

# How lovebirds maneuver through lateral gusts with minimal visual information

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Flying birds maneuver effectively through lateral gusts, even when gust speeds are as high as flight speeds. What information birds use to sense gusts and how they compensate is largely unknown. We found that lovebirds can maneuver through 45° lateral gusts similarly well in forest-, lake-, and cave-like visual environments. Despite being diurnal and raised in captivity, the birds fly to their goal perch with only a dim point light source as a beacon, showing that they do not need optic flow or a visual horizon to maneuver. To accomplish this feat, lovebirds primarily yaw their bodies into the gust while fixating their head on the goal using neck angles of up to 30°. Our corroborated model for proportional yaw reorientation and speed control shows how lovebirds can compensate for lateral gusts informed by muscle proprioceptive cues from neck twist. The neck muscles not only stabilize the lovebirds' visual and inertial head orientations by compensating low-frequency body maneuvers, but also attenuate faster 3D wingbeat-induced perturbations. This head stabilization enables the vestibular system to sense the direction of gravity. Apparently, the visual horizon can be replaced by a gravitational horizon to inform the observed horizontal gust compensation maneuvers in the dark. Our scaling analysis shows how this minimal sensorimotor solution scales favorably for bigger birds, offering local wind angle feedback within a wingbeat. The way lovebirds glean wind orientation may thus inform minimal control algorithms that enable aerial robots to maneuver in similar windy and dark environments.

bird | visual | flight | control | gust

hen maneuvering toward a goal—such as during treetop landings—birds sense gusts and compensate. Over long ranges, birds compensate for crosswinds by fusing visual, olfactory, auditory, magnetic, and vestibular cues (1). In near-ground short-range navigation, it is thought that the velocity of image patterns (optic flow) over the retina (2) enables birds to compensate for lateral gusts (3). Clear vision in flight is made possible by head stabilization, which reduces retinal blur (4), stabilizes image features (5), and defines a clear gravity vector for the vestibular system (6). Birds stabilize their heads using complex neck motions to negate wind perturbations (7), wing flapping (8), and flight maneuvers (9) —even if the body is fully inverted, as it can be for geese (8). Human pilots cannot land safely at night without runway lighting, radio beacons, and guidance from air traffic controllers due to spatial disorientation (10). Birds have none of this technology yet maneuver easily even when visual cues are sparse. Frigate birds, for example, maintain their heading over open water, at times soaring in thick clouds (11), and specialist birds such as swiftlets and oilbirds fly in dark caves (12). What visual information birds need to stabilize their heads and compensate for lateral gusts without becoming disoriented is an open question.

To determine what visual information birds need to maintain their heading in gusts, we manipulated the visual and gust environment in a 3.2-m-long arena in which 3 lovebirds (*Agapornis roseicollis*) flew between 2 perches (Fig. 1A). These generalist, diurnal, nonmigratory birds were raised in captivity, so they were naïve to lateral gusts. We simulated 3 visual environments: a cave, black walls with a small dim light behind the goal perch to simulate a narrow cave exit; a lake, a horizontal contrast line to simulate the wide-field horizon of open water; and a forest, vertical stripes optimized for optic flow perception (Fig. 1B and Materials and Methods). The global illumination in the cave was only 0.2 lx, similar to a full moon (13). We designed the cave (our control case) to give the minimum amount of visual information that still provided a heading to guide birds to a safe landing. In contrast, the illumination in the lake and forest was 160 lx, similar to a closed canopy during a clear sunny day (12). We used movable gust generators to simulate 3 gust environments: still, no gusts; cross, same-side gusts; and shear, opposing-side gusts (Fig. 1C). The gust speeds were comparable to the birds' flight speeds, causing effective wind angles up to 45°. To determine how the birds flew in the 9 environmental permutations, we tracked 3D marker clusters on their head and body at 1,000 Hz over 366 flights. The differences between the marker cluster attitudes quantify the neck's role in wind compensation.

#### Results

Lovebirds Successfully Traverse the Arena in All Visual and Wind Environments. The lovebirds easily traversed the arena in all 9 combinations of visual and wind environments. We only found small differences in the average ground speed (flight speed relative to the ground) between the visual conditions: lovebirds traversed the arena somewhat faster in the forest and somewhat

#### Significance

Pilots need complex instruments and training to safely fly through gusts when their vision is deprived. In contrast, birds fly reliably over open water and at night, despite being more susceptible to gusts due to their much lower flight speeds. We found that even inexperienced lovebirds can navigate through strong opposing gusts in the dark, with only a faint point light source as a beacon. Their ability is surprising, because it was previously thought that diurnal animals needed a visual horizon and image features moving over their retina to maneuver. Instead, lovebirds fixate their head on the beacon while reorienting their body into the gust like a weathervane, enabling them to infer gust angle via neck twist and compensate accordingly.

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**Fig. 1.** Lovebirds fly at constant ground speed toward a goal irrespective of lateral gusts by turning their body into the gust. (*A*) Flight arena. Using IR light, 13 cameras automatically tracked marker clusters on the body and head (1,000 Hz); grayscale cameras recorded high-speed (HS) video (500 Hz). (*B*) Visual environments simulated a cave (uniform black), lake (horizontal stripe), and forest (vertical stripes). (*C*) The gust generators produced still (no gust), cross (side gust), and shear (opposing side gusts) environments. (*D*) The ground speed of lovebirds is somewhat higher in visually richer environments, but is not modified by gust condition (N = 3; separated by bird in *SI Appendix*, Fig. SF5). (*E*) Lovebirds orient their head toward the goal and their body into the gust across visual conditions (PDF = probability density function; histograms are stacked).

slower in the cave (Fig. 1D). These findings agree with earlier observations that visual cues affect ground speed (2). The ground speed is not affected by wind environment; the birds reached the goal just as quickly in strong crosswinds as they did in still air (Fig. 1D), without being blown off course. Using a simple drag model, we estimate lateral displacements of  $23 \pm 11$  cm based on measured gust speeds along the flight path (*SI Appendix*, section S1). Instead, the birds compensated for the gusts and landed near the center of the target perch (half-width 17 cm) across flights. They compensated by turning their body into the gust while directing their head toward the goal across visual conditions (Fig. 1*E*).

To fixate on their goal direction, the lovebirds use fast compensatory neck motions to stabilize their head—and thus their visual and vestibular system—even when their only visual cue is a dim point light (Fig. 1B and Movies S1–S3). We illustrate this ability with bird BB's first flight in the cave–cross environment (Fig. 2B). BB's head was stabilized over roughly 3 timescales: body oscillations during each wingbeat, body wobbling over several wingbeats, and body reorientations into the gust over approximately 10 wingbeats (Fig. 2B). Like the other 2 birds, BB showed no patterned changes in behavior with more time in the arena (*SI Appendix*, Figs. SF20–SF30). Across all flights, lovebirds used their necks to actively stabilize pitch, roll, and yaw relative to the body (Fig. 2 A and C). The stabilization was especially pronounced over wingbeat timescales, where the slope of neck versus body angles is nearly 1 (Fig. 2C). These neck motions must rely on vestibular and proprioceptive cues, because the point light in the dark cave provided very little roll information. Indeed, both the vestibulocollic and the cervicocollic reflex—which remained functional in the dark—underpin active head stabilization in vertebrates (6, 14). These findings are consistent with reports that body-fixed pigeons (15), free-standing pigeons (16), and hand-held owls (17) stabilize their head in the dark based on vestibular and proprioceptive feedback alone.

While compensating body oscillations, lovebirds also use their necks to stabilize head yaw and roll in a coupled fashion relative to the body (Fig. 3B). Head yaw and roll motion are coupled (Fig. 3B) such that the head yaws and rolls toward the goal, similar to how aircraft couple yaw and roll when turning (18). We did not observe a patterned coupling between pitch and other angular degrees of freedom (SI Appendix, Figs. SF31 and SF32). In contrast, yaw and roll are coupled by the neck as follows. The neck translates low-frequency body motions-which are weakly yaw-roll coupled (Fig. 3A)-into low-frequency head motions that are highly coupled (Fig. 3B). The neck does not couple yaw and roll over wingbeat timescales: high frequencies are as weakly yaw-roll coupled in the head as they are in the body (Fig. 3). However, roll and yaw saccades-which are directed gaze changes and not suppressed by head stabilization-show even stronger coupling than low-frequency motions (Figs. 3B and 2B). As with the body-neck coupling (Fig. 2C), the yaw-roll coupling must rely on vestibular and proprioceptive cues, because it persists in the dark cave over a range of timescales (Fig. 3B). Lovebirds seem to make larger saccades in the cave environment (Fig. 3B), probably because gaze slip is harder to detect by the eye. Pitch saccades are infrequent (SI Appendix, Fig. SF33), which helps the vestibular system sense the direction of gravity, according to a robot model of head stabilization (19). Motivated by the low residuals in highfrequency head motion (Fig. 3B), we further analyzed how the head is stabilized within a wingbeat.

Lovebirds Attenuate 3D High-Frequency Head Oscillations with Their Necks. The gain and phase of high-frequency neck motions reveal that wingbeat-driven linear body motion can be attenuated by the neck's semipassive viscoelastic response. By highpass filtering the measured neck motions, we found that lovebirds attenuate lateral (y) and vertical (z), but not frontal (x) motions (Fig. 4A). The lateral and vertical residual head amplitudes are  $20 \pm 6\%$ and  $33 \pm 9\%$  of the eye diameter (5 mm), which reduces retinal image jitter (8). This reduction is probably not essential for frontal motion, where jitter will not substantially change motion parallax (20). Minimal frontal stabilization may be advantageous, because a force transmission ratio near 1 helps birds estimate speed and distance by integrating forward acceleration (21) using their otherwise stabilized vestibular system. By applying a semipassive neck suspension model, we found that the lovebird's S-shaped neck acts like a tuned anisotropic viscoelastic beam. In the frontal direction, the head is nearly in phase with the body (phase lag:  $-0.02 \pm 0.08$  wingbeats), corresponding to either a strutlike stiff spring (high muscle tone) or a narrowly tuned spring (lower muscle tone) with almost no damping (Fig. 4B). The lateral and vertical directions (phase lag:  $-0.03 \pm 0.20$  wingbeats and  $0.18 \pm 0.09$  wingbeats) correspond to underdamped and critically damped springs. Motivated by the larger vertical head-to-body ratios observed in lovebirds compared with whooper swans [0.52 vs. ~0.2 (8); body mass 0.054 vs. 8.5 kg (22)], we analyzed how wingbeat-induced vertical body oscillations scale with body



**Fig. 2.** The neck isolates the head from body motion and orients it toward the goal based on minimal visual information. (*A*) The difference between head and body attitude determines neck pitch, roll, and yaw joint angles. Angles are defined by an arena-based inertial frame (*x*, *y*, *z*) that translates with the body. (*B*) The first flight by bird BB in the cave–cross environment shows how the neck isolates the head from body motion over multiple timescales. (*C*) For each bird (N = 3; separated by bird in *SI Appendix*, Figs. SF6–SF8), neck angle is correlated with body angle, which stabilizes the head in pitch, roll, and yaw over both low and high frequencies (LF, < 8.5 Hz; MF, > 8.5 Hz; *Materials and Methods*). Body–neck slopes are close to 1 at high frequencies (visual conditions pooled: pitch LF, 1.04, R<sup>2</sup> 0.90; pitch HF, 1.02, R<sup>2</sup> 0.76; roll LF, 0.87, R<sup>2</sup> 0.65; roll HF, 1.02, R<sup>2</sup> 0.90; yaw LF, 0.75, R<sup>2</sup> 0.76; yaw HF, 1.01, R<sup>2</sup> 0.81).

mass across flying animals. Using isometric scaling (*SI Appendix*, section S2), we predict that insects and hummingbirds experience minor vertical image jitter even without stabilizing their head, while larger birds experience major jitter that must be attenuated (Fig. 4C).

Whereas passive neck tensioning can provide and explain linear head stabilization, active stabilization is required to explain angular head stabilization according to our lovebird data. The pitch, roll, and yaw residual amplitudes are similar:  $2.5^{\circ} \pm 0.6^{\circ}$ ;  $1.9^{\circ} \pm 0.7^{\circ}$ ; and  $1.9^{\circ} \pm 0.6^{\circ}$ , which are 3 or more times greater than angular uncertainties in our marker constellations (*SI Appendix*, section S6). When applying our neck suspension model, the uncorrelated phase lags in head roll, pitch, and yaw (pitch,  $-0.20 \pm 0.33$ ; roll,  $-0.06 \pm 0.39$ ; yaw,  $0.03 \pm 0.32$ ) correspond to an envelope of torsional spring-damper coefficients (Fig. 4B). The prevalent negative damping ratios represent active motorlike muscle function. Combined with the springlike properties of linear attenuation, these findings exhibit the known motor-, brake-, strut-, and spring-like functions of muscles (23). The maximum angular velocity of the head (residual amplitude  $\times 2\pi \times$  flapping frequency  $\sim 250$  °/s), is larger than what small parrots can resolve at full resolution [visual acuity (24)  $\times$  flicker fusion frequency (25)  $\sim 0.1^{\circ} \times 70$  Hz = 7 °/s] (4). Lovebirds may therefore stabilize the image on their retina further by moving their eye via the vestibuloocular reflex (6, 26), though studies of pigeons suggest these attenuations may be limited to one-sixth those of head stabilization (26). By stabilizing their head within a wingbeat (Figs. 2 *B* and *C* and 4*A*), the lovebirds reduce the wingbeat-induced noise in the visual and vestibular cues that guide them toward their goal over many wingbeats.

