1	Integrating light-level geolocation with activity tracking reveals unexpected
2	nocturnal migration patterns of the tawny pipit
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5	Martins Briedis <sup>1,2</sup> , Václav Beran <sup>3,4</sup> , Peter Adamík <sup>3</sup> , Steffen Hahn <sup>1</sup>
6	
7	1 Department of Bird Migration, Swiss Ornithological Institute, Sempach, Switzerland
8	2 Lab of Ornithology, Institute of Biology, University of Latvia, Salaspils, Latvia
9	3 Department of Zoology, Faculty of Science, Palacký University, Olomouc, Czech Republic
10	4 Municipal Museum of Ústí nad Labem, Ústí nad Labem, Czech Republic
11	
12 13	ORCID IDs:
12	
14	Martins Briedis <u>https://orcid.org/0000-0002-9434-9056</u>
15	Peter Adamík https://orcid.org/0000-0003-1566-1234
16	Steffen Hahn <a href="https://orcid.org/0000-0002-4924-495X">https://orcid.org/0000-0002-4924-495X</a>
17	

# 18 Abstract

19 Migratory birds complete their seasonal journeys between breeding and non-breeding sites with a 20 series of migratory flights that are separated by prolonged stopovers. While songbirds are the most 21 common taxa among migratory birds, empirical data on flight and stopover behaviour along their 22 entire migratory journeys are still rare. Here, we integrate activity and barometric pressure tracking 23 with classical light-level geolocation to describe migration behaviour of tawny pipits Anthus 24 campestris breeding in Central Europe. Surprisingly, tracked pipits used, on average, as many as 10 25 stopover sites during their six week, >5000 km long autumn migration. This conforms to a typical 26 hop-type pattern of migration. In contrast to common knowledge which considers the tawny pipit as 27 a typical diurnal migrant, our data revealed that more than 2/3 of all migratory movements were 28 carried out at night. Nocturnal departure times were highly variable within individuals and spread 29 across the entire night while landing most often took place within the first few hours after sunrise. 30 Consequently, there was a negative relationship between departure timing relative to sunset and 31 flight duration. Short flights of up to 2 h were most common and median flight duration was 4.5 h. 32 There was a hyperbolic relationship between flight duration and maximum flight altitude and flight 33 altitudes during night were two times higher compared to daytime. The overall ratio of flight vs 34 stopover duration during migration was on average 1:6.5. This closely matches predictions from 35 theoretical models. We show that multi-sensor tracking has the potential to provide unprecedented 36 details on migratory behaviour of individual birds along their entire migratory journeys, and it also 37 improves the precision of geographical locations derived from light-level geolocators.

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Keywords: accelerometer, annual cycle, bird migration, departure, flight performance, nocturnal
 migrant

# 41 Introduction

42 Migratory journeys of birds comprise flight phases when distance is covered through energy 43 consumption, and stopover phases when energy reserves are usually replenished. Piersma (1987) 44 outlined three general travel schemes that are shaped by the relationships between fuel loads, 45 stopovers and flight bouts: (1) jump migration that relies on high fuel loads, few long endurance 46 flights and few lengthy stopovers, (2) skip migration with intermediate fuel loads, and several 47 stopovers and flights of intermediate duration, and (3) hop migration that is characterized by low 48 fuel loads, frequent and short flight phases and multiple short stopovers. The overall duration of the 49 movement phase of migration (between the first departure and arrival at the final destination) is 50 directly dependent on the travel scheme employed as fuel load upon the initial departure will 51 determine how far the bird can fly on its first flight phase (Lindström et al. 2019). In small and 52 medium sized passerines, theoretical models predict that the total duration of migration is divided 53 between flight and stopover phases at a ratio of 1:7, with disproportionally more time spent on 54 stopovers, which include the initial fuelling before first migratory flight (Hedenström and Alerstam 55 1997). Despite passerines being by far the most numerous taxon among migratory birds (Hahn et al. 56 2009), empirical data to support these theoretical predictions still remain limited.

