Body saccades of *Drosophila* consist of stereotyped banked turns

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kinematics and aerodynamics showed that flies control aerodynamic torques during the saccadeprimarily by adjusting the timing and amount of span-wise wing rotation.

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INTRODUCTION

27 When exploring a local environment, many species of flies exhibit a flight pattern consisting of straight segments interspersed with rapid turns called body saccades (Collett and Land, 1975; 28 29 Tammero and Dickinson, 2002; Wagner, 1986; Wehrhahn et al., 1982). This distinct flight 30 pattern might serve many functions, but one likely advantage is that the quick turns allow flies to 31 restrict the time periods during which their visual system is severely compromised by motion 32 blur (Collett and Land, 1975; Hateren and Schilstra, 1999; Land, 1999; Schilstra and Hateren, 33 1999). Whatever the function, it appears to be the preferred means of changing direction in some 34 species. For example, a recent analysis of *Drosophila melanogaster* found that more than 80% of 35 all changes in heading occur via body saccades (van Breugel et al., 2012).

36 There is some controversy regarding the neural mechanisms that trigger saccades in 37 Drosophila (Dickinson, 2014). Several studies of both free and tethered flight behavior suggest 38 that most saccades are triggered by visual expansion and thus represent collision avoidance 39 reflexes that protect flies from flying into large obstacles or avoiding clutter (Censi et al., 2013; 40 Reiser and Dickinson, 2013; Stewart et al., 2010; Tammero and Dickinson, 2002). Other studies, 41 however, suggest that some saccades are triggered internally by a deliberately stochastic process 42 that functions to optimize the animal's search efficiency (Maye et al., 2007; Reynolds and Frye, 43 2007). In addition, flies exhibit rapid turns in other contexts, such as when they lose contact with 44 an odor plume (van Breugel and Dickinson, 2014), or in response to a rapid visual expansion as 45 might be created by an approaching predator (Muijres et al., 2014). It is not known, however,

whether rapid turns elicited by different stimuli or internal triggers operate via a single commonmotor program.

48 The aerodynamic basis of saccades, which is the main subject of this paper, has been 49 investigated previously by Fry and coworkers using the fruit fly, *Drosophila melanogaster* (Fry 50 et al., 2003). Based on a relatively small number of high speed video sequences, these authors 51 proposed a model in which flies change course primarily by creating torque around their yaw 52 axis (defined in that study as perpendicular to the longitudinal body axis), which they accomplish 53 by simultaneously changing stroke amplitude and deviations out of the stroke plane. In addition, 54 these authors reported that the changes in wing kinematics were biphasic, which they interpreted 55 as indicating that flies generate first torque and then counter-torque during each maneuver. 56 Finally, they presented a simple model in which the dynamics about the yaw axis were 57 dominated by inertia during the brief maneuvers, consistent with the production of counter-58 torque (Fry et al., 2003). Subsequent authors, however, challenged some conclusions of this 59 simple model. Hesselberg & Lehmann (2007) noted that due to the reciprocating pattern of wing 60 motion, the damping about the yaw axis is quite large and should quickly dominate dynamics 61 during turns – a calculation that was supported by subsequent models and measurements (Cheng 62 et al., 2010; Dickson et al., 2010). Hedrick and coworkers (Hedrick et al., 2009) went so far as to 63 suggest that animals over a very large size range need only produce a small amount of counter-64 torque during saccades, and can rely primarily on passive damping to coast to a stop after 65 initiating a turn. Further, studies of corrective maneuvers in *Drosophila* suggested that flies 66 generate yaw torque by regulating the angle of attack of the wing during the upstroke and 67 downstroke, and not by altering either stroke amplitude or stroke deviation (Bergou et al., 2010).

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68 In this paper, we employed 3D high-speed videography to capture the wing and body 69 motion of the fruit fly, *Drosophila hydei*, during free flight body saccades. Although this study 70 repeats the basic paradigm developed by Fry and coworkers over a decade ago (Fry et al., 2003), 71 the improvements in high speed cameras as well as the utility of an automated machine vision 72 tracking system allowed us to revisit saccade dynamics with greater resolution and statistical 73 rigor. The results demonstrate that body saccades are a remarkably stereotyped behavior 74 combining a brief banked turn (requiring rotation and counter-rotation in roll and pitch) with a 75 unidirectional rotation about the yaw axis. By measuring the changes in wing motion during 76 saccades and using a dynamically-scaled robot, we were able to determine the relative 77 importance of different features of wing motion in generating forces and torques. The results 78 help to resolve some of the recent controversies regarding the dynamics of saccadic turns in 79 Drosophila and other insects.

RESULTS

82 We tracked a total of 44 flight sequences (Fig. 1, see Materials and Methods), each 83 consisting of a straight flight segment followed by a single body saccade (see Supplementary 84 Movies S1,S2). Assuming that there is no difference between left and right hand turns, we 85 mirrored all left hand turns, and then aligned all sequences based on time and heading with 86 respect to the start of the saccade (Fig. 1E,F, see also Supplementary Movies S3-S6). Heading is 87 defined as the angular direction of the flight path, not the body orientation. The saccadic turn 88 angles ($\Delta \sigma$), which quantify the total angular change in heading, varied substantially among 89 saccades from approximately 20° to almost 180° (Fig. 1E,F, Fig. 2A,B), with an average of 90 $93^{\circ}\pm 27^{\circ}$ (mean ± s.d., *n*=44). During the maneuvers, flight speed tended to dip briefly and then 91 gradually rise (Fig. 2C). The duration of turn ($\Delta t = t_{\text{stop}} - t_{\text{start}}$) was 49 ±18 ms (*n*=44), or

92approximately 9 wingbeats, although this is an underestimate of the entire maneuver because t_{start} 93and t_{stop} were defined using finite thresholds (see Materials and Methods). These basic saccade94metrics are similar to those previously reported on free flying *D. melanogaster* (Tammero &95Dickinson 2002; Frye et al., 2003; van Breugel et al. 2012).

To examine how flies alter heading during saccades, we measured the magnitude and direction of horizontal and vertical accelerations throughout the maneuver (Fig. 2D-F).

Immediately at the start of the saccade, flies generate a horizontal force that results in a sideways acceleration. The magnitude (a_{hor}/g) of this sideways acceleration first increases and then decreases (Fig. 2E), while its orientation (σ_a) remains relatively constant (Fig. 2D). Vertical acceleration (a_z/g) remains near zero throughout the entire maneuver (Fig. 2F).

102 The time course of roll rate, pitch rate, and yaw rate during the maneuvers (Fig. 1C, 2G-I) 103 along with their integrals and derivatives (Fig. S1) show that flies rotate about all principal body 104 axes, and thus body saccades constitute a banked turn. Flies also increase force production so the 105 vertical component remains roughly equal to body weight (Fig. 2J,F). The orientation of F in the 106 body reference frame remains constant (Fig. 2K,L), consistent with the so-called 'helicopter 107 model' of insect flight (David, 1978; Götz and Wandel, 1984). Thus, as with more rapid escape 108 maneuvers (Muijres et al., 2014), a fly generates sideways accelerations during saccades by 109 rotating its body rather than by adjusting the orientation of the force vector in the body frame. 110 To determine how the flies control roll, pitch and yaw throughout the saccade, we 111 estimated torque about these axes as the sum of torque required to overcome inertia (inertia 112 torque) and torque required to overcome damping (damping torque) (Fig. 3, see Eqn 2 in 113 Materials and Methods). Torque about the yaw axis consists mostly of damping torque 114 confirming that yaw rotations during a saccade are highly damped (Hedrick et al., 2009;

Hesselberg and Lehmann, 2007). In contrast, torque about the roll axis consists about equally of inertial torque and damping torque, whereas damping torque about the pitch axis is negligible compared to inertial torque. The fact that rotations about the pitch axis are poorly damped during saccades is supported by a recent study of forward flight dynamics in fruit flies (Elzinga et al., 2014).