# Lovebirds Fixate Their Head on the Goal While Yawing Their Body into Gusts. In each gust environment, lovebirds compensate as well in the dark cave as they do in well-lit environments with a wide-field horizon (lake) or strong optic flow (forest) (Fig. 5). Across all



**Fig. 3.** Lovebirds coordinate yaw and roll simultaneously as they maneuver through the gust. (A) For each bird (N = 3; separated by bird in *SI Appendix*, Figs. SF9–SF14), body yaw and roll are coupled at high frequencies (HF pooled, slope -1.18, R<sup>2</sup> 0.51; LF, < 8.5 Hz; HF, > 8.5 Hz; *Materials and Methods*) with biases that depend on gust condition. The apparent coupling in LF shear is caused by the 2 gusts inducing different responses: first gust, negative yaw and positive roll; second gust, positive yaw and negative roll. (*B*) Head yaw and roll are coupled at low frequencies (LF, slope -0.66, R<sup>2</sup> 0.86) and weakly coupled at high frequencies (HF, slope -0.66, R<sup>2</sup> 0.32). The cross condition shows a bias toward negative yaw in combination with positive roll angles. (*Inset*) Simultaneous yaw–roll saccades (70% of saccades recorded) show strong yaw–roll coupling (slope -1.4; R<sup>2</sup> 0.98).



**Fig. 4.** Lovebirds stabilize their head beat by beat in all directions except frontal. (A) Whereas motion in the frontal (x) direction is not stabilized (gain  $\bar{a} \approx 1$ ), the neck stabilizes lateral (y), vertical (z), pitch, roll, and yaw motion for each bird (N = 3; separated by bird in *SI Appendix*, Fig. SF15). Head stabilization in each gust conditions). (B) A passive neck suspension model reveals ranges of natural frequency ratios ( $f_n/f$ ) and damping coefficients ( $\zeta$ ) corresponding to gains and phase lags observed in the head motion (circles, mean; contours, ±SD). (C) Smaller flying animals can maintain vertical image jitter less than eye diameter ( $\Delta_{z,eye}/d_{eye} < 1$ ) regardless of the head–body gain ( $\bar{a}$ ). Mean and SD by species group was derived from literature (58) for evaluating the scaling trend (light gray, insects; medium gray, humming-birds; dark gray, other birds; *SI Appendix*, Fig. SF37 for all species). The *Inset shows* lovebird eye displacements are similar for each visual condition. See *SI Appendix*, section S2 for scaling details.

conditions, the lowpass-filtered flight paths (Fig. 5A) and body reorientations (Fig. 5 B-D) are similar. The most pronounced reorientation is in yaw: the body orients roughly 45° into the gust and reorients almost 90° midflight in the shear environment (Figs. 3A and 5D). The body also rolls into the wind, albeit over much smaller angles (Figs. 3A and 5C). In all conditions, head pitch remains constant while the body pitches up in preparation for landing (Fig. 5B). The lovebirds thus combine strategies of general aviation pilots, who pitch the fuselage up and trim their heading by using 'crabbing" (yaw into the wind) or "wing-low" (roll into the wind) to compensate for strong crosswinds on final approach (18). Overall, the maneuvers to mitigate gusts are primarily performed in the horizontal plane (Fig. 5D). Motivated by the consistent yaw reorientations into the wind (Figs. 3A and 5D), we corroborated a yaw reorientation model to understand how the lovebirds might infer the local wind direction to negate the 45° cross and shear gusts.

#### Discussion

Wind Angle Can Be Inferred by Fixating on the Goal While the Body Yaws into the Wind. A 2D yaw reorientation and speed control model shows how lovebirds can compensate gusts by inferring the local wind direction via neck twist. Their neck is twisted by actively aligning their head with the goal direction, while aerodynamic torques work to align their body with the local wind direction. The local wind angle with respect to the goal direction can then be estimated via muscle proprioceptive cues encoding the angle over which the neck is twisted (Fig. 6A and B). The twist angle feeds back into a basic proportional controller of body yaw, which responds fast enough to compensate for lateral gusts based on the measured flight paths. The ability of lovebirds to stabilize their head while maneuvering in gusts (Fig. 2-4) underpins this neck-informed gust compensation model. Stabilization enables the otoliths in the vestibular system (6) to reliably sense the direction of gravity (19), which provides an inertial horizon for performing horizontal (2D) compensation maneuvers in lateral gusts (Fig. 5D) without a visual horizon (Fig. 1B; cave). It also enables the lovebirds to stabilize their vision, which they need to keep their head fixated on the goal via neck twist (Figs. 2C and 4). The lovebirds fixate on the perch more often during the second half of the flight (Fig. 6*B*), presumably to provide the additional precision required for landing, similar to how raptors use straighter gaze angles when approaching a target (27).

Another essential building block of the compensation model is the aerodynamic restoring torque that orients the bird's body into the wind. Our preliminary analysis of the bird's yaw dynamics (Fig. 5D) suggested that this torque could be passive, like it is for a weathervane. Birds lack a vertical tail to generate this torque. However, when we used our wind tunnel to test a suspended mechanical flapping bird-which had no vertical tail-it passively reoriented into the wind as soon as it was released from a nonzero slip angle (the local wind angle minus body angle). When we removed the horizontal tail, the yaw dynamics still did not markedly change. These experiments show that flapping wings passively reduce slip angle effectively (Fig. 6C). The weathervanelike restoring torque generated by the flapping wings is approximately linearly proportional to the slip angle  $(\theta_{slip})$  up to large angles (Fig. 6D). This is similar to the passive aerodynamic restoring torque generated by vertical tails (and to a much smaller degree, fuselages) of aircraft with nonzero slip angles (28).

The slip-reducing torque generated by flapping wings complements the previously discovered flapping counter torque, a passive torque proportional to body yaw velocity,  $\dot{\theta}_{body}$ , that dampens yaw motion in flapping wings (29). These 2 passive aerodynamic torques generated by a flapping wing sum together and determine the passive angular acceleration of the body yaw as follows (Fig. 6*E*):

$$\ddot{\theta}_{\text{body}} = (k/I)\theta_{\text{slip}} - (c/I)\dot{\theta}_{\text{body}},$$
 [1]

where I is the animal's yaw moment of inertia, k is the aerodynamic restoring torque constant, and c is the aerodynamic



**Fig. 5.** Lovebirds traverse complex wind environments similarly well in forest, lake, and cave visual environments by fixating on a goal. (A) The average horizontal flight paths are similar across visual environments (N = 3; separated by bird in *SI Appendix*, Figs. SF16–SF18). (B, C, and D) The pitch, roll, and yaw orientations of the head and body are similar across visual environments. Lovebirds pitch their body up gradually as they get closer to the landing perch while keeping their head level (B). In cross wind and shear conditions, lovebirds yaw their body into the gust while keeping their head fixated on the goal perch (D).

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**Fig. 6.** Using an inertia-spring-damper model for body yaw, we infer that lovebirds combine passive and active control to reach the goal perch in gusts. (*A*) Slip angles range up to 30° in the cross environment (N = 3; separated by bird in *SI Appendix*, Fig. SF19). Neck angles are sufficient for proprioceptive input (dark green, gaze aligns with perch; medium green, gaze within ±150% of the perch). (*B*) When landing in the shear environment (left side of plot), slip angles are larger and the head is fixated on the perch more often. (*C*) The slip angle passively goes to zero for an ornithopter, except for a small offset ( $\approx 8^\circ$ ) due to minor wing asymmetries (Movie 54). (*D*) The nondimensional restoring torque on the ornithopter is proportional to slip angle over angles relevant to lovebirds (95% of lovebird data occurred between shaded boxes). Gray, tracking data; black, linear fit. (*E*) In our minimalistic model, body yaw is driven by a passive torque proportional to slip angle ( $\theta_{slip}$ ) and an active torque proportional to neck angle ( $\theta_{neck}$ ), and is dampened by a passive flapping counter torque. (*F*) The average corroborated coefficients in Eqs. **1** and **2** are similar across visual/gust environments, leading to similar damping coefficients ( $\zeta$ ) and yaw response time in wingbeats ( $\tau$ ). (G) A scaling analysis of the lovebird yaw gust response model applied for a steplike gust across animals in flapping flight shows they also can infer the direction of gusts based on neck twist within several wingbeats. Air density and nondimensional ratios can change the yaw response time in wingbeats up to an order of magnitude. See *SI Appendix*, section 55 for scaling details. Mean and SD by species group was derived from literature (58) for evaluating the scaling trend (light gray, insects; medium gray, hummingbirds; dark gray, birds; see *SI Appendix*, Fig. SF37 for all species). The *Inset* shows the corroborated lovebird response time varies little with visual condition.

angular damper constant. By using the average corroborated k/I and c/I coefficient ratios based on the lovebird flight data, the model explains most of the yaw reorientation in the cross and shear condition (cross, R<sup>2</sup> 0.87, rms 12°; shear, R<sup>2</sup> 0.60, rms 16°; measurement uncertainty  $\pm 2^\circ$ , *SI Appendix*, section S6). The corroborated response time for the lovebird yaw model (Eq. 1 and Fig. 6*F*) is close enough to that of the mechanical bird model (Fig. 6*C* and *F*;  $\tau = 1.4$  vs. 1.34 wingbeats) to support the idea that a passive aerodynamic restoring torque reduces slip. However, the residual error is still appreciable because the passive model predicts a 0° equilibrium slip angle, whereas lovebirds exhibit slip angles of 15° or more (Fig. 6*A*, *B*, and *E*). Lovebirds must therefore actively control slip angle.

We inferred that a proportional (P) controller may be sufficient to explain how the lovebirds maintain nonzero slip angles, because P controllers produce offsets in their output when competing forces affect the system dynamics (28). Pigeons too have been found to use steering that resembles proportional control for close-range obstacle avoidance (30). In contrast to the passive body yaw response (Eq. 1), proportional yaw control requires wind slip angle feedback. Our recordings show that the birds fixate their gaze on the goal (Figs. 1E, 5 B-D, and 6 A and B) by actively contorting their neck up to  $30^{\circ}$  or more in yaw and pitch (Figs. 2C, 5 B and D, and 6 A and B). Such angles are large enough to give yaw feedback via neck muscle proprioception (6) according to data for human necks (31). We also found that minor wing asymmetries in the mechanical bird model result in nonzero equilibrium slip angles of  $\approx 8^{\circ}$  (Fig. 6C), which is similar to the  $\approx 15^{\circ}$  recorded for lovebirds. Therefore, we hypothesized that neck angle times a constant P control stiffness,  $k_{\rm P}$ , could predict the control torque that the birds apply using wing asymmetry:

$$\dot{\theta}_{\text{body}} = (k/I)\theta_{\text{slip}} + (k_{\text{P}}/I)\theta_{\text{neck}} - (c/I)\dot{\theta}_{\text{body}}.$$
 [2]

Indeed, adding the proportional controller enables the model to represent the data well (cross,  $R^2$  0.94, rms 9°; shear:  $R^2$  0.79, rms 13°). The goodness of fit especially improves in the shear case, where the 90° midflight yaw reorientations presumably require

more active control. The fitted nondimensional damping coefficients,  $\zeta \equiv c/\sqrt{4(k+k_{\rm P})I} = 2.2 \pm 2.0$ , show that the response ranges from under to slightly overdamped (Fig. 6F) (28). To prevent drift while orienting in the wind, the lovebirds could also use their neck angle as feedback to modulate airspeed: we found that for each bird, lateral airspeed is indeed proportional to neck angle ( $R^2 = 0.77, 0.76, 0.52$ ; *SI Appendix*, Figs. SF34 and SF35).

Neck Angle Gives Effective Gust Feedback and Scales Favorably with Body Mass. When combined, the neck-informed proportional control models for body yaw and speed can explain most of the observed lateral-gust compensation behavior in lovebirds. The role of proprioception in flight control is also suggested by the observation that pigeons fly poorly when a paper collar blocks neck motion (9). Further refinement of the lateral-gust response model-e.g., by adding integral, differential, or other feedback terms informed by additional sensory inputs-is thus not essential according to the principle of parsimony. We expect, however, that fusing additional sensory feedback plays a role in making lateral-gust compensation more precise and robust. In addition to proprioceptive feedback, gusts may also be sensed by specialized feathers whose follicles encode feather vibration (32). These so-called filoplumes (33) are thought to inform behavioral changes when wind is blown at the breast of a fixed bird (34). In contrast, neck proprioception offers rapid, high-fidelity, directional feedback, as it does for the cervicocollic reflex (6). Lovebirds surely fuse other cues as well, such as expanding (looming) visual cues (35), parallax (36), or spatial memory cues (37). However, given the predictive strength of our simple model (Eq. 2), the most parsimonious explanation is that lovebirds compensate for gusts in the dark by using the dim point light source as a heading and reference for proprioceptive wind cues. Considering lovebirds are diurnal generalists, their innate ability may apply more generally to other birds, including those that fly in the dark with minimal visual information (12). To see if other birds could make use of proprioception-informed maneuvers, we calculated how the yaw angle response changes with body size according to our model (Eq. 2).

The rate at which the lovebirds can glean gust information from proprioception scales with the rate of the yaw reorientation into the wind. According to our model, the body yaw angle of lovebirds responds to a sharp lateral gust (step function) with a time constant  $\tau = 2fI/c = 1.4 \pm 1.0$  wingbeats (Fig. 6F and SI Appendix, section S4). Using isometric scaling, we find this time constant generally decreases with body size-ranging from around 10 wingbeats for insects to 1 wingbeat for large birdsshowing that bigger animals could use proprioception to gather wind information over fewer wingbeats than lovebirds (Fig. 6G). Our model may therefore help to explain how birds migrate effectively even with minimal visual information, such as at night or in clouds and fog (11, 12, 38), or how blindfolded gulls can fly stably in crosswinds (39). However, the time constant is further modified by parameters such as air density, aspect ratio, and stroke amplitude within 1 order of magnitude (Fig. 6G), so further consideration is required for specific species (SI Appendix, section S5). Our model could also give mechanistic insight into why birds fly toward and crash into artificial light sources at night. These sources, which can be lighthouses (40), monuments (41), or skyscrapers (42), are estimated to lead to billions of bird deaths a year (43). Steady lights—like the one in our study—can be particularly attractive and thus disorienting for migrating birds (44).