57 Because most time of migration is spent on stopovers for refuelling, fuel deposition rate 58 largely underpins the total migration duration (Lindström et al. 2019). Most passerines, however, do 59 not feed at night, hence using nighttime for migratory flights do not interfere with fuelling and can 60 potentially reduce the total migration duration. As the current knowledge on Afro-Palearctic migrants suggest, 63% of species are assumed to migrate during the night (nocturnal migrants), while 61 62 only a handful of species – 16%, mainly aerial foragers, are assumed to migrate during daytime 63 (diurnal migrants; Dorka 1966, Adamík et al. 2016). The remaining pool of species are thought to 64 exercise a mixed strategy. However, it is to be pointed out that the distinction between nocturnal 65 and diurnal migrants is not always unequivocal and many species that predominantly migrate at, e.g.

daytime, have also been recorded to migrate during the night or vice versa (Hansen 1954, Adamík et
al. 2016). Under what exact circumstances this happens, remains largely unknown.

68 The majority of nocturnal migrants are known to depart within the first few hours after the 69 sunset (Liechti et al. 1997, Bulyuk and Tsvey 2006, Schmaljohann et al. 2011). This allows for compass 70 calibration at twilight for orientation (Moore 1987, Muheim et al. 2006) and for longer nocturnal 71 flights when larger distances can be covered. Landing typically occurs around sunrise (Bruderer and 72 Liechti 1999) giving a maximum nocturnal flight duration of ca. 12 h during autumn migration in the 73 Northern hemisphere in September and ca. 10 h during spring migration in April (Bauchinger and 74 Klaassen 2005). There is, however, a considerable spectrum in both departure and landing times 75 relative to sunset/sunrise among individuals (Bolshakov et al. 2007, Schmaljohann et al. 2013) which 76 can vary seasonally (Bolshakov et al. 2007). Much of our current understanding about nocturnal 77 departure and landing times of migrants comes from studies conducted at a single location along the 78 migration route (e.g. Bolshakov and Bulyuk 1999, Bolshakov et al. 2003) or at ecological barriers 79 where long flight duration with early nocturnal onset may be the prevailing pattern (Adamík et al. 80 2016, Ouwehand and Both 2016, Jiguet et al. 2019). Similarly, many of these studies have been 81 conducted using radar observations (e.g. Schmaljohann et al. 2006), which does not allow for 82 distinguishing species-specific behaviours, as species identification in radar signals remains a 83 challenging issue (Bauer et al. 2019). As a result, studies done so far provide only snapshots at 84 specific points in time and space, and we are still missing information on departure and landing 85 behaviour of individual birds along their full migration cycles.

State-of-the-art multi-sensor tracking devices that integrate measurements of ambient light, activity and barometric pressure have the potential to bridge this gap in our knowledge and to provide novel insights into species- and individual-specific migratory behaviour along their entire migratory journeys (Bäckman et al. 2017a, b, Dhanjal-Adams et al. 2018, Liechti et al. 2018, Sjöberg et al. 2018). Here we use multi-sensor individual tracking to describe migratory patterns and flight behaviour over the entire journey of tawny pipits (*Anthus campestris*) breeding in Central Europe. 92 The tawny pipit is among the few Afro-Palearctic migratory species that are characterized as a 93 'typical diurnal migrant' (Dorka 1966, Alerstam 1990, Schmaljohann 2019), however, conclusive 94 evidence is still missing. We employ novel analytical tools to test this long-standing assumption with 95 a particular focus on describing flight and stopover behaviour and take-off and landing times of pipits 96 in relation to sunset/sunrise throughout the migration journey. Furthermore, we integrate classical 97 light-level geolocation with activity and barometric pressure measurements allowing for more 98 detailed and precise estimates of migration timing and geographic positions of stationary sites and 99 migration routes.

100

## 101 Methods

#### 102 Field work

103 We studied tawny pipits breeding in open lignite mines in western Czech Republic (50.5° N, 13.83° E). 104 During the breeding season in 2018, we captured 13 adult birds using mist-nets and perch traps and 105 equipped them with multi-sensor geolocators (GDL3-PAM, Swiss Ornithological Institute; Liechti et al. 106 2018) that were mounted on the birds' backs using flexible silicone harness. The loggers 107 accommodated sensors for measuring ambient light intensity, atmospheric pressure and 108 acceleration. The light sensor was equipped with a 7 mm long light guide and light intensity was 109 measured every minute storing maximum values in 5 min intervals. Acceleration was measured along 110 the Z-axis for 3.2 s at 10 Hz frequency every 5 min storing the sum of the absolute differences 111 between consecutive measures (31 values). Atmospheric pressure recordings were set to 30 min 112 intervals. 113 In 2019, we successfully recaptured and retrieved geolocators from 5 of the 13 previously

tagged individuals. One more bird was seen in the study area, but we failed to recapture it,

amounting the total return rate to 46%. One of the retrieved geolocators contained data

encompassing the full annual cycle. Two devices stopped recording during spring migration before