120 A simple means of implementing a banked turn would be to rotate the body about a fixed 121 axis in the stroke plane and then to counter-rotate to continue level flight, while at the same time 122 generating a yaw rotation to align body orientation with the new flight heading. The magnitude 123 of the turn could then be adjusted by regulating the amount of torque produced, and not its 124 direction. Evidence that flies might implement such a simple control scheme is shown in Fig. 4. 125 The torque vectors for the primary rotation phase and the counter-rotation phase for all 44 126 sequences (in blue and orange, respectively) aligned remarkably well (Fig. 4A,B). The average 127 torque vector axes for the initial rotation and counter-rotation are defined as the primary torque 128 axis μ_1 and the counter-torque axis μ_2 , which are oriented 36° and 8° from the longitudinal body 129 axis, respectively. The time history of the direction (Fig. 4A) and magnitude (Fig. 4C,D) of the 130 torque component in the stroke plane exhibits a biphasic shape indicative of rotation and counter-131 rotation about the μ_1 and μ_2 axis, respectively (Fig. 4C). In contrast, little torque is generated about the orthogonal axes ($\mu_{1\perp}$ and $\mu_{2\perp}$, respectively, Fig. 4D; see also Fig. S2). Thus, animals 132 133 execute the banked turn by generating torque and counter-torque about two control-axes (μ_1 and 134 μ_2) whose orientation remains constant from saccade to saccade (Fig. 4A,B). The magnitude of 135 the torque produced about the control axes, however, does correlate with the turn angle (Fig 4F), 136 which suggests the mechanism by which flies regulate the size of the heading change.

137 Simultaneously with the rotations about the μ_1 and μ_2 axes, but within a longer time 138 scale, flies generate a unidirectional yaw torque in the same direction as the change in heading 139 (Fig. 4E). Also, the magnitude of mean yaw torque during the turn is positively correlated with 140 turn angle (Fig. 4H). Although not necessary for changing the direction of the flight path, the 141 yaw rotation is required to align the longitudinal body axis with the new heading. This correction 142 to minimize sideslip is not fully completed in most sequences due to limitations of our 143 visualization volume (Fig. 4E). Note that by rotating about the yaw axis while its body is banked, 144 the fly will generate a head down movement within the world frame of reference. This could explain why the initial body rotation axis μ_1 and counter-rotation axis μ_2 are not aligned and that 145 146 μ_2 includes a smaller pitch (down) component.

147 The sequence of 21 averaged wingbeats (n=44 trials) show that all kinematic parameters 148 (wingbeat frequency, stroke angle, deviation angle, and wing rotation angle, Fig. 1C) change 149 during a saccade, and that these modifications are all very subtle (Fig. 5A-G). Wingbeat 150 frequency increases by only a few Hz and all modifications in wing angles are less than 5°. 151 Nevertheless, replaying the averaged kinematic sequence on the robotic fly generated normalized 152 forces (|F|) and torques (T_{roll} , T_{pitch} and T_{yaw}) that were similar to those estimated from body 153 dynamics (using Eqns 1-2 in Materials & Methods, respectively, Fig. 5H-K). For example, the 154 time history for the moment about the roll axis measured on the robotic fly exhibits the torque 155 and counter-torque that is predicted from body dynamics (Fig. 5I). Thus, although the measured 156 changes in wing motion are subtle, they appear sufficient to capture the requisite changes in 157 forces and moments reasonably well. Because the robotic fly is fixed and cannot translate and 158 rotate in response to the forces and moments it generates, we did not expect (nor obtain) a perfect 159 match between the measured forces and moments and those calculated from body dynamics.

160 To better understand how flies modulate wingbeat kinematics to control torque around 161 each individual control axis during a saccade, we extracted the wing kinematics associated with 162 peak torque about the μ_1 , μ_2 , and yaw axes from the entire dataset and replayed these kinematics 163 on the robotic fly (Fig. 6, see Materials & Methods). The kinematics correlated with peak torque 164 production exhibit distortion of all three wing angles (Fig. 6A-C), and when played through the 165 robot, produced the expected torques (Fig. 6D-F). The fly's wing motion is able to create 166 positive yaw torque throughout almost the entire wingbeat, with the exception of brief periods during stroke transitions (Fig. 6D). In contrast, torque production about the μ_1 and μ_2 axes is 167 168 more complicated in that the time history includes both positive and negative excursions and the 169 magnitude of the transient peaks are quite large relative to the average value (Fig. 6E). Most of 170 the variations in torque production relative to the torque generated by the steady flight wingbeat 171 (i.e. the symmetric wingbeat that produced weight support and no net torque, Fig 1D), occur at 172 the start of the upstroke and downstroke, just after stroke reversal (Fig. 6E). The wingbeat patterns that generate peak torque about the μ_1 and μ_2 axes create very little mean torque about 173 the orthogonal axes ($\mu_{1\perp}$ and $\mu_{2\perp}$), even thoughout the magnitude of the oscillations through the 174 175 stroke is quite large (Fig. 6F).

Next, we constructed a set of systematically distorted stroke patterns ranging from steady flight conditions to kinematics that generate peak torque about the μ_1 , μ_2 , and yaw axes, and then replayed these on the robot (see Materials & Methods). For yaw, torque measured using the robot matched the values derived from body motion (Eqn 1) throughout the entire range of distorted kinematics (average difference ~2%, Fig. 7A). For the μ_1 and μ_2 axes, the torques derived from body motion are about 66% and 59% (respectively) from that measured with robofly, suggesting that the dynamic model for roll and pitch (Eqns 2-4) may be oversimplified

183 or that the torque measured using a robot in a fixed reference frame do not accurately model the 184 free flight case. We also measure the cross-talk (i.e. torque generated around orthogonal axes) 185 produced by the kinematics associated with production of peak torque around the different 186 torque axes. For the yaw case, the cross-talk about the roll and pitch axes was -24% and 27% of $|T_{yaw}|$, respectively (Fig. 7A). For the μ_1 case, the cross-talk about the $\mu_{1\perp}$ and yaw axes was 3% 187 and 45% of $|T\mu_1|$, respectively, and for the μ_2 case, the cross-talk around the $\mu_{2\perp}$ and yaw axes 188 189 was 23% and 47% of $|T\mu_2|$, respectively (Fig. 7B). The cross-talk between the yaw torque and 190 torque about the axes in the stroke-plane (Fig. 7A,B) shows that our method did not enable us to 191 completely separate the effect of torque and force production about the different principal axes. 192 This is most likely due to the fact that during saccadic maneuvers, flies increase force production 193 and produce torque about the different axes in synchrony. So, wingbeats that produced large 194 torque about the axes in the stroke-plane tended to also produce high yaw torque and increased 195 aerodynamic forces (Figure 5).

196 Next, we varied the kinematics for each of the three wing angles in isolation to determine 197 their relative contribution to torque (Fig. 7C,D). As was also the case for evasive maneuvers 198 (Muijres et al., 2014), the sum of torques resulting from modulating the different components of 199 wing motion separately matches the torque generated by modulating all components 200 simultaneously, indicating a remarkable degree of linearity. For all torque axes, wing rotation 201 angle had the strongest effect on changes in total torque, whereas changes in stroke amplitude 202 and stroke deviation contribute modestly to the control of torque around the μ_1 and μ_2 axes and 203 make almost no contribution to the control of yaw torque (Fig. 7C,D).

