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# Perilous state of critically endangered Northwest African cheetah (Acinonyx jubatus hecki) across the Sudano-Sahel

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#### Keywords

Acinonyx jubatus hecki, human-wildlife conflict; Pendjari; Zakouma; Siniaka Minia; spatially explicit capture-recapture; transboundary conservation; cheetah.

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#### **Abstract**

Northwest African cheetah populations have declined precipitously, with expert opinion estimating that <420 individuals persist across parts of Algeria, Benin, Burkina Faso, Chad, Niger and Mali. However, no reliable density estimates exist in the remaining subspecies strongholds throughout the Sudano-Sahel Zone, including the W-Arly-Pendjari Complex and Greater Zakouma Ecosystem within the Bahr/Salamat landscape. Camera trap surveys were combined with spatially explicit capture-recapture methodologies in both regions to estimate the cheetah density and detectable demographic composition of these populations. Following 15 429 camera trap nights, we detected nine individuals during the dry season and four individuals during the wet season in Pendjari (2021), nine individuals (dry season; 2023) in Zakouma and none in Siniaka Minia. Cheetah densities were thus estimated at 0.17-0.24 and 0.37 cheetah per 100 km<sup>2</sup> in Pendjari and Zakouma, respectively. While marginally higher than predicted, such low-density estimates are concerning in the last remaining habitats harbouring this critically endangered subspecies. Considering the substantial contraction of regional cheetah distribution, we estimate an overall population size of  $68 \pm 29$ individuals across the studied areas. These novel estimates are among the lowest formally determined densities throughout cheetah range in Africa, where a high frequency of people and livestock detected on camera traps highlight the ongoing risks to large carnivores in these protected areas. Subsequent management recommendations include implementation of the established regional conservation strategies that encompass the distributional range of these cheetah, continuous monitoring of populations, genetic analyses to inform management, curbing illegal trade and increasing international awareness around the plight of the subspecies.

# **Highlights**

- Critically endangered Northwest African cheetah populations are understudied.
- Remaining populations of the subspecies survive in only three core areas of the Sudano-Sahelian Zone.
- SECR-based density estimation was applied to the stronghold habitats in Sudano-Sahelian Zone.
- Densities were among the lowest recorded across the global range emphasizing their vulnerability.
- Northwest African cheetah populations are likely smaller than what is generally perceived.

#### Introduction

Large carnivores are among the most globally threatened species given their sensitivity to anthropogenic impacts,

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particularly habitat loss and fragmentation (Woodroffe, 2000; Ripple et al., 2014). The cheetah (Acinonyx jubatus) is especially vulnerable, with the smallest global population among large carnivores, comprising approximately 6500 mature individuals across their African and Asian range (Durant et al., 2017, 2022). Despite their vulnerable conservation status (Durant et al., 2022), most population estimates are based on expert opinion, rather than systematic population estimation surveys. For instance, no reliable occurance data exist for at least 40% of historical cheetah range (IUCN/SSC, 2012), where, in Africa, <40% of cheetah reside within protected areas (PAs), 87% of which are transboundary, requiring international cooperation and coordination to effectively manage PAs which span across these national borders (Durant et al., 2017). Moreover, in many parts of cheetah range, armed conflict and political instability prevent site access for local and international research which often limits the international collaborative support required for repeated transboundary population surveys, particularly across the Sudano-Sahelian Zone (Brito et al., 2018; Farhadinia et al., 2020). A lack of such reliable large-scale data is an urgent concern for Northwest African cheetah (A. j. hecki) which is considered 'Critically Endangered' by the IUCN Red List of Threatened Species with declining populations (Belbachir et al., 2015; Sillero-Zubiri et al., 2015) that may have severe consequences for the remaining genetic diversity of this species (Charruau et al., 2011; Farhadinia et al., 2017; Prost et al., 2022).

Northwest African cheetah are estimated to comprise <420 mature individuals, persisting within three known or suspected major subpopulations across the Sudano-Sahel and Sahara Zones (Durant et al., 2022; Blais et al., 2023), located between southern Algeria and Mali, parts of Termit in Niger, and the W-Arly-Pendjari (WAP) Complex linking Benin, Burkina Faso and Niger, as well as in the Greater Zakouma Ecosystem (GZE) in the Bahr/Salamat landscape of southern Chad and northern Central African Republic (Blais et al., 2023). This genetically distinct subspecies (Charruau et al., 2011; Prost et al., 2022) is believed to differ morphologically from other sub-Saharan cheetah, being physically smaller with shorter pale fur (Dragesco-Joffé, 1993). As it is not yet confirmed that the population in the GZE is the Northwest or Northeast (A. j. soemmerringi) African cheetah subspecies (Charruau et al., 2011; Prost et al., 2022), baseline population estimates would have significant implications for strategic conservation management across the region (Meißner et al., 2023). The only population surveys conducted for the subspecies were carried out in the Algerian Sahara, a region of extremely low productivity, where correspondingly low densities of one individual per 4000 km<sup>2</sup> were recorded (Belbachir et al., 2015; Sillero-Zubiri et al., 2015). There is no formal estimate for the subspecies in more productive savannah habitats which comprise a critical proportion of its distributional range (Belbachir et al., 2015; Sillero-Zubiri et al., 2015). Despite these differences, this subspecies of cheetah is among the least-studied and lacks active international-to-local support for the implementation of established range-wide conservation strategies.

Cheetah are a low-density, wide-ranging species with nomadic movement patterns and cryptic behaviour, which challenges robust population estimation (Belbachir et al., 2015; Becker et al., 2017; Linden et al., 2020). A variety of monitoring methods have been used to estimate cheetah population status with varying success, including long-term observation studies (Caro, 1994; Kelly, 2001; Durant, Kelly, & Caro, 2004; Durant et al., 2007), sign and spoor surveys (Funston et al., 2010; Boast & Houser, 2012), camera traps (Marnewick, Funston, & Karanth, 2008; Belbachir et al., 2015; Brassine & Parker, 2015; Broekhuis & Gopalaswamy, 2016), citizen science (Marnewick et al., 2014; Farhadinia et al., 2016) and detection-dogs (Becker et al., 2017). However, many of these approaches are site-specific, and there is a need for developing and testing a reliable and repeatable approach that can provide robust density estimates for remaining cheetah populations (Strampelli et al., 2021), especially in West and Central Africa (IUCN/SSC, 2012). As a result, robust density estimates and the contextual demographic structures of many extant cheetah populations are unknown throughout most of their global range (Table S1; Belbachir et al., 2015; Durant et al., 2017).

Reliable population estimates are essential for assessing the impact of conservation policy and management interventions aimed at addressing declining populations (Rogan et al., 2019). Spatially explicit capture-recapture (SECR) methods (Borchers & Efford, 2008) have enabled accurate and reliable estimates of density for species that are individually identifiable. Currently, SECR models are widely used to estimate the density of many species, including large carnivores (O'Brien & Kinnaird, 2011); Poilecot et al., 2010, by incorporating the spatial locations of animal captures into a unified model (Borchers & Efford, 2008; Royle et al., 2009). Integrating such spatial information allows for more accurate and informative estimates of animal density (Borchers & Efford, 2008), which have been successfully applied to other large felids including leopard (Panthera pardus; Farhadinia et al., 2019; Rogan et al., 2022; Briers-Louw et al., 2024), jaguar (P. onca; Boron et al., 2016; Harmsen, Foster, & Quigley, 2020) and tiger (P. tigris; Xiao et al., 2016; Ash et al., 2020; Phumanee et al., 2021).

As SECR-based density estimates require relatively consistent and broad resampling to obtain sufficient recaptures of individuals at multiple sites to determine a robust spatial scale parameter  $(\sigma)$  and meet the assumption of population closure (Sollmann et al., 2013; Wilton et al., 2014), such analyses are often challenging for small samples sizes, especially when few individuals (Sharma et al., 2014; Hearn et al., 2019) are infrequently detected (Gerber, Ivan, & Burnham, 2014; Alexander et al., 2015; Rostro-García et al., 2018). The spatial scale parameter,  $\sigma$ , represents the extent of an individual's movement and is crucial for understanding the decrease in detection probability as the distance from the home-range centre increases. Such limitations are common in the density estimation of large carnivores, such as cheetah, where relatively wide-ranging species with large home-range requirements often occur at low densities and may be subject to edge effects (Obbard, Howe, & Kyle, 2010; Farhadinia A. Shams et al.

et al., 2016; Rovero & Zimmermann, 2016). In these cases, it is essential to design the survey such that it optimizes the probability of repeated detections by considering the study duration, as well as the number and placement of cameras (i.e., detector array, Tobler & Powell, 2013; Wilton et al., 2014), where the extent of the detector array should be similar to or larger than the extent of individual movement (Efford & Fewster, 2013; Wilton et al., 2014) and model accuracy may be improved through a multi-session approach (Efford, 2022).

Given the relatively low population densities observed in cheetah (Table S1), as well as their comparably elusive behaviour (Marnewick et al., 2008), population studies frequently turn to indirect methods, such as spoor surveys and citizen science (Houser, Somers, & Boast, 2009; Boast & Houser, 2012; Groom & Watermeyer, 2017; van der Meer et al., 2021), while SECR models have only been applied to cheetah in a handful of studies (Brassine & Parker, 2015; Broekhuis & Gopalaswamy, 2016; Fabiano et al., 2020). As such, our current knowledge of cheetah distribution, density, and conservation status relies disproportionately on expert opinion or indirect methods rather than direct, individualbased methodologies, which may hamper ongoing conservation policy development and intervention efforts. Here we address this knowledge gap for Northwest African cheetah by using the systematic application of camera traps and multi-session maximum-likelihood SECR modelling to estimate population density and demographic composition within remaining habitat across the Sudano-Sahel Zone of West and Central Africa. These data are considered essential to local conservation authorities and international stakeholders in developing policy and interventions that may arrest the decline of cheetah throughout this region and improve the conservation status of this critically endangered subspecies. By interpreting these baseline findings in the context of broader apex predator declines, this study contributes to global discourse around biodiversity loss, emphasizing the interconnected nature of ecological systems and the necessity for coordinated international conservation efforts to mitigate such concerning trends.