#### Conclusion

Our corroborated control model can explain how lovebirds maneuver through 45° lateral gusts, without optic flow or a visual horizon, in visually poor conditions that cause spatial disorientation in pilots. By counteracting most of the low- and highfrequency body motions with their neck, lovebirds can infer the inertial horizon and reliably fixate on the light beacon. By comparing goal heading to body angle, which is driven into the gust by a weathervane-like aerodynamic torque generated by the flapping wings, lovebirds can estimate the local wind angle and proportionally control body slip and speed. The similarity in the proportional control model coefficients across environments (Fig. 6F) and consistent body kinematics (Fig. 5) show that this strategy is robust and works equally well in the dark with only a point light source as a beacon. The corresponding differences in ground speed are remarkably small across visual conditions (Fig. 1D), despite major gust speed differences. These results revise our understanding of the importance of optic flow in avian flight control. Optic flow is likely used to regulate ground speed (Fig. 1D) and vertical position—as it is with budgies (2) and hummingbirds (45) in corridors of still air-but is apparently not essential for dynamic flight control. Furthermore, a wide-field visual horizon may be replaced by a stabilized (Figs. 2 and 4) inertial horizon (46), in combination with a visual beacon, to navigate environments with 45° lateral gusts.

Our model explains how proprioceptive information related to flow direction is both available and functional in the lovebird's gust compensation, whereas it was previously thought to be unimportant for wind orientation over longer flight distances in birds (3). Notably, our corroborated model performs better for the longer gust (Eq. 2; cross, R<sup>2</sup> 0.94, rms 9°) and converges over longer "crosswind" distances (SI Appendix, section S3) in a way that scales favorably with avian body mass (Fig. 6G). These findings suggest future movement ecological studies may find value in tracking both the body and head motion of birds [as recently pioneered in a pigeon navigation study (47)] to interpret atmospheric wind orientation in birds (SI Appendix, Fig. SF36). These studies will also benefit from more detailed laboratory studies that further dissect sensorimotor function in birds negating gusts and atmospheric turbulence across different length and timescales. Finally, the corroborated gust compensation model may inspire new minimal control algorithms that help aerial robots navigate dark and gusty environments as deftly as lovebirds (Movies S1–S3).

#### **Materials and Methods**

**Experimental Setup.** We conducted flight experiments in a flight corridor  $(320 \times 150 \times 70 \text{ cm})$  surrounded by mesh walls, floor, and ceiling (CAD rendering in *SI Appendix*, Fig. SF38). The mesh type (Polyester Mesh 670 Mm - Open Area: 52%, ELKO Filtering) was chosen to be coarse enough for air from the gust generators to pass through, while fine enough that the generators were invisible from inside the arena. The floor was covered with a black rubber mat. Birch landing perches (34 cm long, 1.2 cm diameter) were mounted at the center of each end of the arena (equidistant from sidewalls and 33 cm from the floor). The perches were mounted on transparent acrylic bars set 10 cm off the wall to make them clearly visible (Fig. 1*B*) and allow safe landings. Birds entered the arena through entry windows (12.5 × 12.5 cm) cut out of the wall behind the perches.

We textured the white mesh walls in one of three ways: black vertical stripes 100 mm wide (forest), bottom half black and top half white (lake), and all black (cave). The vertical stripe dimensions (20 cm period, 10 cm black + 10 cm white) were tuned such that birds flying at 2 m/s in the center of the arena experienced a 10-Hz spatiotemporal frequency, a motion rate known to be well perceivable by small parrots (48, 49) like lovebirds. We chose the paint (black matte finish, Quick Color; Rust-Oleum) to provide high contrast: the average Michelson contrast measured from the center of the arena was 0.73  $\pm$  0.03 between vertical stripes and 0.79  $\pm$  0.004 across the horizon, which are perceivable contrasts for small parrots (49, 50). To provide sufficient ambient light for visual navigation (49, 50), we installed 2 large LED panels (120  $\times$  120 cm; Samsung High CRI; illuminance: 600 cd/m<sup>2</sup>) 130 cm above the flight volume. The ambient light level was 155 + 13 lx in the forest condition and 158  $\pm$  12 lx in the lake condition (LX1330B; Dr.Meter), compared with 0.2 lx in the cave condition, where the only light source was a dim light behind the target perch (luminance 30 cd/m<sup>2</sup>, LS-100; Konica Minolta). Black textile sheets prevented light from the LED panels from exiting the arena, and light sources in the surrounding room were shut off. As a result, no exterior visual cues were visible from within the flight arena (Fig. 1B).

Lateral gusts were produced by 2 custom-built gust generators outside the mesh sidewalls. Each generator consisted of 6 fans (12-in. diameter; 2931 CFM, Global Industrial) arranged in 2 rows within a wooden housing (CAD rendering in *SI Appendix*, Fig. SF39). Two mesh screens in front of the fans were designed to merge the individual air streams into a single uniform airflow (S1). Each generator covered the entire height of the arena and one-third of the arena length. To create gust maps, we used a hot wire ane-mometer (CTM DT-8880) to measure airspeed at 135 perch-height locations (20 cm  $\times$  15 cm grid) (Fig. 1C). We placed noise-dampening foam pads on the room walls to reduce the noise to 94 dB (A-weighted; Velleman DVM805) when both gust generators were running. The birds spent no more than 2 h in the room when the generators were running, which is less than the 4 h allowed at these levels by California's Occupational safety and health administration (52).

The lovebirds (Agapornis roseicollis) were hand-raised and housed in indoor social cages with at least 2 birds per cage in a 12-h night/day cycle. To habituate the lovebirds to the gust generator noise, we placed electric fans and speakers playing gust generator recordings in their holding room for 15 min at a time, up to 2 h a day, for a month before the experiments. To habituate the birds to the flight arena, we placed them in the arena for an hour at a time periodically during the 2 wk before the experiment. During the habituation, all lights were on, the visual environment had maximum richness (forest), the gust generators were off (still), and the birds were fed millet spray. Some habituation sessions included wearing tracking gear. Of 4 habituated birds, 3 showed no change in behavior when wearing the motion-tracking gear. The fourth bird was excluded from the experiment as it did not fly reliably wearing gear. The age of the 3 birds ranged from 14 to 36 mo, and their weights range from 53 to 55 g. Two birds were male (NN, RR); one was female (BB). All birds received food and water ad libitum, their cages were enriched, and all training and experimental procedures were approved by Stanford University's Administrative Panel on Laboratory Animal Care.

To capture the positions/orientations of the bird's head and body, we placed clusters of 3 retroreflective markers on a harness and thin goggle sockets worn by the bird (*SI Appendix*, Fig. SF40). The attitude (position and orientation) of each 3-marker cluster was tracked at 1,000 Hz by 13 infrared motion capture cameras (Qualisys Oqus 7+; 3 MP) mounted above the arena. The infrared light (880 nm) used by the cameras was outside the measured spectral sensitivity of the birds (53). During the calibration procedure, the tracking software (Qualisys Track Manager 2) reported positional tracking fitted to the body shape of each bird to ensure a snug fit (54). The goggle

sockets were made thin to ensure the visual field was not occluded (CAD rendering in *SI Appendix*, Fig. SF40). To minimize stress and avoid escape responses, we applied the tracking gear in complete darkness. To aid our vision and hand–eye coordination while applying the gear, we lit the room with 2 infrared LED lights (850 nm; Univivi U48R 48- LEDs WideAngle IR II-luminator) and wore custom-built infrared goggles (GoPro Hero3: Silver Edition with RipCage custom casing and 5.4 mm f/2.5 60d HFOV 10MP lens without IR filter mounted to high-definition video goggles; Dominator Revision A, Fat Shark).

Kinematic videos were made with 2 additional high-speed grayscale CMOS-cameras (Phantom Miro 310; Vision Research) mounted to the side and above the arena. The camera sensitivity in the infrared spectrum allowed us to make 500-Hz recordings in all visual environments, including the cave environment with the infrared motion capture cameras as the only light source. An external trigger was used to trigger the end of a 15-s ring buffer recording.

Data Capture. The birds were exposed to the 9 visual and gust environments psuedorandomly (SI Appendix, Table ST3). For welfare reasons, and to reduce the probability that the birds used visual cues besides wall textures, we started with the bright environments (lake, forest), then finished with the cave (SI Appendix, Table ST3). Within each visual condition, we ordered gust environments for each bird in a Latin square fashion (SI Appendix, Tables ST3 and ST4) (55, 56). Before each set of flights, we put tracking gear on the bird, then transferred it in a covered transport box to 1 of the 2 entry windows of the unlit flight arena. We then slid open the door of the box and turned on the arena lights, prompting the bird to fly to the starting perch. Once the bird crossed the arena (either spontaneously or with a hand-wave cue), we saved data from the ring buffer. We only kept flights in which the takeoff direction was facing directly to the opposite perch (±30°). After each set of flights, birds were returned to their aviary and trained using positive reinforcement and handfed, so that all remained tame and voluntarily approached human hands.

After each flight, we cropped the kinematic video footage from takeoff until landing. After each set of flights, we checked the marker tracking data for quality. Frames with spurious rigid bodies were removed, and clear misidentifications of markers were corrected. These procedures were conducted in the Qualisys Track Manager (Qualisys AB) before exporting the position/orientation data as MAT files. Eight flights exported to MAT files were later discovered to have corrupt tracking data (clear misidentifications and/or blank datasets); these flights were not analyzed. During each flight, the birds flew across the arena in 1 of 2 directions: direction A and direction B. Of the 366 analyzed flights (BB, n = 115; RR, n = 127; NN, n = 124), 187 were direction A and 179 were direction B. Analyzing both flight directions allowed us to ensure that the cross gusts were not always come from the same direction. Due to the symmetry of the arena and the lack of visible differences between direction A and B flights, we mirrored the kinematics of flights from B to A (SI Appendix, Fig. SF41). All data are publicly available online (57).

Data Processing. The body and head attitude data were processed and filtered before subsequent analyses. Across all timesteps, 13% of the positions/ orientations were missing due to markers temporarily being blocked by feathers or part of the bird's body. Most of these missing data occur during takeoff and landing; for our analysis, we cropped out the takeoff/landing data (data where x was within 20 cm of the perches). The remaining data had 2% of values missing, and these values were omitted from subsequent analyses. Noise in the position/orientation data were filtered out using a lowpass filter at 6 times that trial's flapping frequency (6 $f = 102 \pm 5$  Hz). The position/orientation data were either analyzed with no additional filtering (Fig. 2B), an additional highpass filter [Fig. 2C (HF); Fig. 3 (HF); Fig. 4], or an additional lowpass filter [Fig. 2C (LF); Fig. 3 (LF); Fig. 5; Fig. 6 A, B, F, and G)]. The additional highpass filter was designed to isolate high-frequency head stabilization (cutoff frequency f/2 = 8.5 Hz). The additional lowpass filter was designed to isolate low-frequency head orientations (cutoff frequency f/2 = 8.5 Hz). We applied filters using Mathematica's LowpassFilter and HighpassFilter functions (v11.0.1; Wolfram Research), which use Hamming windows for preprocessing and apply linear finite impulse response filters.

Wingbeat frequency and saccade data were extracted manually from kinematic video and tracking data. The ends of down- and up-strokes were defined as frames when wings were in their most anterior and posterior positions, respectively (5). We defined wingbeat frequency as the inverse of the average time between upstrokes ( $f = 17.0 \pm 1.0$  Hz). Saccades were isolated by scanning the unfiltered head orientation data. A linear regres-

sion was applied to each extracted saccade to estimate the angular speed of the saccade.

To isolate the variation in yaw and roll (Fig. 3), we subtracted each trial's average yaw and roll, then added in the ensemble-averaged yaw and roll. The same procedure was used to isolate variation in body-neck coupling (Fig. 2). To create smooth navigation traces (Fig. 5), we resampled the lowpass-filtered position/orientation data over the x domain of the arena such that the y, pitch, roll, and yaw data had the same input domain (-1.3 to 1.3 m with 0.01-m resolution; third-order polynomial fits between successive data points via Interpolation, Mathematica). The mean and SD of y, pitch, roll, and yaw were then calculated at each x value. We omitted averages at x values where more than 10% of the flights contained missing values ( $\approx 2\%$  of x values at the beginning and end of the domain).

**Data Analysis.** To analyze the passive role of the neck in head stabilization, we considered a 2-coefficient mass-spring-damper model for the highpass-filtered head kinematics:

$$m\ddot{\xi}_{\rm h} = -c\dot{\xi}_{\rm h} - k(\xi_{\rm h} - \xi_{\rm b}),$$

where *m* is the head mass, *c* is a damping constant, *k* is a spring constant,  $\xi_h$  is the *x/y/z/*pitch/roll/yaw of the head, and  $\xi_b$  is the corresponding measurement for the body. The coefficients are nondimensionalized as the damping coefficient,  $\zeta \equiv c/\sqrt{km}$ , and the natural frequency ratio,  $f_n/f$ , where  $f_n$  is the natural frequency of the spring  $(\sqrt{k/4\pi^2m})$  and *f* is the average wingbeat frequency.