As suggested by a previous study of *D. melanogaster*, a change in the mean offset of the rotation angle will create yaw torque by increasing the angle of attack during one half-stroke and 206 decreasing it on the other (Bergou et al., 2010). However, another means by which wing rotation 207 might influence torque is through changes in the timing of wing rotation relative to stroke 208 reversal, which can change forces via unsteady mechanisms (Dickinson et al., 1999). To explore 209 the relative importance of these two potential mechanisms, we estimated both the relative phase 210 shift and mean offset of the time course of the wing kinematic angles for the left and right wings 211 during the strokes that generated peak torque (Figs 8, S3). Figure 8C-F shows that there is a 212 phase shift of $\sim 5^{\circ}$ in the wing rotation angle of the left wing relative to the right during wing 213 strokes that produce peak torque around the μ_1 and μ_2 axes, but there is no evidence for a change in mean offset. In the case of yaw torque, a phase shift of $\sim 3^{\circ}$ is accompanied by an offset of $\sim 4^{\circ}$. 214 215 Thus, although torque about the yaw, μ_1 , and μ_2 axes are all primarily controlled by changes in 216 the time course of wing rotation, our results suggest that the relative mechanisms are different. 217 Flies regulate the torque about the μ_1 and μ_2 axes by modulating unsteady rotational lift 218 mechanisms during stroke reversal (Dickinson et al., 1999), whereas yaw torque is controlled by 219 a combination of unsteady effects at stroke reversal and differences in drag during the 220 translational phase of the two half strokes (Bergou et al., 2010). This interpretation is consistent 221 with the time history of the changes in torque throughout the wingbeat for the kinematics that 222 produce peak torques (Fig. 6). Yaw torque is produced mostly during the translation phase of the 223 wingbeat (Fig. 6D), which is indicative of an asymmetry in drag production between the two 224 wings. In contrast, changes in torque about the μ_1 and μ_2 axes (relative to a steady wing stroke) 225 occur mostly at the start of each wingstroke (Fig. 6E), suggesting modulations in rotational 226 effects.

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DISCUSSION

229 Our analysis showed that fruit flies perform body saccades by executing stereotyped 230 banked turns (Fig. 2). The axes of the initial rotation (μ_1) and subsequent counter-rotation (μ_2) are aligned 36° and 8° from the roll axis of the fly, respectively (Fig. 4B). Flies control the size of 231 232 the turn by regulating the magnitude of torque around these rotation axes (Fig. 4F), and not by 233 adjusting their orientation as they do during more rapid escape maneuvers (Muijres et al., 2014). 234 Flies also rotate unidirectionally around the yaw axis during saccades to correct for the 235 misalignment between body orientation and heading (i.e. sideslip) that accumulates as a result of 236 the banked turn.

237 Using a simple dynamic model, we were able to estimate the relative contribution of 238 inertia and damping during a saccade (Fig. 3). We found that yaw dynamics are dominated by 239 passive damping that results from the reciprocal flapping pattern, as suggested by Hesselberg & 240 Lehmann (2007). Pitch dynamics, in contrast, are dominated by inertia, and the contribution of 241 damping and inertia in roll dynamics is roughly equal. Thus, saccade dynamics are quite 242 complex and accurate models must include both inertial and damping terms (Bergou et al., 2010; 243 Cheng et al., 2010; Dickson et al., 2010; Fry et al., 2003; Hedrick et al., 2009; Hesselberg and 244 Lehmann, 2007). The model for rapid turns proposed by Hedrick and coworkers (2009) in which 245 insects rely primarily on passive damping to generate counter-torque may not be as general as 246 proposed, assuming that other insects also employ banked turns and do not simply rotate about 247 the yaw axis.

248 The maneuver that we have measured in fruit flies using high speed videography is 249 similar to the body saccades of blowflies, measured elegantly by Schilstra & Hateren (1999) 250 using tiny inductive coils. Thus, at least two species of flies, encompassing a rather large range in scale, execute banks turns to produce rapid changes in flight direction. Given the high degree
of similarity within their nervous systems, it is likely that body saccades of *Drosophila* and *Calliphora* are generated by homologous circuits.

254 Visually-elicited escape maneuvers (Muijres et al., 2014) and voluntary body saccades in 255 fruit flies both consist of a banked turn, but the dynamics of the two maneuvers are different 256 enough to suggest that they are produced by distinct motor programs. Although body saccades 257 are fast, the changes in heading during evasive maneuver are faster, consistent with a more 258 pronounced rotation of the body that reorients the mean force vector to produce a larger 259 horizontal component. As a consequence, flies do not maintain weight support during the initial 260 stages of an escape maneuver, whereas they do during body saccades (Fig. 2F,J). Similarly, yaw 261 is poorly controlled during the initial stages of an evasive maneuver, resulting in large sideslip 262 angles that are corrected long after the fly changes heading. During a body saccade, the yaw 263 correction is better coordinated with the banked turn, so that sideslip is minimized throughout the 264 maneuver. Perhaps the greatest difference between the two maneuvers relates to the manner by 265 which the magnitude of the change in heading is controlled. Flies regulate the turn angle of a 266 saccade by varying torque magnitude about two highly stereotypic axes (μ_1 and μ_2), whereas 267 during evasive maneuvers the turn angle is controlled by adjusting the direction of the body 268 rotation axis within the stroke plane. One interpretation that unifies all these differences is that 269 evasive maneuvers may be optimized to alter flight heading as quickly as possible at the expense 270 of flight control and motion blur, whereas body saccades are optimized to restrict retinal slip to a 271 brief period.

The transition from rotation to counter-rotation during a body saccade is quite fast and such a pattern might be generated in a feed-forward manner by a central motor program or,

274 alternatively, the initial rotation might trigger the counter-rotation via a sensory-mediated reflex. 275 The halteres are a likely source of such feedback, as they mediate compensatory reactions to 276 imposed rotations (Dickinson, 1999; Nalbach, 1994; Ristroph et al., 2010; Sherman and 277 Dickinson, 2003). Previous studies of saccades using a magnetic tether in which the animal is 278 free to rotate about its yaw axis suggest that haltere feedback, but not visual feedback, plays a 279 role in terminating saccades (Bender and Dickinson, 2006b). Interpretation of these prior 280 experiments using magnetic tethers is complicated, however, by the new free flight data which 281 show that *Drosophila* bank to change direction at the start of the saccade. Given their time 282 course, the slow unidirectional saccade-like rotations that flies exhibit on magnetic tethers most 283 likely represent the slower yaw phase of a free flight saccade. Thus, the manipulation 284 experiments performed by Bender and Dickinson (Bender and Dickinson, 2006b) might indicate that haltere feedback is involved in regulating the duration of the slower vaw correction phase of 285 286 a saccade but do not directly address the question of whether feedback triggers the faster 287 counter-rotation phase of the initial banked turn.

288 By exploiting the high throughput capabilities of our tracking system, we were able to 289 make accurate measurements of the changes in wing motion during saccades (Fig. 6). All three 290 wing angles (ϕ, γ, α) exhibit a biphasic modulation during the time course of the saccade, as 291 expected from the production of torque and counter-torque (Fig. 5B-G). These data are 292 consistent with the previous observations of Fry and coworkers (Fry et al., 2003), although these 293 authors misinterpreted this biphasic pattern as indicating active breaking around the yaw axis, 294 when it is more likely that they observed evidence for the counter-rotation about the μ_2 axis. 295 Replaying the pattern of wing motion on a stationary robot generated a time history of forces and 296 moments that matched those derived from free flight body dynamics reasonably well, but not

297 perfectly (Fig. 5H-K). The match for total flight force and yaw were quite good, whereas roll 298 torque based on the wing kinematics and the robot measurements were larger than roll torque 299 derived from body dynamics. This mismatch is perhaps not too surprising, given that the saccade 300 basically consists of a rapid roll and counter-roll (i.e. the μ_1 and μ_2 axes are not too far off the 301 roll axis). Thus, errors that derive from the fact that the kinematics from a rotating fly were 302 replayed on a stationary robot would be particularly large for this degree of freedom. Other 303 sources of error include the possible inaccuracies of our dynamics model, which did not include 304 cross terms and used damping coefficients based on steady-state approximations.