#### **Materials and methods**

#### Study area

This study was conducted across three study areas (Fig. 1) in two remaining strongholds for Northwest African cheetah across the Sudano-Sahel Zone, including the WAP Complex and Bahr/Salamat landscape, with an annual precipitation of 200 to 1000 mm (Karlson, 2016). The first study area, Pendjari National Park (11.2143° N, 01.5218° E) in northern Benin, forms part of the larger WAP Complex (>30 000 km²) which links a critically important triad of national parks and reserves in the Republics of Benin, Burkina Faso and Niger to form the largest transboundary PA in West Africa (Sinsin *et al.*, 2002). Surveys were conducted within Pendjari National Park and the Konkombri Hunting Zone (hereafter Pendjari; 3042 km²) in the south-western

region of the WAP Complex (Fig. 1a). Falling within the latitudinal tropical Sudanian savanna belt, Pendjari is characterized by a predominantly dry climate with a single wet season, occurring from mid-May to mid-October (Dossou-Yovo, Assogbadjo, & Sinsin, 2016; Vodouhê *et al.*, 2009).

The second and third study areas fell within the in Bahr/-Salamat landscape and southern Chad, including Siniaka Minia Wildlife Reserve (10.4304° N 18.2130° E) and Zakouma National Park (10.8376° N 19.6555° E) which form part of the GZE (>28 000 km<sup>2</sup>). These PAs, with important wildlife corridors, ultimately connect Bahr/Salamat landscape to the Central African Republic and Sudan. Surveys were conducted in Siniaka Minia Wildlife Reserve and the Melfi-Roukoum Hunting Zone (hereafter Siniaka Minia; 5260 km<sup>2</sup>: Fig. 1b), as well as within Zakouma National Park (hereafter Zakouma; 3041 km<sup>2</sup>; Fig. 1c). Falling within the savannah region between the Sahel and the rainforests of the Congo Basin, the GZE protects one of the few remaining intact Sudano-Sahelian ecosystems in Africa (Brottem, 2020). The GZE is characterized by strong seasonal duality, where the wet season spans April to September and its influence is still evident 2 months thereafter, followed by a 4month dry season (Clark et al., 2023). Where the large flood-plains, particularly in the south of GZE, are inundated during the wet season (Ducros et al., 2023; Poilecot et al., 2010).

#### Sampling design

Five camera-trap surveys were carried out in the three study areas between April 2021 and May 2023. Surveys were repeated for both wet and dry seasons in Pendjari and Zakouma, while in Siniaka only one wet season survey was conducted following limited captures of large carnivores, especially cheetah and lion (Panthera leo) in the first survey. Additionally, there were high capture rates of people and livestock with unsustainable levels of camera trap theft. Remote white flash camera traps, including Panthera® V7 (Panthera, New York, NY 10018, USA), and Spartan® Lumen (Spartan, Georgia, GA, 30096, USA) were deployed within  $6.3 \times 6.3$  km grids with average distances between camera stations ranging from 2 479 m to 4 910 m. Grid cell size was based on reported minimum cheetah home-range size estimates of 40 km<sup>2</sup> (Broomhall, Mills, & Toit, 2003) with grid cell numbers varying between 42 and 65 across sessions, while camera-trap array sizes ranged from 2 435 km<sup>2</sup> to 3 386 km<sup>2</sup> across the five sampling sessions (Table 1). The grid size ensured that multiple camera stations fell within a single cheetah home-range, increasing the likelihood of capturing and recapturing individual cheetah at different stations, which is crucial for accurate SECR analysis (Boast et al., 2013; Green, Chynoweth, & Şekercioğlu, 2020). While female cheetah home-ranges can be as large as 1 000 km<sup>2</sup> (Caro, 1994; Marker et al., 2008), the chosen grid size balances the need for extensive coverage with the logistical feasibility of deploying and maintaining many camera traps, particularly in these highly remote and potentially dangerous landscapes. Smaller grid cells would require

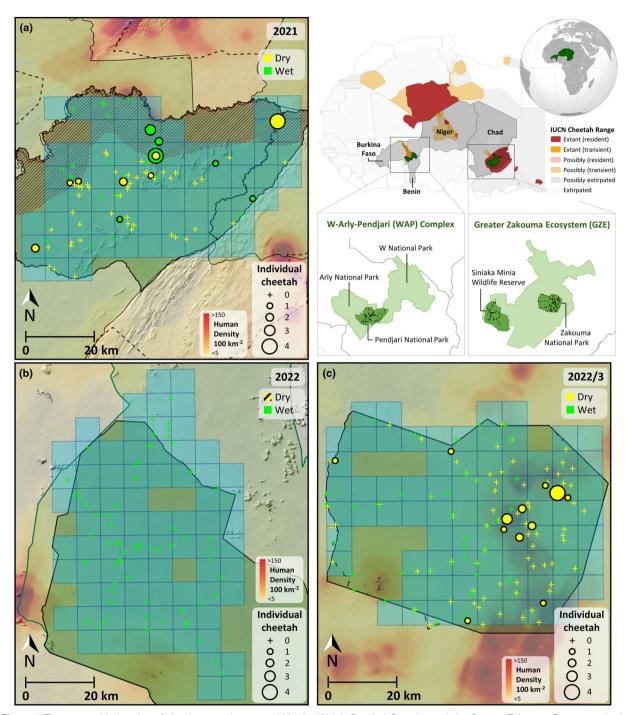


Figure 1 The geographic location of the three study areas within the W-Arly-Pendjari Complex and the Greater Zakouma Ecosystem in the Sudano-Sahel Zone of West and Central Africa. The study area (dark green) falls within larger protected areas (light green), that may include a buffer zone (dashed black lines), militarized zone (red hatching) and varying levels of human density (see insert on maps). Study areas were divided into  $6.3 \times 6.3$  grid cells (indicated in blue) sampled by camera traps (yellow cross = dry season; green cross = wet season), with some cells excluded as inaccessible terrain. Study areas include: (a) Pendjari National Park and the Konkombri Hunting zone (3042 km²), (b) Siniaka Minia Wildlife Reserve and the Melfi-Roukoum Hunting zone (5260 km²), and (c) Zakouma National Park (3041 km²). Independent cheetah detections per season are indicated by filled circles (yellow = dry season; green = wet) with the size of the circle indicating the number of unique individuals detected.

**Table 1** Sampling design for estimating the density of Northwest African cheetah in the W-Arly-Pendjari Complex and Greater Zakouma Ecosystem, the last remaining habitat subspecies strongholds in the Sudano-Sahel, using a multi-session spatially explicit capture–recapture (SECR) analyses framework (2021–2023)

| Study area                               | Pendjari                        |                                | Siniaka Minia                  | Zakouma                        |                                 |  |
|--|---------------------------------|--------------------------------|--------------------------------|--------------------------------|---------------------------------|--|
| Season                                   | Dry                             | Wet                            | Wet                            | Wet                            | Dry                             |  |
| Sampling period (days)                   | 20/04/2021–29/07/<br>2021 (100) | 30/07/2021–30/10/<br>2021 (92) | 01/05/2022–08/07/<br>2022 (68) | 10/05/2022–18/06/<br>2022 (39) | 12/01/2023–22/04/<br>2023 (100) |  |
| Stations (marking<br>  trail   water)    | 73 [56 8 9]                     | 28 [22 6 0]                    | 66 [53 7 6]                    | 38 [24 14 0]                   | 92 [28 58 6]                    |  |
| Effort (trap nights)                     | 2995                            | 2324                           | 2804                           | 1332                           | 5974                            |  |
| Mean spacing $(m \pm SD)$                | 2498 ± 1437                     | 4579 ± 1765                    | 2479 ± 1541                    | 4910 ± 1921                    | 3007 ± 1674                     |  |
| Number of grid cells<br>Array size (km²) | 51<br>2881                      | 42<br>2435                     | 64<br>2797                     | 47<br>2778                     | 65<br>3386                      |  |

significantly more traps and maintenance, while larger cells might miss finer-scale movements and interactions (Green et al., 2020). This spacing of cameras, with average distances between stations, is thus dense enough to consistently capture individuals at multiple locations within their homerange. This grid spacing was also supported by mean maximum distance moved (MMDM) metrics, which aid in retrospectively estimating effective trap spacing and ensuring comprehensive coverage (Boast et al., 2013), while being comparable to such measures in other studies (Marker et al., 2008; Weise et al., 2015). Additionally, some grid cells did not have cameras, especially during the rainy season due to practical constraints, such as inaccessibility or unsuitable habitat (i.e. densely forested areas) that is not preferred by cheetah. Efforts were made to remove grid cells from the edges of the study areas wherever possible to maintain continuity in sampling and minimize any gaps that could negatively impact the comprehensive coverage of the survey. SECR models can effectively integrate such heterogeneous trap locations to provide robust density estimates despite non-uniform placement (Boast et al., 2013; Green et al., 2020). A quarter of all stations in each survey had paired cameras to simultaneously maximize the number of individuals captured and recapture rates by individual identification. Targeted camera placement was used (Brassine & Parker, 2015), with cheetah scent-marking points being prioritized for placement (Table 1), such as higher elevation, large trees and termite mounds with animal signs, and if these signs are not found in each grid, the next priorities were trails with cheetah spoor, and water access points during dry seasons (Ipavec et al., 2018; Drouilly et al., 2019; 2021; 2023). Sampling periods ranged from 39 to 100 days, and were relatively short given average cheetah lifespan (Durant et al., 2004) in order to avoid violating demographic closure assumptions (Rovero & Zimmerman, 2016).

#### **Data preparation**

Individual cheetah were identified from photographs using their unique spot patterns. Two researchers (AS and MSF) independently identified each cheetah, and these identities were

then cross validated by a third independent researcher (VNN; Fig. S1). High quality photographs capturing spot patterns on both flanks were used to identify individuals and where only single flanks were captured, other unique characteristics such as tail rings or facial patterning were used as additional characters to aid identification (Chelysheva, 2004; Brassine & Parker, 2015). Sex was determined when external genitalia were visible in the photograph or by the presence of dependent offspring with an adult. While dependent cubs and juveniles were excluded, all independent adolescents and adults were considered in subsequent density analyses. Each 24-h day was designated as a sampling occasion, where a single event was defined as consecutive photographs of the same individual taken no more than 30 minutes apart (Rovero & Zimmerman, 2016). Images of sympatric large carnivores as well as domestic livestock and people (i.e. presence only, without identifiable features) were also recorded.

