms after beginning of
589 fixation). This reveals an organization in which advanced predictive cells specify the
590 target of the upcoming saccade early during fixation. Later, these cells begin to specify
591 the goal or vector for the saccade that will follow the upcoming saccade while cells
592 without advanced predictive activity begin to indicate the direction of the upcoming
593 saccade. This re-introduction of a signal for the upcoming saccade may be another way
594 the system reinforces the proper order of saccades (Figure 9). It is also possible that cells
595 without advanced-predictive activity are more closely linked to movement cells involved
596 in the actual saccade generation process, although we found the proportion of visual and
597 visuo-movement cells to be roughly equal between the two sub-populations with and
598 without advanced predictive activity (Figure 10). Support for the late specification by
599 advanced predictive cells of the spatial goal of the 2nd saccade comes from a study in
600 which the left and right FEF were electrically stimulated with a delay of 30-250 ms
601 between stimulus trains (Fujii et al. 1998). The result was a sequence of two saccades in
602 which the first went to the movement-field of the first stimulated site, and the second
603 went to a location within the movement-field of the second site referenced to the eye

604 position during stimulation. That is to say, the resulting sequence of saccades indicated
605 that the second stimulation acted as an artificial 2nd goal activity, not 2nd saccade activity.

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607 Insert Figure 9 about here.

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611 Insert Figure 10 about here.

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613 The next problem to resolve in this process is how the 2nd saccade goal and vector
614 signals are interpreted to indicate the direction of the upcoming saccade in the sequence.

615 As Figure 4 demonstrates, depending upon the direction of the 1st saccade, the directions
616 of the 2nd saccade vector versus goal can be very different. This means that during any
617 given fixation period, there could be at least 3 different focuses of activity within the

618 FEF's saccade representation. The highest level of activity would be at the site

619 representing (in an oculocentric reference frame) the target of the next saccade to be

620 made. All of the visual and visuomovement neurons examined in this study demonstrated

621 they would contribute to this activity when the target for the saccade fell within their

622 response field (see also: Burman and Segraves 1994b). In addition, there could be as

623 many as 2 additional loci of activity at sites representing the saccade vector and spatial

624 goal for the saccade that will follow the upcoming saccade. Our results suggest that one

625 site would consist of cells with 2nd saccade vector as well as cells with combined 2nd

626 saccade vector and goal activity signaling the vector of the 2nd saccade in the sequence,
627 the other site would consist of cells with 2nd goal activity and cells with combined
628 activity signaling the vector and spatial goal of the 2nd saccade. Despite these separate
629 loci of activity, this does not mean there is an ambiguity in the signals representing the
630 target for the 2nd saccade, rather, the multiple sites are a consequence of the 2nd saccade
631 target being represented in different reference frames. We think it is most likely that
632 around the time of the 1st saccade, the predictive remapping process results in the
633 cessation of activity at the 2nd goal locus and the validation and strengthening of activity
634 at the 2nd vector locus. This strengthened locus of activity would then be in register with
635 appropriate movement cells to generate the next saccade in the sequence. It is entirely
636 possible that cells with 2nd saccade vector activity that we observed did not comprise a
637 fundamentally different class of neurons separate from those with 2nd saccade goal
638 activity. In fact, a number of cells modulated their activity to indicate the direction of
639 both 2nd saccades and 2nd goals. Instead, 2nd saccade vector cells may be part of the sub-
640 population of cells with advanced predictive activity that show the effects of predictive
641 remapping at an earlier time than do the cells identified with 2nd saccade goal activity
642 alone.

643 SALIENCE AND SACCADE PROBABILITY

644 There are many factors working together to direct our gaze when we scan or
645 search a natural scene. Models that rely on salience maps to predict eye movements do
646 well when subjects freely view images, and appear to be relevant for both humans and
647 rhesus monkeys (Berg et al. 2009; de Breeht and Saiki 2006; Itti and Koch 2001; 2000;
648 Peters et al. 2005). However, it has been known for some time that bottom-up influences

649 cannot entirely account for scan paths, especially when people are not freely viewing a
650 scene. Asking subjects to evaluate a scene in different ways, or to memorize its content,
651 results in scan paths that focus on specific elements of the scene and ignore others
652 (Hayhoe and Ballard 2005; Yarbus 1967). In effect, cognitive control overrides the
653 automatic bottom-up saliency of objects, and makes objects that match an internal
654 representation of the target more salient (Pomplun 2006). Our search task elicited this
655 form of top-down control as monkeys searched scenes for the embedded target. Our
656 results show that changes in a FEF cell's activity that predict future saccades are likely to
657 be based upon internal plans to make saccades or shift attention to particular locations.
658 As mentioned above, in our paradigm, every saccade brings a new visual stimulus into
659 the receptive field of every visual and visuomovement neuron. Under these conditions,
660 visual elements in the image with a high level of saliency may increase a cell's activity;
661 possibly even before the eye movement that places the salient stimulus in the receptive
662 field. We are currently investigating this possibility (Fernandes et al. 2009). For this
663 report, however, our findings depend entirely on where the monkey moved its eyes.