The gain G and phase lag  $\phi$  of the response  $(\xi_{\rm h})$  compared with the forcing  $(\xi_{\rm b})$  is a function of the natural frequency and damping coefficient. For harmonic forcing, the gain and phase lag have closed-form solutions  $G = \sqrt{(1 - (f_{\rm n}/f)^2)^2 + 4\zeta^2 (f_{\rm n}/f)^2}$  and  $\phi = \sin^{-1}(2\zeta(f_{\rm n}/f)G)$ . We inverted these functions to solve for the natural frequency ratio and damping coefficient given the measured average value and SD of the gain and phase offset. We calculated the gain and phase lag directly from experimental data: the gain as the ratio of the mean absolute value of the head signal to the body signal and the phase lag as the peak of the cross-correlation between head and body signal. Inverting the quartic gain function gives 4 solutions. We present the 2 real positive  $f_{\rm n}$  solutions, one of which often represents an inverse damper (c<0) for the rotational degrees of freedom.

To test scaling predictions of the passive head stabilization model, we estimated vertical head displacements compared with eye diameter. We estimated body center of mass displacements to be  $g/(4\pi f^2)$ , where g is the acceleration due to gravity (*SI Appendix*, section S2). We used published frequency versus body mass data to generate displacements as a function of body mass (58). The resulting head displacements are the body displacements times the gain we calculated for lovebirds. To estimate head displacements compared with eye diameter ( $d_{eye}$ ), we used an established power scaling for eye diameter as a function of body mass (59),  $d_{eye} \sim m^{0.23}$ , and passed the scaling through the average for our experiment (body mass = 54 g, eye diameter = 5 mm).

To analyze the role of body yaw in maneuvering through crosswinds, we fit a 3-coefficient inertia-damper-spring model with an active P-controller to the body yaw data (Eq. 2; derivation in SI Appendix, section S2). The aerodynamic stiffness term was corroborated from our ornithopter experiments in the wind tunnel, where the restoring torque was proportional to slip angle over the range of angles experienced by the lovebirds (Fig. 6D). Three scaled coefficients  $(k/I, k_P/I, and c/I)$  were fit using a gradient-descent scheme (ParametricNDSolveValue & FindFit in Mathematica) that minimized the squared residuals between the measured and modeled head data. To avoid sharp initial conditions,  $\theta_{slip}$  and  $\theta_{neck}$  were padded with smooth transitions to zero (transition duration = 10% of the flight time) before the beginning and after the end of each flight. The padding was to provide numerical stability; the goodness of fit is based on data during the true flight time and does not include the padded data. The fit was first computed without the active term  $(k_P = 0)$  and then with the active term  $(k_P \ge 0)$ . In nearly all (99%) of the flights, the coefficients guickly converged to stable averages; the remaining 1%, defined as cases where coefficients were more than  $3\sigma$  from the mean, were not included in the reported averages (Fig. 6F). We present 2 dimensionless outcomes of the fit:

$$\tau = \frac{2fl}{c}$$
 and  $\zeta = \frac{c}{\sqrt{4(k+k_{\rm P})l}}$ ,

where  $\tau$  is the response time in wingbeats and  $\zeta$  is the effective damping coefficient in a 2-spring system with spring constants k and k<sub>p</sub>; it quantifies

whether the yaw response is underdamped ( $\zeta < 1$ ), critically damped ( $\zeta = 1$ ), or overdamped ( $\zeta > 1$ ). To determine whether lovebirds could also use neck angle to regulate airspeed, we compared lateral airspeed (y ground speed minus local wind speed,  $v_{wind}$ ) to neck angle and found they were proportional (*SI Appendix*, Fig. SF35).

We defined the goodness of fit based on the mean squared residuals compared with the variance of the signal,

$$R^{2} = 1 - \frac{\sum (\theta_{body,actual} - \theta_{body,model})^{2}}{\sum (\theta_{body,actual} - \overline{\theta_{body,actual}})^{2}},$$

where  $\theta_{body,actual}$  is the measured body yaw,  $\theta_{body,model}$  is the modeled body yaw, and the overbar denotes time averaging. The goodness of fit runs from 0 (model is no closer to actual than the variance of the actual) to 1 (model is identical to actual).

To test scaling predictions of the body yaw model, we considered the response time of the yaw angle to changes in gust conditions. The model predicts step changes in  $\theta_{neck}$  or  $\theta_{slip}$  to result in oscillations that decay with the time constant  $\tau$  (*SI Appendix*, section S4). Using isometric scaling, we predict that this time constant scales with  $m/\rho t^3$  (*SI Appendix*, section S5), and we estimated the scaling coefficient using the measured point for our experiment (body mass = 54 g, wing length = 120 mm,  $\tau = 1.4$  wingbeats) in Fig. 6G. We estimate that changes in nonisometric variables (air density, aspect ratio, nondimensional third moment of area, stroke amplitude, force coefficient, and wing path shape factor) could shift the trendline by a factor of 0.2 to 4 (*SI Appendix*, section S5). Given the multiple orders of magnitude spanned by the trendlines, the scaling predictions for hummingbirds and insects are robust based on reasonable estimates of error.

**Mechanical Bird Model Experiments.** To determine how flapping wings passively orient in lateral gusts, we tested a free-flight ornithopter (Avitron v2.0) in a wind tunnel (60). The ornithopter started at 1 of 6 slip angles ( $\pm$ 30°,  $\pm$ 60°,  $\pm$ 90°, 3 trials per angle) and then freely rotated on a custom mount that only

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allowed yaw motion. We removed the tail to isolate the contributions of the wings. The ornithopter was fixed at a stroke plane angle of 25° with the rotational axis intersecting the ornithopter's center of gravity. The flow in the tunnel's test section ( $0.8 \times 1.0 \times 1.73$  m) was at a representative lovebird airspeed, 4 m/s. Turbulence intensity in the flow was 3.42%.

We measured the yaw angle with 2 markers tracked at 1,000 Hz by 7 infrared motion capture cameras (Qualisys Oqus 7+, 3 MP). From the calibration procedure, we estimated a positional tracking error of 0.1 to 0.3 mm. Our motion capture process yielded 100% tracking success with no lost frames. To remove wingbeat-driven oscillations, we lowpass filtered the yaw angle data (fourth-order Butterworth) with a cutoff frequency of half the wingbeat frequency. We took derivatives of the data using a central difference scheme and fit the resulting data (fitnml, MATLAB) to a 3-coefficient passive yaw model,

$$\ddot{\theta}_{\text{body}} = (k/I) (\theta_{\text{slip}} - \theta_0) - (c/I) \dot{\theta}_{\text{body}}.$$

The model is identical to the passive model used for lovebirds (Eq. 1), except for a slip angle offset,  $\theta_0$ , used because of slight wing asymmetries in the ornithopter that caused an equilibrium slip angle of about  $-8^\circ$ . The model captured most of the ornithopter yaw dynamics ( $R^2$  0.74) over the range of slip angles encountered by the lovebirds ( $-50^\circ < \theta_{slip} < 31^\circ$  for 95% of data). We nondimensionalized restoring torque (Fig. 6*D*) by using the yaw response time (*SI Appendix*, section S4).

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## **Supplementary Information**

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### Section S1. Predicting drift with a passive drag model

If the lovebirds were to use no compensation, their lateral position, y, would follow passively from the lateral drag force generated by the lateral gusts. The associated lateral displacement can be calculated as the second integral of the lateral gust forces,  $F_y$ , with respect to time:

$$y(t) = \iint_0^t F_y(\tau) \mathrm{d}\tau.$$

The gust drag force can be calculated based on the drag law,

$$F_{y} = C_{D} \frac{1}{2} \rho v_{\text{gust}}^{2} S,$$

where  $\rho$  is the density of air, *S* is the surface area of the bird, and  $C_D$  is a drag coefficient. The drag coefficient will be a function of wing/body position and Reynolds number, but to estimate its magnitude, we can apply a drag coefficient for a sphere with the same surface area (0.01 m<sup>2</sup>, based on morphometric measurements of lovebirds from the same colony) and Reynolds number ( $Re = \rho v_{gust} \ell/\mu \approx (1.2 \text{ kg/m}^2)(3 \text{ m/s})(0.1 \text{ m})/(1.8 * 10^{-5} \text{ kg/m} * \text{s}) \approx 20,000$ ), where  $C_D \approx 0.5$ . This is a reasonable estimate, because while the birds may be more streamlined in the frontal direction, in the lateral direction, they will experience mostly bluff body pressure drag.

We can estimate the total lateral displacement based on our gust velocity maps. We know the lateral gust speed from our hotwire measurements, which give the gust speed,  $v_{gust}$ , as a function of x and y position. We know the x and y position as functions of time from the motion-tracking data. Therefore, we can estimate the expected lateral displacement over the duration of the flight ( $t_{flight}$ ) – assuming there were no compensation – to be

$$y(t_{\text{flight}}) = \iint_0^{t_{\text{flight}}} C_D \frac{1}{2} \rho v_{\text{gust}}^2(x(\tau), y(\tau)) S d\tau.$$

Calculating this integral numerically for all the *crosswind* cases gives  $y(t_{\text{flight}}) = 23 \text{ cm} \pm 11 \text{ cm}$ . We present the predicted and measured lateral drift values for the lovebirds in Fig. SF1 for both the *cross* and *shear* gust condition. Considering the birds reached the goal perch in all 366 flights, sometimes to the opposite side of the perch from what would be expected based on passive lateral drift, the birds clearly compensate for the gusts. To be sure, we tested the measured perch landing locations against the predicted drift values and found they were significantly different (Fig. SF1). The only reasonable explanation for these observations is that the birds are compensating for lateral gust forces to avoid drifting during flight.



Fig. SF1. Lovebirds compensate for the lateral gusts, showing less lateral deflection ( $\Delta y$ ) than what is predicted by a passive drag model. A passive drag model (Section S1) predicts nonzero lateral deflection (empty circles), whereas the measured deflection was closer to zero (filled circles). When pooled by visual condition, the predicted deflections in cross and shear were significantly different from the measured deflections (Mann-Whitney U Test, p < 0.001)

#### Section S2. Derivation and scaling of the vertical head stabilization model

To determine how head stabilization scales with body size, we use the fact that body displacement depends on the net vertical force on the body. Generalist birds and bats are known to have a mostly inactive upstroke during which they do not support much of their body weight. In contrast, hummingbirds and some insects generate appreciable weight support on the upstroke. Either way, the average net vertical force (lift minus body weight) must be 0 during straight forward flight. The corresponding body

displacements are obtained by integrating the net vertical force divided by mass twice with respect to time. The head displacement follows by multiplying the body displacement scaling law with the predicted head stabilization gain, *G*.

For scaling purposes, which only require order of magnitude accuracy at specific scales, we modelled the weight support (lift divided by body weight), L/mg, with a periodic function of wingbeat phase (wingbeat frequency times time), ft. In our function, the ratio of upstroke-to-downstroke weight support,  $\mu$ , can range from 0 to 1 (Fig. SF2A). Generalist birds and bats have a mostly inactive upstroke ( $\mu = 0$ ). Hummingbirds support approximately 25% of their weight on the upstroke ( $\mu = 0.25/0.75 \approx 0.33$ ) (1). Flies support weight equally on the downstroke and upstroke ( $\mu = 1$ ) (2). Our lift function can be written for any  $\mu$  by incorporating the unit step function, U(t):

$$\frac{L}{mg} = \frac{1}{2}\sin(2\pi ft) \left[\pi(2-\mu)U\left(\frac{1}{2}-ft\right) - \pi\mu U\left(ft-\frac{1}{2}\right)\right].$$
 (S1)

The coefficients in the function are tuned such that the net vertical force (lift minus body weight) is zero when averaged over a wingbeat (0 < t < 1/f).



Fig. SF2. The lift and vertical body displacements can be modeled as a periodic function of wingbeat phase. (A) The lift divided by body weight, L/mg, depends on the relative contribution of the upstroke,  $\mu$ . Birds and bats show a mostly inactive upstroke ( $\mu = 0$ ), whereas flies show equal lift contribution on the upstroke ( $\mu = 1$ ). (B) The maximum excursion of the body during a wingbeat,  $\Delta_{z,body}$ , scales with gravity, g, divided by frequency squared,  $f^2$ . The exact value of the maximum excursion can vary up to an order of magnitude depending on the relative contribution of the upstroke.

Regardless of the lift curve's shape, the magnitude of body displacement scales with gravity divided by frequency squared. The net vertical force is equal to lift minus body weight, L - mg. Integrating the net vertical force divided by mass twice with respect to time gives the vertical body displacement,  $z_{body}$ :

$$z_{\text{body}} = \iint \frac{L - mg}{m} dt dt = \frac{g}{f^2} \Big[ \Big( \frac{ft}{2} - \frac{1}{4} \Big) \Big( ft - U \Big( ft - \frac{1}{2} \Big) \Big) + \frac{1}{8\pi} \Big( \mu - 2 + 2U \Big( ft - \frac{1}{2} \Big) \Big) \sin (2\pi ft) \Big].$$
(S2)

The integration constants (0 and ft/4) are chosen such that  $z_{body}$  is periodic with an average height of  $z_{body} = 0$ . The body displacement is equal to  $g/f^2$  times a dimensionless function (everything inside the square brackets). This solution form shows that the precise shape of the lift curve is inconsequential for scaling purposes. The peak-to-peak excursion in vertical body position over a wingbeat,  $\Delta_{z,body}$ , depends mostly on gravity and the wingbeat frequency. The shape of the lift curve, which is driven by the upstroke-to-downstroke weight support fraction, only affects the scaling coefficient (Fig. SF2B). The scaling coefficient can change by a factor of about 9: for generalist birds and bats ( $\mu = 0$ ),  $\Delta_{z,body} = (1/4\pi)(g/f^2) \approx 0.08g/f^2$ ; for hummingbirds ( $\mu = 0.33$ ),  $\Delta_{z,body} = (1/6\pi)(g/f^2) \approx 0.05g/f^2$ ; for flies ( $\mu = 1$ ),  $\Delta_{z,body} = ((\pi - 4)/32\pi)(g/f^2) \approx 0.01g/f^2$ . For the lovebirds, the model captures the body displacement well: the model predicts  $\Delta_{z,body} = 0.08g/f^2 \approx 3$  mm, and the average peak-to-peak vertical body displacement we measured was 2.2 +/- 0.5 mm.