#### Statistical analyses

Northwest African cheetah density was estimated using a closed population maximum-likelihood SECR model (Borchers & Efford, 2008) implemented in the secr package (v 4.2; Efford, 2022) in R software (v 4.2.1; R Core Development Team, 2022). In Pendjari, multi-seasonal data were combined in a single model framework, treating each season as an independent session without temporal overlap, which allowed for model fitting with pooled parameters that applied across sessions (Efford, 2022). In contrast, a single-session modelling framework was applied to the Zakouma dry season, while the lack of detections excluded the Zakouma wet season and Siniaka Minia from cheetah density estimation. As only one individual was detected in both Pendjari sessions (Fig. S1), the inter-session independence assumption was maintained and the risk of pseudo-replication was minimized (O'Connell, Nichols, & Karanth, 2011; Hamel et al., 2013).

SECR is a form of hierarchical modelling with a state process representing density and an observation process representing the expected probability or rate of capture based on the assumption that the probability of detection decreases as the space between a detector and an animal activity centre increases (Efford, 2004; Efford, Dawson, & Borchers, 2009). In this study, Poisson processes were assumed for both these states. Density was expressed as a point process representing the intensity of activity centres within the state space. We modelled observations using a 'count' detector formulation, such that we recorded the number of independent captures for each individual at each station (Fig. 1; Efford, 2022). The expected number of observations of individual i at trap j was assumed to vary as a function of the distance between trap i and the activity centre of individual i following a hazard half-normal function with two parameters: a baseline detection rate  $(g_0)$  and a spatial decay parameter  $(\sigma;$  Efford et al., 2009). All models were fitted by maximizing the full likelihood using the Nelder-Mead optimizer (Borchers & Efford, 2008). To ensure that models converged, we used parameter estimates from a model with homogeneous density at starting values for more complex models with inhomogeneous density (Efford & Fewster, 2013).

Multi- and single-session survey phase models considered both trend (g0~T) and behavioural response (g0~b) to investigate the influence of time on animal activity and behaviour on detection probability within the SECR framework. The trapspecific behavioural response was considered in the baseline detection model, as we anticipated that cheetah behaviour may change after being detected at a specific trap for the duration of the survey session (bk). This adjustment was made as large terrestrial carnivores, including cheetah, exhibit variations in their home-range sizes, movement patterns, and capture probabilities. Accounting for such behavioural differences is considered important in accurately assessing the observation process in capture-recapture studies (Sollmann et al., 2013). To further address heterogeneous capture probabilities, we incorporated a sex-specific covariate in the detection process (Broekhuis et al., 2021; Klein et al., 2021) as a sex-effect in the encounter rate (g0) and spatial scale ( $\sigma$ ), as these were observed in previous cheetah studies (Brassine & Parker, 2015; Broekhuis & Gopalaswamy, 2016; Strampelli et al., 2021). Session-stratified estimates to capture potential temporal variation were also employed, where likelihood was maximized to obtain sessionspecific estimates. The integration area, or state-space model, was defined using evenly spaced points in a regular grid with a mesh spacing of 1 km<sup>2</sup> (Fig. 1).

A range of buffer widths around the trap array were tested to define the modelling state space by determining the point at which the density estimate stabilized (Kalle et al., 2011) and to account for individuals whose activity centres extended beyond the trapping area (Efford, 2004; Borchers & Efford, 2008). Various buffer sizes were applied incrementally to the trap arrays to identify the optimal buffer width. The process involved running multiple SECR models with different buffer widths and assessing at which buffer size the density estimates stabilized, indicating that the buffer was sufficiently large to encompass the activity centres of the animals being studied (Table S4). A mask with a 50 km buffer was optimum to define the state-space area for Pendjari (Fig. 1a), while a 30 km buffer was optimal for Zakouma (Fig. 1c). These buffers were also consistent with limited GPS-collared homerange estimates of Northwest African cheetah, which anecdotally indicate a diameter of approximately 55 km in Pendjari and 26 km in Zakouma. As cheetah are unlikely to maintain home-range centres in areas of increased negative interactions with people (Klein et al., 2021), areas with high levels of anthropogenic impacts, such as large villages and towns were also masked out (Fig. 1).

Several a priori models with varying effects on g0 and  $\sigma$ were fitted (Tables S2 and S3), following a multi-session framework for Pendiari (n = 14 models) and single-session analyses for Zakouma (n = 10 models). We also examined the two parameters of camera location type (Loc) and sex of identified cheetah (Sex) as covariates in predicting density. Each set of candidate models was evaluated using Akaike's Information Criterion corrected for small sample sizes (AICc; Burnham & Anderson, 2003). Top-performing models were selected on the parsimony principle as the best balance of complexity against goodness of fit and were compared across sets based on overlap in parameter confidence intervals and precision. Goodness of fit for the single-session models was tested using 99 replications of Monte Carlo resampling model deviance divided by the residual degrees of freedom. A model was considered adequate if its goodness-of-fit rank was between 10 and 90.

#### Results

#### Sampling effort

After 2 995 dry- and 2 324 wet-season trap nights in Pendjari, a total of 19 and 13 independent cheetah detections were obtained, representing nine (F = 2; M = 7) and four (F = 2; M = 2) unique individuals, respectively (Table 2). All detected adult female cheetah in Pendjari were accompanied by one to four cubs, including two family groups per season of which one family was common between seasons (Fig. 2). However, a cub was lost from this family in the second session, resulting in a cumulative count of three families with eight cubs throughout the study period in 2023.

No cheetah were detected in the wet-season surveys of Siniaka Minia (2 804 trap nights) and Zakouma (1 332 trap nights). However, 5 974 dry-season trap nights in Zakouma yielded a total of 25 independent cheetah detections representing nine (F = 4; M = 4; Unknown = 1) unique individuals, including only one family with two cubs identified.

In addition to cheetah events, a total of two seasons of Pendjari, yielded 211 independent photographic events of other large carnivores, including leopard, lion and spotted hyena (Crocuta crocuta), while the 2 804 wet-season trap nights in Siniaka Minia yielded only eight independent large carnivore events of leopard, spotted and striped hyena (Hyaena hyaena). A total of 7 306 multi-season trap nights in Zakouma yielded 1 261 events of leopard, lion, spotted and striped hyena (Table 2). A total of 6, 98 and 209 independent photographic events of domestic livestock and/or people were also recorded for these sessions in Pendjari, Siniaka Minia and Zakouma, respectively.

Scent marking sites presented significantly higher cheetah detections than other targeted sites (i.e. trails, or water sources),

**Table 2** Detection details of individually recognizable cheetah in Northwest Africa, and sympatric large carnivores and human/domestic animals across multiple study sites in Benin and Chad during 2021–2023. The number within parentheses represent the number of camera trap station with positive independent detections. M = subadult/adult male, F = subadult/adult female and family = mother with dependent cub(s)

| Study area                             | Pendjari |        | Siniaka Minia | Zakouma |          |
|--|----------|--------|---------------|---------|----------|
| Season                                 | Dry      | Wet    | Wet           | Wet     | Dry      |
| Lion (Panthera leo)                    | 18 (6)   | 23 (8) | _             | 7 (4)   | 208 (62) |
| Leopard (Panthera pardus)              | 24 (11)  | 11 (5) | 3 (3)         | 9 (5)   | 139 (45) |
| Spotted hyena (Crocuta Crocuta)        | 74 (17)  | 62 (7) | 3 (3)         | 17 (8)  | 741 (78) |
| Striped hyena ( <i>Hyaena hyaena</i> ) | _        | _      | 2 (2)         | 10 (4)  | 130 (36) |
| People and domestic animals            | 4 (3)    | 2 (2)  | 98 (28)       | 66 (13) | 143 (41) |
| Cheetah (Acinonyx jubatus)             | 18 (10)  | 13 (5) | _             | _       | 25 (12)  |
| # Independent subadult/adult cheetah   | 9        | 4      | _             | _       | 9        |
| Observed sex ratio (M: F)              | 1:0.29   | 1:1    | _             | _       | 1:1      |
| # Families                             | 2        | 2      | _             | _       | 1        |
| # Dependent cubs                       | 4        | 5      | -             | -       | 2        |

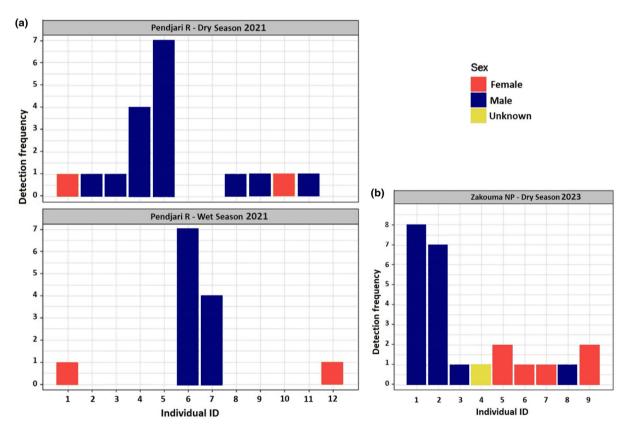


Figure 2 Detection frequency of individual cheetah based on systematic camera trapping across two seasons of (a) Pendjari Reserve of the WAP Complex in Benin and one season (b) in Zakouma National Park in Chad.

accounting for 87% (n = 27) of detections in Pendjari ( $\chi^2 = 4.996$ , df = 2, P < 0.05) and 67% (n = 16) in Zakouma ( $\chi^2 = 63.93$ , df = 2, P < 0.05), respectively (Table 1).

#### **Density estimation**

In Pendjari, the behavioural response model with specific variability in spatial scale (i.e. D~session g0~bk sigma~1)

ranked highest by AICc for multi-session modelling (Table S2), while in Zakouma, two top models were supported (i.e.  $D\sim1~g0\sim$ bk sigma $\sim1$  and  $D\sim1~g0\sim1$  sigma $\sim1$ ), requiring model averaging of the behavioural response for cheetah density estimation (Table S3).

Cheetah in Zakouma exhibited less extensive movement than those in Pendjari (Fig. S2), with  $\sigma$  (i.e. the spatial parameter) estimated at 4 711 m in the dry season, compared

to 16 232 m in the wet and 16 778 m in the dry season for Pendjari (Table 3). The detection probability (g0) was lower during the wet  $0.001 \pm 0.0007$  (SE) compared to the dry season  $0.0015 \pm 0.0008$  in Pendiari, both of which were substantially lower than g0 of  $0.005 \pm 0.0028$  in the dry season survey for Zakouma.