664 For the oculomotor field, the term salience carries more than a pure bottom-up
665 sensory meaning to include top-down influences important for guiding eye movements
666 under task conditions (Thompson et al. 2005a). Even though it has been shown that the
667 representation of salience or saccade probability in FEF can be dissociated from actual
668 saccade production, we cannot make that separation in our experiments (Bichot et al.
669 2001; Thompson et al. 1997; Thompson et al. 2005b). We have no independent measure
670 of the monkey's intent. We can examine the data only with respect to where eye
671 movements are made. Nevertheless, our results are entirely consistent with and lend

672 support to the idea of a target salience or saccade probability map in the FEF where
673 during each fixation, the locus of highest activity specifies the vector of the upcoming
674 saccade. This locus of highest activity would be accompanied by other less robust loci of
675 activity arising from cells with advanced predictive activity representing the goal of the
676 2nd saccade as well as a remapped spatial goal signal in the form of an oculocentric 2nd
677 saccade vector signal.

678 RAPID TARGET SELECTION

679 Becker and Jürgens (1979) demonstrated that under conditions where the delay
680 between first and second target light is sufficiently short, saccades can be programmed in
681 parallel in the double step task. Murthy and colleagues (Murthy et al. 2007; Murthy et al.
682 2001) have demonstrated that a similar process takes place in a search-step task where the
683 search target is moved to a new location at a variable delay before the beginning of the
684 saccade to the original target location. As the delay between target appearance at its
685 original location and its step to a new location increased from 30-140 ms, there was
686 increasing probability that a saccade would be made to the first target location followed
687 by a corrective saccade to the new location of the target. Under these conditions, FEF
688 visual, visuomovement, and movement neurons all showed increases in activity that were
689 preparatory for the corrective saccade at or even before the end of the first saccade that
690 was made in error to the original location of the target. This activity is analogous to what
691 we observe in the scene search task in that the changes in activity of visual and
692 visuomovement neurons occur before new visual input at the end of the error saccade is
693 available. In the search-step task, this provides a rapid mechanism for generating
694 corrective saccades. Murthy and colleagues (Murthy et al. 2007) report mean ROC

695 discrimination times of 40 ms after the end of the first saccade for visual neurons and 60
696 ms for visuomovement cells. This is comparable to the discrimination times we found of
697 56 ms for visual and 57 ms for visuomovement cells. Similar activities have been
698 observed in the monkey SC by McPeck and Keller (2002b), who observed increases in
699 activity of visuomovement neurons analogous to the 2nd goal activity seen in our
700 experiments. In the scene search task of our experiments, we have not developed a way to
701 distinguish when the monkey is making a corrective saccade or an abrupt change in plans
702 regarding where to make the next saccade. The prevalence of early predictive activity that
703 we see suggests that it is part of the normal saccade generation process and is not present
704 only when abrupt changes in saccade target are introduced.

705 PLANNING SACCADE SEQUENCES DURING NATURAL IMAGE SEARCH

706 The processes of predictive visual remapping, maintenance of salience and
707 saccade probability maps, and the rapid correction of error saccades are all components
708 of a saccade planning process. Our analysis of saccade latencies during scene search
709 indicate that the monkey identified the target before it was foveated, and revealed
710 distributions of latencies that were similar to those generated by humans engaged in
711 active visual search (Harwood et al. 2008; Hooge et al. 2005). These findings infer the
712 presence of a plan for future movements beyond the next movement in the sequence.
713 Whether or not the monkey makes a plan for multiple saccades at a conscious level is
714 unknown. Nevertheless, our results along with those described above demonstrate FEF
715 activities that comprise a movement plan that includes the next saccade as well as the one
716 that will follow it. It is unknown whether or not this plan extends further into the future.
717 Clearly the FEF does not function alone in this process. The supplementary eye field, for

718 example, has been implicated in saccade ordering in learned sequences of saccades
719 (Histed and Miller 2006; Isoda and Tanji 2003; Lu et al. 2002).

720 There is a rich history of studies to reveal if and how sequences of multiple
721 movements are planned. Early studies of rapid movement sequences focused on
722 behavioral evidence for planning, arguing that increases in reaction time for longer
723 sequence lengths in speech and typing experiments were due to advanced planning
724 (Rosenbaum et al. 1983; Rosenbaum et al. 1984; Sternberg et al. 1978). Advanced
725 planning theories argue that motor programs for movement sequences are constructed
726 and stored before motor execution begins and that the latency for the first movement
727 reflects the time to retrieve information from a stored plan (Henry and Rogers 1960).

728 Studies of sequences of saccades in humans have also shown increases in latency
729 with sequence length. In a study by Inhoff (1986), human subjects were required to make
730 1 to 3 saccades after the appearance of a visual cue. The paradigm was run under two
731 different conditions. In the parafoveal cue condition asterisks on the screen after the go-
732 signal served as targets for the saccades, and saccades could be programmed and
733 generated serially. In the no cue condition, subjects were told the number of saccades to
734 make before a block of trials began, and had to maintain an internal representation of the
735 motor program in memory. Saccade latency increased only in the no-cue condition,
736 suggesting that saccade sequences can be programmed and executed by different
737 mechanisms. Shortly after the Inhoff study, Zingale and Kowler (1987) reported a linear
738 increase in first saccade latency as the number of saccades in the sequence increased. In
739 contrast, other studies of human saccades have failed to show a response complexity
740 effect between sequences of single and multiple saccades (Pratt et al. 2004; van

741 Donkelaar et al. 2007), most likely due to differences in tasks used versus those used by
742 Inhoff, Zingale, and Kowler. These differences emphasize that different tasks may recruit
743 different motor sequence planning mechanisms.

