# ORGANIZED FLIGHT IN BIRDS

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#### **Document Properties:**

50 pages 11,641 words (14,927 including References and Figures)

## ABSTRACT

1 The organized flight of birds is one of the most easily observed, yet challenging to study, 2 phenomena in biology. Birds that fly in organized groups generally do so in one of two fashions: 3 Line formations and Cluster formations. The former groups are typically demonstrated by large 4 birds like waterfowl, where birds fly arranged in single lines, often joined together. The 5 scientific questions about these groups usually involve potential adaptive functions, such as why 6 do geese fly in a V? The latter, Cluster formations, are typically made up of large numbers of 7 smaller birds like pigeons or blackbirds flying in more irregular arrangements that have a 8 strong three dimensional character. The groups are defined by synchronized and apparently 9 simultaneous rapid changes in direction. Scientific questions about these groups are usually 10 concerned with mechanism; how is synchrony achieved? Although field observations about the 11 phenomenon date to the origins of natural history, experimental studies did not begin until the 12 1970s. Early experimenters and theoreticians were primarily biologists, but more recently 13 aeronautical engineers, mathematicians, computer scientists, and currently, physicists have 14 been attracted to the study of organized flight. Computer modelling of organized flight has 15 recently generated striking visual representations of organized flight and a number of 16 hypotheses about the functions and mechanisms of organized flight, but the ability to test these 17 hypotheses lags behind the capacity to generate them. It is suggested that a multiple-18 disciplinary approach to the phenomenon will be necessary to resolve apparently conflicting 19 current hypotheses.

#### 20 Keywords

21 animat; bird aerodynamics; bird flight; bird flocking; boid; cluster formations; Canada Goose;

- 22 Branta Canadensis; European Starling; Sternus vulgaris; flight formations; flock simulations;
- 23 flocking simulations; line formations; V formation

24 The orderly aerial manoeuvres of birds have fascinated and mystified observers since the 25 beginnings of written natural history 2,000 years ago, when Pliny suggested that geese '...travel 26 in a pointed formation like fast galleys, so cleaving the air more easily than if they drove at it 27 with a straight front' (Rackham 1933). Why do geese fly in a V, and how do pigeons all seem to 28 be able to take off and turn at once? The study of these phenomena offers an encapsulated 29 model of the development of knowledge of other behaviours, starting with anecdotal 30 descriptions and speculation, measured observations of increasing precision, formation of 31 testable hypotheses, and then tests of these hypotheses. In the case of the study of organized 32 flight in birds, the first phase began at about the beginning of the twentieth century, the second 33 and third in the 1970s and the fourth in the mid 1980s. The study of bird organized flight also 34 offers a good demonstration of Kuhn's (1962) suggestion that science advances in saltatory 35 fashion, each 'revolution' being prompted by a new technique or apparatus that allows old data 36 to be looked at in a new way.

37 The early investigators of organized flight were, with a few notable exceptions, biologists. In 38 the 1970s, aeronautical engineers started to be attracted to the phenomenon, followed by 39 computer scientists in the 1980s, and physicists and mathematicians in the 1990s. These later 40 investigators have been primarily interested in modelling the behaviour. The fraction of active 41 investigators with a biological background has steadily decreased over the years. We will try to 42 demonstrate that as the elegance of models has increased, so has their distance from behaviour 43 in the field, and that future progress in the area will depend on collaborations between 44 physicists, mathematicians, computer scientists and biologists rather than specialists working 45 alone.

## 46 THE ERA OF ANECDOTE AND SPECULATION

47 Several ornithologists of the 1930s made visual field observations that would later be very
48 provocative to experimentalists and theoreticians. Nichols (1931) noted that in turning and

49 wheeling pigeon, *Columba livia*, flocks, the position of the birds at the head of a turning flock

would be exchanged with birds at the side after the completion of a turn; there did not appear to be consistent 'leadership' in such flocks. He speculated that this behaviour might be the result of faster birds in the front of the formation moving ahead of the flock, then turning back to rejoin. The visual stimulus provided by the turnaround might provide a signal for the rest of the birds to turn, apparently simultaneously. He suggested that a change in direction was related to a change of positional leadership.

Selous (1931) made a 30-year series of meticulous visual observations on various species of birds flying in organized flocks, and was convinced that within the limits of unassisted human vision, there were occasions when birds rose from the ground, or made turns simultaneously. He concluded that there could be only two possible explanations for such a phenomenon; disturbance from outside the flock, say the sight of a predator, which would be instantaneously received by all birds in the flock, and would be reacted to in identical manner, or an undefined quality he called 'thought transference', or what we might call today 'telepathy'.

63 Selous appeared convinced that there were at least some occasions when groups of birds 64 would rise from the ground, apparently spontaneously, with no discernible source of outside 65 disturbance. He also noted in contrast that there were times when a flock on the ground would 66 be indifferent to the rapid approach of an aerial predator, as when members of a flotilla of 67 Eurasian Coots, Fulica atra, leisurely swam away as a Great Black-backed Gull, Larus marinus, 68 made a low pass over their group. Penrose (1949) made a similar observation when he dove 69 from above toward a large European Starling, *Sternus vulgaris*, flock in a sailplane. 70 Selous also noted that flocks on the ground would sometimes take to the air in a stepwise 71 fashion. Individuals or small groups of Black-headed Gulls, Larus ridibundus, would take flight 72 without any discernible effect on neighbours, and then with no obvious temporal relationship to 73 previous small group departures, the entire remainder of the flock, hundreds of birds, would

74 take flight simultaneously.

75 'Thought transference' had a different standing in the scientific community in Selous' time
76 than it does today, and it is not surprising that, for want of a better explanation, a careful

observer like Selous might be led to something as heterodox as telepathy to explain an
otherwise inexplicable phenomenon. Rhine (1983) had started reporting the results of
parapsychology experiments using conventional experimental design in 1927, and England,
where Selous made his observations was a centre of interest in 'paranormal' phenomena. Selous
never explored what the nature of thought transference might be.

82 Gerard (1943) was one of the first individuals to try to quantify turning behaviour in a flock. 83 Whilst pacing a group of approximately 100 unidentified birds in a car being driven at 35 mph 84 (60 km/h), he observed that the entire flock turned left in a flanking movement, rather than a 85 column movement, in military parlance. In a flanking movement all individuals turn at once 86 upon the signal to do so, rather than advancing to a defined point and then turning. He 87 speculated that no bird advanced more than a body's length beyond any other bird before 88 turning, by his calculation within 5 ms of any other bird. Assuming a minimum reaction time of 89 100 ms, he proposed that any coordinating signal must have been acted on with great constancy 90 by receiving individuals. Gerard's own vision must have been remarkable to be able to make 91 this observation while driving a car, but his estimate of probable reaction time was very close to 92 Pomeroy & Heppner's (1977) laboratory study results of startle reaction times in the European 93 Starling of 70 ms.

94 Much of the early work on flight flocking was devoted to considerations of the biological 95 utility of flocking, from an ecological or behavioural standpoint, rather than the perspective of 96 organizing principles or mechanisms. Beer (1958) questioned whether large groupings of birds 97 had 'any' distinctive utility, and were merely 'haphazard organizations'. Vine (1971), on the 98 other hand, suggested that a circular grouping provided the best predator avoidance strategy 99 against visual predators. Emlen (1952) looked at flocks from the ethological perspective of the 100 times, and suggested that both flocking itself, and the structure of the flock resulted from the 101 interplay of attractive and repulsive behavioural forces.

One of the annoyances that has persisted over the years for those studying flocks is an
etymological one; there has been no consistency in the literature in terms of the definition of

'flock' and categories of same. The difficulty is not a trivial one. One author might be describing
the properties of a class of behaviours that is quite different than those studied by a different
investigator, but both will use the same term.

107 For example, Emlen (1952, p. 160) described a flock as 'any aggregation of homogeneous 108 individuals, regardless of size or density'. This definition immediately presents difficulties, 109 because there are very common aerial groupings, such as mixed blackbird groups, composed of 110 different species. Beer's (1958, p. 78) definition of a flock was '...two or more birds which 111 associate with each other due to innate gregarious tendencies'. This definition breaks down in 112 the face of more recent flocking studies, like Reynolds' (1987), which suggest that coordinated 113 flocking may be the product not simply of 'gregariousness', but extremely simple behavioural 114 rules followed by each bird in the group.

Heppner (1974) developed a taxonomy of airborne bird flocks. The primary dichotomy in this
scheme was between 'Flight Aggregations', which are unorganized groups of flying birds
gathered in an area for a common purpose, such as gulls circling about a fishing trawler, and
'Flight Flocks', which were organized groups of flying birds coordinated in one or more aspects
of flight, such as taking off, turning, landing, etc. However, these distinctions seem not to have
been universally adopted in the literature; one regularly sees the term 'aggregation' used to
describe what Heppner would have called a 'flight flock'.

122 Heppner's second order division of 'Flight Flocks' has demonstrated some persistence and 123 consistency in the literature. He differentiated flight flocks into 'Line Formations' and 'Cluster 124 Formations' (Fig. 1). Line formations are demonstrated by relatively large birds that fly in 125 regular lines or queues, such as geese, cormorants, or ducks. Cluster formations have a three 126 dimensional structure like a sphere, and are typically seen in smaller birds like pigeons, 127 starlings, and smaller shorebirds. Interestingly, line flying birds like geese may sometimes be 128 seen in a cluster, but cluster flying birds like starlings are rarely, if ever, seen flying in single 129 lines.

130 The categories of biological questions that are raised by each of these formations are quite 131 different. Typically, 'how' questions are raised about cluster flocks. Do the birds really turn all at 132 once? How can they achieve synchrony in taking off and landing? How do they decide when to 133 turn, and in what direction? 'Why' questions are more characteristic of line flying birds. What 134 might be the biological advantage of flying in this configuration? Are there energy savings to be 135 had? Does the formation shape facilitate communication? A broad question that might apply to 136 both groups is whether there is a general advantage to flying in groups, as opposed to solitary 137 flight?

A literature search suggests that investigators recognize that the two formation categories may represent quite different biological issues. Early key papers on line formations tend to be cited through generations of papers on line formations, but not cluster formation studies, and vice versa. For this review, we recognize the difference between these lines of investigation, and will treat them separately.

## **143 LINE FORMATIONS**

Line flying birds typically fly in staggered, or 'echelon', formations rather than in straight lines
nose-to-tail. If two such formations are joined at an apex at the front of the formation, we have a
V or a J, its asymmetric variant. Franzisket (1951), von Holst (1952) and Hochbaum (1955)
suggested that close formation flight might provide the advantage of a turbulence free zone
behind a bird ahead, but that would seem to apply only if the birds flew immediately behind the
bird in front, like race cars, which they rarely do.

Two competing, but not necessarily mutually exclusive, hypotheses have been advanced to explain the functionality of staggered line formations (most of the papers to be subsequently cited here refer to V formations and their properties, but Gould & Heppner [1974] found in a study of 104 Canada Goose, *Branta canadensis*, formations that Vs and Js together were less common than single staggered lines, or echelons. Additionally, O'Malley & Evans [1982a, b] found that White Pelicans, *Pelecanus erythrorhynchos*, flying in line formations only flew in Vs 156 10% of the time). Wieselsberger (1914), an aerodynamacist, was the first to suggest an 157 aerodynamic advantage for line formation flight. He proposed that a V partitioned drag equally 158 between the two legs of the flight, and that birds flying to the left or right of a bird in front could 159 recapture energy lost to an 'upwash' generated off the wingtips of the preceding bird. The 160 alternate, behavioural view suggests that social and perceptual factors have guided adoption of 161 staggered formations. Hamilton (1967) suggested that flying in staggered lines permitted the 162 optimum combination of visibility of neighbours, and a clear visual field to the front. Heppner 163 (1974) suggested that the fixed position of the eyes in the heads of line-flying birds might make 164 a staggered formation advantageous for keeping the image of an adjacent bird on the visual axis 165 of a given bird's eyes. However, Heppner et al. (1985) found that the angle between the legs of a V formation of Canada Geese that would place the image of a leading bird on the visual axis of 166 167 the eyes of a following bird (128°) was considerably more obtuse than the measured V-angles of 168 V-formation flying birds in previous studies (Gould & Heppner 1974; Williams et al. 1976; 169 O'Malley & Evans 1982a). They also noted that although Canada Geese have a limited amount of 170 binocular vision to the front, despite having eyes located on the sides of their heads, they also 171 have a 'blind cone' in back of them of 29° on either side of the midline. Thus, a V angle of 58° or 172 greater would enable every bird in the formation to see every other bird, even those following 173 behind.