Cheetah densities in Pendjari were estimated at 0.17 (95% CI 0.05-0.56) and 0.24 (95% CI 0.08-0.67) independent individuals per 100 km<sup>2</sup> in the wet and dry seasons, respectively, while in Zakouma, dry season density was estimated at a higher 0.37 (95% CI 0.18-0.76) cheetah per 100 km<sup>2</sup> (Table 3). When extrapolated across the study areas, comprising each camera array and surrounding buffer (14 600 km<sup>2</sup> of WAP and 12 100 km<sup>2</sup> of GZE), these densities translate to between  $20.9 \pm 11.8$  (SE) and  $26.6 \pm 14.2$ independent individuals in Pendjari and an estimated  $41.9 \pm 14.3$  cheetah in Zakouma.

#### **Discussion**

Sufficient cheetah detections were secured to enable estimation of cheetah density across three survey seasons in two of our three surveyed sites in West and Central African PAs. These density estimates ranged from 0.17 to 0.37 individuals per 100 km<sup>2</sup> for Pendjari and Zakouma National Parks. Despite intensive camera trapping effort, no cheetah were detected in Siniaka Minia, our third site in Chad, indicating the likely perilous state of this cheetah population. Our

Table 3 Density estimates of Northwest African cheetah with standard error (SE) and 95% confidence interval (lower and upper) derived from spatially explicit capture-recapture models using camera trap data from Pendjari Reserve and Zakouma National Park. Density (D) is reported as independent cheetahs per 100 km<sup>2</sup>. The detection rate at the camera trap location (q0) is considered as home-range centre and  $\sigma$  is the scale of an individual's movement distribution (m)

| '  |               |          |        | Lower  | Upper  |  |  |  |  |
|--|---------------|----------|--------|--------|--------|--|--|--|--|
| Parameter                                      | Model         | Estimate | SE     | CI 95% | CI 95% |  |  |  |  |
| Pendjari Session 1: Dry season (Apr–July 2021) |               |          |        |        |        |  |  |  |  |
| D  | g0~bk sigma~1 | 0.24     | 0.13   | 0.08   | 0.67   |  |  |  |  |
| <i>g</i> 0                                     |               | 0.0015   | 0.0008 | 0.0005 | 0.004  |  |  |  |  |
| $\sigma$                                       |               | 16 778   | 6126   | 8386   | 33 565 |  |  |  |  |
| Pendjari Session 2: Wet season (July–Oct 2021) |               |          |        |        |        |  |  |  |  |
| D  | g0~bk sigma~1 | 0.17     | 0.11   | 0.05   | 0.56   |  |  |  |  |
| <i>g</i> 0                                     |               | 0.001    | 0.0007 | 0.0002 | 0.0042 |  |  |  |  |
| $\sigma$                                       |               | 16 232   | 4742   | 8386   | 33 565 |  |  |  |  |
| Zakouma Session 1: Dry season (Jan–Apr 2023)   |               |          |        |        |        |  |  |  |  |
| D  | Avg model     | 0.37     | 0.14   | 0.18   | 0.76   |  |  |  |  |
| <i>g</i> 0                                     |               | 0.0053   | 0.0028 | 0.0018 | 0.0154 |  |  |  |  |
| $\sigma$                                       |               | 4711     | 899    | 3252   | 6826   |  |  |  |  |
| D  | g0~bk sigma~1 | 0.40     | 0.16   | 0.19   | 0.84   |  |  |  |  |
| <i>g</i> 0                                     |               | 0.0041   | 0.0019 | 0.0016 | 0.0105 |  |  |  |  |
| $\sigma$                                       |               | 5011     | 946    | 3472   | 7233   |  |  |  |  |
| D  | g0~1 sigma~1  | 0.35     | 0.13   | 0.18   | 0.69   |  |  |  |  |
| <i>g</i> 0                                     |               | 0.0079   | 0.002  | 0.0039 | 0.0159 |  |  |  |  |
| $\sigma$                                       |               | 4292     | 647    | 3200   | 5757   |  |  |  |  |

estimated densities are substantially below the maximum densities of 2.2 and 2.5 per 100 km<sup>2</sup> found in the Kruger National Park of South Africa and Serengeti ecosystem of Tanzania, respectively (Durant et al., 2011: Marnewick et al., 2014), however, these estimates are substantially higher than a density of 1 per 4000 km<sup>2</sup> found for the only other population of A. j. hecki in the Saharan Desert (Table S1). Our estimates are more in line with typical densities of 0.18-0.90 individuals per 100 km<sup>2</sup> found across a range of different land use types and ecoregions in southern Africa (Weise et al., 2017). Given that the rainfall, and hence the productivity, of our sites is higher than that in southern Africa, these observed densities are likely lower than expected. Moreover, although only one survey was done outside the core PAs (i.e. Siniaka Minia) which are afforded greater protection, the lack of cheetah detected at that site, despite intensive survey effort, indicates that cheetah may have declined rapidly outside of the immediate survey area. Considering these findings, we recognize the current limitations of these baseline density estimates, where the associated uncertainties around extrapolated population sizes call for an improved understanding of cheetah population dynamics in West and Central African ecosystems.

#### Status of northwest African cheetah

Our total estimate of mature cheetah across Pendjari and surrounding areas (i.e. 44% of WAP) was  $20.9 \pm 11.8$  to  $26.6 \pm 14.2$  in two consecutive seasons which is in line with previous expert estimates of 23 mature individuals in the WAP Complex of Benin, Niger and Burkina Faso (Durant et al., 2022). Our survey area was focused on Pendjari National Park, which is the most well protected part of the WAP ecosystem. Previous surveys using spoor indicate lion numbers are substantially reduced outside the immediate Arly-Pendjari area (Henschel et al., 2016). Moreover, in 2017, intensive camera trap surveys across the Burkina Faso and Niger parts of the WAP ecosystem, including Arly, detected cheetah only once (Harris et al., 2019). Since these surveys, Burkina Faso has faced increasing insecurity, and Arly National Park has been occupied by insurgents (Steiner, 2021). It is therefore extremely unlikely that there are many cheetah outside the core Pendjari National Park survey area, and hence our population estimate is likely to comprise nearly the entire cheetah population occupying the larger WAP protected area complex, supporting recent reports (Ipavec et al., 2018; Drouilly et al., 2019; 2021; 2023).

Our survey in Zakouma and surrounding areas (i.e. 43% of GZE) yielded a total population estimate of 41.9  $\pm$  14.3 mature individuals, however, our survey in the Siniaka Minia did not detect any cheetah. Zakouma comprises the best protected habitat in the Bahr/Salamat landscape, and hence, in the absence of any further information, we are forced to conclude that there are no cheetah, or very low numbers of cheetah, outside of our survey area. This estimate of 42 cheetah is considerably lower than the previous estimate of 218 mature individuals in the Bahr/Salamat landscape (Durant et al., 2017, 2022). The previous estimate was

derived from a much older mapping exercise conducted in 2012 which assumed that cheetah were distributed, albeit at low densities, across the entire landscape encompassing 238 234 km<sup>2</sup> (IUCN/SSC, 2012). It is therefore possible that, as was predicted by Durant *et al.* (2017), we are witnessing the extirpation of cheetah outside of core PAs across this landscape.

Overall, our surveys indicate an estimated population of  $68 \pm 29$  mature individuals remaining in the western Sudano-Sahel Zone. This estimate is substantially lower than previous estimations of approximately 241 mature individuals for this region (Durant et al., 2017, 2022). The only other known population of A.j. hecki is over 1 200 km away, centred around the southern Algerian Sahara, where density estimates from surveys conducted in 2008 and 2010 (Belbachir et al., 2015), indicated a remaining population of around 180 mature individuals (Durant et al., 2022). Together, these suggest a total population estimate of c. 230 Northwest African cheetah, which is substantially lower than the previous estimate of 419 individuals (Durant et al., 2022), indicating that this cheetah subspecies is facing an increasingly grave risk of extinction across its remaining range. This situation aligns with predictions by Durant et al. (2017), where authors warned of a rapidly increasing threat to cheetah due to ongoing anthropogenic change across the continent, and that biased population estimates focused on core protected areas could be leading to a 'systematic underestimation' of these threats.

Almost 80% of the Northwest African cheetah range lies outside of formally designated PAs, implying that there is still habitat available for cheetah outside, as well as inside these areas, but that these landscapes often support large carnivores against substantial anthropogenic pressures (IUCN/SSC, 2012; Schulte to Bühne et al., 2017). Our study was conducted within PAs that likely have the highest levels of conservation effort and performance throughout the larger landscapes of the WAP Complex and GZE, and where cheetah were expected to be least affected by external anthropogenic pressures (Brugière, Chardonnet, & Scholte, 2015; Lhoest et al., 2022). However, our results show that the cheetah populations within these PAs are relatively small and fragile. In other parts of the Northwest African cheetah range, such as the Algerian Sahara deserts, the cheetah density is even lower, almost one seventh of our estimates in Benin and Chad (Belbachir et al., 2015), highlighting that this subspecies has a deeply concerning population status in both its remaining Sahara and Sudano-Sahel Zones.

The underlying reasons for the low densities of Northwest African cheetah populations may be variable throughout its range. In the Algerian Sahara Zone, the low landscape-level productivity and subsequently lower prey availability, exacerbated by high levels of anthropogenic pressure closer to settlements may form the primary bottom-up mechanism regulating cheetah density (Belbachir *et al.*, 2015). Such scarcity of food and water typical of deserts suggests that wildlife communities should be primarily governed by such bottom-up processes (i.e. constrained by resource availability; Rocha, Bennett, & Monterroso, 2022). By contrast, in the

Sudano-Sahel Zone, additional to these constraints posed by the natural environment and anthropogenic pressure, the relative abundance of other large carnivores such as lion, leopard, and especially spotted hyena in Pendjari and Zakouma, could be further restricting cheetah density in these PAs through inter-specific competition, creating a top-down regulating mechanism (Gigliotti *et al.*, 2020; Hayward *et al.*, 2019). Taken together, these drivers suggest that cheetah populations may be regulated by both bottom-up (i.e. land-scape productivity and prey availability) as well as top-down (i.e. dominant predators and people) ecological functions across their range.