744 The structure of the scene-searching task attempted to approximate real-world
745 conditions. The design of pop-out oddball discrimination tasks forces the choice of next
746 saccade to take place after the search array appears and the target has been identified. No
747 plan can exist before fixation starts, or even while fixating before array onset. Saccades in
748 the real world however are not made in isolation. During natural visual search, visual
749 processing is continuous, and what lands in a cell's receptive field may have already been
750 identified during a previous fixation. Under these conditions, plans for future eye
751 movements may develop continuously within sub-populations of FEF neurons, with the
752 timing and strength of activity modulation playing a crucial role in determining the order
753 and direction of future eye movements.

754

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ACKNOWLEDGEMENTS

756

We are grateful to Angela Nitzke for technical assistance, to Konrad Kording for

757

comments on a draft of this manuscript, and to the anonymous reviewers for many

758

helpful comments regarding the analysis and interpretation of these experiments.

759

GRANTS

760

This work was supported by the National Institutes of Health Grants EY08212

761

and EY07128.

762

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948

FIGURE LEGENDS

949 **FIGURE 1. SCENE SEARCH TASK.** *A.* Sample scene with embedded target fly. Monkey's
950 eye traces during the trial appear in yellow. Bottom right: zoom in on target for better
951 visibility. *B.* Extraction process for saccades of this trial. Blue = response-field; Red =
952 anti-response-field; Green = neutral fields; Gray = excluded border zones. *C.* Polar plot
953 of vector endpoints for all saccades made while recording activity from the neuron with
954 response-field depicted in part B.

955

956 **FIGURE 2. SACCADES EXCLUDED FROM ANALYSIS.** Activity recorded at the colored
957 fixation spots were excluded for varying reasons. *A.* Although saccade A is towards the
958 response-field, activity recorded while fixating at the gray spot is excluded because the
959 vector of the preceding saccade also was directed towards the response-field. *B.* Saccade
960 B was excluded in our second analysis because due to the size of FEF response-fields, the
961 portion of the scene located around the gray spot was in the cell's response-field for two
962 successive fixation periods (blue and green spots). Therefore, early increases in activity
963 while fixating at the green spot could have been due to prior activation during the
964 previous fixation period. *C.* Second goal activity recorded while fixating at the location
965 marked by the blue spot was excluded because although the 2nd goal (the endpoint of
966 vector C) was towards the response-field, the second saccade (saccade B) was as well.

967

968 **FIGURE 3. EARLY PREDICTION TIMES DURING THE SCENE SEARCH TASK.** *A.* Representative
969 visual cell. Rows 1 and 2 show spike rasters and spike density curves for mean firing

970 rates during the fixation period prior to saccades made into the response-field (Blue), and
971 into the anti response-field (Red). Row 3 compares the firing rates between the two
972 conditions, and indicates the ROC prediction time (Green line). Black vertical lines
973 indicate the beginning of the fixation period before the saccade (red dots in rasters).
974 Activity occurring after the mean saccade latency shaded in gray. Row 4 displays the
975 same cell's activity during the memory-guided saccade task. Activity is aligned by target
976 onset (left) and saccade onset (right). Onset of visual response indicated by vertical green
977 line. The cell fires strongly after target onset, but not before the saccade. *B*.
978 Representative visuomovement cell. *C*. Comparison between the mean visual response
979 latency and the ROC prediction times for visual and visuomovement cell. Mean visual
980 response latency was significantly greater than the ROC prediction times for either type
981 of FEF cell.

982

983 FIGURE 4. SECOND SACCADE AND SECOND GOAL DETERMINATIONS. Solid arrows
984 indicate examples of two successive saccades. Often a single trial yielded multiple
985 saccade pairs for analysis. Activity obtained during the fixation period preceding the
986 saccade pairs was analyzed for predictive activity (gray circle). *A*. Second saccade
987 analysis. Instances in which the 2nd saccade was directed into the response-field (top,
988 solid blue arrow) were compared with cases in which the 2nd saccade was directed away
989 from the response-field (bottom, solid red arrow). These sequences were included
990 because vectors of both the 1st saccade (solid green arrows) and the 2nd goal (dotted green
991 arrows) fell in neutral areas far from the response-field or its opposite direction. *B*.
992 Second goal analysis. Instances in which the 2nd goal was within the response-field (top,

993 dotted blue arrow) were compared with cases in which the 2nd goal was located in a
994 direction opposite to that of the response-field (bottom, dotted red arrow). These
995 sequences were included because vectors of both the 1st saccade and 2nd saccades (solid
996 green arrows) fell in neutral areas far from the response-field or its opposite. The circular
997 inset in the lower right corner depicts the cell's response field in a manner identical to
998 Figure 1B.

999

1000 FIGURE 5. TYPES OF 2ND SACCADE AND 2ND GOAL PREDICTIVE ACTIVITY. We found cells
1001 that displayed 2nd saccade and/or 2nd goal predictive activity, as well as cells that did
1002 neither. *Left*. Firing rates during fixation periods in which the 2nd saccade was directed
1003 toward (blue) and away from (red) the response-field. *Right*. Firing rates during fixation
1004 periods in which the 2nd goal was located either within (blue) or at a location opposite to
1005 the response-field (red). Black vertical line indicates the beginning of the fixation period
1006 preceding the pair of saccades. Vertical green line mark the time at which ROC analysis
1007 indicated that advanced predictive activity occurred. Time after the mean latency of the
1008 1st saccade shaded in gray. *Row 1*. A cell that could predict only the 2nd saccade of a
1009 sequence, but not the goal. *Row 2*. A cell that could only predict the 2nd goal of a
1010 sequence, but not the 2nd saccade. *Row 3*. A cell that could predict both the 2nd saccade
1011 and the 2nd goal of a sequential pair of saccades. *Row 4*. A cell that did not display any
1012 advanced predictive activity.