Using our scaling prediction, we find that wingbeat-driven eye displacements are less detrimental to the vision of hummingbirds and insects. By using published frequency and mass data for flying animals (3), we plotted the predicted peak-to-peak eye displacements,  $\Delta_{z,eve}$ , across species (Fig. 3C). For these estimates, we used the same vertical head-body gain that we measured for lovebirds:  $\Delta_{z,eve} = 0.64 \Delta_{z,body}$ . This is a conservative estimate given that lower gains (0.25) were observed in whooper swans (4). To compare the displacement with eye diameter, we used an established power law for eye size as a function of body mass,  $d_{eve} \sim m^{0.23}$  (5), which we passed through the measured point for our lovebirds: m = 54 g,  $d_{eve} = 5$  mm. Changing the head-body gain would shift the prediction by an order 1 value and would not change the scaling. Similarly, using a different lift curve with nonzero upstroke weight support would decrease the predicted eye displacement by up to a factor of 9. However, a lower eye displacement would only strengthen our conclusion, which is that smaller flying animals have vertical eye displacements that are tiny fractions of eye diameter. For this reason, we predict head stabilization to be more important for larger flying animals like lovebirds and whooper swans (4).

#### Section S3. Derivation of the body yaw dynamics model

We modeled the body yaw dynamics of lovebirds to better understand how they respond to crosswind. Our second-order spring-damper-inertia model has three forcing terms: an aerodynamic restoring torque inspired by our ornithopter experiments in the wind tunnel (Fig. 5D), a damping term inspired by Flapping Counter Torque (*6*), and a proportional (P) controller term inspired by the slip angles we observed (Fig. 5A,B):

$$\ddot{\theta}_{\text{body}} = (k/I)\theta_{\text{slip}} + (k_{\text{P}}/I)\theta_{\text{neck}} - (c/I)\dot{\theta}_{\text{body}},\tag{S3}$$

where  $\theta_{body}$  is the body yaw angle with respect to the x-direction (Fig. 2B),  $\theta_{slip} = \theta_{wind} - \theta_{body}$  is the slip angle (effective wind angle minus body yaw angle),  $\theta_{neck} =$ 

 $\theta_{\text{head}} - \theta_{\text{body}}$  is the neck yaw angle (head yaw angle minus body yaw angle), *I* is the body's moment of inertia about the vertical axis, and *k*,  $k_{\text{P}}$ , and c are constants.

To verify that the corroborated coefficients for Eqn. S3  $(k/I, k_P/I, c/I)$  are physically reasonable, we determined expected rough magnitudes of each torque in Eqn. S3.

The first torque,  $k\theta_{\rm slip}$ , is a passive torque inspired by ornithopter tests (Fig. 5D) that drives the bird to orient into the wind. The magnitude of this term in our corroborated yaw dynamics model is consistent with a classical aerodynamic analysis. The restoring torque is caused by a difference in the average thrust or drag between the two wings (Fig. SF3). Aerodynamic forces like average thrust and drag scale with  $(1/2)\rho u^2 C_{\rm F}S$ where  $\rho$  is air density, u is the incoming flow speed,  $C_{\rm F}$  is an aerodynamic force coefficient, and S is the surface area of the wing. The restoring torque on the body is proportional to the difference between these forces times  $\hat{r}_3 \ell$ , where  $\hat{r}_3$  is the nondimensional third moment of wing area and  $\ell$  is wing length (shoulder to wingtip). The moment arm of the torque also includes the distance from center of mass to shoulder, but this distance is small compared to  $\hat{r}_3 \ell$  and does not affect the scaling exponents. We can estimate the magnitude of restoring torques by substituting typical physical values. The density of air at sea level is about 1.2 kg/m<sup>3</sup>. The average airspeed of the lovebirds in our experiment was 2.9 m/s. A typical non-dimensional third moment of area is 0.59 (average of 31 species in Tab. S1, Hedrick, 2011). We estimate lovebird wing length and body area to be about 120 mm and 6000 mm<sup>2</sup> based on measurements on birds from the same colony. A typical restoring torque is therefore  $\hat{r}_3 \ell (1/2) \rho u^2 \Delta C_F S \approx$  $2\Delta C_{\rm F}$  N\*mm, where  $\Delta C_{\rm F}$  is the difference in force coefficient between left and right wings (Fig. SF3). Order 1 values of  $\Delta C_F$  would result in torques  $\approx 2 N^*$ mm. This estimated torque magnitude is consistent with the torque magnitudes we found in our corroborated yaw model. Based on the average corroborated k value ( $12 \pm 5 N^*$ mm) and a slip angle of 10° (Fig. 5A,B), the model exhibits passive torques of  $k\theta_{slip} \approx 2 N^* mm$ .



**Fig. SF3.** A passive restoring torque due to differential wing forces acts to minimize the slip angle. The restoring torque is equal to the thrust or drag on each wing times the second moment of wing area (plus the distance from body center of mass to wing shoulder).

The second torque in Eqn. S3,  $k_P \theta_{neck}$ , is a torque that the birds actively produced using wing asymmetries to navigate towards the goal perch based on proprioceptive input. The magnitude of this term in our corroborated yaw dynamics model is consistent

with the theoretical torque that Hedrick et al. (2009) proposed for asymmetric wing motion:  $(1/8)(\gamma - 1)\rho f^2 \ell^5 \gamma^{-1} \hat{r}_3^3 \Phi^2 \overline{C_F \sin(\delta) \hat{\omega}^2}$ . In this equation,  $\gamma$  is a coefficient of asymmetry that ranges from 0 (maximum asymmetry) to 1 (symmetric wing motion), f is wingbeat frequency,  $\chi$  is wing aspect ratio (shoulder-to-wingtip length divided by mean chord),  $\Phi$  is stroke amplitude,  $C_F$  is an aerodynamic resultant force coefficient of the wing,  $\delta$  is the spanwise rotation angle of the wing,  $\hat{\omega}$  is the non-dimensional angular velocity of the wing, and the overbar denotes a stroke-averaged value. We can estimate the expected magnitude of this torgue by substituting typical physical values. We estimate a wing aspect ratio of about 2.4 based on measurements on lovebirds from the same colony. From kinematic videos, we estimate the stroke amplitude for the lovebirds to be about 140° ( $\Phi \approx 2.4$  rad). The wingbeat frequency for the lovebirds was 17  $\pm$  1 Hz. The remaining term,  $\overline{C_F \sin(\delta) \hat{\omega}^2}$ , has been estimated to be about 31.3 for typical harmonic wing motions (6). Combined with the estimates above ( $\rho = 1.2 \text{ kg/m}^3$ ,  $\hat{r}_3 =$ 0.59), the magnitude of torque due to wing asymmetry is  $(1/8)(\gamma -$ 1) $\rho f^2 \ell^5 \chi^{-1} \hat{r}_3^3 \Phi^2 \overline{C_F \sin(\delta) \hat{\omega}^2} \approx 13(\gamma - 1) \text{ N*mm}$ . Based on the average corroborated  $k_{\rm P}$  value of the lovebird data (8  $\pm$  5 N\*mm) and a neck angle of 25° (Fig. 5A,B), the yaw dynamics model exhibits active torques of  $k_{\rm P}\theta_{\rm neck} \approx 3\,{\rm N}^{*}{\rm mm}$ . The lovebirds could therefore generate the corrective torques modeled by the P-controller by using an asymmetry coefficient of about 0.77 (1 - 3/13), representing mild wing asymmetry.

The third torque in Eqn. S3,  $c\dot{\theta}_{body}$ , represents a passive aerodynamic torque that dampens yaw motion. The magnitude of this term in our corroborated yaw dynamics model is consistent with Flapping Counter Torque theory. Passive yaw damping torque is expected to equal  $\rho f \ell^5 \chi^{-1} \hat{r}_3^{-3} \Phi \overline{C_F \sin(\delta)} \hat{\omega} \dot{\theta}_{body}$  (6). The term  $\overline{C_F \sin(\delta)} \hat{\omega}$ , has been estimated to be about 6.0 for typical harmonic wing motions (6). Combined with the estimates of other terms given above ( $\rho = 1.2 \text{ kg/m}^3$ , f = 17 Hz,  $\ell = 120 \text{ mm}$ ,  $\chi = 2.4$ ,  $\hat{r}_3 = 0.59$ ,  $\Phi = 2.4 \text{ rad}$ ), the damping torque evaluates to about 0.5  $\dot{\theta}_{body}$  N\*mm, that is, Flapping Counter Torque theory predicts  $c \approx 0.5 \text{ N*mm*s}$ . The average corroborated cvalue in our yaw dynamics model was  $1 \pm 1 \text{ N*mm*s}$ . The strength of the damping torque in our model is therefore the same order of magnitude as what Flapping Counter Torque theory predicts.

#### Section S4: Solution to the body yaw dynamics model with unit step forcing

To gain analytical insight into how body yaw responds to crosswind, we derived a closed-form solution to Eqn. S3 when the neck or slip angle experiences a sudden change. To derive a solution, it is clearer to express all terms in Eqn. S3 in terms of the body angle:

$$I\ddot{\theta}_{\text{body}} = k(\theta_{\text{wind}} - \theta_{\text{body}}) + k_{\text{P}}(\theta_{\text{head}} - \theta_{\text{body}}) - c \dot{\theta}_{\text{body}}$$
  
$$= (k + k_{P}) \left(\frac{k\theta_{\text{wind}} + k_{P}\theta_{\text{head}}}{k + k_{P}} - \theta_{\text{body}}\right) - c \dot{\theta}_{\text{body}}.$$
(S4)

This rearrangement shows that the system responds like a damped angular spring with a stiffness of  $k + k_p$  and an equilibrium angle of  $(k\theta_{wind} + k_p\theta_{head})/(k + k_p)$ . When this equilibrium angle experiences a sudden change in the form of a unit step function U(t), we find a transient response that decays with a time constant in wingbeats of  $f/(2\pi f_n\zeta)$  or 2fI/c:

Initial conditions:  $\theta_{\text{body}}(0) = \dot{\theta}_{\text{body}}(0) = 0$ , Forcing function (inspired by Eqn. S4):  $\frac{k\theta_{\text{wind}} + k_{\text{P}}\theta_{\text{head}}}{k + k_{\text{P}}} = U(t)$ , Solution:  $\theta_{\text{body}} = U(t) \left[ 1 - e^{-\frac{t}{1/(2\pi f_{\text{n}}\zeta)}} \left[ \frac{\zeta}{\sqrt{\zeta^2 - 1}} \operatorname{Sinh}(2\pi f_{\text{n}}t\sqrt{\zeta^2 - 1}) + \operatorname{Cosh}(2\pi f_{\text{n}}t\sqrt{\zeta^2 - 1}) \right] \right]$ , (S5)

where  $\zeta$  is the damping coefficient  $\left(c/\sqrt{4(k+k_{\rm P})I}\right)$  and  $f_{\rm n}$  is the resonant frequency of the undamped system  $\left(\sqrt{(k+k_{\rm P})/I}/2\pi\right)$ . To understand how the lovebird's body responds to changes in neck or slip angle, we can substitute the average fitted value of  $\zeta$  and  $f_{\rm n}$  (Fig. SF4). The time constant of the transient response in wingbeats is  $f/(2\pi f_{\rm n}\zeta) = 2fI/c$ , which for our data is  $1.4 \pm 1.0$  wingbeats. The hyperbolic sine and cosine functions cause the actual response to be slightly slower; the yaw angle settles to its new equilibrium value after closer to 4 wingbeats (Fig. SF4).



**Figure SF4. The model predicts a nearly critically-damped yaw angle response.** A unit step function stimulates a response in the yaw angle defined by Eqn. S5. The solution is shown with the average fitted values of  $\zeta$  and  $f_n$  based on the yaw angle traces of the lovebirds:  $\zeta = 2.2 \pm 2.0$  and  $f_n = 2.8 \pm 0.5$  Hz.

#### Section S5. Scaling the body yaw response time

To determine how animals may respond to crosswind more generally, we perform a scaling analysis based on the transient time constant in wingbeats we derived for lovebirds, 2fI/c. We first analyze the effect of body size on the time constant, after which we consider the remaining variables that influence the precise value.

The time constant depends on the moment of inertia, *I*, and the damping constant, *c*, due to Flapping Counter Torque (6). Moment of inertia scales roughly with body mass (*m*) times wing length squared (3). The damping constant *c* is expected (6) to equal  $\rho f \ell^5 \chi^{-1} \hat{r}_3^{\ 3} \Phi \overline{C_F \sin(\delta)} \widehat{\omega}$ . If all non-dimensional ratios stayed constant, the damping constant *c* would scale with  $\rho f \ell^5$ . Therefore, the time constant in wingbeats, 2fI/c, is expected to scale with  $2fm\ell^2/(\rho f \ell^5) \sim m/\rho \ell^3$ . By using published mass and wing length data for flying animals (3), we plotted the predicted time constant across

species (Fig. 5G). Because mass scales roughly with wing length cubed (*3*), the predicted time constant has only a weak dependence on body mass (spans 2 orders of magnitude across 6 orders of magnitude in body mass). We therefore considered how air density and non-dimensional ratios would cause deviations from isometric scaling.