#### Effects of seasonality and inundation

Cheetah exhibit stable consistent spatial parameter ( $\sigma$ ) variability between the two seasons in Pendjari, implying that the wet season does not constrain their movement. In contrast, season has been noted to affect the movement patterns of cheetah in other parts of sub-Saharan Africa (Houser et al., 2009; Vanak et al., 2013), and while this may ostensibly represent seasonal polarity following optimal habitat, water availability and prey abundance, limited telemetry data from Zakouma and Pendjari (n = 4) suggests that cheetah in this area do not demonstrate a pronounced behavioural response to seasonal changes. Importantly, the spatial parameter  $\sigma$  was substantially lower in Zakouma than in Pendjari, which could be associated with a smaller mean home-range (Efford & Fewster, 2013), as a result, cheetah in Zakouma may be more likely to occur near the centroid of their homerange which is then associated with a higher detection probability (g0) as evident in the dry-season comparison of Pendjari and Zakouma (Table 3). Such discrepancies emphasize the importance of more detailed behavioural and movement research on cheetah in these unique landscapes (Fig. S2). The effect of seasonal inundation on habitat suitability, prey densities and predator movement are also likely to have a significant landscape-level effect, however such interpretations would require more extensive monitoring and multispecies response analyses.

#### Insights into demographic structure

The observed sex ratios varied between the two study sites (Table 2), with an even sex ratio in Zakouma while in Pendjari the population was highly skewed towards males in the dry season (1:0.29). The latter reflects a global pattern of male-skewed sex ratios in cheetah surveyed using camera traps, with such male bias reported in Algeria (Belbachir et al., 2015), Iran (Farhadinia et al., 2016), and multiple study sites throughout sub-Saharan Africa (Brassine & Parker, 2015; Fabiano et al., 2020). There are two common explanations for a male-biased sex ratio in cheetah surveyed using camera traps.

The first is that the placement of cameras at scent-marking sites results in a bias in detection towards adult males who are more likely to frequent such sites (Marker *et al.*, 2003; Farhadinia *et al.*, 2016; Melzheimer et al., 2018; Fabiano

et al., 2020). Adult female cheetah, particularly when accompanied by dependent cubs, may avoid marking sites that are frequented by adult males (Mills & Mills, 2017; Melzheimer et al., 2020), however, this effect may be offset by overlapping female home-ranges (Caro, 1994; Durant et al., 2004). In Pendjari, we recorded a strong male bias where most camera stations were situated at marking sites (77%), whereas in Zakouma we found an even sex ratio, where a smaller proportion (30%) of stations were placed at marking sites (Table 1). Additionally, in Pendjari, every adult female was detected with dependent cubs, while in Zakouma, only one female (25% of all females) had dependent offspring (Table 2). However, the models run by location type covariate obtained lower AICc scores than the trap-specific behavioural response models (Tables S2 & S3).

The second reason is that female cheetah generally have larger home ranges compared to territorial males (Caro, 1994; Marker *et al.*, 2008; Marnewick & Somers, 2015; Welch *et al.*, 2015; Melzheimer *et al.* 2018), which, for a given camera trap spacing would increase the overall likelihood of male detection, but female home ranges also overlap, thus overall detection should remain unchanged (Caro, 1994; Durant *et al.*, 2004). Previous studies have identified high levels of male—male aggression, resulting in a higher male mortality rate and a female biased sex ratio (Caro, 1994; Durant *et al.*, 2004; Marker *et al.*, 2008; Marnewick & Somers, 2015; Welch *et al.*, 2015; Melzheimer *et al.* 2018).

Our relatively small sample size requires us to view these interpretations as suggestive, highlighting the need for further investigation into sex-specific survival of Northwest African cheetah. Skewed demographic parameters generally exacerbate the severity of stochastic events in such relatively small and isolated populations (Fagan & Holmes, 2006), as is currently affecting the persistence of fragile Asiatic cheetah (A. j. venaticus) populations (Farhadinia et al., 2016, 2017).

# Mortality and growing anthropogenic pressure

Cheetah density confidence intervals overlapped between the two seasons in Pendjari, indicating that this population estimate was relatively similar between seasons (Table 3). However, at least three out of 12 detected cheetah in Pendjari died within 1 year, as confirmed through telemetry-guided observations and the monitoring of cheetah families using repeat photographs from camera traps. Moreover, we had a relatively low recapture rate for individuals (i.e. eight individuals detected only once) and only one independent individual in the two consecutive seasons which were only a month apart in Pendjari (Fig. 2). These lines of evidence suggest that, while cheetah density is relatively stable between the two seasons, this population experiences a high level of turnover which could potentially affect the spatial resident tenure of cheetah in Pendjari.

People and their livestock were frequently detected over large areas in both Siniaka Minia (n = 98) and Zakouma

(n = 209) in the GZE (Table 2). While we failed to detect any cheetah in Siniaka Minia, other large carnivores such as leopards and spotted or stripped hyena were also only rarely detected (n = 8). Moreover, in Zakouma National Park, which is regarded as the primary 'safe zone' within the GZE, the frequency of detecting anthropogenetic factors on camera traps was 8.3 times more than that of cheetah. This anthropogenic activity within the GZE may reveal a degraded conservation status with adverse consequences for most wildlife including cheetah (Durant et al., 2017: Steiner, 2021). This situation mirrors typical reasons for population declines in other large carnivores such as lions (Bauer et al., 2015), tigers (Goodrich et al., 2015), and wolves (Canis lupus; Ripple & Beschta, 2012), emphasizing a broader crisis affecting apex predators globally (Arias et al., 2024). Further research is thus urgently recommended to quantify and contextualize the effect of such nomadic pastoralism on the persistence of large carnivore populations in this landscape.

#### **Management recommendations**

Our revised population size estimate is markedly lower than previous projections for the subspecies (Durant *et al.*, 2022), providing an urgently needed assessment of cheetah population size in Northwest Africa that is contemporary and robust, given the difficulties of monitoring in this landscape. Where the critical status of this subspecies is further highlighted through the ever-increasing challenges posed by anthropogenic activities and limited law enforcement capacity across the Sudano-Sahel Zone, which is exacerbated by recent sectarian unrest and ongoing armed conflict (Cusack *et al.*, 2021; Steiner, 2021). Our data urges local management and international stakeholders to focus on improving the conservation status of the Northwest African cheetah, where immediate recommendations include:

1 Stakeholders, particularly range-state governments, should engage with the imminent review and update of the existing range-wide strategy for the conservation of Northwest African cheetah (IUCN/SSC, 2012) currently adopted within the African Carnivores Initiative (ACI), jointly established by the United Nations Environment Program (UNEP) Convention on the Conservation of Migratory Species of Wild Animals (CMS) and the Convention on International Trade in Endangered Species of Wild Fauna and Flora (CITES). The updated regional strategy should be prioritized for implementation within the ACI by the establishment of a North-western African Cheetah Working Group to facilitate transboundary coordination to direct resources and efforts towards implementation of the regional strategy. Current priorities include the recovery of suitable habitat and prey populations, as well as a reduction in anthropogenic pressures on the remaining cheetah populations through landscape-level and holistic management of ecosystems that directly accounts for the needs of these cheetah as unique flagships of biodiversity for this system.

- 2 All three remaining *A. j. hecki* core populations should be subject to regular monitoring by implementing surveys using the methods outlined here and in Belbachir *et al.* (2015) at 2–3-year intervals. Where an in-depth ecological study is needed in at least one site, to better understand the ecological needs of this subspecies and identify the proximal threats to its survival.
- 3 Genetic analyses are urgently required to understand the phylogeny and genetic diversity of cheetah subspecies across the region. Our data show that the largest population of Northwest African cheetah across the Sudano-Sahel zone persist in GZE in Chad. However, due to the limited availability of genetic samples from these specific regions, it is not yet confirmed that this population in GZE is the Northwest (A. j. hecki), as opposed to the Northeast (A. j. soemmerringi) African cheetah subspecies (Charruau et al., 2011; Prost et al., 2022), which would have significant implications for strategic conservation management across the region (Durant et al., 2017).
- 4 Quantify and curb the illegal trade of cheetah skins and parts throughout the Sudano-Sahel Zone.
- 5 Finally, the Northwest African cheetah requires more international attention to deliver the political will and funding required to reverse its precipitous decline. Currently, these cheetah follow the continued extirpation of multiple key species throughout the Sahara-Sahel (Brito *et al.*, 2018; Belbachir *et al.*, 2015). Without urgent action, the iconic biodiversity of this region and the essential ecosystem services it provides may face total collapse.

Overall, our findings provide compelling evidence for the current precarious status of Northwest African cheetah populations and the urgent need to actively implement existing transboundary cooperative strategies towards recovering this subspecies.

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#### **Conflict of interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

#### Author contributions

Ali Shams: Conceptualization, Methodology, Validation, Formal analysis, Investigation, Data Curation, Writing - Original Draft, Writing – Review and Editing, Visualization, Project administration. Mohammad S. Farhadinia: Conceptualization, Methodology, Validation, Formal analysis, Investigation, Writing - Original Draft, Writing - Review and Editing, Supervision, Project administration, M. Justin O'Riain: Conceptualization, Methodology, Validation, Writing Review and Editing, Supervision, Project administration. Angela Gaylard: Conceptualization, Writing - Review and Editing, Project administration. Marna Smit: Conceptualization, Methodology, Resources, Writing - Review and Editing. Project administration. Funding acquisition. Jörg Melzheimer: Conceptualization, Methodology, Investigation, Writing - Review and Editing. Chiara Fraticelli: Investigation, Resources, Writing - Review and Editing. Mando Koutou: Investigation, Resources, Writing - Review and Editing. Kaki B. Clement: Investigation, Resources, Writing - Review and Editing. Sarah M. Durant: Investigation, Writing - Review and Editing. Vincent N. Naude: Conceptualization, Methodology, Validation, Investigation, Writing -Original Draft, Writing - Review and Editing, Supervision, Project administration, Funding acquisition.

## **Data availability statement**

Derived data used in all analyses are available in the Supplementary data, where raw data can be made available upon request.