1013

1014 FIGURE 6. TIMING OF PREDICTIVE ACTIVITY. *A*. Comparison between prediction times
1015 for upcoming saccades and future saccades. Activity that predicts the upcoming (1st)

1016 saccade occurs significantly earlier in the fixation period than that of the 2nd goal or 2nd
1017 saccade. Indicated by asterisk. *B.* Prediction times before the upcoming saccade. When
1018 FEF cells are divided into those with advanced predictive activity and those without, a
1019 clear distinction can be seen. FEF cells that combined both types of advanced predictive
1020 activity indicated the direction of the upcoming saccade significantly earlier than FEF
1021 cells that did not display advanced predictive activity. Indicated by asterisk. Cells with
1022 only 2nd goal activity also showed earlier prediction times, but this did not reach
1023 significance.

1024

1025 FIGURE 7. SHORTER SACCADE LATENCIES TO TARGET. Saccade latencies towards the
1026 target are plotted against saccade latencies towards other portions of the scene during the
1027 search. Each black dot represents mean latency data from one recording session.
1028 Regression line in **solid black**. Dotted black line indicates expected values if there were
1029 no difference in latency between the two conditions.

1030

1031 FIGURE 8. LATENCY AND AMPLITUDE FOR SACCADES TO SCENE AND TARGET. *A.*
1032 Comparison of latency of saccades to the target versus saccades to non-target portions of
1033 the image as a function of saccade order in the trial Asterisks mark number of saccade in
1034 trial where latency of saccade to target was significantly less than saccade to a non-target
1035 part of the scene. *B.* Comparison of saccade latencies and amplitudes for target and non-
1036 target saccades. Asterisks mark saccade amplitudes where latency of saccades to non-
1037 target parts of scene were significantly longer than saccades to the target. Vertical Bars
1038 mark standard error of the mean.

1039 FIGURE 9. RELATIVE TIMING OF FEF VISUAL AND VISUOMOVEMENT CELL ACTIVITY FOR
1040 THE GENERATION OF A SEQUENCE OF 2 SACCADES. After the start of fixation, at relative
1041 time-point A, cells with advanced predictive activity are the first to signal the direction of
1042 the upcoming saccade (S1). Later, at time-point B, cells without advanced predictive
1043 activity also signal the direction for S1. Later in the fixation period at time-point C,
1044 advanced predictive cells signal the spatial goal (G2) and saccade vector (S2) for the eye
1045 movement that will follow the upcoming saccade. The relative times of these activities
1046 are based upon the values illustrated in Figure 6 and discussed in the text.

1047

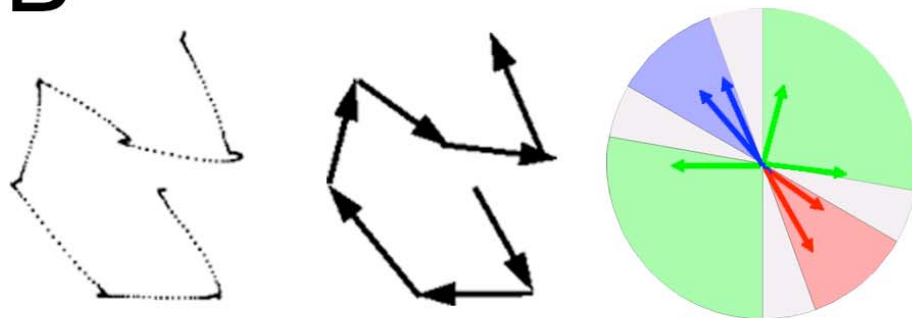
1048 FIGURE 10. DISTRIBUTION OF FRONTAL EYE FIELD CELLS WITH AND WITHOUT ADVANCED
1049 PREDICTIVE ACTIVITY. This diagram shows the relative numbers of visual neurons with no
1050 motor activity and visuomovement neurons with motor activity. The distribution of these
1051 2 cell types across the groupings of cells with and without advanced predictive activity
1052 was roughly the same.