174 Warnke (1984) offered a third hypothesis that, judging by the number of subsequent 175 citations, seems not to have generated much enthusiasm in the V formation community. He 176 suggested that the V formation could be explained by the interaction of electrostatic fields 177 generated by flapping flight. He did not discuss how birds would be able to detect such fields, nor did he explore the advantage that might accrue to a bird by basing its proximity to a 178 179 neighbour on the basis of these fields. There was much interest in the biological effects of 180 electromagnetic fields in the 1970s and 1980s; Heppner & Haffner (1974) suggested that 181 coordinated cluster flocks might be explained by signals sent by a leader to all birds in a flock by 182 means of a hypothetical radiated electromagnetic field. Interestingly, Hill (1972) described a

device he patented that was a wing-levelling autopilot for model aircraft that operated by the
differential in electrostatic fields between wingtips of a moving model airplane, so Warnke's
idea was not totally implausible.

186 There have been more papers addressing the aerodynamic hypothesis of staggered flight than 187 other hypotheses, and a bit of aerodynamic theory here will make the subsequent references 188 more intelligible. For a bird to fly by use of a wing requires a 'relative wind'; a passage of air 189 over the wing. If the front of the wing is tilted up slightly relative to the wind, the relative wind 190 is deflected downward. The result is a positive force on the underside of the wing, 'Newtonian 191 lift' (Fig. 2). Additionally, airplane wings are typically constructed so that the top of the wing is 192 curved and air moves faster over the top of the wing, creating a negative pressure on the top of 193 the wing; 'Bernoulli lift'. In still air, we must generate the relative wind by moving the aircraft 194 forward. To do so, we must have a force called 'thrust', generated, for example, by a propellor. In 195 general, the faster the aircraft goes, the more lift is generated by the wing. Unfortunately, as the 196 aircraft accelerates, 'drag' is produced, at least in part by friction between the air and the 197 surface. One type of drag, 'induced drag', is especially germane to bird flight. Lift is, partly, 198 created by the angle with which the wing meets the air (referred to also as the angle of attack). 199 Up to a limit, the steeper the angle, the greater the lift—but also, the greater is the induced drag, 200 which is produced as a by-product of lift. Compared to airplanes, birds are typically low-speed 201 aircraft whose wings produce a lot of induced drag.

202 The inner part of a bird's wing provides most of the lift, the outer part, by a kind of rowing 203 action, provides the thrust. As air streams over a wing generating lift, it tends to form vortices, 204 which typically stream off the wing as 'tip vortices', essentially horizontal tornadoes. These tip 205 vortices have a rising and falling component, and in an airplane, may carry sufficient energy to 206 upset a smaller aircraft following a larger one in for a landing. It is this energy, which essentially 207 represents a cost of flight using wings, that the aerodynamic hypothesis of V formation suggests 208 might be partially recaptured by a following bird whose own wingtip was located in the upward 209 rising part of the tip vortex, or upwash, streaming off the wing of the preceding bird (Fig. 3). The diameter of the vortex increases with distance from the producing bird's wingtip, and tends to
dissipate with increasing distance. The placement of a following bird's wingtip in relationship to
the vortex from a preceding bird's wingtip should, in theory, affect how much energy is
recaptured by the following bird. To recapture tip vortex energy from a preceding bird, a
following bird would have to be positioned to the left or right of a preceding bird, suggesting
that a V (or at least a staggered, or echelon) formation would be advantageous for birds flying in

217 Lissaman & Schollenberger (1970) produced the first quantitative suggestion, based on 218 aerodynamic theory, of exactly how much energy might be saved by a group of birds flying in a 219 V formation. They proposed that a group of 25 (unspecified species) birds flying in a V would 220 have 71 percent more range than a single bird. Their optimum V angle appeared to be about 221 120° between the legs of the V. For later investigators, this paper was both stimulating and 222 frustrating because they did not present the calculations and formulae used to arrive at their 223 conclusions, ignored the quantitative effects of flapping rather than fixed wing flight, and did not 224 apparently consider the difference between air flowing over a smooth metal surface and a 225 feathered wing nor the aerodynamic scaling effects of small birds flying at low speeds compared 226 to aircraft. Nonetheless, this paper provided a 'target' for experimental and quantitative 227 observational work.

Haffner (1977) flew Budgerigars, *Melopsittacus undulatus*, in a wind tunnel and used a smoke stream to visualize the airflow over the bird's wing. He concluded that flapping wing flight is aerodynamically complex, and that calculations of energy saving for the V formation using fixed wing models were oversimplified, and probably overgenerous. Using Cone's (1968) theoretical studies on flapping wing flight and his own experimental work, he concluded that potential energy saving of V formation flight compared to solitary flight was a much smaller maximum of 22%.

Willis et al. (2007) examined the theoretical energy savings in formation flight with respect tobasic positioning and wing beat phase relationships between a preceding bird and a following

237 bird. Nachtigall (1970) found a phase synchrony in a field study of wing beats in Canada Goose 238 formations, but Gould (1972), in a similar study, failed to do so. Willis et al.'s (2007) study is 239 preliminary as they do not consider the optimal formation shape or detailed flapping kinematics 240 or wing shapes. Nonetheless, their results suggest that optimal flapping phase synchrony 241 accounts for up to 20% of induced flight power savings, but that precision phase locking is not 242 required for energy savings to occur. They also observed that ideally, the following bird would 243 not be vertically elevated above or below the lead bird's wake if flapping started in phase. If 244 flapping is not in phase, however, it may be advantageous to take on a vertical displacement 245 relative to the preceding bird to most effectively capture its strongest upwash regions. They 246 suggest that vertical displacements in nature probably do not happen for aerodynamic benefit, 247 as for that to occur precision flight dynamics and sensing would be required. 248 Determination of the distance between birds, and the angle of the legs of the V would be 249 necessary to test V formation hypotheses. Gould & Heppner (1974) performed the first field 250 measurement of both parameters in Canada Geese using projective geometry and still 251 photography. They reported a mean angle between the legs of the V  $\pm$ SD of  $34\pm6^{\circ}$ , N=5, with a 252 mean distance between bird bodies  $\pm$ SD of  $4.1\pm0.8$  m, N=3 and a mean flock size  $\pm$ SD of  $18\pm12$ 253 birds, N=5. Two years later, Williams et al. (1976) examined V angles in Canada Goose 254 formations using a radar technique. They found a range of 38–124° in the feeding flights they 255 recorded. Further, they noted that the angle in a single formation varied from 5–40° between 256 successive sweeps of the radar beam (duration of sweep not reported). Both groups of authors 257 used their respective photographic and radar techniques on the same flocks of birds in 1975, 258 and found no significant difference between the two. 259 Higdon & Corrsin (1978) refined Lissaman & Schollenberger's (1970) hypothesis by 260 considering the effects of flying in three-dimensional fashion, i.e. in a cluster, like starlings. As 261 one might suspect, the physics is considerably more complex, but they suggested that it was

aerodynamically disadvantageous to fly directly behind another bird, and that a tall, narrow

263 cluster flock (such as is often seen in mixed blackbird flocks) is aerodynamically

264 disadvantageous compared to solitary flight. May (1979) also re-examined Lissaman & 265 Schollenberger's (1970) suggestions, and concluded that the aerodynamic advantage of line 266 flight in large birds was 'slight', perhaps as little as 10% compared to solitary flight. 267 Badgerow & Hainsworth (1981) re-examined Gould & Heppner's (1974) data on distances 268 between Canada Geese to obtain 'wingtip spacing', a variable they felt was more appropriate 269 than 'distance between body centres' in testing the aerodynamic hypothesis of V formation 270 flight. When they did this, they found a number of birds had wingtips that overlapped the 271 position of the wingtips of a bird ahead, a problematic situation for producing an energy 272 advantage in Lissaman & Schollenberger's (1970) hypothesis. In contrast to Lissaman & 273 Schollenberger's (1970) predicted maximum range increase of 71% for V formation flight, 274 Badgerow & Hainsworth's (1981) revision predicted a maximum increase of 51%, with a range 275 increase of 2–23% for the birds in a selected Gould & Heppner (1974) flock. Hainsworth (1987) 276 later provided an excellent description of the modified projective geometry technique he and 277 Badgerow used in the study above for examination of goose flocks, and applied it to his own 278 photographs of Canada Goose flocks. He noted that birds frequently shifted positions laterally 279 relative to the bird ahead, although the basic energy saving model of Lissaman & Schollenberger 280 (1970) predicted that there was an optimum position for energy saving. Using their model, he 281 concluded that the goose flocks he filmed were only enjoying a 36% energy advantage over 282 solitary flight, about half of the Lissaman & Schollenberger (1970) model. He cautioned against 283 a simplistic engineering model for explaining in toto a behaviour that might be highly variable, 284 depending on circumstance. 285 O'Malley & Evans (1982a, b) broadened the examination of line formation flight by studying 286 line flight in White Pelicans, Pelecanus erythrorhynchos. They used a variant of Gould & 287 Heppner's (1974) projective geometry technique to measure angles of Vs and Js, and distance

between birds, with much larger sample sizes (45 flocks) than in the Gould & Heppner (1974)

study. The angles ranged from  $24-122^\circ$ , with a mean ±SD of  $67\pm8^\circ$ , *N*=12, for V formations, and

290 70±5°, *N*=33, for J formations. As in the earlier goose formation measurements, there was wide

variation in the measured angles, and the means were well below Lissaman & Schollenberger's
(1970) predicted optimum angle of 120° for maximum aerodynamic advantage. Again, as in the
goose studies, V formations were less common than single line formations.

Hummel (1983), an aerodynamacist, further refined the theoretical aspects of formation flight by considering wing shape, homogeneous vs. non-homogeneous spacing, size of bird, flight speed, and straight vs. curved lines. He concluded that, under optimum conditions of the above, energy savings for formation flight were possible due to aerodynamic considerations, but the wide variance seen in the arrangements of flocks in the field suggested that aerodynamics might not be the only factor in formation flight.

300 Badgerow (1988) took a fresh look at the aerodynamic and visual hypotheses, and tried to 301 organize the scant real field data in such a way that they could be subject to test. He suggested 302 that if aerodynamic advantage was the primary driver of line flight, there should be a certain 303 geometric relationship between birds in a formation, but if visual considerations were 304 paramount, there should be a different configuration. Unfortunately, the variation in data 305 between flocks was sufficiently large to prohibit a clear distinction between the hypotheses, 306 although Badgerow felt that there was a non-trivial (about 10%) energetic advantage of 307 formation flight over solo flight.

308 Cutts & Speakman (1994) also found wide variation in placement of individuals in their study 309 of formation flight of Pink-footed Geese, Anser brachyrhynchus. They photographed 54 skeins 310 from directly beneath, simplifying the extraction of distances and angles. They found that large 311 numbers of birds flew outboard of the position predicted by theory to maximize aerodynamic 312 savings, resulting in a postulated mean energy saving of 14%. Further, after a discussion of optimum flight speed for optimum range, they suggested that if the birds in their sample flew at 313 314 a speed that would maximize their range, the savings would drop to 2% of that predicted by 315 Lissaman & Schollenberger (1970). Speakman & Banks (1998) later used the same technique to 316 photograph 25 formations of Greylag Geese, Anser anser. They found a great deal of variation in 317 positioning and that only 17% of birds flew in the predicted optimum position for aerodynamic

savings. They suggested, using the same assumptions as the Cutts & Speakman (1994) paper,
that the mean saving in induced power was 27%, and the reduction in total flight costs was
5–9% of the whole. Hainsworth (1988) also found in film studies of Brown Pelicans, *Pelicanus occidentális*, that there was wide variation in wingtip spacing, and that there was no evidence
that the birds spaced to optimize possible aerodynamic effects.