We now consider variables that factor into the time constant that don't depend on body size. Many birds fly annually up to 6000 m above ground during migration, some species up to 9000 m (7). At these altitudes, the air density ( $\rho$ ) drops to about 40% of its value at sea level. The remaining variables are order 1 non-dimensional ratios, and their average values are relatively consistent. The average wing aspect ratio ( $\chi$ ) and nondimensional third moment of area  $(\hat{r}_3)$  do not vary much among birds, bats and insects (8). The average wing aspect ratio was 3.3 +/- 1.0 across 319 species of insects, hummingbirds, bats, and birds. The non-dimensional third moment of area was 0.59 +/-0.03 across 31 species of insects and birds (Tab. S1 (9)). The stroke amplitude ( $\phi$ ) can theoretically vary from 0 to  $\pi$ , but tends to cluster near what we observed for the lovebirds; across 42 species, the average stroke amplitude was 2.1 +/- 0.6 (Tab. S1 (9)). Similarly, the maximal force coefficients of wings do not vary considerably amongst taxa; across hawkmoths, bumblebees, mayflies, and quails, force coefficients differed by up to about +/- 15% over a range of incidence angles representative for flight (Fig. 8 (10)). The wing path shape factor,  $\overline{\sin(\delta)\hat{\omega}}$ , depends on the flight path of the wing, but it cannot vary considerably. We can test two extremes, a sine wave and a square wave, where the stroke-averaged values of the waveform are 1 and  $2/\pi$ , respectively  $(\int_0^1 |\operatorname{sgn}(\sin(2\pi t))| dt$  and  $\int_0^1 |\sin(2\pi t)| dt$ ). Thus, we expect the variation in  $\overline{\sin(\delta)\widehat{\omega}}$  to be no more than about  $+(\pi - 2)/2\pi \approx +18\%$ .

Based on the preceding analysis, we expect the time constant to be minimal when the damping constant,  $c = \rho f \ell^5 \chi^{-1} \hat{r}_3^{-3} \Phi \overline{C_F \sin(\delta) \omega}$ , is maximized. Conversely, we expect the time constant to be maximal when the damping constant is minimized. The damping constant, c, is up to 4 times higher than the average value for the following combined condition extremes: sea level air density (also used to calculate the average value), high aspect ratio, high non-dimensional third moment of area, high stroke amplitude, high force coefficient, and square wave wing path. Assuming the representative maximum variation is twice the reported standard deviations (preceding paragraph), we expect each variable to increase c as follows:

Variable	<u>Effect on average c</u>
sea level air density $ ho$	× 1
high aspect ratio $\chi$	× 1.61
high non-dimensional third moment of area $\hat{r}_3$	× 1.10
high stroke amplitude $arPhi$	× 1.57
high force coefficient $C_F$	× 1.15
square wave $\overline{\sin{(\delta)}\widehat{\omega}}$	× 1.18
square wave $\sin(\delta)\hat{\omega}$	× 1.18

The cumulative effect is that the maximum *c* is about 4 times more than the average *c*  $(1 \times 1.61 \times 1.10 \times 1.57 \times 1.15 \times 1.18 \approx 3.8)$ .

If we now consider the opposite extreme values for all variables, the time constant would be 0.2 times the average value. We expect the highest possible time constant when c is minimized (low air density, low aspect ratio, low non-dimensional third moment of area, low stroke amplitude, low force coefficient, sin wave wing path). High altitude flight is typically performed by animals with higher aspect ratio wings, so we will also use the high aspect ratio multiplier when calculating this extreme condition. We expect each variable to decrease c as follows:

 $\begin{array}{ll} & \underline{\text{Variable}} & \underline{\text{Effect on average }c} \\ \text{low air density } \rho \ (\text{high altitude}) & \times 0.40 \\ & \text{high aspect ratio } \chi & \times 1.61 \\ \text{low non-dimensional third moment of area } \hat{r}_3 & \times 0.90 \\ & \text{low stroke amplitude } \Phi & \times 0.43 \\ & \text{low force coefficient } C_F & \times 0.85 \\ & \text{sinusoidal } \overline{\sin (\delta) \widehat{\omega}} & \times 0.82 \end{array}$ 

The cumulative effect is that the minimum *c* is about 0.2 times the average *c*  $(0.4 \times 1.61 \times 0.90 \times 0.43 \times 0.85 \times 0.82 \approx 0.2)$ .

#### **Section S6: Motion-Capture Uncertainties**

Uncertainties in the reported x/y/z/pitch/roll/yaw data result from a combination of motion-tracking uncertainty and marker positioning uncertainty. The Qualisys motion-tracking software reports an RMS error for position markers of 0.1-0.3 mm. We verified this accuracy using ground truth measurements of markers on a servo arm with a known trajectory (60° rotation in 30 ms). We also considered stretching or slippage of the harness/goggles. There are two types of uncertainty to consider: constant offset ("DC") uncertainty, caused by the fabric shifting during flight or from trial to trial, and periodic ("AC") uncertainty, caused by a systematic stretch or slip during each wingbeat.

*DC* (constant offset) uncertainties: The harness and goggles were made snug by custom-fitting the straps to each bird (1). However, we installed the harness and goggles by eye, so variations up to around 1 mm are possible as DC sources of uncertainty between trials. Based on the dimensions of the marker constellations, this leads to a worst-case uncertainty in angles of  $\pm \tan^{-1}(1 \text{ mm}/3 \text{ cm}) \approx \pm 2^{\circ}$ . We mitigated these uncertainties by analyzing *relative* motions wherever possible. For example, the coupling between neck and body angles (Fig. 2C), which illustrates the key compensatory behavior that facilitates the gust mitigation, is mostly unaffected by DC uncertainty. In contrast, the traces of absolute angles (Fig. 5) should be considered with this uncertainty in mind.

AC (time-variant) uncertainties: Based on the dimensions of the marker constellations ( $\approx$  3 cm across), we can estimate how much stretch or slip would be required to produce the reported angle/displacement residuals. For the residual in head pitch angle

 $(2.5^{\circ}+/-0.6^{\circ})$ , the required stretch/slip is  $(3 \text{ cm})^* \tan(2.5^{\circ}) \approx 1.3 \text{ mm}$ . The required stretch/slip in other directions are comparable: x, 5.0 mm; y, 1.1 mm; z, 2.2 mm; roll, 1.0 mm; yaw, 1.0 mm. If there were stretch/slip, it would lag the body/head motions by about 1/4 of a flapping cycle (0.015 s). However, we observed no phase-lagged marker motion in our high speed visual light cameras (1MP; 500 Hz). In those videos, the 5 mm markers are 5 or more pixels wide, so we were able to resolve motions at the sub-pixel/sub-millimeter scale (*11*) over about 1/30 of a flapping cycle (0.002 s). Therefore, we expect the RMS error (0.1-0.3 mm) to drive the AC uncertainty, causing at worst a signal-to-noise ratio in the residuals of about 3 (1.1 mm / 0.3 mm  $\approx$  3).

#### Section S7: Additional Supplemental Figures



**Fig. SF5. Ground speed, wind speed, body yaw, and head yaw separated by bird (BB, NN, and RR).** See Figure 1D, E in the main manuscript for additional details.



Fig. SF6. Head-neck pitch coordination separated by bird (BB, NN, and RR). See Figure 1D, E in the main manuscript for additional details.



Fig. SF7. Head-neck roll coordination separated by bird (BB, NN, and RR). See Figure 2C in the main manuscript for additional details.



Fig. SF8. Head-neck yaw coordination separated by bird (BB, NN, and RR). See Figure 2C in the main manuscript for additional details.



Fig. SF9. Yaw-roll body coordination in the *cave* separated by bird (BB, NN, and RR). See Figure 3A in the main manuscript for additional details.



Fig. SF10. Yaw-roll body coordination in the *lake* separated by bird (BB, NN, and RR). See Figure 3A in the main manuscript for additional details.



Fig. SF11. Yaw-roll body coordination in the *forest* separated by bird (BB, NN, and RR). See Figure 3A in the main manuscript for additional details.



**Fig. SF12. Yaw-roll head coordination in the** *cave* **separated by bird (BB, NN, and RR).** See Figure 3B in the main manuscript for additional details.



Fig. SF13. Yaw-roll head coordination in the *lake* separated by bird (BB, NN, and RR). See Figure 3B in the main manuscript for additional details.



Fig. SF14. Yaw-roll head coordination in the *forest* separated by bird (BB, NN, and RR). See Figure 3B in the main manuscript for additional details.



**Fig. SF15. High frequency head stabilization summary separated by bird (BB, NN, and RR).** See Figure 4A in the main manuscript for additional details.



**Fig. SF16. Flight path summaries in the** *still* **environment separated by bird (BB, NN, and RR).** See Figure 5 in the main manuscript for additional details.



**Fig. SF17. Flight path summaries in the** *cross* **environment separated by bird (BB, NN, and RR).** See Figure 5 in the main manuscript for additional details.



**Fig. SF18. Flight path summaries in the** *shear* **environment separated by bird (BB, NN, and RR).** See Figure 5 in the main manuscript for additional details.



Fig. SF19. Slip and neck angles separated by bird (BB, NN, and RR). See Figure 6A,B in the main manuscript for additional details.



**Fig. SF20 Gust compensation metrics show no clear trends with increasing trial number. (A)** The body yaw angle soon after takeoff (20 cm right of perch) does not show patterned changes within each gust configuration as trial number increases. The lovebirds show little to no yaw preference in the *still* environment ( $\theta_{body,1st} = -5^{\circ} \pm 12^{\circ}$ ) but are consistently turned into the first gust in the *cross* and *shear* environments ( $\theta_{body,1st} = -26^{\circ} \pm 15^{\circ}$  and  $-28^{\circ} \pm 15^{\circ}$ , respectively). The consistent nonzero yaw angles in the *cross* and *shear* environments suggest that any anticipatory yaw behavior in the *still* environment is small compared to yaw responses in the gusts. **(B)** The maximum body yaw speed as lovebirds enter the second half of the arena (max value for -0.4 m < *x* < 0.8 m; area between dashed lines shown on gust maps) does not show patterned changes within each gust configuration as trial number increases. The lovebirds consistently reorient into the second gust in the *shear* case ( $\dot{\theta}_{body,2nd} = 258^{\circ}/s \pm 91^{\circ}/s$ ). In contrast, they do not reorient in *still* or *cross* trials ( $\dot{\theta}_{body,2nd} = -28^{\circ}/s \pm 94^{\circ}/s$  and  $-31^{\circ}/s \pm 104^{\circ}/s$ , respectively), even directly following *shear* trials, showing that they are not anticipating a second gust in those cases. Data separated by bird are shown in Fig. SF 23, 24.



Fig. SF21. The body yaw angle soon after takeoff (20 cm right of takeoff perch) does not show patterned changes with increasing flight number. We observe no decay of transient behaviors, suggesting that lovebirds are not learning to anticipate the first gust from flight to flight. The number of flights that share the same flight number in a batch (with Flight # = 1, 2, 3...) is shown to the right of each data set. The number of flights, *n*, starts at 9 (3 birds x 3 visual conditions) and then reduces, because the total number of trials varies per bird and condition. In all cases, *n* is 9 for the first 5 Flight #'s and thus only partially plotted to avoid clutter. Data separated by bird are shown in Fig. SF 25-27.



Fig. SF22. The maximum body yaw speed as lovebirds enter the second half of the arena (-0.4 m < x < 0.8 m) does not show patterned changes with increasing flight number. We observe no decay of transient behaviors, suggesting that lovebirds are not learning to anticipate the second gust from flight to flight. The number of flights that share the same flight number in a batch (with Flight # = 1, 2, 3...) is shown to the right of each data set. The number of flights, *n*, starts at 9 (3 birds x 3 visual conditions) and then reduces, because the total number of trials varies per bird and condition. In all cases, *n* is 9 for the first 5 Flight #'s and thus only partially plotted to avoid clutter. Data separated by bird are shown in Fig. SF 28-30.



Fig. SF23. Figure SF20 ( $\theta_{body,1st}$ ) separated by bird (BB, NN, and RR).



Fig. SF24. Figure SF20 ( $\dot{\theta}_{yaw,2nd}$ ) separated by bird (BB, NN, and RR).



Fig. SF25. Figure SF21 (still) separated by bird (BB, NN, and RR). RR shows a negative yaw bias soon after takeoff ( $\theta_{\text{body,1st}} = -16^\circ \pm 7^\circ$ ). However, his behavior doesn't decay with subsequent trials, suggesting his yaw bias is preferential rather than learned. The number of flights, *n*, starts at 3 (3 visual conditions) and then reduces, because the total number of trials varies per condition. In all cases, *n* is 3 for the first 5 Flight #'s and thus only partially plotted to avoid clutter.



**Fig. SF26. Figure SF21 (cross) separated by bird (BB, NN, and RR).** The number of flights, n, starts at 3 (3 visual conditions) and then reduces, because the total number of trials varies per condition. In all cases, n is 3 for the first 5 Flight #'s and thus only partially plotted to avoid clutter.



**Fig. SF27. Figure SF21 (shear) separated by bird (BB, NN, and RR).** The number of flights, n, starts at 3 (3 visual conditions) and then reduces, because the total number of trials varies per condition. In all cases, n is 3 for the first 5 Flight #'s and thus only partially plotted to avoid clutter.



**Fig. SF28. Figure SF22 (still) separated by bird (BB, NN, and RR).** The number of flights, n, starts at 3 (3 visual conditions) and then reduces, because the total number of trials varies per condition. In all cases, n is 3 for the first 5 Flight #'s and thus only partially plotted to avoid clutter.