1053

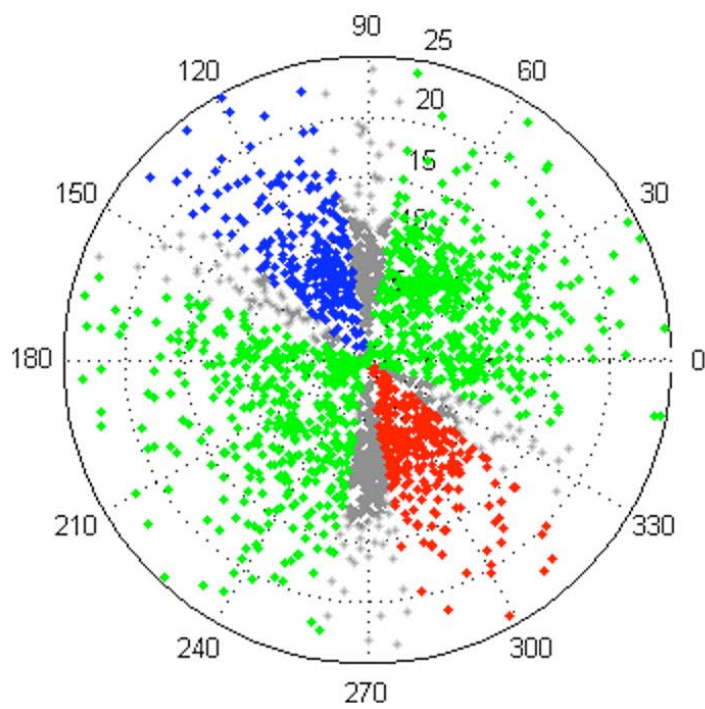
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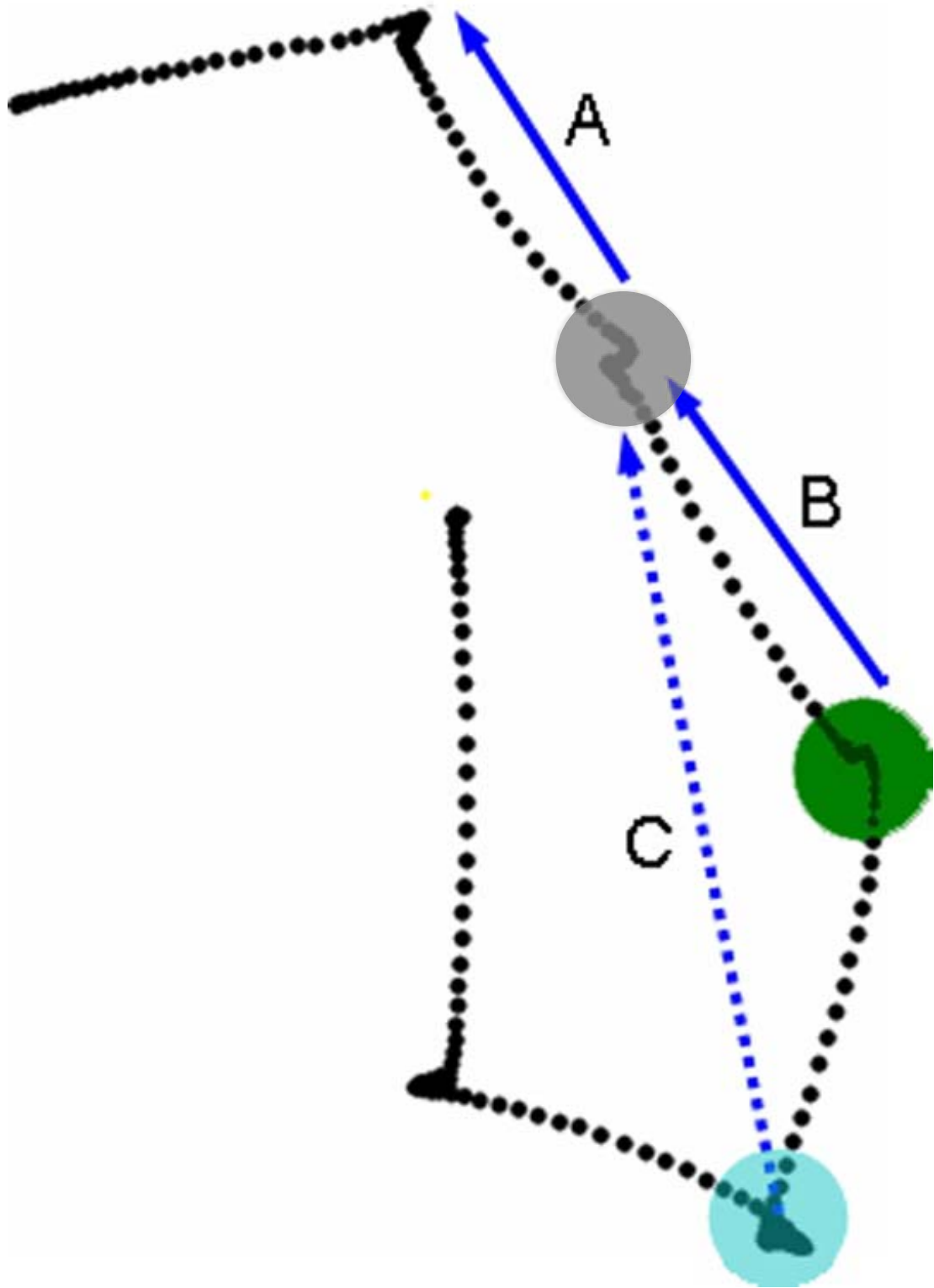