323 Shortly after the turn of the new century, several papers appeared with a decidedly more 324 mathematical bent than had been seen previously, from investigators with backgrounds in the 325 control of multiple autonomous unmanned aerial vehicles, like the Predator, and Global Hawk. 326 Seiler et al. (2002) noted the wide variation in distances and angles reported in bird formations 327 in previous field studies, and in a rather puzzling table suggested that the average number of 328 birds in a V formation appeared to be small, typically under 10 birds. Other studies (Gould & 329 Heppner 1974; Hainsworth 1987) had reported mean V formation sizes closer to 20 birds. 330 Seiler et al. (2002, p. 122) noted that, on theoretical grounds, maintenance of a specific spacing 331 and angular relationship between a 'leader', and following autonomous robotic vehicles is a daunting task, and that errors in spacing rapidly multiply with each subsequent vehicle, so 332 333 much so that '---flying in close formation is *not possible* (italics added) with information only 334 about the predecessors'. In other words, if a vehicle attempts to maintain position in the 335 formation only by maintaining position with its immediate predecessor in line, the formation 336 itself will quickly break down. However, they proposed two potential resolutions:

337

1. the formations should be very small, and/or

2. leader positional information should be simultaneously communicated to all
members of the formation; in other words, a trailing bird should maintain its position
with respect to the leader, rather than its immediate predecessors.

The same team expanded this idea, and explored the concept of 'string instability', the phenomenon where the trailing vehicle in a line has such difficulty tracking predecessors that it oscillates in position to such a degree that it eventually cannot stay with the formation (Seiler et al. 2003). In particular, they explored the difficulties of maintaining lateral positioning in a 345 line formation. They proposed that the difficulty in maintenance of position increases markedly 346 with position back from the leader; the 'positional error' (assuming the birds were 'trying' to 347 maintain an optimum position for either aerodynamic or visual reasons) of the number four 348 bird in relation to the lead bird would be twice as much as that of the number two bird. Seiler 349 350 added) difficult'. A glance overhead at a winter waterfowl assembly area displaying a panorama 351 of dozens of birds flying in each of hundreds of separate line flocks suggests a variant of the 352 catch phrase of the late Spanish ventriloquist, Señor Wences, 'Difficult for me; easy for you'. 353 Seiler et al. (2003) suggested that their hypothesis could be tested by examining whether birds 354 further back in the formation have a greater variation in wingtip spacing than those closer to 355 the leader. This hypothesis, of course, rests on the prior hypothesis that there is an optimum 356 spacing that the birds are attempting to maintain.

357 Weimerskirch et al. (2001) have provided the best (and to date) most realistic attempt to 358 resolve in the field whether there is an energy advantage to line formation flight. They trained a 359 flock of eight Great White Pelicans, Pelecanus onocrotalus, to fly in formation behind a 360 motorboat. Energy consumption during flight was not recorded directly, but inferred from heart 361 rate data. They measured heart rate from selected individuals in the flock, and from a solitary 362 bird flying under the same conditions. Heart rates of the birds in formation were 11–15% lower 363 than that of the solitary bird. From this, they concluded that they had provided empirical 364 evidence of an aerodynamic advantage to formation flight, in about the same fractional 365 proportion as the heart rate difference.

An alternate interpretation of the data is possible, especially given the relatively scant proposed saving compared to most aerodynamic theory-based predictions. Pelicans are highly social animals and the experience of flying solo might have been stressful compared to normal social flight. Späni et al. (2003) found that laboratory mice housed individually had a heart rate 4% higher than that of mice housed in pairs. So the effect seen may have been due, at least in part, to social stress rather than aerodynamic advantage.

#### 372 Modelling, Simulations and Application

The development of very powerful, relatively inexpensive computers in the late 1990s permitted a more sophisticated mathematical analysis of V formations. The first to report a model producing V formations was Flake (2000, pp. 270–275), who extended Reynolds' (1987) model (to be discussed later) with an additional rule; each artificial bird, or 'animat' (Wilson 1985; Watts 1998), 'attempted' to move laterally away from any animat that blocked its view to the front, and with that achieved V-formation flocks.

379 Assuming that there is, in fact, a reduction in collective aerodynamic drag experienced by members of a flock in a V, Dimock & Selig (2003) went a step further and developed a computer 380 381 simulation that actually modelled the induced drag. They extended Reynolds' (1987) model to 382 'detect' potential drag reductions by adding a rule by which each animat acted to reduce the drag, and observed how the animats self-organized themselves. There was an evolutionary 383 384 component to this study—they used genetic algorithms to evolve the model's parameters and as 385 each animat acted so as to reduce its own drag, the collective result was that the drag reduction 386 of the flock as a whole was maximized. Limiting the utility of the model, their induced drag 387 calculations were based on a rigid wing just as Lissaman & Schollenberger's (1970). In relatively 388 short simulations, their model correctly penalized collisions, and ultimately produced 389 rigid/stable flocks of perfect Vs. Using the same evolutionary theme, Andersson & Wallander 390 (2004) suggested that kin selection might explain why there appeared to be so much variation 391 in V formation structure. Most aerodynamic advantage studies propose that the lead position is 392 to some degree less advantageous than following positions, but Andersson & Wallander (2004) 393 suggested that if the flock is composed of kin, the leader might enjoy a gain in inclusive fitness, 394 even if at a personal energetic disadvantage. A casual glance at feeding or migrating flocks 395 suggests considerable shifting of position, and 'leadership' changes within the flock, but it would 396 be useful if there were a quantitative study indicating whether all or most birds assume the 397 'leader' position during a flight.

398 Nathan & Barbosa (2008) developed a comprehensive computer model that produced V 399 formations. Their model evolved from a series of simulations that yielded cluster flocks 400 (discussed below). The animats in their model followed simple rules; each bird attempted to 401 seek the proximity of the nearest bird (while avoiding collision), each bird attempted to find a 402 position that offered an unobstructed longitudinal view (if the first rule was not applicable), and 403 each bird attempted to position itself in the upwash of a leading bird. Using these rules, they 404 were able to produce Vs, Js and echelons; as well as inverted Vs which are rarely seen in nature. 405 The model was limited in its ability to handle flock turning movements as it assumed a constant 406 heading and the rules produced only lateral displacements. An attractive feature of the model 407 was, nonetheless, that it offered the opportunity to test the relative importance of aerodynamic, 408 or communication hypotheses, by changing the values of parameters.

#### 409 So, Why do Birds Fly in a V Formation?

410 After over 30 years of active interest in the field, we may be reasonably certain of the following411 things;

412 1. Many large birds (but not all) fly in line formations; small birds almost never.

- 413
  413
  2. The V and J formations are the most striking and eye catching line formations for
  414
  414 humans to observe, but they are not the most common for birds to fly in; the echelon
- 415 has that distinction.
- 4163. There is wide variation, from flock to flock and species to species, in positioning and
- 417 distances of individual birds in a line. Aerodynamic theory predicts, however, that
- 418 there is an optimum position and distance between birds if aerodynamic advantage is
- to be maximized, both for individuals and flocks.

420 4. The lines are wavy as often as they are straight.

421 One of us (FH) once asked a WWII B-17 pilot why bombers flew in a V. His reply was, 'To keep

422 a clear field of fire for the guns to the front, and to keep an eye on the leader, who does the

423 navigation.' Birds clearly need not worry about the former, but if in fact the 'leader' is

determining the direction the flock is to take, it would be an advantage to keep it in sight, anadvantage in a large flock accruing to a curved or irregular line.

426 Why not fly directly to the side of the leader, or directly in back? If a bird flew to the 427 immediate left or right of another bird, a gust of wind or a startled response from the neighbour 428 might precipitate a collision. Similarly, if the bird ahead were to suddenly slow down for any 429 reason, a rear-end collision might be possible. On an uncrowded motorway, drivers rarely 430 prefer to drive for long distances alongside a car in an adjacent lane, or tuck in close behind a 431 leading car if there is an opportunity to pass, possibly for similar anti-collision reasons. If the 432 object of the staggered line formation is primarily to avoid collision while keeping a leader in 433 sight, one would expect to see wide variation in spacing and alignment, simply because there is 434 no particular advantage to one spatial relationship rather than another. Similarly, one would 435 expect to see undulations in the line. As the body of a neighbour momentarily blocked the view 436 of the leader, perhaps due to a wind gust, an individual bird could simply speed up a bit or drop 437 back to regain sight of the leader, thus precipitating a wave.

438 But what of the potential aerodynamic advantage of V flight? Aerodynamic theory suggests 439 that one exists, under certain conditions. One must ask about its relative importance and need, 440 however, as it is noted that most of the field studies of line formations have not been made on 441 migration flights, where energy savings, even small ones, might well be of importance, but on 442 short feeding flights of 10–20 km, where the energy expended in flight represents a small 443 fraction of the birds' daily energy budget, and that whereas staggered lines are common, Vs and 444 Js are much less so. We simply do not know what kinds of formations large birds use on their 445 long migratory flights, which are often over water. Additionally, there may be an energetic cost to flying in close formation. The stress level in flying in very close proximity to other birds, with 446 447 consequent collision risk, might (on migration flights) raise metabolic levels enough to partially 448 negate any aerodynamic energy advantage of close formation flight.

The 'crucial' experiment, to determine if, in formation flight, there is a worthwhile energy
advantage to be gained for aerodynamic reasons, might be to train a group of imprinted line-

formation birds like geese to fly in a wind tunnel, and then use modern airflow visualization
techniques to empirically determine what the upwash properties of birds flying in formation
really are (Pennycuick et al. 1997; Rayner 1995).

## 454 **CLUSTER FLOCKS**

455 There is an extensive literature discussing the biological value of flocking in general (Krebs & 456 Barnard 1980), but very few papers have appeared with specific reference to the highly 457 organized turning and wheeling ('cluster') flocks of some small birds. The most commonly 458 offered hypothesis is that the closely spaced cluster flocks offer protection against aerial 459 predators like hawks, presumably by increasing the risk of collision to the predator (Tinbergen 460 1953). Examples have been reported where flocks of starlings and shorebirds bunch up tightly 461 when attacked by a hawk (Major & Dill 1978). This hypothesis appears reasonable, but leaves a 462 commonly seen behaviour in some cluster flying species to be explained. At sunset, or just 463 before, large flocks of European Starlings will form over a roost from smaller foraging flocks 464 that have dispersed during the day from that roost. These flocks will engage in some of the most 465 spectacular group movements seen in flocking birds for periods of 30–45 min before settling 466 into the roost for the night. Two questions immediately present themselves: 1) Do not these 467 movements 'waste' energy in species for which energy is important (Hamilton et al. 1967)? and 468 2) by occurring every night in the same location, and being highly visible from up to a km away, 469 do they not almost invite predator attack? A loitering predator would have an excellent 470 opportunity to pick off a straggler (we have seen many pre-roosting turning and wheeling flocks 471 that generate stragglers as the flock splits and rejoins). Why do these flocks not land 472 immediately in the roost after returning from foraging, and why are there often 10–15 min of 473 coordinated turning and wheeling before a flock descends to a feeding area, both expending 474 energy, and facilitating predation? 475 Wynne-Edwards (1962) proposed instead that these movements represented 'epideictic'

476 displays that might enable individual flock members to assess the population numbers and