305 By mining the entire database, we were able to determine the pattern of wing motion that 306 correlated with peak torque production around the μ_1 , μ_2 , and yaw axes (Fig. 6), and then to 307 determine the relative contribution of the three wing angles to the moments by playing 308 systematically distorted wing patterns through the robotic fly (Fig. 7). The results indicate that 309 changes in the time history of the wing rotation angle, which strongly influences the angle-ofattack, are by far the most important for regulating torque about the μ_1 , μ_2 , and yaw axes (Fig. 310 311 7C,D). However, the torque modulations about the yaw axis and about the two axes in the stroke 312 plane (μ_1 and μ_2) appear to occur via two distinct aerodynamic mechanisms (Fig. 8). As 313 suggested by Bergou and coworkers (2010), changes in the mean offset of the wing rotation 314 angle magnitude lowers the angle-of-attack during one half stroke while raising it on the other, 315 thus producing an upstroke-to-downstroke imbalance in drag and thus net torque around the axis 316 normal to the stroke plane. Although our results support this mechanism (Fig. 6A,D and Fig. 317 7A,B), we also found that the flies adjust the relative phase of wing rotation as well, thus 318 creating additional yaw torque via unsteady mechanisms at stroke reversal (Dickinson et al., 319 1999; Sane and Dickinson, 2002). Flies also create torque about the μ_1 and μ_2 axes via changes

in wing rotation angle, but in these cases the effect appears to be mediated almost entirely by
changes in phase, and thus through unsteady effects at stroke reversal (Fig. 6E and Fig. 7C-F).
One possible explanation for this difference is that changes in angle of attack during the
translational portion of the stroke would be undesirable for regulating roll because they would
generate large cross-talk in yaw torque.

325 A quite surprising result of our analysis was the relatively small importance of stroke 326 amplitude and stroke deviation in the control of torque during saccades (Fig. 7C,D). This was 327 particularly true for yaw torque, an observation that complicates interpretation of many tethered 328 flight studies, which collectively show that flies generate large changes in stroke amplitude in 329 response to both visual and mechanosensory rotations about the yaw axis (e.g. Sherman & 330 Dickinson 2003), as well as transient spontaneous changes that have been ubiquitously 331 interpreted as fictive saccades. These changes in stroke amplitude were quite large and clearly 332 correlated with yaw torque (Tammero, 2004). Why do tethered flies generate such large changes 333 in stroke amplitude that do not seem necessary to generate yaw torque in free flight? One 334 possibility is that the stroke amplitude signal measured during fictive saccades is indicative of 335 the roll and pitch required for a banking maneuver, and not for yaw production *per se*. If true, 336 this has immediate implications for the underlying circuitry as it is noteworthy that the stroke 337 amplitude changes associated with fictive saccades are unidirectional, i.e. there is no evidence of 338 an attempt at a programmed counter-rotation.

Recently, Schnell and coworkers (Schnell et al., 2014) suggested that the basic optomotor circuit in *Drosophila* includes an integral feedback term that might be mediated by Ca²⁺ dynamics in the terminals of the interneurons that encode horizontal rotation. Because the putative integrator winds up with prolonged stimulation, flies generate extremely large motor

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343 responses during typical open-loop optomotor experiments. Although this hypothesis explains 344 why the optomotor responses in tethered flight are so large relative to the kinematics changes 345 exhibited during free flight maneuvers, it does not explain why flies generate such enormous 346 changes in stroke amplitude when presented with stimuli that should elicit the production of yaw 347 torque. Perhaps flies respond to visual rotation about the yaw axis by producing not just yaw 348 torque but also roll torque, because they are attempting to turn via banking, as has been 349 suggested by previous authors (Mronz and Lehmann, 2008). This hypothesis could be tested in 350 the future by measuring free flight responses to horizontal motion.

MATERIALS AND METHODS

Animals and experimental setup

354 The methods used in this study were identical to those described in detail elsewhere 355 (Muijres et al., 2014) and are only briefly outlined here. Experiments were performed on 1-to-5 356 day old male and female *Drosophila hydei*, from a laboratory stock reared in a 14:10 (L:D) light 357 cycle. Each day, approximately 50 one-day-old flies were released in the experimental chamber 358 4 hours before their subjective dawn, after which experiments ran for 8 hours. The experimental 359 chamber consisted of a transparent cylindrical enclosure, surrounded by a panoramic array of 360 green LED panels (Reiser and Dickinson, 2008) that provided a uniform illumination of 70 lux. 361 Flies were filmed using three synchronized high-speed cameras (Photron SA5 with AF Nikor 362 60mm lenses, lens aperture = f/22), which viewed the central portion of the arena from above and 363 from two orthogonal side positions (Fig. 1A). The cameras operated at 7,500 frames per second 364 with an image resolution of 1024×1000 pixels, exposure time of 1/30,000 second, and image 365 depth of 12 bits. Due to limitations in optics, the region of interest was restricted to a cube ~ 40 366 mm on each side. Each camera view was backlit using high intensity infrared light panels, which

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were strobed in synchrony with every exposure. To maintain the inside temperature at ~25°C, we
passed refrigerated air around the outside of the flight chamber. At the start and end of each 5day recording period, we calibrated the camera system using direct linear transformation (DLT)
(Christoph Reinschmidt; http://isbweb.org/software/movanal.html).

371 Throughout each experimental session, the cameras sampled continuously. When a fly 372 flew directly through the center of the region of interest, it tripped an infrared laser crossbeam, 373 which automatically triggered the storage of 372 ms of data both before and after the trigger 374 event. We captured more than 300 flight sequences, of which the majority consisted of a straight 375 flight path, but occasionally a fly would perform a saccadic maneuver (Supplementary Movie 376 S1). Although fruit flies are largely insensitive to infrared light, we were concerned that the high 377 intensity of the IR trigger lasers might elicit behavioral responses. For this reason, we only 378 analyzed the saccades that flies initiated before passing through the trigger point. Given our 379 sampling methods, we have no way of knowing whether any given saccade was elicited by visual 380 expansion or via some internal stochastic event.

Measuring body and wingbeat kinematics

We manually selected 44 sequences from the entire data set for detailed analysis, which we subjectively classified as body saccades based on visual inspection of the raw video sequences. To extract kinematics throughout these saccades, we used an automatic machinevision system as described in a recent analysis of escape maneuvers (Fig. 1B) (Muijres et al., 2014). The tracking routine provided us with Kalman filtered estimates of the body and wing kinematics throughout each flight sequence (Fig. 1C, Supplementary Movie S2) (Muijres et al., 2014). For all Kalman filters, the cross-product values in the error covariance matrices (\mathbf{R} and \mathbf{Q}) were set to zero, and covariance matrix \mathbf{R} was set to identity. Thus, adjusting the parameters in covariance matrix \mathbf{Q} controlled Kalman smoothing. For positional data, we used a linear Kalman filter and the smoothing parameters of matrix \mathbf{Q} were scaled according to a Taylor series. \mathbf{Q} values corresponding to position were set to dt^2 , velocity values were set to 1, and acceleration values were set to $1/dt^2$, where dt is the time step between two measurements (inverse of the frame rate).

397 To filter body and wing orientation data, we used an extended Kalman filter with two 398 filtering steps (Yun & Bachmann, 2006), because quaternion update is non-linear. For body 399 orientation filtering, we used the following *Q* parameters. For the first iteration, *Q* parameters 400 associated with angular velocities and angular accelerations were set to zero, and parameters 401 associated with quaternions were set to 0.003. For the second iteration, angular velocity parameters were set to 0.0001, angular acceleration parameters were set to $0.0001/dt^2$, and 402 403 quaternion parameters were set to 1. For wing orientation filtering, we used a similar strategy but 404 less smoothing was desired. For the first iteration, angular velocity parameters and angular 405 acceleration parameters were set to zero, and quaternion parameters in Q were set to 1. For the second iteration, angular velocity parameters in Q were set to $1/dt^2$, angular acceleration 406 407 parameters were set to 0, and quaternion parameters were set to 1.