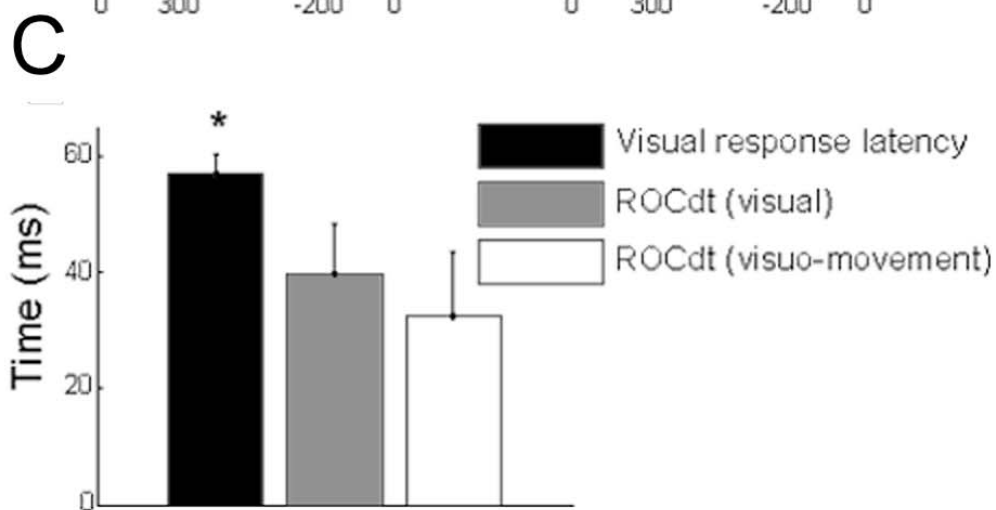
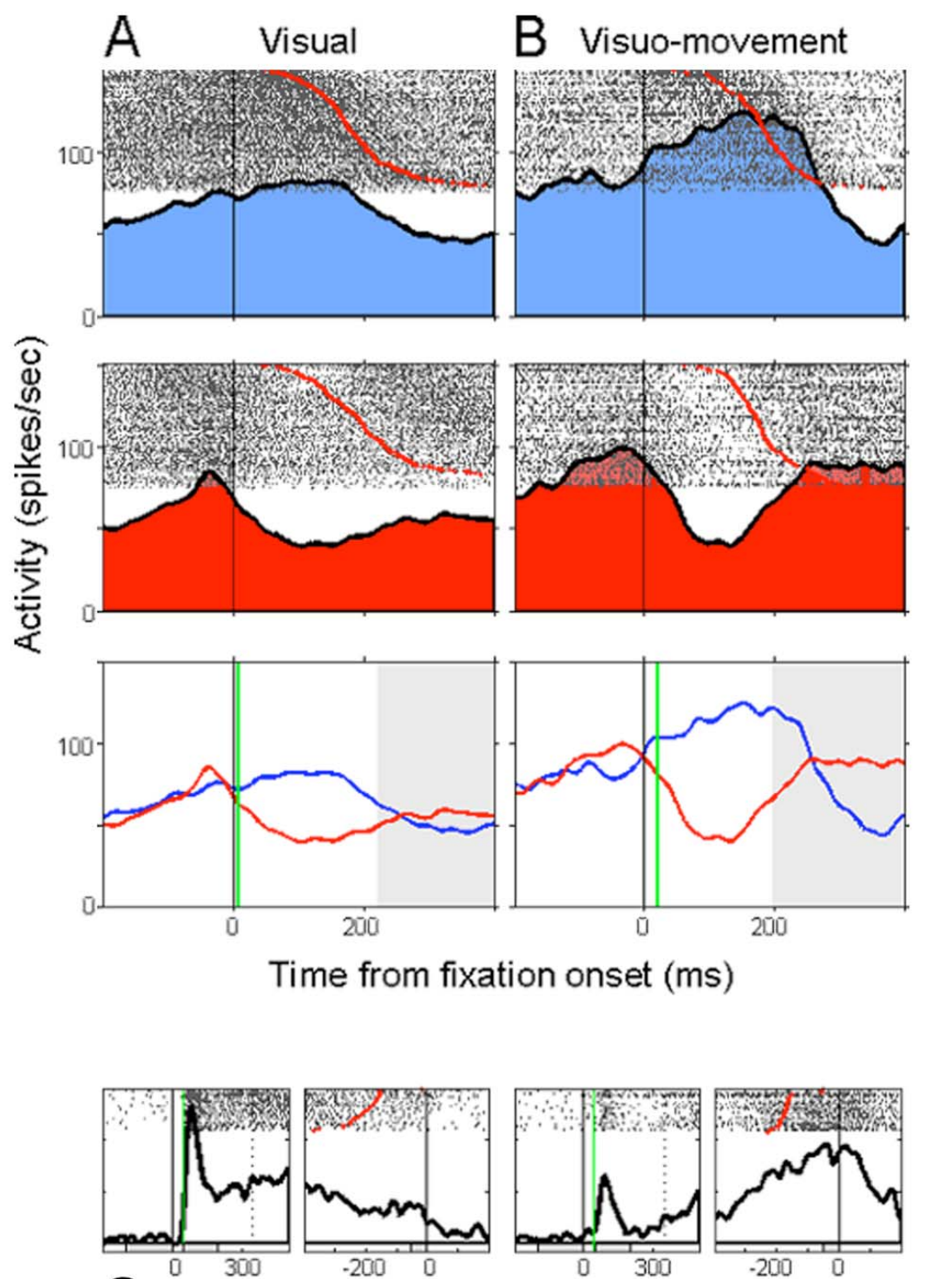
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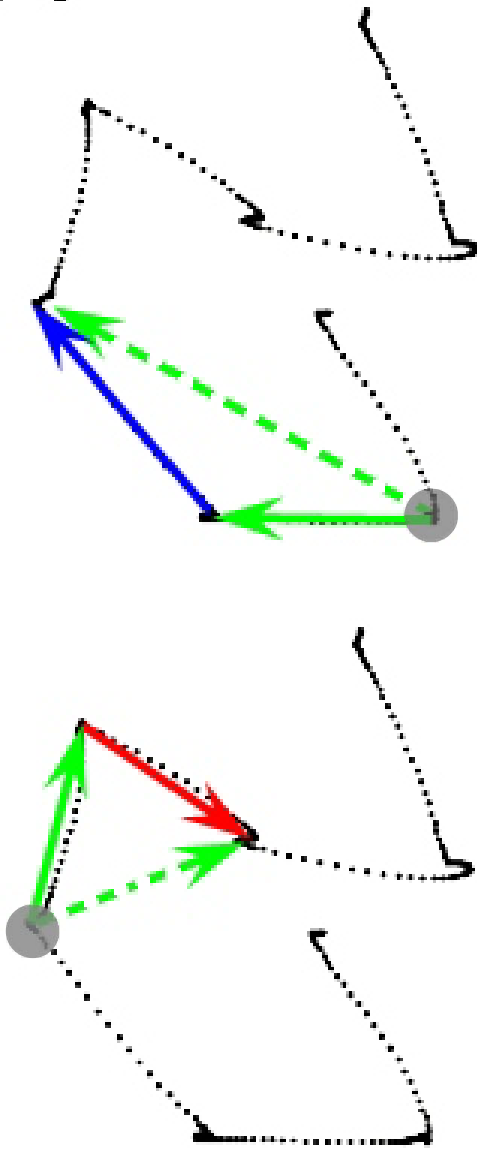