#### References

- Alexander, J.S., Gopalaswamy, A.M., Shi, K. & Riordan, P. (2015). Face value: towards robust estimates of snow leopard densities. *PLoS One.* **10**, e0134815.
- Arias, M., Coals, P., Ardiantiono, Elves-Powell, J., Rizzolo, J.B., Ghoddousi, A., Boron, V., da Silva, M., Naude, V., Williams, V., Poudel, S., Loveridge, A., Payán, E., Suryawanshi, K. & Dickman, A. (2024). Reflecting on the role of human-felid conflict and local use in big cat trade. *Conserv. Sci. Pract.* 6(1). https://doi.org/10.1111/csp2.13030
- Ash, E., Hallam, C., Chanteap, P., Kaszta, Ż., Macdonald, D.W., Rojanachinda, W., Redford, T. & Harihar, A. (2020). Estimating the density of a globally important tiger (*Panthera tigris*) population: using simulations to evaluate survey design in eastern Thailand. *Biol. Conserv.* 241, e108349.
- Bauer, H., Chapron, G., Nowell, K., Henschel, P., Funston, P., Hunter, L.T., Macdonald, D.W. & Packer, C. (2015). Lion (*Panthera leo*) populations are declining rapidly across Africa, except in intensively managed areas. *Proc. Natl. Acad. Sci.* 112, 14894–14899.
- Becker, M.S., Durant, S.M., Watson, F.G.R., Parker, M., Gottelli, D., M'soka, J., Droge, E., Nyirenda, M., Schuette,

- P., Dunkley, S. & Brummer, R. (2017). Using dogs to find cats: detection dogs as a survey method for wide-ranging cheetah, J. Zool. 302, 184-192.
- Belbachir, F., Pettorelli, N., Wacher, T., Belbachir-Bazi, A. & Durant, S.M. (2015). Monitoring rarity: the critically endangered Saharan cheetah as a flagship species for a threatened ecosystem. PLoS One. 10, e0115136.
- Blais, Y., Drouilly, M., Ipavec, A., Henschel, P. & Durant, S.M. (2023). Historical and current distributions of cheetah in Northwest Africa. Cat News. 77, 28-33.
- Boast, L.K. & Houser, A. (2012). Density of large predators on commercial farmland in Ghanzi, Botswana. S. Afr. J. Wildl. Res. 42, 138-143.
- Boast, L.K., Houser, A.M., Good, K. & Gusset, M. (2013). Regional variation in body size of the cheetah (Acinonyx jubatus). J. Mammal. 94, 1293-1297.
- Borchers, D.L. & Efford, M.G. (2008). Spatially explicit maximum likelihood methods for capture-recapture studies. Biometrics. 64, 377-385.
- Boron, V., Tzanopoulos, J., Gallo, J., Barragan, J., Jaimes-Rodriguez, L., Schaller, G. & Payán, E. (2016). Jaguar densities across human-dominated landscapes in Colombia: the contribution of unprotected areas to long term conservation. PLoS One. 11, e0153973.
- Brassine, E. & Parker, D. (2015). Trapping elusive cats: using intensive camera trapping to estimate the density of a rare African felid. PLoS One. 10, e0142508.
- Briers-Louw, W.D., Kendon, T., Rogan, M.S., Leslie, A.J., Almeida, J., Gaynor, D. & Naude, V.N. (2024). Anthropogenic pressure limits the recovery of a postwar leopard population in central Mozambique. Conserv. Sci. Pract. 6(5). https://doi.org/10.1111/csp2.13122
- Brito, J.C., Durant, S.M., Pettorelli, N., Newby, J., Canney, S., Algadafi, W., Rabeil, T., Crochet, P.-A., Pleguezuelos, J.M., Wacher, T., de Smet, K., Gonçalves, D.V., da Silva, M.J.F., Martínez-Freiría, F., Abáigar, T., Campos, J.C., Comizzoli, P., Fahd, S., Fellous, A., Garba, H.H.M., Hamidou, D., Harouna, A., Hatcha, M.H., Nagy, A., Silva, T.L., Sow, A.S., Vale, C.G., Boratyński, Z., Rebelo, H. & Carvalho, S.B. (2018). Armed conflicts and wildlife decline: challenges and recommendations for effective conservation policy in the Sahara-Sahel. Conserv. Lett. 11, e12446.
- Broekhuis, F. & Gopalaswamy, A.M. (2016). Counting cats: spatially explicit population estimates of cheetah (Acinonyx jubatus) using unstructured sampling data. PLoS One. 11, e0153875.
- Broekhuis, F., Elliot, N.B., Keiwua, K., Koinet, K., Macdonald, D.W., Mogensen, N., Thuo, D. & Gopalaswamy, A.M. (2021). Resource pulses influence the spatio-temporal dynamics of a large carnivore population. Ecography. 44, 358-369.
- Broomhall, L.S., Mills, M.G.L. & Toit, J.T.d. (2003). Home range and habitat use by cheetahs (Acinonyx jubatus) in the Kruger National Park. J. Zool. 261, 119-128.

- Brottem, L.V. (2020). Pastoral resource conflict in the context of Sudano-Sahelian security crises: a critical review of research. Afr. Secur. 13, 380-402.
- Brugière, D., Chardonnet, B. & Scholte, P. (2015). Large-scale extinction of large carnivores (lion Panthera Leo, cheetah Acinonyx jubatus and wild dog Lycaon pictus) in protected areas of west and Central Africa. Tropical Conservation Science. 8, 513-527.
- Burnham, K.P. & Anderson, D.R. (2003). Model selection and multimodel inference: a practical information-theoretic approach. New York, NY: Springer Science & Business Media.
- Caro, T. (1994). Cheetahs of the Serengeti plains: group living in an asocial species. Saint Charles, IL, USA: University of Chicago Press.
- Charruau, P., Fernandes, C., Orozco-Terwengel, P., Peters, J., Hunter, L., Ziaie, H., Jourabchian, A., Jowkar, H., Schaller, G., Ostrowski, S., Vercammen, P., Grange, T., Schlötterer, C., Kotze, A., Geigl, E.-M., Walzer, C. & Burger, P.A. (2011). Phylogeography, genetic structure and population divergence time of cheetahs in Africa and Asia: evidence for long-term geographic isolates. Mol. Ecol. 20, 706-724.
- Chelysheva, E.V. (2004). A new approach to cheetah identification. Cat News. 41, 27-29.
- Clark, R.K., Fennessy, J., Ferguson, S., Fraticelli, C., Honig, N., Morrison, T.A. & Brown, M.B. (2023). Seasonal dynamics impact habitat preferences and protected area use of the critically endangered Kordofan giraffe (Giraffa camelopardalis antiquorum). Sawr. 1, 53.
- Cusack, J.J., Bradfer-Lawrence, T., Baynham-Herd, Z., Castelló y Tickell, S., Duporge, I., Hegre, H., Moreno Zárate, L., Naude, V., Nijhawan, S., Wilson, J., Zambrano Cortes, D.G. & Bunnefeld, N. (2021). Measuring the intensity of conflicts in conservation. Conserv. Lett. 14(3), e12783.
- Dossou-Yovo, H.O., Assogbadjo, A.E. & Sinsin, B. (2016). The contribution of termitaria to plant species conservation in the Pendjari Biosphere Reserve in Benin. Environ. Ecol. Res. 4, 200-206.
- Dragesco-Joffé, A. (1993). La vie sauvage au Sahara. Lonay, Switzerland: Delachaux & Niestle.
- Drouilly, M., Ipavec, A., Lapeyre, V., Henschel, P., Ouindeyama, A. & Durant, S. (2019). Ecological monitoring of cheetah and leopard populations in Pendjari National Park. Benin: ZSL-RWCP/Panthera/IUCN Cat SG in collaboration with AP/PNP. 18 pages.
- Drouilly, M., Ipavec, A., Horion, R., Henschel, P. & Durant, S. (2021). Ecological monitoring of leopard and cheetah in the Pendjari and W Complexes of Benin - Camera trapping sessions January-July 2021. ZSL-CCI/Panthera in collaboration with APN/PNPC and APN/WNPCB. 33 pages + separate appendices.
- Drouilly, M., Ipavec, A., Horion, R., Ouindeyama, A. & Durant, S. (2023). Ecological monitoring of leopard and cheetah in Pendjari National Park, Benin - Camera trapping

A. Shams et al.

- sessions January-July 2023. ZSL-CCI/Panthera in collaboration with APN/PNP. 27 pages + separate appendices.
- Ducros, D., Devillers, R., Messager, A., Suet, M., Wachoum,
  A.S., Deschamps, C., Breme, B.M., Petersen, I.K., Kayser,
  Y., Vincent-Martin, N., Djimasngar, M.N., Portier, B.,
  Champagnon, J., Mondain-Monval, J.-Y. & Defos du Rau,
  P. (2023). Planning from scratch: a new modelling approach for designing protected areas in remote, data-poor regions.
  J. Appl. Ecol. 60, 2018–2030.
- Durant, S.M., Kelly, M. & Caro, T.M. (2004). Factors affecting life and death in Serengeti cheetahs: environment, age, and sociality. *Behav. Ecol.* **15**, 11–22.
- Durant, S.M., Bashir, S., Maddox, T. & Laurenson, M.K. (2007). Relating long-term studies to conservation practice: the case of the Serengeti cheetah project. *Conserv. Biol.* 21, 602–611.
- Durant, S.M., Mitchell, N., Groom, R., Pettorelli, N., Ipavec, A., Jacobson, A.P., Woodroffe, R. et al. (2017). The global decline of cheetah *Acinonyx jubatus* and what it means for conservation. *Proc. Natl. Acad. Sci.* 114, 528–533.
- Durant, S.M., Groom, R.J., Ipavec, A., Mitchell, N. & Khalatbari, L. (2022). *Acinonyx jubatus*. The IUCN Red List of Threatened Species e.T219A124366642.
- Durant, S.M., Craft, M.E., Hilborn, R., Bashir, S., Hando, J. & Thomas, L. (2011). Long-term trends in carnivore abundance using distance sampling in Serengeti National Park, Tanzania. *J. Appl. Ecol.* 48(6), 1490–1500.
- Efford, M. (2004). Density estimation in live-trapping studies. *Oikos.* **106**, 598–610.
- Efford, M.G., 2022. secr: spatially explicit capture-recapture models. R package version 4.5.5.
- Efford, M.G. & Fewster, R.M. (2013). Estimating population size by spatially explicit capture–recapture. *Oikos.* **122**, 918–928.
- Efford, M.G., Dawson, D.K. & Borchers, D.L. (2009). Population density estimated from locations of individuals on a passive detector array. *Ecology.* **90**, 2676–2682.
- Fabiano, E.C., Sutherland, C., Fuller, A.K., Nghikembua, M., Eizirik, E. & Marker, L. (2020). Trends in cheetah *Acinonyx jubatus* density in north-central Namibia. *Popul. Ecol.* 62, 233–243.
- Fagan, W.F. & Holmes, E.E. (2006). Quantifying the extinction vortex. *Ecol. Lett.* 9, 51–60.
- Farhadinia, M.S., Gholikhani, N., Behnoud, P., Hobeali, K., Taktehrani, A., Hosseini-Zavarei, F., Eslami, M. & Hunter, L.T.B. (2016). Wandering the barren deserts of Iran: illuminating high mobility of the Asiatic cheetah with sparse data. J. Arid Environ. 134, 145–149.
- Farhadinia, M.S., Hunter, L.T.B., Jourabchian, A., Hosseini-Zavarei, F., Akbari, H., Ziaie, H., Schaller, G.B. & Jowkar, H. (2017). The critically endangered Asiatic cheetah *Acinonyx jubatus* venaticus in Iran: a review of recent distribution, and conservation status. *Biodivers. Conserv.* 26, 1027–1046.