- the birds had returned to the breeding area and two more devices stopped recording while the birdswere still in their non-breeding residency sites in sub-Saharan Africa.
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#### 120 Data analyses

Geolocator data analyses were carried out using the R-packages 'TwGeos' (Lisovski et al. 2015), 'SGAT' (Wotherspoon et al. 2013), and 'PAMLr' (Dhanjal-Adams et al. 2020). Location data were analysed using a threshold approach following general guidelines described in Lisovski et al. (2020) and integrating activity and atmospheric pressure recordings for more precise designation of migration timing, i.e. movement and stationary phases (flight, migratory stopovers and long residency periods).

127 For distinguishing between movement and stationary phases during the annual cycle, we 128 used accelerometer and atmospheric pressure recordings. Because tawny pipits use flapping flight 129 for migration, we used the flapping flight classification from the R-package 'PAMLr' and set the 130 threshold to 1 h (equals to 12 consecutive readings of flapping activity at 5 min recording intervals) 131 to classify migratory flights. Thus, activity measures that were classified as flapping and lasted for at 132 least 1 h were regarded as migration episodes. A visual inspection of the atmospheric pressure 133 readings revealed that some migratory flights when individuals clearly changed their location were, 134 however, missed. Therefore, we performed a second classification based on atmospheric pressure 135 recordings and cross-validated the two approaches. Atmospheric pressure is not expected to change 136 rapidly when the bird is stationary (weather related changes) but can vary considerably as the bird 137 takes altitude or covers substantial distance in flight (Liechti et al. 2018, Sjöberg et al. 2018). Because 138 background variation in air pressure linked to weather rarely exceeded 1 hPa 30 min<sup>-1</sup>, we used a 139 threshold of atmospheric pressure change >1.5 hPa 30 min<sup>-1</sup> for identifying flight phases within the 140 dataset. This approach allowed for identification of start times of migratory flights and their length with an accuracy of 30 min. If the bird was stationary for at least 24 hours, we considered this a 141 142 stopover. To derive geographic positions, we first log-transformed the recorded light values and

143 derived sunrise and sunset times in the R-package 'TwGeos' using a light intensity threshold of 1 unit 144 on the log-transformed scale. Recorded twilight times were then calibrated against the actual sunrise 145 and sunset times at the breeding sites of the birds prior to the start of the autumn migration (i.e. in-146 habitat calibration; Lisovski & Hahn 2012). Further, we used the R-package 'SGAT' to model the most 147 likely migration path, stopover and residency locations along with their confidence intervals. For this, 148 we used a grouped Estelle model where location estimates coming from the same site (based on 149 acceleration and pressure classification) were grouped together. This procedure increases the overall 150 accuracy of the stationary positions (Lisovski et al. 2020). We applied a spatial mask that confined 151 stationary sites to terrestrial habitats only while movement was allowed to cross over oceans and 152 seas. The twilight error distribution was assumed to follow Gamma distribution as based on the 153 parameters inferred from the in-habitat calibration. The final model also included a movement 154 model – birds were allowed to move only when preceding activity and pressure analyses had 155 detected migratory flights and movement duration was restricted to the duration of migratory flight 156 hours at the specific day (dt parameter in the groupedThresholdModel function). Speed distribution for the movement model followed a Gaussian distribution (shape = 30, scale = 0.6) with the highest 157 probability of ground speeds between 40–60 km  $h^{-1}$  during the movement phase. The start of all 158 159 tracks and the end of the single complete track were fixed to the known tagging/breeding location. 160 To initiate the model, we first ran a modifiedGamma model with relaxed assumptions for 1000 161 iterations. Then the resulting model was tuned five times (300 iterations each) with all 162 assumptions/priors (Gamma model) before initiating the final run with 2000 iterations to ensure 163 convergence. We present the most likely migration tracks and stationary locations as inferred from 164 median location estimates along with 95% probability distributions of location estimates.