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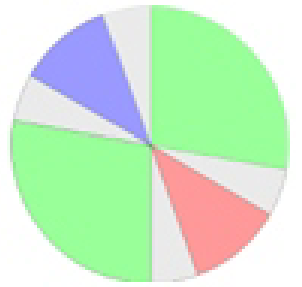
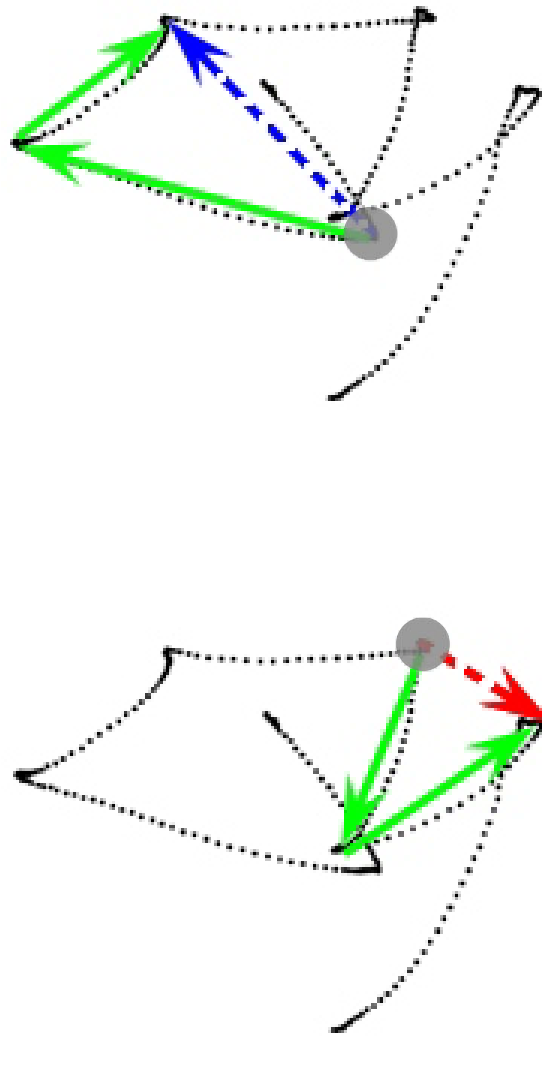