477	density of the flock as a whole; information that might be used in regulating breeding behaviour.		
478	This suggestion was part of a larger concept that is called today 'naïve group selection'. This		
479	hypothesis received little support at the time (Crook 1965), but has enjoyed a recent re-		
480	examination (Wilson & Wilson 2007) that may be useful in considering how organized flight		
481	evolved. Another hypothesis was provided by Major & Dill (1978) who suggested that these		
482	turning and wheeling movements were 'protean' (Driver & Humphries 1970); irregular		
483	movements designed to confuse potential predators. A number of recent studies (Biro et al.		
484	2006; Codling et al. 2007; Dell'Ariccia et al. 2008) have suggested that flying in a group		
485	improves homing performance in pigeons, but it is not clear that the structure of the flock has		
486	anything to do with this improvement.		
487	There are several questions that are usually asked when considering the mechanism, rather		
488	than the function of cluster flocks:		
489	1. Do the flock members truly turn simultaneously during a turning movement, or is		
490	there a wave of movement starting at a centre somewhere and passing through the		
491	flock?		
492	2. Is there a leader in the flock who communicates an action intention in some fashion to		
493	other members of the flock, or is there some emergent property of flocking itself that		
494	produces coordinated movement?		
495	3. What mechanism governs the departure of flocks from the roost, ground, or perch, in		
496	which sometimes the whole flock departs, and at other times, subgroups will depart		
497	before the main group?		
498	Simultaneity (or not) of individuals making a turn has relevance to the related question of		
499	leadership. A wave of turning in the flock would suggest (but does not necessarily provide		
500	evidence for) a relatively simple model where a leader turns, followed by a turn by neighbours		
501	after a suitable reaction time (which was established by Pomeroy & Heppner [1977] to be under		
502	100 ms in laboratory studies of starlings), then a wave passing through the flock as birds		
503	respond to a turn by birds distant from the leader, but who ultimately have responded to a turn		

504 initiated by the leader. Vision would be the most parsimonious medium for information 505 transmittal in such a model. If birds turn simultaneously instead (within the limits of the 506 recording instrumentation), the question becomes more interesting; either a putative leader has 507 to communicate a message instantaneously to all members of the flock, seemingly ruling out 508 sound and vision in large flocks (because the bodies of nearby neighbours would block the view 509 of more distant birds), or it would be necessary to propose an organizing principle that could 510 produce synchronized turns without leadership. Such a model only became available in the 511 1980s.

512 Davis (1980) filmed turning flocks of Dunlin, *Calidris alpine*, with a slow-motion cine camera 513 (72 frames/s). Dunlin are differentially coloured on their dorsal and ventral surfaces, and Davis observed that some individuals in flocks of approximately 40 birds all appeared to turn within 514 515 120 ms, giving the appearance of a 'flash'. Potts (1984) using a similar technique with Dunlin, 516 noted some examples of waves of turning that propagated from neighbour to neighbour within 517 14 ms, considerably faster than the measured reaction times in birds. He proposed a 'chorus-518 line' hypothesis to account for rapid turns, in which one bird or a small group could initiate the 519 movement, which would then be followed by neighbours who responded to their immediate 520 neighbours and whose speed of response would depend on their own reaction times, but more 521 distant birds would be able to estimate and anticipate the passage of the wave, as in the 522 'Mexican wave' in stadiums (Farkas et al. 2002). However, Heppner (1997) suggested the 523 possibility that a perceived wave of turning in differentially turning birds might be an artefact of 524 observer position relative to the near and far borders of the flock, and that individuals in a flock 525 apparently turning in wave fashion might in fact be turning nearly simultaneously. Early on it was realized that to approach these questions, some idea of the geometric 526 527 relationship between birds in a cluster flock would be needed, and that meant the development 528 of three-dimensional (3D) analysis techniques. These techniques are well developed for 529 laboratory studies of fish schools (Partridge et al. 1980), but are much more challenging for 530 birds in the field.

531 Major & Dill (1978) obtained the first 3D measurements of distances between birds in free-532 flying flocks of Dunlin, *Caladris alpina*, and European Starlings by using a stereoscopic 533 photographic technique that utilized two 35 mm film cameras whose optic axes were parallel, 534 and which were firmly fixed on an aluminium bar 5.5 m long. They were particularly interested 535 in nearest-neighbour distances, and the angles between neighbours, as these would provide an 536 index of condensation of the flocks. They reported that the nearest neighbour to a reference 537 bird was typically behind and below a reference bird, a pattern often seen in fish shoals. 538 Pomeroy (1983) and Pomeroy & Heppner (1992) used an orthogonal 3D photographic 539 technique to obtain sequence pictures of semi-domestic Rock Pigeons, Columba livia, turning in 540 flocks of 8–11 birds. Using this technique, they were able to plot the flight paths of individual birds, as well as nearest neighbour distances. They reported that the flight paths of individual 541 542 birds crossed over each other, such that in a 90° turn, a bird that had been in the lead would be 543 to the right or left of the flock, and after a 180° turn, would be in the rear of the flock. They 544 suggested that an individual bird would find it difficult to 'lead' a flock by positioning itself at 545 the head of the flock.

546 Ballerini et al. (2008a, b) and Cavagna et al. (2008a, b) have developed a powerful tool for the 547 analysis of cluster flocks by essentially solving the 'correspondence problem' that has bedevilled 548 photographic 3D analysis techniques. Most such methods involve taking a pair of pictures from 549 slightly different viewpoints, and noting the displacement of the image of a single bird in one view from the other member of the pair. With large numbers of birds of identical appearance, 550 551 how do you match the image of the same bird in the two views? By using a novel statistical 552 method, they were able to determine the positional relationships of over 1,000 birds in a European Starling flock flying over Rome. Using data obtained by this technique, Ballerini et al. 553 554 (2008a) suggest that the significant factor in determining interaction between birds in cluster 555 flocks is not the distance between birds ('metric' distance), but the number of birds between 556 any two birds ('topological' distance, in their terminology).

#### 557 Modelling, Simulations and Application

558 Davis (1980), after reviewing the deficiencies of a leadership model for cluster flock turning and 559 wheeling movements, suggested the possibility that a 'self-generated synchronous activity' 560 might provide a model for coordinated movements. Within a decade, the development of 561 accessible and powerful computers and programming languages produced such models. 562 Working independently, Okubo (1986), Reynolds (1987) and Heppner & Grenander (1990) each developed flock flight models based on the concept that each bird in a flock followed simple 563 564 behavioural rules in relation to its neighbours, and that the interaction of these rules produced 565 the emergent property of a coordinated flock. Moreover, Okubo (1986) and Reynolds (1987) 566 suggested that the same concept could be employed to model schools and herds, which lead to 567 numerous studies in all three fields based on similar models, as if to find a universal theory. To some extent the conceptual ancestor of all models was John Conway's 'Game of Life', (Gardner 568 569 1970), one of the first cellular automata that demonstrated how complex global behaviours can 570 arise as a product of self-organization by simple components following simple local rules. 571 To be specific, Reynolds (1987) proposed that for the purpose of computer animation a flock 572 could be modelled as a group of animats (or 'boids', using his terminology) that followed three 573 simple rules, which might behaviourally be rephrased as 'drives'. These drives caused the 574 animats to attempt to avoid collisions with nearby neighbours ('separation' or 'repulsion'), 575 match velocity with nearby neighbours ('velocity matching'), and stay close to nearby 576 neighbours ('cohesion' or 'attraction'). The term 'nearby' was used to describe the animat's 577 localized perception of the universe. In all incarnations of the model, Reynolds (1987, 1999, 578 2004) used drive dependent perception volumes (nearby neighbours were all animats within a 579 sphere of a predefined diameter centred at the currently observed animat's origin) with a 580 biologically realistic perception model (limitations of visual perception were accounted for; a 581 'blind cone' [the three-dimensional equivalent of a 'blind spot'] was subtracted from the 582 perceptual sphere at the back of the observed animat). At the time of proposal the approach 583 represented a giant step forward compared to the traditional techniques used in computer

animation for motion pictures. The first animation created with the model was 1987's '(Stanley
and Stella in) Breaking the Ice', followed by a feature film debut in Tim Burton's 1992 film
'Batman Returns' with computer generated bat swarms and 'armies' of penguins marching
through the streets of Gotham City. The current state of the art in computer animation for
motion pictures has evolved even further (Massive 2008); these advanced models, however, due
to the obvious financial consequences, remain proprietary.

590 Heppner & Grenander's (1990) distinguishing features were the approach used to model 591 perception and the animats' drives. In their case the same perception volume (a sphere of a 592 predefined diameter centred at the currently observed animat's origin) was used for all drives 593 and limitations of visual perception were not accounted for. The animats attempted to stay in 594 the roosting area ('homing'), attempted to fly with a predefined flight speed ('velocity 595 regulation'), and attempted to move apart if too close, or closer if not too distant ('interaction'). 596 An additional feature was 'random impact', which was intended to simulate the random 597 distractions that are present in a natural environment (wind gusts, distractions from moving 598 objects on the ground, etc.). Heppner & Grenander (1990) implemented the latter by using a 599 Poisson stochastic process and admitted that without its inclusion they were unable to produce 600 a flock-like behaviour.

601 In the mid 1980s and early 1990s, computer processing power was limited and real time 602 simulations of large flocks consisting of more than a few dozen birds were infeasible. The first 603 step to simulations that would allow observing an animated output while running the 604 simulation and interactively changing the model's parameters was performed by Lorek & White 605 (1993), who, just a few years after Reynolds' (1987) paper was published, used a Meiko 606 Transputer System with up to 50 processors to run flight flock simulations, consisting of merely 607 100 birds at slow, but interactive rates (6 frames/s). The recent advances in multicore 608 technology (Gschwind et al. 2006) and computer graphics dedicated hardware (NVIDIA 2007), 609 and their use for scientific research (Khanna 2007; Sijbers & Batenburg 2008) give the 610 impression that barriers to real time simulations and interactivity will soon be breached.

Reynolds (2006), for example, reported a multicore solution, which takes advantage of the Sony
PlayStation 3 Cell processor for running simulations of 10,000 fish with animated output of
cinematic quality at 60 frames/s. More recently, at the SIGGRAPH 2008 conference, the Game
Computing Applications Group of AMD, Inc. was showing a cinematic quality technology demo
titled 'March of the Froblins' (AMD 2008; Shopf et al. 2008), a graphics processing unit (GPU)
based crowd simulation of 65,000 agents at 30 frames/s.

617 The techniques used for achieving high frame rates might at times be at the expense of 618 biological realism. It is also true that for a scientific study centred on behaviour, the ability to 619 interactively change the model's parameters and observing the effects in real time is a welcome 620 plus. In computer animation for games and virtual reality (Brogan et al. 1998) high frame rates 621 are important and the modelling of flocking behaviour has a niche of its own—it falls under the 622 subject of 'controlling groups of objects'. Disregarding the cost of achieving the desired degree 623 of visual realism, the simplicity of achieving high frame rates depends on the class of the 624 controlled group of objects. Using Parent's (2002) terminology, there are three principal classes 625 of controlled groups: 1) 'particles', characterized as large collections of individual objects, each 626 of which obeys simple physical laws, such as momentum and conservation of energy, but has no 627 'intelligence', or decision making capacity; usually, such particles interact mostly with their 628 environment, and there is little, if any, inter-individual exchange (typical examples are models 629 of fluids, gaseous phenomena, hair, fur, etc.); 2) 'flocks', characterized as medium (fewer in 630 number than particles) size collections of individual objects, with some incorporated physics 631 and intelligence—interaction with the environment and inter-individual exchange (typical 632 examples are models of schools, swarms, herds, crowds, traffic, etc.); 3) 'autonomous agents', characterized as small collections, with little, if any, incorporated physics and much intelligence 633 634 (typical examples are intelligent agents, autonomous robots, software agents, computer viruses, 635 etc.). All three classes are examples of independently behaving members of groups with varying 636 levels of autonomy, physical characteristics and simulated motions.