Body position data consists thus of Kalman filtered estimates of position, X(t), velocity, U(t), and linear acceleration, a(t). Based on U(t) and a(t), we determined the start and end of each saccade by estimating horizontal accelerations normal and tangential to the flight path ($a_N(t)$ and $a_T(t)$, respectively). Using an expectation maximization-based clustering analysis on $a_N(t)$ and $a_T(t)$ for all measured flight sequences (Muijres et al., 2014), we divided flight sequences 413 into steady and maneuvering segments, such that steady segments satisfied $a_N < 0.19g$ and -414 $0.17g < a_T < 0.14g$, where g is gravitational acceleration. The times at which a saccade starts (t_{start}) 415 and ends (t_{end}) were defined as the moments when body accelerations passed these threshold 416 values. Note that these points in time do not encompass the entire length of the maneuver, but the 417 method enabled us to systematically and objectively define and align the saccades. 418 Based on the velocity data, we determined flight heading, $\sigma(t)$, which we used to 419 determine the turn angle, $\Delta \sigma$, for each saccade. U(t) was also used to determine changes in flight 420 speed, dU(t), throughout the maneuver relative to the start of each sequence. Linear acceleration, 421 a(t), was used to estimate the direction, σ_a , and magnitude, a_{hor}/g , of normalized acceleration 422 within the horizontal plane, as well as the magnitude of the vertical acceleration, a_z/g . Body 423 orientation was expressed in the body Euler angles (yaw, $\psi_{\rm E}$; pitch, $\theta_{\rm E}$; and roll, $\eta_{\rm E}$) in the world 424 reference frame and normalized angular velocity of the body, $\boldsymbol{\Omega} = \{\omega_x, \omega_y, \omega_z\}$, in the body 425 reference frame (Fig. 1C). All rotation rates were normalized using f_{steady} , where f_{steady} is the 426 wingbeat frequency during steady flight for D. hydei, (~ 189 Hz, from Muijres et al. 2014). 427 Each tracked wingbeat was expressed by the wingbeat frequency, f, and three Euler 428 angles within the body reference frame: wing stroke angle, ϕ , stroke deviation angle, γ , and wing 429 rotation angle, α (Fig. 1C). Note that all body and wing orientation variables are defined relative 430 to the stroke plane, which is defined as horizontal during steady flight (Fig. 1C). For D. hydei, 431 this is at an inclination angle of 47.5° relative to the long axis of the body (Muijres et al., 2014). 432 433 Estimating aerodynamic forces and torques based on body dynamics

434 The aerodynamic forces throughout a flight maneuver can be estimated directly from435 body accelerations as:

437
$$F(t) = (a(t)+g)/|g|,$$
 (1)

where F is the aerodynamic force vector normalized with body weight, mg, and $g = \{0, 0, g\}$ is the gravitational acceleration vector. The orientation of this force vector in the body frame was defined as the roll (ξ) and pitch (β) angle of F relative to the stroke-plane normal (Fig. 1C), and is calculated based on the body Euler angles and F.

The aerodynamic torque produced throughout a maneuver was estimated from the body rotations. Because aerodynamic damping has been shown to be an important source of passive stability in flapping flight (Hesselberg and Lehmann, 2007; Hedrick et al. 2009), we estimate normalized torque *T* using a linear model based on both normalized angular velocities and accelerations:

448

449
$$T(t) = C \Omega(t) + I \dot{\Omega}(t), \qquad (2)$$

450

451 where $\dot{\Omega}$ is the angular acceleration vector of the body normalized by f_{steady}^2 , and which is 452 estimated by numerically differentiating Ω . *C* is the aerodynamic damping coefficient matrix 453 normalized by mgl/f_{steady} , where *l* is wing length, and *I* is the body inertia matrix normalized by 454 mgl/f_{steady}^2 . Because aerodynamic torque produced by a wing scales with the product of force and 455 wing length, we normalized torque by |a+g|ml. We modeled *C* as

457
$$\boldsymbol{C} = \begin{bmatrix} C_{roll} & 0 & 0\\ 0 & C_{pitch} & 0\\ 0 & 0 & C_{yaw} \end{bmatrix},$$
 (3)

459 and *I* as

460

461
$$I = \begin{bmatrix} I_{roll} & 0 & 0\\ 0 & I_{pitch} & 0\\ 0 & 0 & I_{yaw} \end{bmatrix}.$$
 (4)

462

463 Thus, our simplified model assumes that all interaction coefficients in both C and I are 464 negligible.

465 The damping coefficients in C were based on damping estimates for D. melanogaster 466 reported in literature (Cheng et al., 2009; Dickson et al., 2010). The yaw-damping coefficient for 467 D. hydei (C_{vaw}) was estimated by scaling values measured for D. melanogaster using a robotic 468 model (Dickson et al., 2010). Roll and pitch damping for D. hydei were based on computational 469 estimates of damping coefficients in *D. melanogaster* (Cheng et al., 2009). For consistency 470 among the damping coefficients for the three degrees-of-freedom, we first linearly scaled all 471 damping coefficients estimated for *D. melanogaster* by Cheng et al. (2009) equally, such that 472 yaw damping was equal to that reported by Dickson et al. (2010), and then scaled these values to 473 the slightly larger species, D. hydei. This resulted in the following normalized roll, pitch, and 474 yaw damping coefficients: $C_{\text{roll}} = 0.22$; $C_{\text{pitch}} = 0.08$; $C_{\text{yaw}} = 0.41$. Note that the damping 475 coefficient for yaw is 5 times greater than for pitch and twice as large as that for roll.

Inertia coefficients within the stroke-plane reference frame were estimated based on a
cylindrical body model with body mass *m* and pitch angle of 47.5° and a wing model consisting
of a horizontal disk divided into 100 concentric rings (Fig. 1C). Each ring has a homogenously
distributed mass equal to the mass of the local spanwise wing section plus its added fluid mass.

Following (Ellington, 1984), total wing mass was estimated as 5% of body mass, and added mass was equal to a cylindrical fluid mass circumventing each wing section. This resulted in normalized roll inertia $I_{roll} = 0.64$, normalized pitch inertia $I_{pitch} = 1.07$, and normalized yaw inertia $I_{vaw} = 0.57$.

- 484
- 485

Correlating wingbeat kinematics with torque production

486 To determine how a fly controls torque throughout a saccade, we correlated changes in 487 wing kinematics with torques estimated from body dynamics (Eqn 2). Wing kinematics were 488 correlated with torque about an axis defined by a torque vector, T, by parsing the complete 489 dataset into steady wingbeats and wingbeats in which the fly generated some absolute magnitude 490 of T' (|T'|) that was larger than one standard deviation of the entire distribution of |T'| for all 491 wingbeats in the dataset. Changes in kinematics angles throughout a wingbeat relative to the 492 steady wingbeat angles were linearly correlated with the stroke-averaged normalized torque 493 estimated from body dynamics (Eqn 2) as:

494

$$mod(\kappa, T')_i = (\kappa_i - \kappa_{steady}) / |T'|_i,$$
(5)

496

495

497 where $mod(\kappa, T')_i$ is the wingbeat modification variable for kinematic angle κ (representing 498 either ϕ , γ , or α) of the *i*th wingbeat in the dataset of |T'| producing wingbeats. κ_{steady} is the 499 equivalent kinematics angle distribution of the average steady wingbeat of *D. hydei*, based on 500 1603 wingbeats measured by Muijres et al. (2014) (Fig. 1D).