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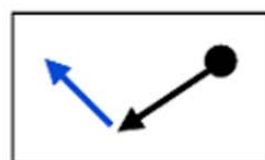


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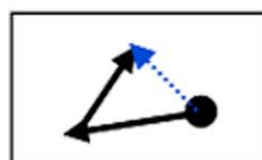


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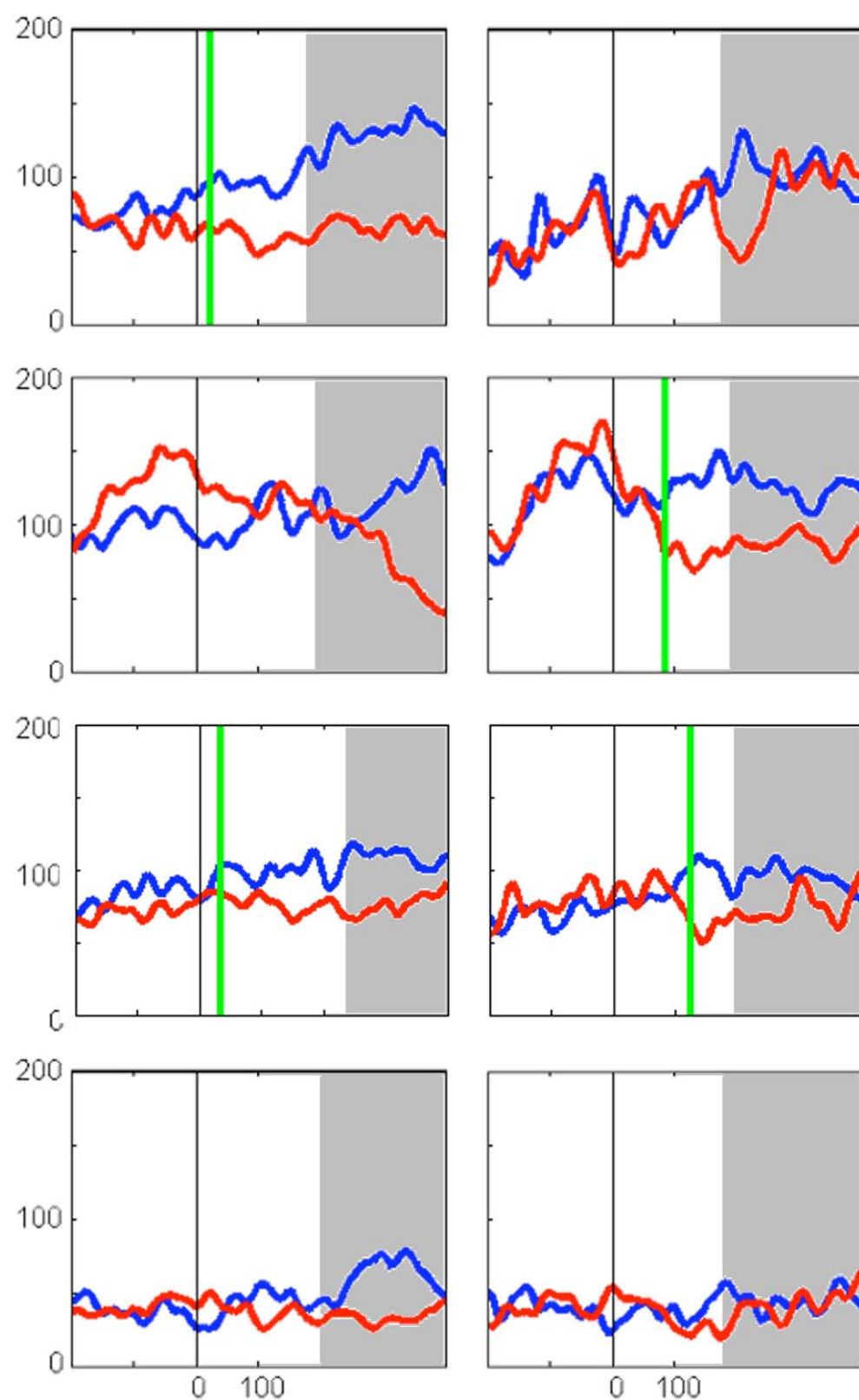
2nd saccade



2nd goal

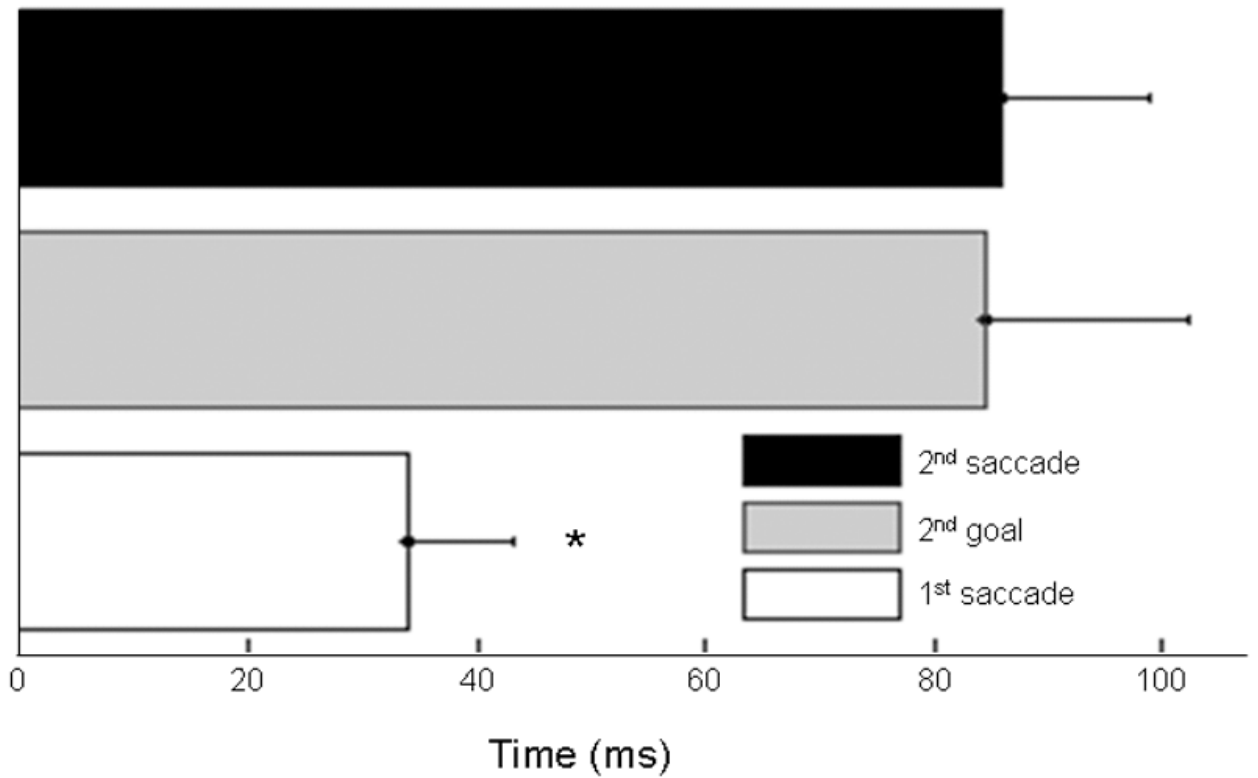


Activity (spikes/sec)



Time from fixation onset before
2-saccade sequence

A Prediction time for upcoming vs. future saccades



B Prediction time before the upcoming saccade