637 Kennedy & Eberhart (1995) were the first to incorporate elements from artificial life and 638 artificial intelligence (AI) studies to allow bird flocking behaviour models to serve as exemplars 639 for more general kinds of behaviour, including human social behaviour (Helbing & Molnár 640 1995). A group of interacting animats is a 'swarm' in AI terms, and Kennedy & Eberhart (1995) 641 presented algorithms by which a swarm might optimize its behaviour, or adapt to serve some 642 end, such as increasing energy input. The animats in a swarm make decisions about their own 643 behaviour based on the behaviour and knowledge gained from their neighbours, as well as the 644 perceived elements of their surroundings, such as locations of 'feeding areas'. From the swarm's 645 collective behaviour emerges the animats' indirect approach to relatively-good solutions. These 646 algorithms are also known as 'particle swarm optimization', or PSO for short (Kennedy et al. 647 2001; Engelbrecht 2006). Macgill & Openshaw (1998) and Macgill (2000), for example, later on 648 used flocking behaviour to assist the analysis of geographical data. Subsequent AI studies 649 started introducing more and more intelligence in individual animats while reducing their 650 number; Odell (1998) provided a summary of the terminology and properties attributed to 651 'agents' in computer studies.

652 In the mid-1990s, physicists began to show interest in the mathematics and physics of 653 organized flocks, using a perspective very different from those found in earlier biological and 654 aerodynamic studies. Vicsek et al. (1995) and Toner & Tu (1995, 1998) viewed the birds in a 655 flock as particles, behaving much as molecules in a fluid or atoms in a crystal might, and that 656 they were responsive to the same mathematical rules. The models were all based around the 657 same perception model as in Heppner & Grenander (1990); inter-individual influences occurred 658 between animats that were not further apart than a predefined distance. Additionally, an overall 659 constant flight speed was assumed and the number of drives was reduced to merely one, 660 attempting to match flight direction with nearby neighbours. A stochastic component had been 661 added in these models, perhaps on similar presumptions as the random impact used by 662 Heppner & Grenander (1990). As theoretical physicists, Toner & Tu (1998, p. 4830) may have 663 been somewhat removed from realities in the field when they suggested, 'This correlation

664 function should be *extremely easy* (italics added) to measure in simulations, and in experiments 665 on real herds or flocks, in which, say, video tape allows one to measure the positions ... of all the 666 birds ... in the flock at a variety of times t'. Vicsek et al. (1995) suggested that the physics 667 concepts associated with phase transitions, as in the transition from solid to liquid forms of 668 materials, might serve to explain the puzzling shifts between orderly and disorderly flock 669 formations often seen in birds like European Starlings. All in all, their models represent a 670 substantial simplification in biological assumptions over the initial ones proposed by Okubo 671 (1986), Reynolds (1987) and Heppner & Grenander (1990). Using Parent's (2002) terminology, 672 these models fall perfectly under the particles category. The model devised by Vicsek et al. 673 (1995) is also known as the 'self-propelled particles' model, or SPP. Physicists embraced these 674 minimalist models and a number of subsequent studies have been published (see Czirók et al. 675 1997; Czirók & Vicsek 1999, 2000; Tu 2000; Li et al. 2007; Li & Xi 2008; Chaté et al. 2008; Gönci 676 et al. 2008; Huepe & Aldan 2008, for example). Recent field observations by Ballerini et al. 677 (2008a, b) and Cavagna et al. (2008a, b) seem to be making an impact in the physics community 678 and even physicists are starting to acknowledge the importance of inclusion of attractive-679 repulsive drives (Grégoire et al. 2003; Grégoire & Chaté 2004; Feder 2007). An additional result 680 of these field observations, is one that somewhat contradicts the approach commonly assumed 681 by flock flight models. These typically assume a fixed radius of interaction. Data obtained by 682 Ballerini et al. (2008a, b) and Cavagna et al. (2008a, b) seems, on the other hand, to suggest that 683 it is not the radius, but the number of influencing individuals, which remains constant. 684 Just as Kennedy & Eberhart (1995) incorporated AI elements into flight flock models to 685 devise PSO, other computer science studies applied AI algorithms to evolve the models 686 themselves. Reynolds (1993a, b), Zaera et al. (1996), and Spector et al. (2005), used genetic 687 programming, a technique for automatically creating computer programs that satisfy a specified 688 fitness criterion, to evolve the individual animat's rules, or in this case 'programs', which, when 689 the animats interacted, produced flocking behaviour. All previous models employed constants 690 like 'perception radius' (diameter of the sphere centred at the currently observed animat's

691 origin, by the use of which nearby neighbours are selected), 'weights' (typically the direction of 692 flight [and flight speed] of the currently observed animat is computed as a weighted sum of the 693 individual 'desired' flight directions that would meet the individual drives, respectively), etc. 694 Heppner & Grenander's (1990) approach was to modify these by hand and analyse the results. 695 The AI approach was to use evolutionary computing. Genetic algorithms were used to vary the 696 parameters to optimize the behaviour to a specified fitness criterion. Dimock & Selig (2003), for 697 example, used genetic algorithms on a modified Reynolds (1987) model to find parameters for 698 minimum power consumption in a flock of simulated birds. Wood & Ackland (2007), on the 699 other hand, using a Couzin et al. (2002) model, studied the evolution of group formation when 700 subjected to simulated predation and foraging. Their results replicate conventional evolutionary 701 behaviour—foraging animats prefer a narrower perception volume, while the hunted prefer a 702 wider one.

703 Couzin et al. (2002) and Couzin & Krause (2003) added the next level of sophistication in 704 flocking models. The substantial difference was not in the animats' drives, but in the perception 705 model, or when these drives were actually in effect. Whereas Heppner & Grenander (1990) used 706 one perception volume for all three drives, Reynolds (1987, 1999, 2004) three non-exclusive 707 perception volumes with biologically inspired limitations, Couzin et al. (2002) and Couzin & 708 Krause (2003) introduced a different approach; in their model there were three exclusive 709 perception volumes, or 'zones', using their terminology: 1) 'zone of repulsion', 2) 'zone of 710 orientation' and 3) 'zone of attraction'. If there were neighbours in the zone of repulsion, then 711 only the separation drive was active and the other two ignored. If, however, there were no 712 neighbours in it, the other two drives were averaged, but the animat attempted to match velocity only with the neighbours in the zone of orientation and attempted to stay close only to 713 714 the neighbours in the zone of attraction. Additionally, the zone of repulsion was modelled as a 715 sphere, whereas the other two were modelled as a sphere with a blind cone subtracted at the 716 animats' back. Couzin et al. (2002) considered what would happen to group movements if 717 individuals in the group modified their behavioural rules in response to experience with the

718 flock as a whole. More specifically, what would happen if the diameter of the zone of orientation 719 was variable, while keeping the zones of repulsion and attraction constant. They found that, as 720 the diameter of the zone of orientation increased, the group went from a loosely packed 721 stationary swarm, to a torus where individuals circle round their centre of mass and, finally, to a 722 parallel group moving in a common direction (see also Sumpter 2006). Further on they 723 discovered that the transitions were rapid, and as the diameter decreased, the collective 724 behaviour was different. They established that two completely different behavioural states can 725 exist for identical parameters, and that transition between behavioural states depends on the 726 previous history (structure) of the group, even though the individuals have no explicit 727 knowledge of what that history is. Consequently, they suggested that the system exhibits a form 728 of 'collective memory'. In a later study, Couzin et al. (2005) examined leadership and decision 729 making in animal groups on the move by giving knowledge of a preferred flight direction only to 730 a proportion of the simulated animals. The study revealed that the larger the group, the smaller 731 the proportion of informed individuals needed to guide the group, and that only a small proportion is required to achieve great accuracy. Several recent experimental studies (Biro et al. 732 733 2006; Codling et al. 2007; Dell'Ariccia et al. 2008) investigated the 'many-wrongs principle' in 734 pigeon homing and suggest that pigeons flying in a group have better navigational performance 735 than birds flying alone, but it is not clear whether the spatial organization of the flock is 736 significant in this observation.

737 Lebar Bajec et al. (2003a, b, 2005) and Lebar Bajec (2005) introduced the concept of fuzzy 738 logic to flocking models. The basic concept of the model remained the same; three drives and 739 perception modelled as a sphere with a blind cone removed from the back. But in previous 740 models, the animats would react to their surroundings in a 'crisp' way. For example, if we are 741 interested in two moving animats that are on a closing course with one another, there might be 742 some specific threshold distance at which they would deviate to avoid collision (e.g. when they 743 enter each other's zone of repulsion [Couzin et al. 2002]). Or, in a slightly more complex 744 example, there might be a gradient for different closing angles such that the animats would

745 deviate proportionately, but still in deterministic fashion depending on the closing angle. 746 However, with fuzzy logic, vague qualities like 'close' or 'far' rather than a specific distance or 747 angle can be used to describe the behavioural repertoire of the animat. In this fashion, a more 748 naturalistic type of behaviour can be produced. Indeed, Heppner & Grenander (1990) used a 749 single perception volume, Reynolds (1987, 1999, 2004) three overlapping perception volumes, 750 and Couzin et al. (2002) and Couzin & Krause (2003) advanced the model by introducing three 751 non-overlapping perception zones, the use of vague qualities enabled Lebar Bajec et al. (2005) 752 to produce a mixture of these approaches with partially overlapping perception zones. The issue 753 this model has, with respect to the others, is that it is two dimensional; animats can move left or 754 right, but not up or down. As real birds exist in three dimensions, a genuinely realistic 755 simulation needs to feature the third dimension. Moškon et al. (2007) expanded the fuzzy model 756 to account for foraging behaviour by including hunger as a drive. While doing so, they also 757 modelled foraging fields and landing and taking off from them; while this has not been achieved 758 by promoting the drives to work in three dimensions, they upgraded the model to pseudo 3D 759 nonetheless.

## 760 So, How do Birds Seem to Turn and Wheel Together?

761 In the 1970s, there was no conceptual alternative to a leadership model for producing 762 simultaneous or near-simultaneous turning movements in cluster flocks. With the advent of the 763 many models that treat flocks as collections of independently acting agents that produce turning 764 movements as the product of individual movement decisions, a viable alternative to leadership 765 models now exists, but such models 1) do not rule out the possibility that under certain 766 circumstances, particularly with small, or family flocks, leadership might still play a role in 767 cluster flock movements, and 2) do not provide evidence that birds use the same algorithms as 768 the models. Just as there may be several biological functions for line formations, it may be that 769 there are multiple mechanisms for producing cluster flock movements.

## 770 **CONCLUSION**

Advances in the understanding of the function and mechanisms of organized flight have been
strongly linked to the introduction of new techniques or technologies. Heppner (1997)
identified several areas that might be expected to produce such advances, but a decade later,
although it has been possible to refine and more closely define these needs, much still needs to
be done.

776	1.	Three dimensional simulations. Some of the existing simulations (Vicsek et al. 1995;
777		Lebar Bajec et al. 2005; Moškon et al. 2007; Nathan & Barbosa 2008), although
778		capable of producing realistic-appearing flocks on a computer screen, feature animats
779		that travel in a two dimensional universe. They may travel left or right, but not up or
780		down. As real birds exist in a 3D world, a genuinely realistic simulation would have to
781		feature the third dimension. Adding the additional dimension is not a trivial
782		programming task, but its accomplishment could be expected to pay large dividends.
783	2.	Non-homogeneous models. To date, flight flock models have assumed that flocks are
784		composed of identical subjects. In reality, there will be individual differences in age,
785		gender, sensitivity to hunger, health, and other factors that may well influence the
786		collective behaviour of the flock.
787	3.	Fast, cheap, field data acquisition. Cavagna et al.'s (2008a) technique for obtaining the
788		3D positions of thousands of birds in a flock has yielded remarkable results, but the
789		method requires custom-made synchronizing equipment for the cameras, skilled
790		operators, lengthy processing, and a fixed location. As a result, it is difficult to
791		compare species, conditions, or fine structure over time. The current generation of
792		digital still and video cameras offers the potential for both high resolution and a high
793		frame rate at a reasonable cost. Commercial wireless technology, such as that used to
794		simultaneously fire multiple remote flash units, offers the potential of synchronizing

795

796

two (or more) cameras in the field without the necessity for custom made synchronizing devices.