**Fig. SF29. Figure SF22 (cross) separated by bird (BB, NN, and RR).** The number of flights, n, starts at 3 (3 visual conditions) and then reduces, because the total number of trials varies per condition. In all cases, n is 3 for the first 5 Flight #'s and thus only partially plotted to avoid clutter.



**Fig. SF30. Figure SF22 (shear) separated by bird (BB, NN, and RR).** The number of flights, n, starts at 3 (3 visual conditions) and then reduces, because the total number of trials varies per condition. In all cases, n is 3 for the first 5 Flight #'s and thus only partially plotted to avoid clutter.



Fig. SF31. Roll and pitch are not coupled in the way that yaw and roll are coupled (Fig. 3).



Fig. SF32. Yaw and pitch are not coupled in the way that yaw and roll are coupled (Fig. 3).



**Fig. SF33. Saccade magnitudes are larger in the cave environment.** (**A**) The number of saccades per flight was comparable across all conditions. Pitch saccades were rare; only one saccade was recorded in the *forest-shear* condition and none were recorded in the *cave-shear* condition. (**B**) Yaw and roll saccade magnitudes were slightly higher in the cave environment (roll,  $11.0 \pm 4.2^{\circ}$ ; yaw,  $14.6 \pm 5.6^{\circ}$ ) compared to the lake and forest environments (roll,  $4.9 \pm 3.0^{\circ}$ ; yaw,  $7.9 \pm 4.2^{\circ}$ ). No differences were observed across wind conditions. (**C**) Saccade speeds were comparable across all conditions ( $310^{\circ}$ /s +/-  $130^{\circ}$ /s).



Fig. SF34. Lovebirds increased airspeed to maintain nearly constant ground speed in *gust* and *shear* conditions. Arrow lengths are mean speeds across all flights and error bars show standard deviations.



Fig. SF35. Lateral airspeed could be controlled based on neck angle. Neck angle,  $\theta_{neck}$ , and lateral airspeed (lateral ground speed,  $\dot{y}$ , minus local lateral wind speed,  $v_{wind}$ ) are linearly correlated for each lovebird. Colored dots, observed data; black lines, linear fit. Linear fits ( $\dot{y} - v_{wind} = \alpha \theta_{neck} + \beta$ ): BB,  $\alpha = 0.09 \text{ m/s}$ ,  $\beta = 0.02 \text{ m/s}$ ,  $R^2 = 0.77$ ; NN,  $\alpha = 0.07 \text{ m/s}$ ,  $\beta = 0.29 \text{ m/s}$ ,  $R^2 = 0.76$ ; RR,  $\alpha = 0.08 \text{ m/s}$ ,  $\beta = -0.23 \text{ m/s}$ ,  $R^2 = 0.52$ .



**Fig. SF36.** Lovebirds can use proprioceptive cues to effectively compensate for lateral gusts. Regardless of visual condition, lovebirds effectively compensate for crosswinds (0 = full drift; 1 = full compensation) compared to migratory species (table of avatar species in Tab. ST1). We calculated crosswind compensation by comparing lateral drift speed to crosswind speed. Lateral drift speed was calculated as the numerical derivative of y position (DerivativeFilter, Mathematica, at a Gaussian scale of one wingbeat period, 59 ms). We calculated ground speeds as the numerical derivative of x position using the same technique (Fig. 1D shows mean +/- STD). The slope of drift speed versus crosswind speed was calculated for each flight by fitting a line through zero crosswind speed and zero drift speed. We report crosswind compensation as 1 minus this slope (0 implies full drift; 1 implies full compensation).



**Fig. SF37.** Figures 4C (A) and 5G (B) are shown with all species data. Species data are derived from literature (*3*) for evaluating the scaling trend (blue, insects; yellow, hummingbirds; red, other birds). Table of avatar species in Tab. ST2.



**Fig. SF38. CAD renderings of flight arena.** (A) Isometric view. (B) Side view. The arena is shown in the *gust* wind condition (both wind generators on the same side). The black cloth used to cover the arena is not shown so that the location of the cameras and other components of the setup can be seen.



**Fig. SF39. CAD rendering of wind generators.** Wind generators were made from six fans arranged in a wooden housing. (**A**) A front view shows the flow straightening honeycomb. (**B**) A back view shows the six fans behind the honeycomb.



Fig. SF40. Reflective marker gear. (A) Front and side CAD rendering of the 3D-printed goggle sockets.
(B, C) Reflective marker constellations were mounted on the custom-fitted goggle sockets and harness.
(D) The custom-fit provided a snug fit while lovebirds flew in the wind arena.



**Fig. SF41. Flight kinematics in one direction were mirrored.** The arena was symmetrical, so the kinematics from flights in direction B were mirrored. By mirroring the flights, we made all flights occur in the positive x direction to facilitate averaging. The mirroring transformations were set up so that in the *cross* case, crosswinds came from the right of the lovebirds, and in the *shear* case, crosswinds came from the right of the lovebirds. In the *cross* environment, Direction B, crosswinds originated from the bird's left rather than right, so x and y were flipped, then y was flipped again, and the net effect was no change in y.

# Section S8. Supplemental Tables

Source	Animal	Avatar	Comp.	Notes
Sapir et al. ( <i>12</i> ), pg. 749	bee-eaters	*	0.69	Inverse slope given (0.31)
McLaren et al. ( <i>13</i> ), pg. 482	black- backed gulls	Z	0.58	Average of 4 conditions: tailwind <200m, 1.32; tailwind >200m, -0.15; headwind <200m, 0.75; headwind >200m, 0.4.
Chapman et al. ( <i>14</i> ),	moths	*	-0.46*	Average of autumn and spring; inverse slopes given (0.93, 1.99)
Table 2	songbirds	*	0.3	Average of autumn and spring; inverse slopes given (0.50, 0.90)
Goto et al. ( <i>15</i> ), Tab. 1	shearwaters		0.75	Average of three sections reported; inverse slopes given (0.17, 0.33, 0.24)
Klaassen et al. ( <i>16</i> ),	osprey	Z	0.56	Inverse slope given (0.44)
Tab. 1	marsh harrier	<b>N</b>	0.53	Inverse slope given (0.47)
Van Doren et al. ( <i>17</i> ), pg. 1126	songbirds	*	0.42	Inverse slope given (0.58)
Vidal-Mateo et al. (18)	Egyptian vulture		0.23	Average of autumn and spring; inverse slopes given (0.66, 0.89)
Tab. 1	booted eagle	3	0.24	Average of autumn and spring; inverse slopes given (0.75, 0.78)
	short-toed eagle	short-toed *		Average of autumn and spring; inverse slopes given (0.71, 1.87)
	dragonflies	×	0.54	Value given in Figure 3
Srygley & Dudley ( <i>19</i> ), Fig. 3	moths	¥	0.12	Value given in Figure 3
	butterflies	*	1.14	Value given in Figure 3

### Tab. ST1. Gust compensation values taken from literature for Fig. SF35:

\*Not shown in Fig. 5H

Source	Animal	Avatar	Mass (g)	Wing length (mm)
This study	lovebirds	k	44.6*	120
Sapir et al. ( <i>12</i> ), Methods; Lessells & Ovenden ( <i>20</i> ), Tab. 1	bee-eaters	X	56.3	150
Shirai et al. ( <i>21</i> ), pg. 58 & Tab. 1	shearwaters	~	515	315
Ferguson-Lees & Christie ( <i>22</i> ), pg. 244; Spaar & Reto ( <i>23</i> ), Fig. 1	booted eagles	2	840	630
Pennycuick ( <i>24</i> ), Tab. 2	kelp gulls	Z	890	705
Greenewalt ( <i>3</i> ), Tab. 13; Spaar & Reto ( <i>23</i> ), Fig. 1	Egyptian vulture		2120	495
Pennycuick ( <i>24</i> ), Tab. 2	whooper swans	r	8500	1130

#### Tab. ST2. Mass and wing length values used for Fig. SF35:

\* Differs from the 54 g reported in main text, because this mass and wing length are based on two lovebirds from the same colony (masses = 45.4 g, 46.0 g).

**Tab. ST3. Trial ordering.** We first conducted experiments in the *lake* condition, then the *forest* condition, then the *cave* condition. Within each visual condition, we pseudorandomly varied the gust conditions depending on which of the three lovebirds were flying.

Trial Set	1	2	3	4	5	6	7	8	9
BB	lake +	lake +	lake +	forest +	forest +	forest +	cave +	cave +	cave +
	still	cross	shear	cross	still	shear	shear	cross	still
RR	lake +	lake +	lake +	forest +	forest +	forest +	cave +	cave +	cave +
	cross	still	shear	shear	still	cross	still	cross	shear
NN	lake +	lake +	lake +	forest +	forest +	forest +	cave +	cave +	cave +
	shear	cross	still	cross	shear	still	still	shear	cross

Tab. ST4. Detailed trial orderingWe analyzed 366 of the flights saved over 10 days of experiments.

						45	2/3/16	RR	lake	cross	В
Fligh		Bir	Vis.	Wind	Dir	46	2/3/16	RR	lake	cross	Α
t	Date	d	Cond.	Cond.		47	2/3/16	RR	lake	still	Α
1	2/2/16	BB	lake	Still	В	48	2/3/16	RR	lake	still	Α
2	2/2/16	BB	lake	STIII	A	49	2/3/16	RR	lake	still	В
3	2/2/16	BB	lake	Still	В	50	2/3/16	RR	lake	still	Α
4	2/2/16	BB	lake	Still	A	51	2/3/16	RR	lake	still	В
5	2/2/16	BB	lake	Still	В	52	2/3/16	RR	lake	still	В
0 7	2/2/10	DD	lake	Still	A	53	2/3/16	RR	lake	still	Α
/	2/2/10		lake	still	D A	54	2/3/16	RR	lake	still	В
0	2/2/10		lake	etill	A D	55	2/3/16	RR	lake	still	Α
9 10	2/2/10		lako	etill		56	2/3/16	RR	lake	still	В
10	2/2/10		lako	cross	A 	57	2/3/16	RR	lake	still	Α
10	2/2/10		lake	cross	A A	58	2/3/16	RR	lake	still	В
12	2/2/10		lake	cross	A 	59	2/3/16	RR	lake	still	Α
10	2/2/10	BB	lake	cross	R	60*	2/3/16	RR	lake	still	В
14	2/2/10	BB	lake	cross	۵ ۸	61	2/3/16	RR	lake	shear	A
16	2/2/10	BB	lake	cross	Δ	62	2/3/16	RR	lake	shear	В
17	2/2/10	BB	lake	shear	R	63	2/3/16	RR	lake	shear	A
18	2/2/16	BB	lake	shear	Δ	64	2/3/16	RR	lake	shear	В
10	2/2/16	BB	lake	shear	Δ	65	2/3/16	RR	lake	shear	A
20	2/2/16	BB	lake	shear	B	66	2/3/16	RR	lake	shear	В
21	2/2/16	BB	lake	shear	A	67	2/3/16	RR	lake	snear	В
22	2/2/16	BB	lake	shear	B	68	2/3/16	RR	lake	snear	A
23	2/2/16	BB	lake	shear	A	69	2/3/16	RR	lake	snear	A
24	2/2/16	BB	lake	shear	В	70	2/3/16	RR	lake	shear	В
25	2/2/16	BB	lake	shear	А	71	2/3/10		lake	shear	A
26	2/2/16	BB	lake	shear	В	72	2/3/10		lako	shear	
27	2/2/16	BB	lake	shear	А	73	2/3/10	nn DD	lake	shear	R
28	2/2/16	BB	lake	shear	В	74	2/3/10		lake	shear	
29	2/2/16	BB	lake	shear	А	75	2/4/10	NN	lake	shear	R
30	2/2/16	BB	lake	shear	В	70	2/4/16	NN	lake	shear	Δ
31	2/2/16	BB	lake	shear	Α	78	2/4/16	NN	lake	shear	B
32	2/3/16	RR	lake	cross	В	70 79	2/4/16	NN	lake	shear	A
33	2/3/16	RR	lake	cross	В	80	2/4/16	NN	lake	shear	B
34	2/3/16	RR	lake	cross	А	81	2/4/16	NN	lake	shear	Ā
35	2/3/16	RR	lake	cross	В	82	2/4/16	NN	lake	shear	B
36	2/3/16	RR	lake	cross	А	83	2/4/16	NN	lake	shear	В
37	2/3/16	RR	lake	cross	В	84	2/4/16	NN	lake	shear	Ā
38	2/3/16	RR	lake	cross	Α	85	2/4/16	NN	lake	shear	В
39	2/3/16	RR	lake	cross	В	86	2/4/16	NN	lake	shear	А
40	2/3/16	RR	lake	cross	А	87	2/4/16	NN	lake	shear	А
41	2/3/16	RR	lake	cross	В	88	2/4/16	NN	lake	shear	В
42	2/3/16	RR	lake	cross	Α	89	2/4/16	NN	lake	cross	А
43	2/3/16	RR	lake	cross	В	90	2/4/16	NN	lake	cross	В
44	2/3/16	RR	lake	cross	Α						