We calculated the ratio between the duration of flight and stopover phases as the total number of flight hours vs the total number of stationary hours between the initial departure flight and final arrival flight. Thus, our estimated do not include the initial fuelling before departure (Hedenström and Alerstam 1997).Departure (i.e. take-off) and landing times were compared to sunset and sunrise times as derived from the data recorded by the geolocators light-sensor. Inhabitat calibration revealed that sensitivity of the light-sensors was on average higher than Sun's azimuth of 0° relative to the horizon (actual sunrise/sunset) at  $-4.8^{\circ} \pm 0.5$  (mean  $\pm$  SD). Thus, the migratory flight timing here is expressed relative to the approximate start of civil twilight (centre of the Sun 6° below the horizon) rather than sunrise/sunset when the centre of the Sun is at 0° relative to the horizon.

Maximum flight altitude (measured in m above sea level, m asl) during each flight was calculated applying the hypsometric equation to the atmospheric pressure measurements assuming standard atmospheric conditions (Stull 2016, Liechti et al. 2018). We compared flight altitudes during diurnal and nocturnal migratory phases using linear mixed effects model accounting for random effects of individual identity in R-package Ime4 (Bates et al. 2014). The precision of altitude estimates of the used loggers is described in Liechti et al. (2018); rarely under extraordinary atmospheric conditions it can exceed 200 m (approx. 25 hPa).

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### 183 Results

184 Throughout the year, the start and end of the daily activity patterns coincided with sunrise and 185 sunset times as recorded by the geolocators light sensor in such a manner that the tracked birds 186 were immobile (resting or sleeping) during the dark hours of the night. The only exception to this was 187 migratory flights, most of which took place at night. Actogram summarizing annual activity patterns 188 of the individual 22BK, the single individual with a full annual track, is shown in Figure 1, actograms 189 of the remaining four individuals are given in Supplementary materials Figure S1. Pipits were often 190 most active during the early morning hours after sunrise and in the evening a few hours before 191 sunset (Figure 1, Figure S1). The time period in the middle of the day was often spent 192 resting/sleeping.

#### 194 *Migration timing, distance, stopovers*

195 In autumn, all birds migrated along the western flyway to their non-breeding sites in West Africa 196 (Figure 2; see Supplementary materials Figure S2 for comparison of location estimates their CIs and 197 migration timing estimates when using classical light-level geolocation where data analyses are 198 performed using only the light data). Migration started in the second half of August and birds arrived 199 in sub-Saharan Africa about six weeks later (average migration duration = 43 days) in late September 200 - early October. A summary of autumn migration parameters for each individual is given in Table 1. 201 Two birds (20NT & 22BN) spent long periods (>40 days in total) at multiple intermediate 202 stopover/non-breeding sites in sub-Saharan Africa before they arrived at their final non-breeding 203 residency site in the second half of November – these movements were not considered as part of the 204 autumn migration. Overall, during the autumn migration, tracked pipits used on average 10 different 205 stopover sites where birds stopped for at least 24 hours. Longer stopovers of more than 3 days, 206 however, were scarce, averaging at 3.2 per individual. Interestingly, the ratio of flight to stationary 207 days during the movement phase of autumn migration (from departure until arrival) was on average 208 1:1 (21.4 flight days vs 21 stationary days; Table 1). From the total migration duration (measured in 209 hours), the proportion of time spent in migratory flight was 13.3% while the remaining 86.7% of time 210 was spent on stopovers, which includes all stops of any length. Thus, the ratio of flight vs stopover 211 duration was on average 1:6.5. Pipits on average migrated more than 5000 km reaching an average 212 travel speed of 125 km day<sup>-1</sup>.