501 Variation in wingbeat frequency (which is equal for both wings) is excluded from this
502 analysis because such modulation could not alter torque directly. By fitting a Fourier series

504 modulation distributions, $MOD(\kappa, T^{*})$ for each kinematics angle and torque axis. Fourier series

505 were fitted using a Levenberg-Marquardt algorithm and are defined as:

506

507
$$k(t^*) = a_0 + \sum_{n=1}^{N} a_n \cos(2\pi n t^*) + b_n \sin(2\pi n t^*),$$
 (6)

508

where a_n and b_n are the Fourier series coefficients for the n^{th} order, and τ is normalized time for each wingbeat ($t^* = t f$). All Fourier series ($MOD(\phi, T^*), MOD(\gamma, T^*), MOD(\alpha, T^*)$) were 8th order (N=8). From the $MOD(\kappa, T^*)$ estimates, the set of wing kinematics variables that would result in a given amount of torque | T^* | about torque axis T^* can be reconstructed by:

513

514
$$\kappa = \kappa_{\text{steady}} + |\mathbf{T}'| MOD(\kappa, \mathbf{T}').$$
 (7)

515

516

Measuring aerodynamic forces and torques using a dynamically scaled robot

Apart from estimating aerodynamic forces and torques from body dynamics (Eqn 1 and Eqn 2, respectively), we also estimated forces and torques from wing kinematics, using a dynamically scaled robot in a fixed body reference frame (Dickinson et al., 1999). This technique enabled us to study the aerodynamics of saccadic maneuvers in a systematic and detailed manner. We replayed the wingbeat kinematics in a fixed body reference frame because aerodynamic and inertial effects of body rotations were modeled using Eqn 2. Note that aerodynamics effects due to body translations were ignored. 524 To assess the accuracy of our methods, we compared torque measurements based on the 525 wingbeat kinematics with the torque estimates based on body dynamics (Eqn 2). This analysis 526 was performed on two sets of data. The first dataset consisted of the mean wing kinematics and 527 body dynamics throughout the average saccade, estimated by aligning the wingbeats from all 528 maneuvers. This enabled us to test qualitatively whether the measured changes in wingbeat 529 kinematics captured the forces and torques produced throughout the saccade. The second dataset 530 was based on the systematic analysis described above, in which we correlated wingbeat 531 kinematics with torque production. Using Eqn 7, we constructed a set of kinematics patterns that 532 should produce a systematically increasing amount of body torque about a specific body axis T. 533 The range of body torques was chosen such that it captured the complete behavioral envelope of 534 measured torque production. We defined a body torque distribution spanning a range from zero 535 body torque (steady flight) to a torque equal to approximately three times the standard deviation 536 of the |T'| distribution for all measured wingbeats, and parsed it into 8 values. For each, we 537 created the matching deformed wingbeat kinematics using Eqn 7. We then replayed the set of 538 systematically distorted wing kinematics on the robotic fly and measured the resulting stroke-539 averaged forces and torques about all three orthogonal body axes, and compared these values 540 with the values of body torques. This approach also enabled us to determine cross-talk between 541 torque modulations about the different orthogonal axes. The distributions of |T'| and the 542 corresponding wing kinematics constructed using Eqn 7 were also used to study the effects of 543 stroke, deviation, and wing rotation angle on torque production. Using a method similar to that 544 described by Muijres et al. (2014), we systematically modulated one wing kinematics variable, 545 while maintaining steady kinematics for the other angles, and replayed these on the robot.

546 Cases in which body torque was equal to three standard deviations of the |T'| distribution, 547 which we considered as an estimate for peak torque production, were analyzed in more detail 548 using two complementary methods. First, we replayed the wingbeat kinematics that 549 corresponded to this peak torque (estimated using Eqn 7) on the robot and measured force and 550 torque throughout the wingbeat. Second, we analyzed the changes in wing kinematics that result 551 in peak torque production. For each kinematic angle, the difference in kinematics between the 552 left and right wing might result from temporal phase shift, from a shift in the mean value, or 553 from higher order modulations in the time history (Fig. 1D). For each kinematic variable, we 554 estimated the temporal phase shift and offset in mean value between the left and right wing by 555 systematically translating the left wing data along the time (τ) and ordinate (κ) axes. For each 556 combination of $\Delta \tau$ and $\Delta \kappa$; we determined the root mean square error (RMSE) between the right 557 wing and shifted left wing values. The combination of $\Delta \tau$ and $\Delta \kappa$ at which RMSE was minimum 558 defines the phase shift an angular offset between left and right wing for that wing kinematics 559 angle and |T'| axis combination. The corresponding magnitude of RMSE quantifies how well the 560 wing kinematics modulations are described by $\Delta \tau$ and $\Delta \kappa$, relative to any higher order 561 modulations.

562

List of symbols and abbreviations

Α	Amplitude
$\boldsymbol{a} = \{a_{\mathrm{x}}, a_{\mathrm{y}}, a_{\mathrm{z}}\}$	Acceleration vector in the world reference frame
a _N	Horizontal acceleration normal to the flight path
a _T	Horizontal acceleration tangential to the flight path
a _n	Fourier series coefficient
<i>b</i> _n	Fourier series coefficient
dt	Time step between measurements (inverse of camera frame rate)
С	Normalized aerodynamic damping coefficient matrix

dU	Flight speed relative to the start of the maneuver
F	Normalized aerodynamic force vector in the world reference frame
f	Wingbeat frequency
$g = \{0,0,g\}$	Gravitational acceleration vector
g	Gravitational acceleration scalar
Ι	Normalized inertia coefficient matrix
l	Wing length
m	Body mass
mg	Body weight
Q	Error covariance matrix of Kalman filter
R	Error covariance matrix of Kalman filter
T	Normalized aerodynamic torque vector in the body reference frame
<i>T</i> '	An arbitrarily defined aerodynamic torque vector
t	Time relative to the start of the saccade
<i>t</i> *	Normalized time within a wingbeat relative to the start of the downstroke
$\boldsymbol{U} = \{u, v, w\}$	Velocity vector in the world reference frame
$\boldsymbol{X} = \{x, y, z\}$	Position vector in the world reference frame
$\boldsymbol{X}_{\mathbf{B}} = \{\boldsymbol{x}_{\mathrm{B}}, \boldsymbol{y}_{\mathrm{B}}, \boldsymbol{z}_{\mathrm{B}}\}$	Position vector in the body reference frame
α	Rotation angle of the wing around its long axis
β	Pitch angle of the aerodynamic force vector in the body reference frame
γ	Deviation angle of the wing out of the stroke plane
Δα	Shift of the mean wing rotation angle of the left wing relative to the right
Δτ	Phase shift of the left wing movement relative to the right wing movement
Δκ	Shift of the mean wing kinematic angle of the left wing relative to the right
$\Delta\sigma$	Turn angle of the saccade
Δt	Duration of a saccadic turn
η	Body roll angle derived from roll rate ω_x
$\eta_{ m E}$	Body roll Euler angle in the world reference frame
θ	Body pitch angle derived from pitch rate ω_y