797 4. User-friendly simulations. The current generation of flocking simulations is primarily 798 designed to be used and manipulated by their designers, who may or may not be 799 familiar with the behaviour of animals in the field. The programs are not easily used 800 or modified by other users unfamiliar with programming. It would be very helpful if 801 future simulations came with a 'console', or control panel that would allow non-802 programmers to change the parameters or their values in the simulation, such as 803 preferred velocity, or attractiveness of feeding site, thus allowing field biologists to 804 examine the results of changing inputs to the program based on their field experience. 805 It might also be possible to set up 'detectors' in the program, as is done in 806 experimental particle physics, to allow many different combinations of parameters 807 and values to be run in sequence, and the program would flag interesting behaviours, 808 such as the appearance of a V, when they appear. For example, the Boston Museum of 809 Science in Massachusetts has a large public display called the 'Virtual Fishtank' 810 (Nearlife, Inc. 2001) that enables visitors to interactively change the behaviour of 811 individual fish in a 'school', and immediately see the change in the behaviour of the 812 school.

813 5. Metrics for 'truth testing'. Current simulations offer naturalistic appearing virtual 814 flocks, but it cannot be certain that real birds use the same algorithms employed in 815 the simulation. Ideally, one would produce a simulation of a particular species' 816 flocking behaviour, and use it to make predictions about the behaviour of the real flock, and then test those predictions in the field. To do this, one would have to have a 817 818 metric that could be derived from the simulation, and then measured in the field. For 819 example, some simulations produce flocks that apparently turn and wheel much like 820 real flocks. Perhaps 'turning and wheeling' could be quantified, such that one could 821 say that, for example, a flock of X number of birds of species Y will make a turn,

822defined as a departure of more than 20° from the mean direction exhibited in the823previous 5 s, every 8.2 s. If this variable were measurable in the field, it could then be824possible to refine the model to produce more accurate predictions. Successful825prediction would, of course, not be prima facie evidence that the algorithms in the real826and virtual worlds were the same, but would certainly provide stronger evidence than827a superficial, qualitative similarity. Dill et al. (1997) discussed this issue more828extensively.

829 The last 40 years have seen remarkable progress in the understanding of this intriguing and 830 aesthetically spectacular phenomenon. In addition to being a phenomenon worthy of 831 examination in its own right, the study of organized flight in birds has provided a model system 832 that has demonstrated utility in the study of crowd behaviour, bird strikes on aircraft, traffic 833 theory, complex systems, particle swarms, computer animation, and control of (remotely 834 piloted) autonomous aircraft. At this time, it is possible to foresee that with the assistance of 835 biologists, physicists, mathematicians and computer scientists working together, we will, before 836 long, truly be able to say how and why birds fly in organized groups.

#### 837 **ACKNOWLEDGEMENTS**

838 We sincerely thank Maja Lebar Bajec, Michael Byrne, Andrea Cavagna, Marjorie Heppner, Jim

839 Kennedy, Craig Reynolds, and Timothy Williams for reading early drafts of the manuscript. This

- 840 work was funded in part by the Slovenian Research Agency (ARRS) through the Pervasive
- 841 Computing research programme (P2-0395).

#### 842 **REFERENCES**

- AMD 2008. ATI Radeon HD 4800 series real-time demos. (accessed February 2009)
- 844 http://developer.amd.com/documentation/videos/pages/froblins.aspx
- 845 Andersson, M. & Wallander, J. 2004. Kin selection and reciprocity in flight formation?
- 846 *Behavioral Ecology*, **15**(1), 158–162. doi: 10.1093/bheco/arg109.

- Badgerow, J. P. 1988. An analysis of function in the formation flight of Canada Geese. *The Auk*,
  105(4), 749–755.
- 849 **Badgerow, J. P. & Hainsworth, F. R.** 1981. Energy savings through formation flight? A
- reexamination of the Vee formation. *Journal of Theoretical Biology*, **93**(1), 41–52.
- doi: 10.1016/0022-5193(81)90055-2.
- 852 Ballerini, M., Cabibbo, N., Candelier, R., Cavagna, A., Cisbani, E., Giardina, I., Lecomte, V.,
- 853 Orlandi, A., Parisi, G., Procaccini, A., Viale, M. & Zdravkovic, V. 2008a. Interaction ruling
- animal collective behavior depends on topological rather than metric distance: Evidence from
- a field study. *Proceedings of the National Academy of Science*, **105**(4), 1232–1237.
- doi: 10.1073/pnas.0711437105.
- 857 Ballerini, M., Cabibbo, N., Candelier, R., Cavagna, A., Cisbani, E., Giardina, I., Orlandi, A.,
- 858 **Parisi, G., Procaccini, A., Viale, M. & Zdravkovic, V.** 2008b. Empirical investigation of
- starling flocks: A benchmark study in collective animal behaviour. *Animal Behaviour*, **76**(1),
- 860 201–215. doi: 10.1016/j.anbehav.2008.02.004.
- Beer, J. R. 1958. The composition of bird flocks. *The Flicker*, **30**, 78–83.
- Biro, D., Sumpter, D. J. T., Meade, J. & Guilford, T. 2006. From compromise to leadership in
   pigeon homing. *Current Biology*, 16(21), 2123–2128. doi: 10.1016/j.cub.2006.08.087.
- 864 Brogan, D. C., Metoyer, R. A. & Hodgins, J. K. 1998. Dynamically simulated characters in
- virtual environments. *Computer Graphics and Applications*, **18**(5), 58–69.
- doi: 10.1109/38.708561.
- 867 Cavagna, A., Giardina, I., Orlandi, A., Parisi, G. & Procaccini, A. 2008a. The STARFLAG
- 868 handbook on collective animal behaviour: 2. Three-dimensional analysis. *Animal Behaviour*,
- 869 **76**(1), 237–248. doi: 10.1016/j.anbehav.2008.02.003.

- 870 Cavagna, A., Giardina, I., Orlandi, A., Parisi, G., Procaccini, A., Viale, M. & Zdravkovic, V.
- 871 2008b. The STARFLAG handbook on collective animal behaviour: 1. Empirical methods.
- 872 *Animal Behaviour*, **76**(1), 217–236. doi: 10.1016/j.anbehav.2008.02.002.
- 873 Chaté, H., Ginelli, F., Grégoire, G. & Raynaud, F. 2008. Collective motion of self-propelled
- particles interacting without cohesion. *Physical Review E*, **77**(4), 046113.
- doi: 10.1103/PhysRevE.77.046113.
- 876 **Codling, E. A., Pitchford, J. W. & Simpson, S. D.** 2007. Group navigation and the 'many-wrongs
- principle' in models of animal movement. *Ecology*, **88**(7), 1864–1870.
- doi: 10.1890/06-0854.1.
- 879 Cone, Jr, C. R. 1968. The aerodynamics of flapping birdflight. Special Scientific Report 52,
- 880 Gloucester Point, VA: Virginia Institute of Marine Science. 133 p.
- 881 **Couzin, I. D. & Krause, J.** 2003. Self-organization and collective behavior in vertebrates.
- 882 *Advances in the Study of Behavior*, **32**, 1–75. doi: 10.1016/S0065-3454(03)01001-5.
- 883 Couzin, I. D., Krause, J., Franks, N. R. & Levin, S. A. 2005. Effective leadership and decision-
- making in animal groups on the move. *Nature*, **433**(7025), 513–516.
- doi: 10.1038/nature03236.
- 886 Couzin, I. D., Krause, J., James, R., Ruxton, G. D. & Franks, N. R. 2002. Collective memory and
  887 spatial sorting in animal groups. *Journal of Theoretical Biology*, 218(1), 1–11.
- doi: 10.1006/jtbi.2002.3065.
- 889 Crook, J. H. 1965. Adaptive significance of avian social organization. *Symposia of the Zoological*890 *Society of London*, 14, 181–218.
- 891 Cutts, C. J. & Speakman, J. R. 1994. Energy savings in formation flight of Pink-footed Geese.
- 892 *Journal of Experimental Biology*, **189**(1), 251–261.

- 893 Czirók, A., Stanley, H. E. & Vicsek, T. 1997. Spontaneously ordered motion of self-propelled
- particles. *Journal of Physics A: Mathematical and General*, **30**(5), 1375–1385.

doi: 10.1088/0305-4470/30/5/009.

- 896 Czirók, A. & Vicsek, T. 1999. Collective motion. In: *Statistical Mechanics of Biocomplexity*, Vol.
- 897 527/1999 of Lecture Notes in Physics (Ed. by D. Reguera, J. M. G. Vilar & J. M. Rubí), pp.
- 898 152–164. Berlin: Springer. doi: 10.1007/BFb0105002.
- Czirók, A. & Vicsek, T. 2000. Collective behavior of interacting self-propelled particles. *Physica A*, 281(1), 17–29. doi: 10.1016/S0378-4371(00)00013-3.
- 901 Davis, J. M. 1980. The coordinated aerobatics of Dunlin flocks. *Animal Behaviour*, **28**(3),
- 902 668-673. doi: 10.1016/S0003-3472(80)80127-8.
- 903 Dell'Ariccia, G., Dell'Omo, G., Wolfer, D. P. & Lipp, H.-P. 2008. Flock flying improves pigeons'
- homing: GPS track analysis of individual flyers versus small groups. *Animal Behaviour*, **76**(4),
- 905 1165–1172. doi: 10.1016/j.anbehav.2008.05.022.
- 906 Dill, L. M., Holling, C. S. & Palmer, L. H. 1997. Predicting the three-dimensional structure of
- animal aggregations from functional considerations: The role of information. In: *Animal*
- 908 *Groups in Three Dimensions* (Ed. by J. K. Parrish & W. M. Hamner), pp. 207–224. New York:
- 909 Cambridge University Press.
- 910 **Dimock, G. A. & Selig, M. S.** 2003. The aerodynamic benefits of self-organization in bird flocks.
- 911 In: Proceedings of the 41st AIAA Aerospace Sciences Meeting and Exhibit, Reno, NV. AIAA 2003-
- 912 0608. Reston, VA: AIAA.
- 913 Driver, P. M. & Humphries, D. A. 1970. Protean displays as inducers of conflict. *Nature*,
- 914 **226**(5249), 968–969. doi: 10.1038/226968a0.
- 915 **Emlen, J. T.** 1952. Flocking behavior in birds. *The Auk*, **69**(2), 160–170.

- 916 Engelbrecht, A. P. 2006. Fundamentals of Computational Swarm Intelligence. Chichester, UK:
  917 John Wiley & Sons Ltd.
- 918 Farkas, I., Helbing, D. & Vicsek, T. 2002. Social behaviour: Mexican waves in an excitable
  919 medium. *Nature*, 419(6903), 131–132. doi: 10.1038/419131a.
- 920 **Feder, T.** 2007. Statistical physics is for the birds. *Physics Today*, **60**(10), 28–30.
- 921 doi: 10.1063/1.2800090.
- Flake, G. W. 2000. The Computational Beauty of Nature: Computer Explorations of Fractals,
  Chaos, Complex Systems, and Adaptation. Cambridge, MA: MIT Press.
- **Franzisket, L.** 1951. Über die ursachen des formationsfluges. *Vogelwarte*, **16**, 48–55.
- 925 Gardner, M. 1970. Mathematical games: The fantastic combinations of John Conway's new
- solitaire game 'life'. *Scientific American*, **223**(4), 120–123.
- 927 Gerard, R. W. 1943. Synchrony in flock wheeling. *Science*, 97(2511), 160–161.
- 928 doi: 10.1126/science.97.2511.160.
- 929 Gönci, B., Nagy, M. & Vicsek, T. 2008. Phase transition in the scalar noise model of collective
- 930 motion in three dimensions. *The European Physical Journal Special Topics*, **157**(5), 53–59.
- 931 doi: 10.1140/epjst/e2008-00630-2.
- **Gould, L. L.** 1972. Formation flight in the Canada Goose (*Branta c. canadensis*). MSc thesis,
- 933 University of Rhode Island, Kingston, RI.
- 934 Gould, L. L. & Heppner, F. H. 1974. The Vee formation of Canada Geese. *The Auk*, 91(3),
  935 494–506.
- 936 Grégoire, G. & Chaté, H. 2004. Onset of collective and cohesive motion. *Physical Review Letters*,
- 937 **92**(2), 025702. doi: 10.1103/PhysRevLett.92.025702.