- Farhadinia, M.S., McClintock, B.T., Johnson, P.J., Behnoud, P., Hobeali, K., Moghadas, P., Hunter, L.T.B. & Macdonald, D.W. (2019). A paradox of local abundance amidst regional rarity: the value of montane refugia for Persian leopard conservation. *Sci. Rep.* 9, 14622.
- Farhadinia, M.S., Johnson, P.J., Zimmermann, A., McGowan, P.J.K., Meijaard, E., Stanley-Price, M. & Macdonald, D.W. (2020). Ex situ management as insurance against extinction of mammalian megafauna in an uncertain world. *Conserv. Biol.* 34, 988–996.
- Funston, P.J., Frank, L., Stephens, T., Davidson, Z.,
  Loveridge, A., Macdonald, D.M., Durant, S., Packer, C.,
  Mosser, A. & Ferreira, S.M. (2010). Substrate and species constraints on the use of track incidences to estimate
  African large carnivore abundance. J. Zool. 281, 56–65.
- Gerber, B.D., Ivan, J.S. & Burnham, K.P. (2014). Estimating the abundance of rare and elusive carnivores from photographic-sampling data when the population size is very small. *Popul. Ecol.* **56**, 463–470.
- Gigliotti, L.C., Slotow, R., Hunter, L.T.B., Fattebert, J., Sholto-Douglas, C. & Jachowski, D.S. (2020). Context dependency of top-down, bottom-up and density-dependent influences on cheetah demography. J. Anim. Ecol. 89, 449–459.
- Goodrich, J., Lynam, A., Miquelle, D., Wibisono, H., Kawanishi, K., Pattanavibool, A., Htun, S., Tempa, T., Karki, J., Jhala, Y. & Karanth, U. (2015). *Panthera tigris*. The IUCN Red List of Threatened Species 2015: e. T15955A50659951.
- Green, A.M., Chynoweth, M.W. & Şekercioğlu, Ç.H. (2020). Spatially explicit capture-recapture through camera trapping: a review of benchmark analyses for wildlife density estimation. *Front. Ecol. Evol.* **8**, 563477.
- Groom, R. & Watermeyer, J. (2017). Carnivore Densities in Gonarezhou National Park - Results of the 2017 Spoor Survey.
- Hamel, S., Killengreen, S.T., Henden, J.-A., Eide, N.E., Roed-Eriksen, L., Ims, R.A. & Yoccoz, N.G. (2013). Towards good practice guidance in using camera-traps in ecology: influence of sampling design on validity of ecological inferences. *Methods Ecol. Evol.* 4, 105–113.
- Harmsen, B.J., Foster, R.J. & Quigley, H. (2020). Spatially explicit capture recapture density estimates: robustness, accuracy and precision in a long-term study of jaguars (*Panthera onca*). *PLoS One.* **15**, e0227468.
- Harris, N.C., Mills, K.L., Harissou, Y., Hema, E.M.,
  Gnoumou, I.T., VanZoeren, J., Abdel-Nasser, Y.I. &
  Doamba, B. (2019). First camera survey in Burkina Faso and Niger reveals human pressures on mammal communities within the largest protected area complex in West Africa. *Conserv. Lett.* 12(5), e12667.
- Hayward, M.W., Edwards, S., Fancourt, B.A., Linnell, J.D.C. & Nilsen, E.B. (2019). Top-down control of ecosystems and the case for rewilding: does it all add up? In N. Pettorelli, S.M. Durant, & J.T. du Toit (Eds.), *Rewilding* (pp. 325–354). chapter, Cambridge: Cambridge University Press. https://doi.org/10.1017/9781108560962.016

- Hearn, A.J., Ross, J., Bernard, H., Bakar, S.A., Goossens, B., Hunter, L.T.B. & Macdonald, D.W. (2019). Responses of Sunda clouded leopard Neofelis diardi population density to anthropogenic disturbance: refining estimates of its conservation status in Sabah. Oryx. 53, 643-653.
- Henschel, P., Petracca, L.S., Hunter, L.T.B., Kiki, M., Sewadé, C., Tehou, A. & Robinson, H.S. (2016). Determinants of distribution patterns and management needs in a critically endangered lion Panthera leo population. Front. Ecol. Evol. 4. https://doi.org/10.3389/fevo.2016.00110
- Houser, A.M., Somers, M.J. & Boast, L.K. (2009). Spoor density as a measure of true density of a known population of free-ranging wild cheetah in Botswana. J. Zool. 278, 108-115.
- Ipavec, A., Durant, S., Henschel, P., Lapeyre, V. & Ouindeyama, A. (2018). Cheetah and leopard population assessment in Pendjari National Park. Benin: ZSL-RWCP/Panthera/IUCN Cat SG/Cenagref.
- IUCN/SSC. (2012). Regional conservation strategy for the cheetah and African wild dog in West, Central and North Africa, Gland, Switzerland: IUCN,
- Kalle, R., Ramesh, T., Qureshi, Q. & Sankar, K. (2011). Density of tiger and leopard in a tropical deciduous forest of Mudumalai Tiger Reserve, southern India, as estimated using photographic capture-recapture sampling. Acta Theriol. 56, 335-342.
- Karlson, M. & Ostwald, M. (2016). Remote sensing of vegetation in the Sudano-Sahelian zone: A literature review from 1975 to 2014. J. Arid Environ. 124, 257-269.
- Kelly, M.J. (2001). Computer-aided photograph matching in studies using individual identification: an example from Serengeti cheetahs. J. Mammal. 82, 440-449.
- Klein, K., Jaeger, S., Melzheimer, J., Wachter, B., Hofer, H., Baltabayev, A. & Schreiber, F. (2021). Visual analytics of sensor movement data for cheetah behaviour analysis. J. Vis. **24**, 807–825.
- Lhoest, S., Linchant, J., Gore, M.L. & Vermeulen, C. (2022). Conservation science and policy should care about violent extremism. Glob. Environ. Chang. 76, 102590.
- Linden, D.W., Green, D.S., Chelysheva, E.V., Mandere, S.M. & Dloniak, S.M. (2020). Challenges and opportunities in population monitoring of cheetahs. Popul. Ecol. 62, 341-352.
- Marker, L.L., Dickman, A.J., Jeo, R.M., Mills, M.G.L. & Macdonald, D.W. (2003). Demography of the Namibian cheetah, Acinonyx jubatus jubatus. Biol. Conserv. 114, 413-425.
- Marker, L.L., Dickman, A.J., Mills, M.G., Jeo, R.M. & Macdonald, D.W. (2008). Spatial ecology of cheetahs on north-central Namibian farmlands. J. Zool. 274, 226-238.
- Marnewick, K. & Somers, M.J. (2015). Home ranges of cheetahs (Acinonyx jubatus) outside protected areas in South Africa. African Journal of Wildlife Research. 45, 223-232.
- Marnewick, K., Funston, P.J. & Karanth, K.U. (2008). Evaluating camera trapping as a method for estimating

- cheetah abundance in ranching areas. S. Afr. J. Wildl. Res. **38**, 59–65.
- Marnewick, K., Ferreira, S.M., Grange, S., Watermeyer, J., Maputla, N. & Davies-Mostert, H.T. (2014). Evaluating the status of and African wild dogs Lycaon pictus and cheetahs Acinonyx jubatus through tourist-based photographic surveys in the Kruger National Park. PLoS One. 9, e86265.
- van der Meer, E., Sousa, L.L. & Loveridge, A.J. (2021). Reassessment of an introduced cheetah Acinonyx jubatus population in Matusadona National Park, Zimbabwe. Oryx **55**(2), 294–301.
- Meißner, R., Winter, S., Westerhüs, U., Sliwa, A., Greve, C., Bottriell, L.G., Bottriell, P., Fernandes, C.R., Vercammen, P., Hunter, L.T. & Abramov, A.V. (2023). The potential and shortcomings of mitochondrial DNA analysis for cheetah conservation management. Conserv. Genet. 24, 125-136.
- Melzheimer, J., Heinrich, S.K., Wasiolka, B., Mueller, R., Thalwitzer, S., Palmegiani, I., Weigold, A., Portas, R., Roeder, R., Krofel, M., Hofer, H. & Wachter, B. (2020). Communication hubs of an asocial cat are the source of a human-carnivore conflict and key to its solution. Proc. Natl. Acad. Sci. 117, 33325-33333.
- Melzheimer, J., Streif, S., Wasiolka, B., Fischer, M., Thalwitzer, S., Heinrich, S.K., Weigold, A., Hofer, H. & Wachter, B. (2018). Queuing, takeovers, and becoming a fat cat: Long-term data reveal two distinct male spatial tactics at different life-history stages in Namibian cheetahs. Ecosphere 9(6), e02308.
- Mills, G. & Mills, M. (2017). Kalahari cheetahs: adaptations to an arid region. Oxford, New York: Oxford University Press.
- O'Brien, T.G. & Kinnaird, M.F. (2011). Density estimation of sympatric carnivores using spatially explicit capturerecapture methods and standard trapping grid. Ecol. Appl. **21**, 2908–2916.
- O'Connell, A.F.O., Nichols, J.D. & Karanth, K.U. (2011). Camera traps in animal ecology. Tokyo, Japan: Springer.
- Obbard, M.E., Howe, E.J. & Kyle, C.J. (2010). Empirical comparison of density estimators for large carnivores. J. Appl. Ecol. 47, 76-84.
- Phumanee, W., Steinmetz, R., Phoonjampa, R., Weingdow, S., Phokamanee, S., Bhumpakphan, N. & Savini, T. (2021). Tiger density, movements, and immigration outside of a tiger source site in Thailand. Conserv. Sci. Pract. 3, e560.
- Poilecot, P., N'Gakoutou, E.B. & Taloua, N. (2010). Evolution of large mammal populations and distribution in Zakouma National Park (Chad) between 2002 and 2008, Vol. 74. Berlin, Germany: De Gruyter.
- Prost, S., Machado, A.P., Zumbroich, J., Preier, L., Mahtani-Williams, S., Meissner, R., Guschanski, K., Brealey, J.C., Fernandes, C.R., Vercammen, P., Hunter, L.T.B., Abramov, A.V., Plasil, M., Horin, P., Godsall-Bottriell, L., Bottriell, P., Dalton, D.L., Kotze, A. & Burger, P.A. (2022). Genomic analyses show extremely perilous conservation status of African and Asiatic cheetahs (Acinonyx jubatus). Mol. Ecol. 31, 4208-4223.