#### 213 *Flight performance*

Tracked pipits completed their autumn migration with an average of 23.8 individual flights. The total number of flight hours ranged between 121 and 146 h for the five individuals (Figure 3). During barrier crossing, flights were prolonged into the day lasting on average 14 ± 3.8 h (SD; n = 11 from a total of 132 tracked flights) and up to 20 h for two of the five tracked individuals (Table 1). Average ground speed along the most likely migration track (orange lines in Figure 2) was estimated at 39.5 km h<sup>-1</sup> (Table 1). Pipits predominantly travelled during the night (on average 68.6% of all migratory
movements; Table 1). Time of nocturnal departures were spread across the entire night with an
average departure time 4:25 ± 5:17 h (SD, n = 132) after the sunset (Figure 4a). Longer flights
(including Sahara crossing flights) typically started shortly before or after sunset and there was a
general decline in flight duration with increasingly later nocturnal departure times (Figure 4c).

225 Landing most often occurred around sunrise (average landing time: 0:45 ± 3:41 h (SD), n = 226 132, Figure 4b). Median migratory flight duration across all five birds was 4:30 hours (Table 1) and 227 short flights of up to 2 hours were the most common accounting for 30% of all recorded flights 228 (40/132; Figure 4d). Maximum flight altitudes ranged between 2600 and 3200 m asl for different 229 individuals and there was a positive hyperbolic relationship between individual flight duration and 230 the maximum altitude reached (Table 1, Figure 5). Flight altitudes during night were higher compared 231 to daytime (night: 1090 ± 728 m asl (SD); daytime: 498 ± 428 m asl;  $\beta$  = 590 ± 38, t = 15.7, random 232 effects variance: bird identity 2417 (49.2 SD)).

#### 233 Spring migration

234 The departure date for spring migration could only be estimated for three birds which showed a 235 variation of more than one month: 22BP = 18 Feb, 22BN = 12 Mar, 22BK = 22 Mar. Loggers 22BP and 236 22BN stopped recording shortly after the birds departed while 22BK recorded until the bird arrived at 237 the breeding site on 24 Apr. Spring migration of this individual started with a 20 h long non-stop 238 flight across the Sahara and compared to autumn migration spring migration was overall shorter 239 (both in distance -11.6%, and duration -17.5%), the migration speed was higher (7.4%), the total 240 number of flight hours was lower (24.5%), while the maximum flight altitude reached was 500 m 241 higher (3662 m asl) (see Table 1 for all migration parameters).

## 243 Discussion

244 Our results of activity and barometric pressure tracking revealed that tawny pipits predominantly 245 migrate at night contradicting the earlier notion of the species as a typical diurnal migrant (Dorka 246 1966, Alerstam 1990, Schmaljohann 2019). We found that landing most often occurred within the 247 first four hours after sunrise, which could explain the earlier observation-based assumption of 248 diurnal migration by tawny pipits. Similarly, barrier crossing flights over the Sahara often stretched 249 into the daytime as shown in other long-distance migrants (Adamík et al. 2016, Ouwehand and Both 250 2016, Jiguet et al. 2019, Schmaljohann et al. 2006). Departure times of migratory flights were spread 251 across the night, contrasting the commonly shown pattern of departures being clustered shortly 252 after sunset (Kerlinger and Moore 1989, Liechti et al. 1997, Bruderer and Liechti 1999, Bolshakov et 253 al. 2003). Departure times relative to sunset were highly variable within and across individuals during 254 the migration season. Thus, it is likely that environmental settings and individual body condition, 255 rather than an inherent circadian clock, are the main drivers of departure time (cf. Bulyuk and Tsvey 256 2006, Müller et al. 2016).

257 During migration, tawny pipits employed a hop migration pattern with numerous short 258 flights and stopovers (Piersma 1987). Our conclusion of the pipits conforming to a hop migration is 259 clearly dependent on the high temporal resolution of our data making it possible to identify 24–72h 260 long stopovers. The number of longer stopovers (>3 days) varied from 1–5 between different 261 individuals and in many cases prolonged stopovers were associated with Sahara crossing which was 262 completed with long endurance flights (Figure 2, Figure 3). Such co-occurrence is likely attributed to 263 prolonged fuelling to build energy stores necessary for crossing ecological barriers (Schaub and Jenni 264 2000, Fransson et al. 2006). The ratio between the duration of flight and stopover phases was on 265 average 1:6.5 which is slightly lower than the predicted ratio of 1:7 based on theoretical models 266 (Hedenström and Alerstam 1997). However, our estimates of the total stopover duration did not 267 include the fuelling period before the initial departure for migration (Lindström et al. 2019). It is likely that with this period included, the ratio of flight vs stopovers would match the theoretical predictions
(Hedenström and Alerstam 1997).