- Grégoire, G., Chaté, H. & Tu, Y. 2003. Moving and staying together without a leader. *Physica D*,
  181(3-4), 157–170. doi: 10.1016/S0167-2789(03)00102-7.
- 940 Gschwind, M., Hofstee, H. P., Flachs, B., Hopkins, M., Watanabe, Y. & Yamazaki, T. 2006.
- 941 Synergistic processing in Cell's multicore architecture. *IEEE Micro*, **26**(2), 10–24.
- 942 doi: 10.1109/MM.2006.41.
- 943 Haffner, J. 1977. A flapping wing model for avian formation flight. MSc thesis, University of
  944 Rhode Island, Kingston, RI.
- 945 Hainsworth, F. R. 1987. Precision and dynamics of positioning by Canada Geese flying in
- formation. *Journal of Experimental Biology*, **128**(1), 445–462.
- Hainsworth, F. R. 1988. Induced drag savings from ground effect and formation flight in brown
  pelicans. *Journal of Experimental Biology*, 135(1), 431–444.
- 949 Hamilton, III, W. J. 1967. Social aspects of bird orientation mechanisms. In: Animal Orientation
- 950 *and Migration* (Ed. by R. M. Storm), pp. 57–71. Corvallis, OR: Oregon State University Press.
- 951 Hamilton, III, W. J., Gilbert, W. M., Heppner, F. H. & Planck, R. J. 1967. Starling roost dispersal
- and a hypothetical mechanism regulating rhythmical animal movement to and from dispersal
- 953 centers. *Ecology*, **48**(5), 825–833.
- Helbing, D. & Molnár, P. 1995. Social force model for pedestrian dynamics. *Physical Review E*,
- 955 **51**(5), 4282–4286. doi: 10.1103/PhysRevE.51.4282.
- 956 **Heppner, F. H.** 1974. Avian flight formations. *Bird-Banding*, **45**(2), 160–169.
- 957 Heppner, F. H. 1997. Three-dimensional structure and dynamics of bird flocks. In: Animal
- 958 *Groups in Three Dimensions* (Ed. by J. K. Parrish & W. M. Hamner), pp. 68–89. New York:
- 959 Cambridge University Press.

- 960 Heppner, F. H., Convissar, J. L., Moonan, D. E. & Anderson, J. G. T. 1985. Visual angle and
- 961 formation flight in Canada Geese (*Branta canadensis*). *The Auk*, **102**(1), 195–198.

962 Heppner, F. H. & Grenander, U. 1990. A stochastic nonlinear model for coordinated bird flocks.

- 963 In: *The Ubiquity of Chaos* (Ed. by S. Krasner), pp. 233–238. Washington DC: American
- 964 Association for the Advancement of Science.
- 965 Heppner, F. H. & Haffner, J. D. 1974. Communication in bird flocks: An electro-magnetic model.
- 966 In: Biological and Clinical Effects of Low-Frequency Magnetic and Electric Fields (Ed. by J. G.
- 967 Llaurado, A. Sances & J. H. Battocletti), pp. 147–162. Springfield, IL: Charles C. Thomas.
- 968 Higdon, J. J. L. & Corrsin, S. 1978. Induced drag of a bird flock. *The American Naturalist*,
- 969 **112**(986), 727–744. doi: 10.1086/283314.
- Hill, M. L. 1972. Introducing electrostatic auto pilots. *AIAA Astronautic Journal of Aeronautics*,
  10(11), 22.
- Hochbaum, H. A. 1955. *Travels and traditions of waterfowl*. Minneapolis, MN: University of
  Minnesota Press.
- 974 Huepe, C. & Aldan, M. 2008. New tools for characterizing swarming systems: A comparison of
- 975 minimal models. *Physica A*, **387**(12), 2809–2822. doi: 10.1016/j.physa.2008.01.081.
- 976 Hummel, D. 1983. Aerodynamic aspects of formation flight in birds. *Journal of Theoretical*
- 977 *Biology*, **104**(3), 321–347. doi: 10.1016/0022-5193(83)90110-8.
- 978 Kennedy, J. & Eberhart, R. C. 1995. Particle swarm optimization. In: *Proceedings of the IEEE*
- 979 *International Conference on Neural Networks, Perth, WA*, Vol. 4, pp. 1942–1948. New York:
- 980 IEEE. doi: 10.1109/ICNN.1995.488968.
- 981 Kennedy, J., Eberhart, R. C. & Shi, Y. 2001. *Swarm Intelligence*. San Francisco, CA: Morgan
  982 Kaufmann Publishers.

- 983 Khanna, G. 2007. *PlayStation3 gravity grid*. (accessed February 2009)
- 984 http://gravity.phy.umassd.edu/ps3.html
- 985 Krebs, J. R. & Barnard, C. J. 1980. Comments on the function of flocking in birds. In:
- 986 Proceedings of the XVII International Ornithological Congress (Symposium on Flocking
- 987 *Behavior*), *Berlin, Germany*, Vol. 2, pp. 795–799. Berlin, Germany: International Ornithological
  988 Congress.
- 989 Kuhn, T. 1962. *The Structure of Scientific Revolutions*. Chicago, IL: University of Chicago Press.
- 990 Lebar Bajec, I. 2005. Fuzzy model for a computer simulation of bird flocking. PhD thesis,
- 991 Faculty of Computer and Information Science, University of Ljubljana, Slovenia.
- 992 Lebar Bajec, I., Zimic, N. & Mraz, M. 2003a. Boids with a fuzzy way of thinking. In: *Proceedings*
- 993 *of Artificial Intelligence and Soft Computing (ASC 2003)*, Banff, Canada (Ed. by H. Leung), pp.
- 994 58–62. Anaheim: ACTA Press.
- 995 Lebar Bajec, I., Zimic, N. & Mraz, M. 2003b. Fuzzifying the thoughts of animats. In: *Fuzzy Sets*
- 996 and Systems: Proceedings of the 10th International Fuzzy Systems Association World Congress
- 997 (IFSA 2003), Istanbul, Turkey, Vol. 2715 of Lecture Notes in Artificial Intelligence (Ed. by T.
- Bilgiç, B. De Baets & O. Kaynak), pp. 195–202. Berlin: Springer-Verlag.
- 999 doi: 10.1007/3-540-44967-1\_23.
- 1000 **Lebar Bajec, I., Zimic, N. & Mraz, M.** 2005. Simulating flocks on the wing: The fuzzy approach.
- 1001 *Journal of Theoretical Biology*, **233**(2), 199–220. doi: 10.1016/j.jtbi.2004.10.003.
- 1002 Li, X., Cai, Z. & Xiao, J. 2007. Biologically inspired flocking of swarms with dynamic topology in
- 1003 uniform environments. In: *Proceedings of the 46th IEEE Conference on Decision and Control,*
- 1004 New Orleans, LA, pp. 2522–2527. Piscataway, NJ: IEEE. doi: 10.1109/CDC.2007.4434572.

- 1005 Li, X. & Xi, Y. 2008. Flocking of multi-agent dynamic systems with guaranteed group
- 1006 connectivity. *Journal of Systems Science and Complexity*, **21**(3), 337–346.
- 1007 doi: 10.1007/s11424-008-9117-7.
- 1008 Lissaman, P. B. S. & Schollenberger, C. A. 1970. Formation flight of birds. Science, 168(3934),
- 1009 1003-1005. doi: 10.1126/science.168.3934.1003.
- 1010 Lorek, H. & White, M. 1993. Parallel bird flocking simulation. In: Proceedings of BCS
- 1011 International Conference on Parallel Processing for Graphics and Scientific Visualization,
- 1012 Edinbourgh, Scotland, pp. 1-13. London, UK: British Computer Society.
- 1013 (accessed February 2009) http://citeseer.ist.psu.edu/53206.html
- 1014 Macgill, J. 2000. Using flocks to drive a geographical analysis engine. In: Artificial Life VII (Ed. by
- M. A. Bedau, J. S. McCaskill, N. H. Packard & S. Rasmussen), pp. 446–453. Cambridge, MA: MIT
  Press.
- 1017 **Macgill, J. & Openshaw, S.** 1998. The use of flocks to drive a geographic analysis machine. In:
- 1018 *Proceedings of the 3rd International Conference on GeoComputation*, Bristol, United Kingdom.
- 1019 GeoComputation CD-ROM. (accessed December 2008)
- 1020 http://www.geocomputation.org/1998/24/gc24\_01.htm
- 1021 Major, P. F. & Dill, L. M. 1978. The three-dimensional structure of airborne bird flocks.
- 1022 *Behavioral Ecology and Sociobiology*, **4**(2), 111–122. doi: 10.1007/BF00354974.
- 1023 Massive 2008. *Massive software artificial life solutions*. (accessed February 2009)
- 1024 http://www.massivesoftware.com
- 1025 May, R. M. 1979. Flight formations in geese and other birds. *Nature*, **282**(5741), 778–780.
- 1026 doi: 10.1038/282778a0.

1027	Moškon, M., Heppner, F. H., Mraz, M., Zimic, N. & Lebar Bajec, I. 2007. Fuzzy model of bird
1028	flock foraging behavior. In: Proceedings of the 6th EUROSIM Congress on Modelling and
1029	Simulation, Ljubljana, Slovenia, Vol. 2 (Ed. by B. Zupančič, R. Karba & S. Blažič), pp. 1–6.
1030	Vienna, Austria: ARGESIM.
1031	Nachtigall, W. 1970. Phasenbeziehungen der flügelschläge von gänsen während des
1032	verbandflugs in keilformation. <i>Journal of Comparative Physiology A</i> , <b>67</b> (4), 414–422.
1033	doi: 10.1007/BF00297909.
1034	Nathan, A. & Barbosa, V. C. 2008. V-like formations in flocks of artificial birds. Artificial Life,
1035	<b>14</b> (2), 179–188. doi: 10.1162/artl.2008.14.2.179.
1036	Nearlife, Inc. 2001. Virtual fishtank. (accessed February 2009)

- 1037 http://www.virtualfishtank.com
- 1038 Nichols, J. T. 1931. Notes on the flocking of shore birds. *The Auk*, **48**(2), 181–185.
- **NVIDIA** 2007. *High performance computing (HPC) NVIDIA Tesla many core parallel*
- 1040 *supercomputing*. (accessed February 2009)
- 1041 http://www.nvidia.com/object/tesla\_computing\_solutions.html
- 1042 **Odell, J.** April 1998. Agents and beyond: A flock is not a bird. *Distributed Computing*, 52–54.
- 1043 **Okubo, A.** 1986. Dynamical aspects of animal grouping: Swarms, schools, flocks, and herds.
- 1044 *Advances in Biophysics*, **22**, 1–94. doi: 10.1016/0065-227X(86)90003-1.
- 1045 **O'Malley, J. B. E. & Evans, R. M.** 1982a. Flock formation in white pelicans. *Canadian Journal of*
- 1046 *Zoology*, **60**(5), 1024–1031. doi: 10.1139/z82-143.
- 1047 O'Malley, J. B. E. & Evans, R. M. 1982b. Structure and behavior of white pelican formation
- 1048 flocks. *Canadian Journal of Zoology*, **60**(6), 1388–1396. doi: 10.1139/z82-187.