$ heta_{ m E}$	Body pitch Euler angle in the world reference frame
κ	Wing kinematics angles
μ	Torque axis angle within the stroke plane relative to the roll torque axis
μ_{i}	Primary torque axis angle (mean torque angle during the initial phase of the
	banked turn)
$\mu_{1\perp}$	Angle within the stroke plane and orthogonal to μ_{I}
μ_2	Counter-torque axis angle (mean torque angle during the counter-torque
	phase of the banked turn)
$\mu_{2\perp}$	Angle within the stroke plane and orthogonal to μ_2
ξ	Roll angle of the aerodynamic force vector in the body reference frame
σ	Heading (the direction of the horizontal body velocity component)
σ_{a}	Direction of horizontal body acceleration component
τ	Phase within a wingbeat relative to the start of the downstroke
φ	Stroke angle of the wing within the stroke plane
Ψ	Body yaw angle derived from yaw rate ω_z
ΨE	Body yaw Euler angle in the world reference frame
$\mathbf{\Omega} = \{ \omega_x, \omega_y, \omega_z \}$	Normalized rotation rate vector of the body in the body reference frame
ω _x	Normalized body roll rate in the body reference frame
ω _y	Normalized body pitch rate in the body reference frame
<i>W</i> _z	Normalized body yaw rate in the body reference frame

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567

568

Competing interests

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572	F.T.M and M.H.D planned experiments and wrote the paper. F.T.M. and N.A.I. collected data in
573	flight arena, ran the automated machine vision tracking software, and identified sequences with
574	saccadic turns. M.J.E. collected data using the robotic fly. F.T.M. analyzed the data, with the
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582	
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 - **Figure Legends**
- **Figure 1:** Experimental setup, coordinate system conventions, and flight tracks of saccades. (A)
- The experimental setup consists of a cylindrical enclosure, three synchronized high-speed
- 665 cameras with IR LED backlighting, and a laser triggering system. (B) An automated machine
- vision system tracks kinematics by projecting body and wing models onto the three orthogonal
- 667 camera images. (C) Measured parameters in the body reference frame. Body dynamics are
- described by the angular velocity vector of the body, $\Omega = \{\omega_x, \omega_y, \omega_z\}$ and its derivatives, about

669	the principal body axes $X_{B} = \{x_{B}, y_{B}, z_{B}\}$. Wing kinematics are defined by stroke angle within the
670	stroke plane, ϕ , deviation angle out of the stroke plane, γ , and wing rotation angle, α . Based on
671	the vector sum of body acceleration and the gravitational acceleration vector, we determined
672	normalized force vector, F , with orientation in the body reference frame defined as force pitch
673	angle, β , and roll angle, ξ . (D) Temporal dynamics of the wing kinematics angles for a single
674	wingbeat. The black trace shows the average steady wingbeat of <i>D. hydei</i> that is used as a
675	baseline for our analysis (from Muijres et al., 2014). Grey traces show hypothetical wing angles:
676	stroke angle has a phase shift of $\Delta \tau = 5^{\circ}$ relative to the steady wingbeat, wing deviation has a
677	mean deviation angle shift of $\Delta \gamma = 5^{\circ}$, and wing rotation angle has both a shift of $\Delta \tau = 5^{\circ}$ and $\Delta \alpha$
678	= 5°. (E,F) Side view (E) and top view (F) of the flight tracks of all 44 trials. Traces are color-
679	coded with time according to the scale bar in (E). Note that all left-handed turns have been
680	mirrored into right-handed turns, and all sequences were aligned according to position and
681	heading at the start of the saccadic maneuver ($t_{\text{start}} = 0 \text{ ms}$).

Figure 2: Saccades in flies consist of banked turns. (A) Heading and speed (depicted as vectors of horizontal velocity component) after the saccades for all measured trials separately (grey) and its mean (black solid vector), relative to the aligned initial zero heading (black dotted mean velocity vector). Speed is scaled according to the reference vector of 0.1 m/s. (B-L) temporal dynamics of experimental parameters. (B) Heading relative to initial heading of $0^{\circ}, \sigma$. (C) Changes in flight speed relative to initial flight speed, dU, (D) Direction of the horizontal component of body acceleration in the world reference frame, σ_{a} . (E) Horizontal component of normalized body acceleration, a_{hor}/g . (F) Vertical component of normalized body acceleration, a_z/g (negative values are shown such that upwards accelerations are in the positive y axis

692 direction). (G-I) Normalized roll rate (G), pitch rate (H), and yaw rate (I). (J) |F|, normalized 693 aerodynamic force generated by the fruit fly. (K,L) ξ , roll angle (K), and β , pitch angle (L) of *F* 694 (see also Fig. 1C). In B-L, grey traces depict data from separate trials and the black traces with 695 grey bars show the mean and 95% confidence interval for all trials.

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Figure 3: Throughout a saccade, flies produce torque about all body axes, the roll axis, pitch axis, and yaw axis. The total normalized body torque (A-C) is the sum of torques required to resist aerodynamic damping (D-F) and to resist inertia (G, H). All torques are defined in the body reference frame (Figure 1C) and normalized by |a+g|ml. Grey lines show data from the separate saccades, black lines with grey bars are means and 95% confidence intervals for all trails.

703 Figure 4: The early stage of a saccade can be separated into two phases, an initial body rotation 704 (-25ms<t<-5ms, data in blue) and a counter-rotation (30ms<t<60ms, data in orange). During 705 each phase, flies produce torque about two body axes and keep torque about the third orthogonal 706 axis to a minimum. (A) Direction of torque within the stroke plane, μ , throughout the saccade. 707 (B) Vectors depicting orientation and magnitude of torque component within the stroke plane, 708 $T\mu$, during the initial rotation phase (blue) and during the counter-rotation phase (orange) (see 709 (A) for the time windows). The black dashed vectors are mean $T\mu$ for both time windows, 710 defining the primary torque axis ($\mu_1=36^\circ$) and the counter-torque axis ($\mu_2=8^\circ$). Normalized 711 torque vectors are scaled according to the reference vector of 0.01. (C) Torque about the primary 712 torque axes μ_1 (t<12.5ms) and the counter-torque axis μ_2 (t>12.5ms). (D) Torque about the 713 orthogonal axes $\mu_{1\perp}$ (t<12.5ms) and $\mu_{2\perp}$ (t>12.5ms). (E) Torque about the yaw axis. (F) Average 714 magnitude of normalized body torque relative to turn angle $\Delta\sigma$ about the μ_1 (blue) and μ_2

(orange) axes. (G) Torques about their orthogonal $\mu_{1\perp}$ and $\mu_{2\perp}$ axes. (H) Torque about the yaw axis. All torques are defined in a right-handed reference frame relative to the μ_1 , μ_2 and yaw axes and were normalized by |a+g|ml. In A, C, D, and E, grey lines show data from all measured saccades, and black lines with grey bars are means and 95% confidence intervals.

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720 **Figure 5:** The average wing and body kinematics, determined by aligning the wingbeats of all 721 trials relative to the start of each saccade, show that flies produce aerodynamic torques 722 throughout a saccade using small changes in their wing movement patterns. (A) Wingbeat 723 frequency f, (mean and 95% confidence interval). (B) Stroke angle, ϕ , for the left (blue) and right 724 (red) wing. (C) Difference in stroke angle at the end of the downstroke (blue) and upstroke 725 (orange). (D) Deviation angle, γ (E) Difference in deviation angle amplitude during the 726 downstroke (blue) and upstroke (orange). (F) wing rotation angle, α . (G) Difference in wing 727 rotation angle at mid-downstroke (blue) and mid-upstroke (orange). (H) Normalized stroke-728 averaged force, |F|, based on body accelerations (black trace for mean and grey bar for 95%) 729 confidence interval) and based on wing kinematics shown in B, D, and F (green trace). (I-K) 730 Normalized roll torque, T_{roll} (I), pitch torque, T_{pitch} (J), and yaw torque, T_{vaw} (K). Plotting 731 conventions in (I-K) are the same as in H.