A. Shams et al.

- R Core Development Team. (2022). *R: a language and environment for statistical computing*. Vienna, Austria: R Foundation for Statistical Computing.
- Ripple, W.J. & Beschta, R.L. (2012). Trophic cascades in Yellowstone: the first 15 years after wolf reintroduction. *Biol. Conserv.* 145, 205–213.
- Ripple, W.J., Estes, J.A., Beschta, R.L., Wilmers, C.C., Ritchie, E.G., Hebblewhite, M., Berger, J., Elmhagen, B., Letnic, M., Nelson, M.P., Schmitz, O.J., Smith, D.W., Wallach, A.D. & Wirsing, A.J. (2014). Status and ecological effects of the world's largest carnivores. *Science*. **343**, 1241484
- Rocha, F., Bennett, B. & Monterroso, P. (2022).
  Understanding top-down and bottom-up processes in an ungulate community to define conservation priorities in a desert environment. *Biodivers. Conserv.* 31, 2179–2203.
- Rogan, M.S., Balme, G.A., Distiller, G., Pitman, R.T., Broadfield, J., Mann, G.K.H., Whittington-Jones, G.M., Thomas, L.H. & O'Riain, M.J. (2019). The influence of movement on the occupancy-density relationship at small spatial scales. *Ecosphere*. 10, e02807.
- Rogan, M.S., Distiller, G., Balme, G.A., Pitman, R.T., Mann, G.K.H., Dubay, S.M., Whittington-Jones, G.M., Thomas, L.H., Broadfield, J., Knutson, T. & O'Riain, M.J. (2022).
  Troubled spots: human impacts constrain the density of an apex predator inside protected areas. *Ecol. Appl.* 32, e2551.
- Rostro-García, S., Kamler, J.F., Crouthers, R., Sopheak, K., Prum, S., In, V., Pin, C., Caragiulo, A. & Macdonald, D.W. (2018). An adaptable but threatened big cat: density, diet and prey selection of the Indochinese leopard (*Panthera* pardus delacouri) in eastern Cambodia. R. Soc. Open Sci. 5, 171187.
- Rovero, F. & Zimmerman, F. (2016). Camera trapping for wildlife research. Exeter, UK: Pelagic Publishing.
- Royle, J.A., Nichols, J.D., Karanth, K.U. & Gopalaswamy, A.M. (2009). A hierarchical model for estimating density in camera-trap studies. *J. Appl. Ecol.* 46, 118–127.
- Schulte to Bühne, H., Wegmann, M., Durant, S.M., Ransom, C., de Ornellas, P., Grange, S., Beatty, H. & Pettorelli, N. (2017). Protection status and national socio-economic context shape land conversion in and around a key transboundary protected area complex in West Africa. *Remote Sens. Ecol. Conserv.* 3, 190–201.
- Sharma, K., Bayrakcismith, R., Tumursukh, L., Johansson, O., Sevger, P., McCarthy, T. & Mishra, C. (2014). Vigorous dynamics underlie a stable population of the endangered snow leopard *Panthera uncia* in Tost Mountains, south Gobi, Mongolia. *PLoS One.* **9**, e101319.
- Sillero-Zubiri, C., Rostro-García, S., Burruss, D., Matchano, A., Harouna, A. & Rabeil, T. (2015). Saharan cheetah *Acinonyx jubatus* hecki, a ghostly dweller on Niger's Termit Massif. *Oryx.* 49, 591–594.
- Sinsin, B., Tehou, A.C., Daouda, I. & Saidou, A. (2002). Abundance and species richness of larger mammals in Pendjari National Park in Benin. *Mammalia*. 66, 369–380.

- Sollmann, R., Tôrres, N.M., Furtado, M.M., de Almeida Jácomo,
  A.T., Palomares, F., Roques, S. & Silveira, L. (2013).
  Combining camera-trapping and noninvasive genetic data in a spatial capture–recapture framework improves density estimates for the jaguar. *Biol. Conserv.* 167, 242–247.
- Steiner, K. (2021). Terror, rebellion and insurgency: its impact on conservation in Africa. In *Directions in international terrorism: theories, trends and trajectories*: 97–119. Solomon, H. (Ed.). Singapore: Springer. https://doi.org/10. 1007/978-981-16-3380-5 6
- Strampelli, P., Searle, C.E., Smit, J., Grau, A., Henschel, P., Lobora, A.L., Mitchell, N., Macdonald, D.W. & Dickman, A.J. (2021). Insights into the status and distribution of cheetah (*Acinonyx jubatus*) in an understudied potential stronghold in southern Tanzania. *Afr. J. Ecol.* **59**, 334–341.
- Tobler, M.W. & Powell, G.V.N. (2013). Estimating jaguar densities with camera traps: problems with current designs and recommendations for future studies. *Biol. Conserv.* 159, 109–118.
- Vanak, A.T., Fortin, D., Thaker, M., Ogden, M., Owen, C., Greatwood, S. & Slotow, R. (2013). Moving to stay in place: behavioral mechanisms for coexistence of African large carnivores. *Ecology.* 94, 2619–2631.
- Vodouhê, F.G., Coulibaly, O., Greene, C. & Sinsin, B. (2009). Estimating the local value of non-timber forest products to Pendjari biosphere reserve dwellers in Benin. *Econ. Bot.* **63**, 397–412.
- Weise, F.J., Lemeris, J.R., Jr., Munro, S.J., Bowden, A.,
  Venter, C., van Vuuren, M. & van Vuuren, R.J. (2015).
  Cheetahs (*Acinonyx jubatus*) running the gauntlet: an evaluation of translocations into free-range environments in Namibia. *PeerJ.* 3, e1346.
- Weise, F.J., Vijay, V., Jacobson, A.P., Schoonover, R.F., Groom, R.J., Horgan, J., Keeping, D., Klein, R., Marnewick, K., Maude, G., Melzheimer, J., Mills, G., van der Merwe, V., van der Meer, E., van Vuuren, R.J., Wachter, B. & Pimm, S.L. (2017). The distribution and numbers of cheetah (*Acinonyx jubatus*) in southern Africa. *PeerJ* 5, e4096.
- Welch, R.J., Bissett, C., Perry, T.W. & Parker, D.M. (2015). Somewhere to hide: Home range and habitat selection of cheetahs in an arid, enclosed system. *J. Arid Environ.* **114**, 91–99.
- Wilton, C.M., Puckett, E.E., Beringer, J., Gardner, B., Eggert, L.S. & Belant, J.L. (2014). Trap array configuration influences estimates and precision of black bear density and abundance. *PLoS One.* 9, e111257.
- Woodroffe, R. (2000). Predators and people: using human densities to interpret declines of large carnivores. *Anim. Conserv.* 3, 165–173.
- Xiao, W., Feng, L., Mou, P., Miquelle, D.G., Hebblewhite,
  M., Goldberg, J.F., Robinson, H.S., Zhao, X., Zhou, B.,
  Wang, T. & Ge, J. (2016). Estimating abundance and density of Amur tigers along the Sino–Russian border.
  Integr. Zool. 11(4), 322–332.

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# **Supporting information**

Additional supporting information may be found online in the Supporting Information section at the end of the article.

**Table S1.** An informal review of available peer-reviewed literature regarding cheetah density estimation. SECR, spatially explicit capture-recapture; Non-SECR, non-spatially explicit capture-recapture techniques

**Table S2.** Model selection results for two sets of 12 fitted multi-session models (totalling 30 models) ranked by Akaike's Information Criterion corrected for small sample sizes (AICc) for two sessions of 2021 Northwest African cheetah density in Penjari Reserve, WAP Complex, Benin. Loc and sex are two parameters whose effects on detection probability were investigated in the models to check the gender of the identification or the type of station influencing the identification (sense mark, trail, or water points)

Table S3. Model selection results for one set of eight fitted multi-session models (totalling 18 models) ranked by Akaike's Information Criterion corrected for small sample sizes (AICc) for dry season of 2023 Northwest African cheetah density in Pendjari NP, Greater Zakouma, Chad. Loc and sex are two parameters whose effects on detection probability were investigated in the models to check the gender of the identification or the type of station influencing the identification (sense mark, trail, or water points)

**Table S4**. Testing of different buffers with top models in Pendjari and Zakouma

Figure S1. Pendjari cheetah IDs in 2021: Photographs of M4. M5. M11 and F10 taken in this survey were compared with previous (2019; 2021) camera trap photographs taken in ZSL-RWCP/Panthera survey. IDs were consolidated using multiple images across multiple stations and collaborative ID kits for the landscape. M8 and M9 were coalition. Only the right flank of M8 was available, which was not matched with any other males right side. Zakouma cheetah IDs 2023: F7 had only the left flank. But because it was the only female that had two cubs and it was not matched with any other female or unknown female on the left flank, it was considered a separate female. F9 and F5 got to different flanks. Available flank which was not matched by any other females or unknown. But on the other hand, the pattern of their tails was completely different, and they were considered as 2 separate individuals. U4, with only its left flank identified and an undetermined gender, does not align with any other left sides of cheetahs. It is selected as an independent individual with an unknown sex.

**Figure S2.** When individuals were detected at different camera traps within a seasonal period, we indicated the straight-line distance between these camera traps with lines Moving paths of individuals between the camera traps in the dry and wet seasons of Pendjari and the dry season of Zakouma.