- Parent, R. 2002. *Computer Animation: Algorithms and Techniques*. San Francisco, CA: Morgan
  Kaufmann Publishers.
- Partridge, B. L., Pitcher, T., Cullen, J. M. & Wilson, J. 1980. The three-dimensional structure of
   fish schools. *Behavioral Ecology and Sociobiology*, 6(4), 277–288. doi: 10.1007/BF00292770.
- 1053 **Pennycuick, C. J., Alerstam, T. & Hedenstrom, A.** 1997. A new low-turbulence wind tunnel for
- bird flight experiments at Lund University, Sweden. *Journal of Experimental Biology*, 200(10),
  1055 1441–1449.
- 1056 **Penrose, H.** 1949. *I flew with the birds*. London, UK: Country Life Ltd.
- 1057 **Pomeroy, H.** 1983. Three-dimensional analysis of turning within airborne bird flocks. PhD
- 1058 thesis, University of Rhode Island, Kingston, RI.
- 1059 **Pomeroy, H. & Heppner, F. H.** 1977. Laboratory determination of startle reaction time in the
- 1060 European Starling (*Sternus vulgaris*). *Animal Behaviour*, **25**(3), 720–725.
- 1061 doi: 10.1016/0003-3472(77)90121-X.
- 1062 **Pomeroy, H. & Heppner, F. H.** 1992. Structure of turning in airborne Rock Dove (*Columba livia*)
- 1063 flocks. *The Auk*, **109**(2), 256–267.
- Potts, W. K. 1984. The chorus-line hypothesis of manoeuvre coordination in avian flocks.
   *Nature*, **309**(5966), 344–345. doi: 10.1038/309344a0.
- 1066 Rackham, H. 1933. *Pliny's Natural History*. Vol. X:XXXII. Cambridge, MA: Harvard University
   1067 Press.
- 1068 **Rayner, J. M. V.** 1995. Dynamics of the vortex wakes of flying and swimming vertebrates. In:
- 1069 *Biological Fluid Dynamics*, Vol. 49 of Symposia of the Society for Experimental Biology (Ed. by
- 1070 C. P. Ellington & T. J. Pedley), pp. 131–155. Cambridge: The Company of Biologists Ltd.

- 1071 **Reynolds, C. W.** 1987. Flocks, herds, and schools: A distributed behavioral model. *Computer* 1072 *Graphics*, **21**(4), 25–34. doi: 10.1145/37402.37406.
- 1073 **Reynolds, C. W.** 1993a. An evolved, vision-based behavioral model of coordinated group
- 1074 motion. In: From Animals to Animats 2: Proceedings of the Second International Conference on
- 1075 *Simulation of Adaptive Behavior (SAB92)* (Ed. by J.-A. Meyer, H. L. Roitblat & S. W. Wilson), pp.
- 1076 384–392. Cambridge, MA: MIT Press.
- 1077 **Reynolds, C. W.** 1993b. An evolved, vision-based model of obstacle avoidance behavior. In:
- 1078 *Artificial Life III*, Vol. XVI of Santa Fe Institute Studies in the Science of Complexity (Ed. by C. G.
- 1079 Langton), pp. 327–346. Redwood City, CA: Addison-Wesley.
- 1080 **Reynolds, C. W.** 1999. Steering behaviors for autonomous characters. In: *Proceedings of GDC*
- 1081 *1999*, San Jose, CA, pp. 763–782. San Francisco, CA: Miller Freeman Game Group.
- 1082 (accessed February 2009) http://www.red3d.com/cwr/papers/1999/gdc99steer.html
- 1083 **Reynolds, C. W.** 2004. *Opensteer library*. (accessed February 2009)
- 1084 http://opensteer.sourceforge.net
- 1085 **Reynolds, C. W.** 2006. Big fast crowds on PS3. In: Sandbox '06: Proceedings of the 2006 ACM
- 1086 *SIGGRAPH Symposium on Videogames*, Boston, MA, pp. 113–121. New York, NY: ACM.
- 1087 doi: 10.1145/1183316.1183333.
- 1088 **Rhine, J. B.** 1983. *Extra-sensory Perception*. Boston, MA: Branden Books.
- 1089 Seiler, P., Pant, A. & Hedrick, J. K. 2002. Analysis of bird formations. In: Proceedings of 41st
- 1090 *IEEE Conference on Decision and Control*, Las Vegas, NV, Vol. 1, pp. 118–123. Piscataway, NJ:
- 1091 IEEE. doi: 10.1109/CDC.2002.1184478.
- 1092 Seiler, P., Pant, A. & Hedrick, J. K. 2003. A systems interpretation for observations of bird V-
- 1093 formations. *Journal of Theoretical Biology*, **221**(2), 279–287. doi: 10.1006/jtbi.2003.3191.

1094 Selous, E. 1931. *Thought-transference (or what?) in birds*. London, UK: Constable & Co.

- 1095 Shopf, J., Barczak, J., Oat, C. & Tatarchuk, N. 2008. March of the Froblins: Simulation and
- 1096 rendering massive crowds of intelligent and detailed creatures on GPU. In: *SIGGRAPH '08:*
- 1097 ACM SIGGRAPH 2008 classes, Los Angeles, CA, pp. 52–101. New York, NY, USA: ACM.
- 1098 doi: 10.1145/1404435.1404439.
- 1099 Sijbers, J. & Batenburg, J. 2008. FASTRA GPU SuperPC. (accessed February 2009)
- 1100 http://fastra.ua.ac.be
- 1101 Speakman, J. R. & Banks, D. 1998. The function of flight formation in Greylag Geese Anser
- 1102 *anser*; energy saving or orientation? *Ibis*, **140**(2), 280–287.
- 1103 doi: 10.1111/j.1474-919X.1998.tb04390.x.
- Spector, L., Klein, J., Perry, C. & Feinstein, M. 2005. Emergence of collective behavior in
   evolving populations of flying agents. *Genetic Programming and Evolvable Machines*, 6(1),
- 1106 111-125. doi: 10.1007/s10710-005-7620-3.
- 1107 Späni, D., Arras, M., König, B. & Rülicke, T. 2003. Higher heart rate of laboratory mice housed
- individually vs in pairs. *Laboratory Animals*, **37**(1), 54–62.
- doi: 10.1258/002367703762226692.
- 1110 Sumpter, D. J. T. 2006. The principles of collective animal behaviour. *Philosophical Transactions*
- 1111 *of the Royal Society B*, **361**(1465), 5–22. doi: 10.1098/rstb.2005.1733.
- 1112 **Tinbergen, N.** 1953. *Social behavior in animals*. London, UK: Methuen.
- 1113 **Toner, J. & Tu, Y.** 1995. Long-range order in a two-dimensional dynamical *XY* model: How birds
- 1114 fly together. *Physical Review Letters*, **75**(23), 4326–4329. doi: 10.1103/PhysRevLett.75.4326.
- 1115 **Toner, J. & Tu, Y.** 1998. Flocks, herds, and schools: A quantitative theory of flocking. *Physical*
- 1116 *Review E*, **58**(4), 4828–4858. doi: 10.1103/PhysRevE.58.4828.

- 1117 **Tu, Y.** 2000. Phases and phase transitions in flocking systems. *Physica A*, **281**(1–4), 30–40.
- 1118 doi: 10.1016/S0378-4371(00)00017-0.
- 1119 Vicsek, T., Czirók, A., Ben-Jacob, E., Cohen, I. & Shochet, O. 1995. Novel type of phase
- transition in a system of self-driven particles. *Physical Review Letters*, **75**(6), 1226–1229.
- 1121 doi: 10.1103/PhysRevLett.75.1226.
- **Vine, I.** 1971. Risk of visual detection and pursuit by a predator and the selective advantage of
- 1123 flocking behaviour. *Journal of Theoretical Biology*, **30**(2), 405–422.
- 1124 doi: 10.1016/0022-5193(71)90061-0.
- 1125 von Holst, E. 1952. Diskussionsbemerkung. *Journal für Ornithologie*, **93**(2), 191.
- 1126 Warnke, U. 1984. Avian flight formation with the aid of electromagnetic forces: A new theory
- for the formation alignment of migrating birds. *Electromagnetic Biology and Medicine*, **3**(3),
- 1128 493–508. doi: 10.3109/15368378409027710.
- 1129 Watts, J. M. 1998. Animats: Computer-simulated animals in behavioral research. *Journal of*
- 1130 *Animal Science*, **76**(10), 2596–2604.
- 1131 Weimerskirch, H., Martin, J., Clerquin, Y., Alexandre, P. & Jiraskova, S. 2001. Energy saving
- 1132 in flight formation. *Nature*, **413**(6857), 697–698. doi: 10.1038/35099670.
- 1133 Wieselsberger, C. 1914. Beitrag zur erklärung des winkelfluges einiger zugvögel. Zeitshrift
- 1134 *FlugTechnologie MotorLuft*, **5**, 225–229.
- 1135 Williams, T. C., Klonowski, T. J. & Berkeley, P. 1976. Angle of Canada Goose V flight formation
- 1136 measured by radar. *The Auk*, **93**(3), 554–559.
- 1137 Willis, D. J., Peraire, J. & Breuer, K. S. 2007. A computational investigation of bio-inspired
- 1138 formation flight and ground effect. In: *Proceedings of the 25th AIAA Applied Aerodynamics*
- 1139 *Conference,* Miami, FL, AIAA 2007-4182. Reston, VA: AIAA.

- 1140 Wilson, D. S. & Wilson, E. O. 2007. Rethinking the theoretical foundation of sociobiology. *The*
- 1141 *Quarterly Review of Biology*, **82**(4), 327–348. doi: 10.1086/522809.
- 1142 **Wilson, S. W.** 1985. Knowledge growth in an artificial animal. In: *Proceedings of the 1st*
- 1143 International Conference on Genetic Algorithms (Ed. by J. J. Grefenstette), pp. 16–23. Hillsdale,
- 1144 NJ: Lawrence Erlbaum Associates.
- 1145 **Wood, A. J. & Ackland, G. J.** 2007. Evolving the selfish herd: Emergence of distinct aggregating
- strategies in an individual-based model. *Proceedings of the Royal Society B*, **274**(1618),
- 1147 1637–1642. doi: 10.1098/rspb.2007.0306.
- 1148 Wynne-Edwards, V. C. 1962. Animal dispersion in relation to social behaviour. Edinburgh, UK:
  1149 Oliver & Boyd.
- 1150 **Zaera, N., Cliff, D. & Bruten, J.** 1996. (Not) evolving collective behaviours in synthetic fish. In:
- 1151 From Animals to Animats 4: Proceedings of the Fourth International Conference on Simulation
- 1152 *of Adaptive Behavior*, Cape Cod, MA (Ed. by P. Maes, M. J. Matarić, J.-A. Meyer, J. Pollack & S. W.
- 1153 Wilson), pp. 635–644. Cambridge, MA: MIT Press.







B) Cluster formation

- 1154 **Figure 1**. A) Line formation of Snow Geese, *Chen hyperborea*. B) Cluster formation of European
- 1155 Starlings, *Sternus vulgaris*, over Rome (© 2009 STARFLAG project, INFM-CNR).



A) Newtonian lift



B) Bernoulli lift

- 1156 **Figure 2.** Lift is generated in two principal ways. A) Air is deflected downward when there is a
- 1157 positive angle of attack between a wing and the relative wind. This deflection produces a
- 1158 reactive 'Newtonian lift' force. B) When air moves faster over the top of the wing than the
- bottom, a reduced pressure area is created on the top of the wing, generating 'Bernoulli lift'.



A) Top view



B) Front view

- 1160 **Figure 3.** Air streams off of a bird's wingtip as a horizontal vortex that has a rising and falling
- 1161 component. If the wingtip of a following bird were positioned in the rising component of the
- 1162 vortex generated by a preceding bird, some of the energy lost by that bird into the tip vortex, as
- 1163 a product of generating lift, might be recaptured by a following bird.