732

Figure 6. Average wing kinematics angles and torque for wingbeats that generate peak torque about the control axes. (A-C) Kinematics angles for the left wing (blue) and for the right wing (red) for strokes that generated peak yaw torque (A), peak μ_1 torque (B), and peak μ_2 torque (C). (D) Normalized yaw torque measured by replaying wingbeat kinematics in panel A (black) and the steady flight kinematics in Fig. 1D (grey) on the robotic fly model. Solid lines are time series

throughout the wingbeat, dotted lines are stroke-averaged values. (E) Normalized torque about the μ_1 axis for the kinematics in panel B (blue), normalized torque about the μ_2 axis for the kinematics in C (orange), and torque about the μ_1 and μ_2 axes for the steady flight wingbeat kinematics in Fig. 1D (black and grey, respectively). Note that the black and grey traces are so similar that they appear to be a single line. (F) Normalized torques about the $\mu_{1\perp}$ and $\mu_{2\perp}$ axes, using the color conventions as in E.

745 Figure 7: Torques derived from body dynamics plotted against stroke-averaged torques 746 measured using a robotic fly. The data are based on a graded series of wing kinematics that range 747 from steady wingbeats to those that produce peak torque about the μ_1 , μ_2 , and yaw axes as shown 748 in Fig. 6A-C. (A) Comparison of torque about the three principal body axes: yaw (black), roll 749 (red), and pitch (blue), for the kinematics correlated with yaw production. (B) Comparison of 750 torque about the μ_1 (blue), the μ_2 (orange), $\mu_{1\perp}$ (grey), $\mu_{2\perp}$ (also grey), and yaw (black) axes. 751 Positive values are for the kinematics correlated with control of torque about the μ_1 axis; 752 negative values are for the kinematics that controls torque about the μ_2 axis. (C) Torques 753 produced by varying the different wing kinematics parameters correlated with yaw torque control 754 in isolation while maintaining all others at steady flight conditions. The effect of the different 755 parameters is shown in blue (stroke angle, ϕ), magenta (deviation angle γ), and green (rotation 756 angle α). The grey trace is the sum of the torques for the separate cases; the red trace shows the 757 case where all kinematics angles were varied together. The thin black solid line in all panels 758 shows a match between torques determined from body dynamics and from wing kinematics 759 played through the robot. (D) The same analysis as in C, but using the kinematics correlated 760 with the control of torque about the μ_1 axis (positive values) and the μ_2 axis (negative values).

773

762 **Figure 8:** Flies modulate the phase of wing rotation to control torque about the μ_1 and μ_2 axes, 763 and modulate both the phase and offset of wing rotation to control torque about the yaw axis. (A) 764 Wing rotation angles of the right wing (red), left wing (grey), and left wing trace (blue dotted) 765 that has been translated along both abscissa (wingbeat phase) and ordinate (rotation angle) to 766 produce the lowest RMSE between the right and shifted left wing traces. (B) A plot of RMSE as 767 a function of plot of wingbeat phase (-10°< $\Delta\tau$ <10°) and mean wing rotation angle 768 $(-10^{\circ} < \Delta \alpha < 10^{\circ})$ for the kinematics correlated with peak yaw torque. Maximum correlation 769 (minimum RMSE) is depicted by a white dot. RMSE is coded in grey on a logarithmic scale. (C 770 and D) The same analysis as in A and B, but for the data correlated with peak torque about the μ_1 771 axis. (E and F) The same analysis as in A and B, but for the data correlated with peak torque 772 about the μ_2 axis.

Supplementary Figure Legends

774 Figure S1: Temporal dynamics of body rotations throughout the saccadic maneuver. Rotational 775 dynamics of the fly body are described as angular positions (A-C), normalized angular velocities 776 (D-F) and normalized angular accelerations (G-I) about the principal body axes (roll axis, pitch 777 axis and yaw axis as defined in Fig. 1C). The temporal dynamics of the angular positions were 778 estimated by integrating angular velocities in the body reference frame (integration constant was 779 set to zero at the start of each track); angular velocities were normalized by the wingbeat 780 frequency at steady flight, f_{steady} , estimated by Muijres et al. (2014); angular accelerations were 781 estimated by differentiating angular velocities, and were normalized by the steady wingbeat 782 frequency $f_{\text{steady.}}^2$ Grey lines show data from all measured saccades, and black lines with grey 783 bars are means and 95% confidence intervals for all trails.

792

Figure S2: Torque dynamics within the stroke plane throughout the saccadic maneuver, described by torque about the primary torque axis μ_1 (A), the counter-torque axis μ_2 (B) and their respective orthogonal axes $\mu_{1\perp}$ (C) and $\mu_{2\perp}$ (D). All torques are normalized by |a+g|ml; grey lines show data from the separate saccades, and black lines with grey bars are means and 95% confidence intervals for all trails. The vertical dotted line defines the point in time where torque in the stroke plane is approximately zero, and that therefore separates the primary rotation phase and the counter-rotation phase (*t*=12.5 ms).

793 Figure S3: Correlation between wingbeat kinematics angles of the left and right wing, for the 794 kinematics that results in peak yaw torque (left column), peak torque about the primary μ_1 axis 795 (middle column), and peak torque about the counter-torque axis μ_2 (right column). (A-C) 796 kinematics angles of the right wing (red), the original kinematics of the left wing (grey), and the 797 translated left wing kinematics for which correlation between the wingbeat kinematics angles of 798 the left and right wing were maximal (blue dotted traces). (D-L) root-mean square error (RMSE) 799 based on the difference between the left and right wing kinematics angle throughout the 800 measured phase shift range $-10^{\circ} < \Delta \tau < 10^{\circ}$ and mean kinematics angle shift range $-10^{\circ} < \Delta \kappa < 10^{\circ}$ 801 (maximum correlation at minimum RMSE is depicted by a white dot): (D-F) for stroke angle; 802 (G-I) for deviation angle; (J-L) for wing rotation angle. Logarithmic values of RMSE are scaled 803 according to the scale bar in (L).

Supplementary Movie Legends

805 Movie S1: Top view of a fruit fly performing a saccadic maneuver. The movie is slowed down 806 100 times, and every third recorded frame is shown. The turn angle of this saccade is 807 approximately 90 degrees, which is close to the average saccadic turn angle for all trails. 808 809 Movie S2: Body and wings model of a fruit fly performing a saccadic maneuver. The movie is 810 slowed down 300 times. The turn angle of this saccade is approximately 90 degrees, which is 811 close to the average saccadic turn angle for all trails. 812 813 Movie S3: A movie of all 44 flight tracks overlaid on top of each other, viewed from below. The 814 movie is slowed down 100 times, and traces are color-coded with time according to the scale bar

815 in Fig. 1E. Note that all left-handed turns have been mirrored into right-handed turns, and all 816 sequences were aligned according to position and heading at the start of the saccadic maneuver 817 ($t_{\text{start}} = 0 \text{ ms}$).

818

819 **Movie S4:** A movie of all 44 flight tracks overlaid on top of each other, viewed from the side as 820 shown in Fig. 1F. The movie is slowed down 100 times, and traces are color-coded with time 821 according to the scale bar in Fig. 1E. Note that all left-handed turns have been mirrored into 822 right-handed turns, and all sequences were aligned according to position and heading at the start 823 of the saccadic maneuver ($t_{\text{start}} = 0$ ms).

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Movie S5: A movie of all 44 flight tracks overlaid on top of each other, viewed from the front.
The movie is slowed down 100 times, and traces are color-coded with time according to the scale
bar in Fig. 1E. Note that all left-handed turns have been mirrored into right-handed turns, and all

828 sequences were aligned according to position and heading at the start of the saccadic maneuver 829 $(t_{\text{start}} = 0 \text{ ms}).$

831 **Movie S6:** A movie of all 44 flight tracks overlaid on top of each other, in perspective view. The 832 movie is slowed down 100 times, and traces are color-coded with time according to the scale bar 833 in Fig. 1E. Note that all left-handed turns have been mirrored into right-handed turns, and all 834 sequences were aligned according to position and heading at the start of the saccadic maneuver 835 ($t_{\text{start}} = 0 \text{ ms}$).