91	2/4/16	NN	lake	cross	Α	140	2/8/16	BB	forest	still	Α
92	2/4/16	NN	lake	cross	В	141	2/8/16	BB	forest	still	В
93	2/4/16	NN	lake	cross	А	142	2/8/16	BB	forest	still	Α
94*	2/4/16	NN	lake	cross	В	143	2/8/16	BB	forest	still	В
95	2/4/16	NN	lake	cross	А	144	2/8/16	BB	forest	still	Α
96	2/4/16	NN	lake	cross	В	145	2/8/16	BB	forest	still	В
97	2/4/16	NN	lake	cross	В	146	2/8/16	BB	forest	still	Α
98	2/4/16	NN	lake	cross	А	147	2/8/16	BB	forest	still	В
99	2/4/16	NN	lake	cross	В	148	2/8/16	BB	forest	still	В
100	2/4/16	NN	lake	cross	А	149	2/9/16	BB	forest	shear	Α
101	2/4/16	NN	lake	cross	В	150	2/9/16	BB	forest	shear	В
102	2/4/16	NN	lake	cross	А	151	2/9/16	BB	forest	shear	Α
103*	2/4/16	NN	lake	cross	В	152	2/9/16	BB	forest	shear	В
104	2/4/16	NN	lake	cross	Α	153	2/9/16	BB	forest	shear	Α
105	2/4/16	NN	lake	Cross	Α	154	2/9/16	BB	forest	shear	В
106	2/4/16	NN	lake	Cross	В	155	2/9/16	BB	forest	shear	Α
107	2/4/16	NN	lake	Cross	Α	156	2/9/16	BB	forest	shear	В
108	2/4/16	NN	lake	Cross	В	157	2/9/16	BB	forest	shear	Α
109	2/4/16	NN	lake	still	А	158	2/9/16	BB	forest	shear	В
110*	2/4/16	NN	lake	still	А	159	2/9/16	BB	forest	shear	Α
111	2/4/16	NN	lake	still	В	160	2/9/16	BB	forest	shear	В
112	2/4/16	NN	lake	still	Α	161	2/9/16	BB	forest	shear	A
113	2/4/16	NN	lake	still	Α	162	2/9/16	BB	forest	shear	В
114	2/4/16	NN	lake	still	В	163	2/9/16	BB	forest	shear	A
115	2/4/16	NN	lake	still	Α	164	2/9/16	BB	forest	still	В
116	2/4/16	NN	lake	still	В	165	2/9/16	BB	forest	still	A
117	2/4/16	NN	lake	still	Α	166	2/9/16	BB	forest	still	В
118	2/4/16	NN	lake	Still	В	167	2/9/16	RR	forest	shear	A
119	2/4/16	NN	lake	Still	A	168	2/9/16	RR	forest	shear	В
120	2/8/16	BB	forest	cross	A	169	2/9/16	RR	forest	shear	A
121	2/8/16	BB	forest	Cross	В	170	2/9/16	RR	forest	shear	В
122	2/8/16	BB	forest	Cross	A	1/1	2/9/16	RR	forest	snear	A
123	2/8/16	BB	forest	Cross	В	172	2/9/16	RR	forest	snear	В
124	2/8/16	BB	forest	Cross	A	173	2/9/16	RR	forest	snear	A
125	2/8/16	BB	forest	cross	В	174	2/9/16	RR	forest	snear	В
120	2/8/16	BB	forest	cross	A	175	2/9/16	RR	forest	shear	A
127	2/8/16	BB	forest	cross	В	176	2/9/16	RR	forest	shear	В
120	2/0/10		forest	cross		170	2/9/10		forest	shear	A
129	2/0/10		forest	cross	A	170	2/9/10		forest	shear	
121	2/0/10		forest	cross		179	2/9/10		forest	shear	
132	2/0/10	BB	forest	cross	~	181	2/9/10		forest	shear	
132	2/0/10	BB	forest	cross	~	182	2/9/10		forest	shear	R
13/	2/8/16	BB	forest	still	Δ	183	2/9/10	BB	forest	still	B
135	2/8/16	BB	forest	still	R	18/1*	2/9/16	BB	forest	still	
136	2/8/16	BR	forest	still	Δ	185	2/9/16	BR	forest	still	R
137	2/8/16	BR	forest	still	B	186	2/9/16	BR	forest	still	Δ
138	2/8/16	BR	forest	still	A	187	2/9/16	RR	forest	still	B
139	2/8/16	BR	forest	still	B	188	2/9/16	BR	forest	still	Δ
	_, _, , , , _	20			2	100	_, 0, 10				, ,

189	2/9/16	RR	forest	still	А	238	2/15/16	NN	forest	shear	В
190	2/9/16	RR	forest	still	В	239	2/15/16	NN	forest	shear	Α
191	2/9/16	RR	forest	still	А	240	2/15/16	NN	forest	shear	В
192	2/9/16	RR	forest	still	В	241	2/15/16	NN	forest	shear	Α
193	2/9/16	RR	forest	still	А	242	2/15/16	NN	forest	shear	В
194	2/9/16	RR	forest	still	В	243	2/15/16	NN	forest	still	Α
195	2/9/16	RR	forest	still	Α	244	2/15/16	NN	forest	still	Α
196	2/9/16	RR	forest	still	В	245	2/15/16	NN	forest	still	В
197	2/9/16	RR	forest	still	А	246	2/15/16	NN	forest	still	Α
198	2/9/16	RR	forest	cross	А	247	2/15/16	NN	forest	still	В
199	2/9/16	RR	forest	cross	В	248	2/15/16	NN	forest	still	Α
200	2/9/16	RR	forest	cross	В	249	2/15/16	NN	forest	still	В
201	2/9/16	RR	forest	cross	A	250	2/15/16	NN	forest	still	A
202	2/9/16	RR	forest	Cross	В	251	2/15/16	NN	forest	Still	В
203	2/9/16	RR	torest	Cross	A	252	2/15/16	NN	forest	Still	A
204	2/9/16	RR	torest	Cross	В	253	2/15/16	NN	torest	Still	В
205*	2/9/16	RR	torest	Cross	A	254	2/15/16	NN	forest	STIII	A
206	2/9/16	RR	forest	Cross	В	255	2/15/16	NN	forest	Still	В
207	2/9/16	RR	forest	Cross	A	256	2/15/16	NN	forest	Still	A
208	2/9/16	RK	forest	Cross	A	257	2/15/16	ININ	forest	Still	В
209	2/9/16	RK	forest	cross	В	258	2/15/16	ININ	forest	Still	A
210	2/9/16	RK	forcet	cross	A	259	2/15/16		lorest	Still	В
211	2/9/16		forcet	cross	В	260	2/18/16	RR	Cave	Still	B
212	2/15/10		forest	cross	A	201	2/18/10		Cave	still	A
213	2/15/10		forest	cross	Б ^	202	2/18/10		cave	still	D
214	2/15/10	ININ NINI	forest	cross	A D	203	2/10/10		cave	still	
210	2/15/10	NIN	forest	cross	۵ ۸	204	2/10/10		cave	still	R
210	2/15/16	NN	forest	cross	R	200	2/18/16	BB	cave	still	Δ
218	2/15/16	NN	forest	cross	Δ	200	2/18/16	RR	cave	still	R
219	2/15/16	NN	forest	cross	A	268	2/18/16	RR	cave	still	A
220	2/15/16	NN	forest	cross	B	269	2/18/16	RR	cave	still	B
221	2/15/16	NN	forest	cross	Ā	270	2/18/16	RR	cave	still	Ā
222	2/15/16	NN	forest	cross	В	271	2/18/16	RR	cave	still	В
223	2/15/16	NN	forest	cross	Ā	272	2/18/16	RR	cave	still	В
224	2/15/16	NN	forest	cross	В	273	2/18/16	RR	cave	cross	В
225	2/15/16	NN	forest	cross	А	274	2/18/16	RR	cave	cross	В
226	2/15/16	NN	forest	cross	В	275	2/18/16	RR	cave	cross	В
227	2/15/16	NN	forest	shear	А	276	2/18/16	RR	cave	cross	Α
228	2/15/16	NN	forest	shear	В	277	2/18/16	RR	cave	cross	В
229	2/15/16	NN	forest	shear	А	278	2/18/16	RR	cave	cross	В
230	2/15/16	NN	forest	shear	В	279	2/18/16	RR	cave	cross	В
231	2/15/16	NN	forest	shear	А	280	2/18/16	RR	cave	cross	Α
232	2/15/16	NN	forest	shear	В	281	2/18/16	RR	cave	cross	В
233	2/15/16	NN	forest	shear	А	282	2/18/16	RR	cave	cross	Α
234	2/15/16	NN	forest	shear	В	283	2/18/16	RR	cave	cross	В
235	2/15/16	NN	forest	shear	Α	284	2/18/16	RR	cave	cross	Α
236	2/15/16	NN	forest	shear	В	285	2/18/16	RR	cave	shear	Α
237	2/15/16	NN	forest	shear	Α	286	2/18/16	RR	cave	shear	В

287	2/18/16	RR	cave	shear	А	331	2/24/16	BB	cave	cross	Α
288	2/18/16	RR	cave	shear	В	332	2/24/16	BB	cave	cross	В
289	2/18/16	RR	cave	shear	А	333	2/24/16	BB	cave	still	Α
290	2/18/16	RR	cave	shear	В	334	2/24/16	BB	cave	still	В
291	2/18/16	RR	cave	shear	А	335*	2/24/16	BB	cave	still	Α
292	2/18/16	RR	cave	shear	В	336	2/24/16	BB	cave	still	В
293	2/18/16	RR	cave	shear	А	337	2/24/16	BB	cave	still	Α
294	2/18/16	RR	cave	shear	В	338	2/24/16	BB	cave	still	В
295	2/18/16	RR	cave	shear	А	339	2/24/16	BB	cave	still	Α
296	2/18/16	RR	cave	shear	В	340	2/24/16	BB	cave	still	Α
297	2/18/16	RR	cave	shear	А	341	2/24/16	BB	cave	still	В
298	2/18/16	RR	cave	shear	В	342	2/24/16	BB	cave	still	Α
299	2/18/16	RR	cave	shear	А	343	2/24/16	BB	cave	still	В
300	2/18/16	RR	cave	shear	В	344	2/24/16	BB	cave	still	В
301	2/18/16	RR	cave	shear	В	345	2/24/16	BB	cave	still	Α
302	2/19/16	NN	cave	still	В	346	2/24/16	BB	cave	still	В
303	2/19/16	NN	cave	still	А	347	2/24/16	BB	cave	still	Α
304	2/19/16	NN	cave	still	В	348	2/24/16	BB	cave	still	В
305	2/19/16	NN	cave	still	А	349	2/24/16	NN	cave	still	Α
306	2/19/16	NN	cave	still	В	350	2/24/16	NN	cave	still	В
307	2/19/16	NN	cave	still	А	351	2/24/16	NN	cave	still	Α
308	2/19/16	NN	cave	still	А	352	2/24/16	NN	cave	still	В
309	2/23/16	BB	cave	shear	В	353	2/24/16	NN	cave	still	Α
310	2/23/16	BB	cave	shear	А	354	2/24/16	NN	cave	still	В
311	2/23/16	BB	cave	shear	В	355	2/24/16	NN	cave	shear	В
312	2/23/16	BB	cave	shear	A	356	2/24/16	NN	cave	shear	A
313	2/23/16	BB	cave	shear	В	357	2/24/16	NN	cave	shear	A
314	2/23/16	BB	cave	shear	A	358*	2/24/16	NN	cave	shear	B
315	2/23/16	BB	cave	shear	В	359	2/24/16	NN	cave	shear	В
316	2/23/16	BB	cave	shear	A	360	2/24/16	NN	cave	shear	A
317	2/23/16	BB	cave	snear	В	361	2/24/16	NN	cave	snear	В
318	2/23/16	BB	cave	snear	В	362	2/24/16	NN	cave	snear	A
319	2/23/16	BB	cave	shear	A	363	2/24/16	ININ	cave	shear	В
320	2/23/16	BB	cave	snear	В	364	2/24/16	ININ	cave	Snear	A
321	2/24/16	BB	cave	cross	A	365	2/24/16		cave	cross	A
322	2/24/10	DD	cave	cross	A	300	2/24/10		Cave	cross	A
323	2/24/10		Cave	cross	D A	307	2/24/10		Cave	cross	D A
324 205	2/24/10		Cave	cross	A	300	2/24/10		Cave	cross	A
323 206	2/24/10		Cave	cross		309	2/24/10		Cave	cross	A
320 207	2/24/10		cave	cross	A	370	2/24/10		Cave	cross	
১८। ३२०	2124/10 2/21/16		Cave	cross	A A	ا <i>ا</i> د 122	2/24/10	ININ NINI	Cave	cross	
320	2/24/10	BD	Cave	cross	~	312 272	2/24/10	NIN	Cave	Cross	
329 330	2/24/10	BD	Cave	cross	R	515	2/24/10	NIN	Cave	cross	
000	2124/10	טט	Gave	01033	D	574	2124/10	ININ	Gave	01033	А

\* flights excluded from analysis due to clear misidentifications and/or blank datasets

#### Section S9. Supplemental Videos

Video S1: BB's first flight in the *cave-still* environment. Footage from an infrared camera above the arena shows bird BB flying from left to right. There were no gust generators in this trial and no visual cues except a faint point light source behind the target perch. The blue and red arrows show the orientation of the body and head based on the motion tracking data.

**Video S2: BB's first flight in the** *cave-cross* **environment.** Footage from an infrared camera above the arena shows bird BB flying from left to right. White arrows show the location of two gust generators producing lateral gusts in the same direction. There were no visual cues in this trial except a faint point light source behind the target perch. The blue and red arrows show the orientation of the body and head based on the motion tracking data.

**Video S3: BB's first flight in the** *cave-shear* **environment.** Footage from an infrared camera above the arena shows bird BB flying from left to right. White arrows show the location of two gust generators producing lateral gusts in opposing directions. There were no visual cues in this trial except a faint point light source behind the target perch. The blue and red arrows show the orientation of the body and head based on the motion tracking data.

# **Video S4: A bird-scale ornithopter passively reorients into the wind, minimizing slip angle.** Footage from three angles (top, left, right) of the ornithopter as it is released from a slip angle of 90 degrees in a 4 m/s wind in the wind tunnel. The stroke plane angle is 25 degrees.

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