270 Overall, exercising a hop migration pattern may have energetic benefits for individuals. Birds 271 can save energy on reduced transport costs if they migrate in short flight steps and low fuel levels 272 (Alerstam 2001). Consequently, birds need to spend less time on stopovers refuelling and reduction 273 in total energy requirements will also enable to reduce the total duration of migration. Such 274 migration strategy is, however, possible only if resources along the migration routes are widespread 275 and settling costs at new stopover sites are small. The observed difference in flight altitudes between 276 night and day may suggest that birds employ a fly-and-search migration when prolonging the flight 277 into the day. Flight of short duration and diurnal flights were most commonly carried out at altitudes 278 below 500 m asl which may allow the birds to search for favourable landing sites where food for 279 refuelling may be found. This may also explain why pipits prefer late night/early morning flights 280 where new stopover sites may be visually located after sunrise. Thus, hop migration may be 281 inevitably linked with fly-and-search migration strategy and hence, late night departure times and 282 landing times after sunrise.

Our estimates of the average ground speed of 39.5 km h<sup>-1</sup> along the most likely migration track is slightly lower than the grounds speed measurements of ca 50 km h<sup>-1</sup> for passerines obtained using tracking-radar (Bruderer and Boldt 2001). Such discrepancy is not surprising, because geolocators provide positions only twice per day and the migration path between them is smoothed. Therefore, with a positional frequency averaging at 12 h intervals, we cannot account for small inflight detours of the birds when estimating ground speed. Consequently, both ground speed and travel speed (average of 125 km day<sup>-1</sup>) are likely underestimated.

Tawny pipits' migration routes via the Iberian Peninsula and non-breeding sites in the Sahel
zone in West Africa were largely similar to an earlier tracking study of this population (Briedis et al.
2016). Integration of activity and barometric pressure tracking into the classical light-level
geolocation, however, opens a new avenue in the details we can reveal about migration patterns.

294 This includes a detailed description of the seasonal flight and stopover behaviour as well as their

295 interrelationship which can then be tested against theoretical predictions for different migratory

296 strategies. Developing algorithms that can translate activity recordings into daily, seasonal and year-

297 round energy budgets have the potential to further our understanding on the linkages between

298 particular evolutionary and behavioural strategies we observe in the wild and their energetics.

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# 305 Authors' contributions

- 306 MB, PA, and SH conceived the idea and study design; VB carried out fieldwork; MB
- 307 performed data analyses and drafted the manuscript with inputs from all other authors.

## 308 Data accessibility

- 309 Bird tracking dataset will be uploaded to an open repository (Zenodo, Dryad or MoveBank)
- 310 providing the manuscript is accepted for publication.
- 311

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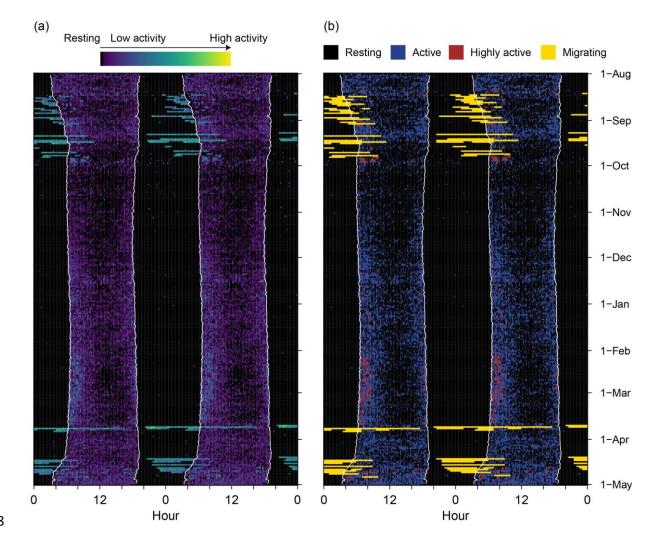
# 413 Tables & Figures

**Table 1.** Summary data for each bird. Note that departure date is always given as the date of the evening of the night when the first migratory flight occurred. Arrival is given as the date of the morning when the last migratory movement occurred. Total duration, however, is given as the number of days (rounded to full days) between the precise time of departure and arrival, thus in some instances creating a discrepancy in the numbers given in the table and the absolute difference in days between departure date and arrival date.

Migration				Spring			
characteristics	22BK	20NT	22AU	22BN	22BP	Average	22BK
Departure	15-Aug	18-Aug	28-Aug	28-Aug	26-Aug	23-Aug	22-Mar
Arrival	25-Sep	2-Oct	6-Oct	10-Oct	11-Oct	5-Oct	24-Apr
Total duration (days)	40	45	39	42	46	43	33
Migratory track distance (km)	5440	5290	5340	4890	5370	5266	4810
Great circle distance (km)	4480	4740	4390	4410	4450	4494	4480
Travel speed (km day <sup>-1</sup> )	136	118	137	116	117	125	146
Travel speed great circle distance (km day <sup>-1</sup> )	112	105	113	105	97	106	136
No. flight days	26	19	22	17	23	21	13
No. stopover days	14	26	17	25	23	21	20
No. stopovers	12	10	11	7	9	10	5
No. stopovers (>3 days)	1	5	3	4	3	3.2	1
Proportion in flight	13.1%	12.3%	15.8%	11.9%	13.3%	13.3%	12.2%

Proportion stationary	86.9%	87.7%	84.2%	88.1%	86.7%	86.7%	87.8%
Flight characteristics							
No. flights	27	25	25	19	23	23.8	15
Median flight duration (hh:mm)	3:30	3:00	5:30	6:00	4:30	4:30	5:00
Cumulative flight hours (hh:mm)	126:30	132	146	121	144:30	134	95:30
Longest flight (hh:mm)	14:30	20	16	11:30	20:30	16:30	21:00
Proportion of migratory flight at night	75.4%	64.2%	73.7%	75.7%	54.2%	68.6%	70.4%
Flight speed along migratory track (km h <sup>-1</sup> )	43	40.1	36.6	40.4	37.2	39.5	51.6
Maximum flight altitude (m asl)	3159	2611	2978	3182	2912	2968	3662
420							

Figure 1. Actograms showing the annual activity pattern of a tawny pipit (bird ID: 22BK) from 1-Aug
2018 until 1-May 2019. (a) Raw accelerometer measures, (b) activity data classified into 4 categories
– resting, active, highly active, and migrating. In both panels, each horizontal line represents the
activity data of two consecutive days, where the second day is repeated as the first day on the next
line. White lines in the actograms represents sunrise and sunset times as recorded by the
geolocator's light sensor.



430 Figure 2. Migration routes, stopovers and non-breeding sites of five geolocator-tracked tawny pipits. 431 Shaded areas show 95% probability distributions of location estimates. For each bird, timing and 432 duration of migration is shown alongside the map where coloured bars indicate stopovers longer 433 than 24 h (stopovers longer than 3 days are marked with black borders) and white spaces between 434 them indicate movement periods between the stopovers. Please note that bars indicating migration 435 timing have variable scales. Panels a and b represent autumn and spring migration of the same 436 individual. Intermediate non-breeding sites are marked in blue for the two birds that showed non-437 breeding site itinerancy (panels c & d).

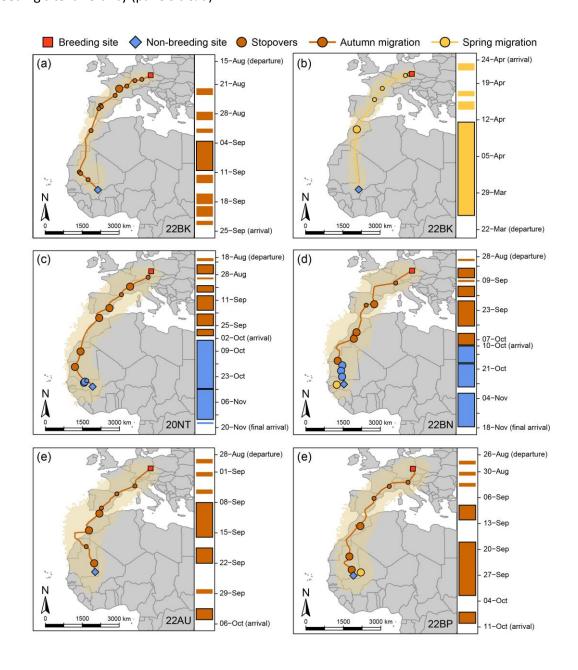


Figure 3. Cumulative flight hours of five tawny pipits during the autumn migration between 15-Aug
and 15-Oct 2018. Start of Sahara crossing for each bird is indicated with a dot.

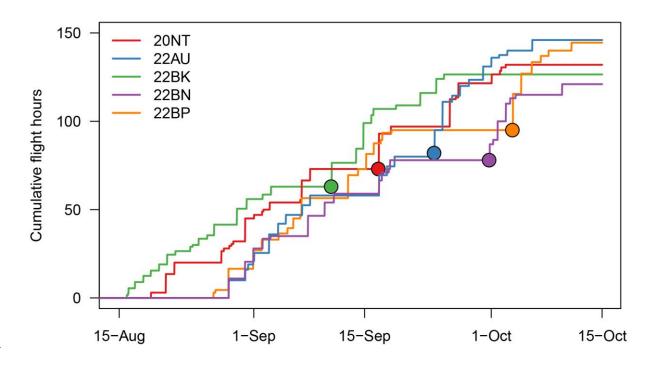
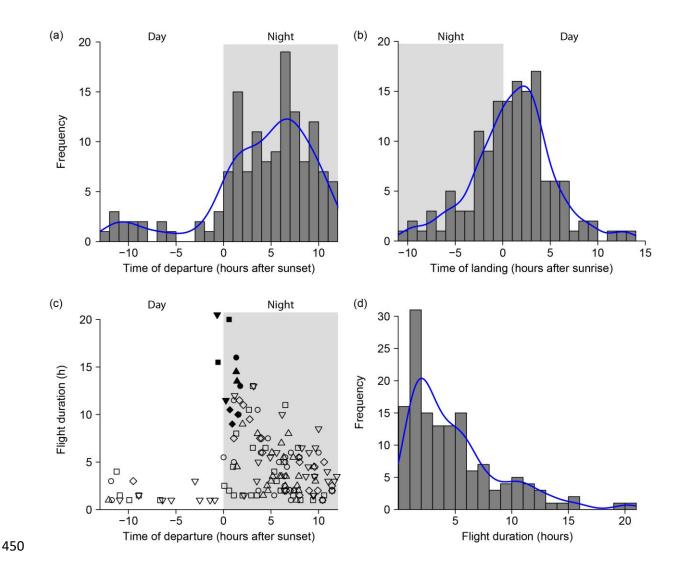
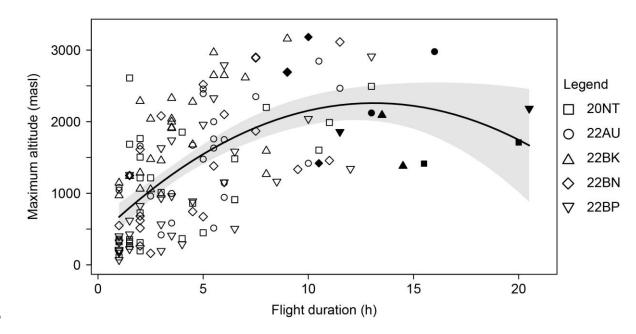


Figure 4. Characteristics of migratory flights of tawny pipits. (a) Frequency distribution of departure
time relative to sunset, (b) landing time relative to sunrise, (c) relationship between flight duration
and departure time relative to sunset. Different symbols denote different individuals (legend as in
Fig. 5), filled symbols denote barrier crossing flights, (d) frequency distribution of flight duration. Blue
lines in panels a, b and d are estimated frequency density curves. Note that sunrise and sunset times
here are derived from geolocators' light recordings and approximately correspond to a sun's azimuth
of -4.8° (see methods).



- 452 **Figure 5.** Relationship between flight duration and the maximum altitude during autumn migration.
- 453 Different symbols denote different individuals, filled symbol indicate Sahara crossing flights.



454 Quadratic model fit is depicted by a solid line with 95% CI (shaded area).