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# **Resting State Network Topology of the Ferret Brain**

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#### Abstract

Resting state functional magnetic resonance imaging (rsfMRI) has emerged as a versatile tool for non-invasive measurement of functional connectivity patterns in the brain. RsfMRI brain dynamics in rodents, non-human primates, and humans share similar properties; however, little is known about the resting state functional connectivity patterns in the ferret, an animal model with high potential for developmental and cognitive translational study. To address this knowledge-gap, we performed rsfMRI on anesthetized ferrets using a 9.4 tesla MRI scanner, and subsequently performed group-level independent component analysis (gICA) to identify functionally connected

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Authorship Statement

ZZ, YIS, and FF designed the experiments, ZZ, YL, and KKS performed the experiments, AS and WG analyzed the data, SRS performed histology and labeling, and ZZ, AS, SRS, WG, FF, and JHG wrote the paper.

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brain networks. Group-level ICA analysis revealed distributed sensory, motor, and higher-order networks in the ferret brain. Subsequent connectivity analysis showed interconnected higher-order networks that constituted a putative default mode network (DMN), a network that exhibits altered connectivity in neuropsychiatric disorders. Finally, we assessed ferret brain topological efficiency using graph theory analysis and found that the ferret brain exhibits small-world properties. Overall, these results provide additional evidence for pan-species resting-state networks, further supporting ferret-based studies of sensory and cognitive function.

#### **Keywords**

Resting state; fMRI; Ferret; Default mode network; Networks; Graph theory

#### INTRODUCTION

Behavior and cognition are supported by the brain's intrinsic anatomical and functional connectivity (i.e. correlated activity patterns between distinct brain regions) (Fox et al., 2012; Brusa et al., 2014; Zhou et al., 2016a). Resting state functional magnetic resonance imaging (rsfMRI) has emerged as a powerful tool for measuring functional connectivity non-invasively across species (Biswal et al., 1995; Damoiseaux et al., 2006; Vincent et al., 2007; Belcher et al., 2013; Mechling et al., 2014; Kyathanahally et al., 2015). Groups of functionally connected brain regions measured using rsfMRI can be defined as networks that likely reflect the underlying structural organization and communication in the brain (Greicius et al., 2009; van den Heuvel and Hulshoff Pol, 2010). However, functional connectivity within such resting state networks (RSNs) is impaired in human psychiatric disorders such as schizophrenia, Alzheimer's disease, and autism spectrum disorders (Liu et al., 2008; Minshew and Keller, 2010; Sanz-Arigita et al., 2010; Zhang et al., 2011; Karbasforoushan and Woodward, 2012; Spetsieris et al., 2015; Wang et al., 2015). In particular, the default mode network (DMN), which is composed of the hubs in the parietal and medial prefrontal cortices, has been shown to exhibit elevated activity in neurotypical participants at rest, while the aforementioned disorders show either hypo- or hyperconnected DMNs (Raichle et al., 2001; Greicius et al., 2004; Minshew and Keller, 2010; Sheline et al., 2010; Wang et al., 2015). Resting state studies using graph theory analysis, a set of techniques that assesses the ease of information transfer among distributed brain regions within the whole brain system, have suggested that human and animal brains exhibit smallworld network topology (Watts and Strogatz, 1998; Achard et al., 2006; Bullmore and Sporns, 2012). This network attribute characterizes optimized trade-off between costefficient wiring and network resilience, and has shown to be altered in neuropsychiatric disorders (Liu et al., 2008; Zhang et al., 2011; Zhao et al., 2012).

Animal models bridge the gap between human psychiatric disorders and their underlying mechanisms. However, the study of these underlying mechanisms relies on accurate comparisons between animal model and human brain dynamics. Therefore, it is important to identify RSNs and their impairments across all research models. The ferret has a rich history of developmental research due to its early post-natal (P) ages corresponding to 25 weeks of gestation in the human (Barnette et al., 2009), as well as its manageable gestation time of

~42 days. Importantly, the ferret brain is born lissencephalic and begins cortical folding (gyrification) at P10 (Sawada and Watanabe, 2012), allowing for translational study of early brain insults and impairments (Empie et al., 2015; Kou et al., 2015). Due to its well-developed sensory and higher-order brain structures, the ferret can be a useful model for studying sensory and cognitive impairments across a broad range of developmental time points (Basole et al., 2003; Fritz et al., 2010; Foxworthy et al., 2013a; Atiani et al., 2014). A map of neurotypical functional connectivity patterns would serve as a framework for translational studies in the ferret. Despite studies exploring the structure and function of individual brain regions, such large-scale brain network topology in the ferret has yet to be examined (Manger et al., 2002; Basole et al., 2003; Bizley and King, 2009; Fritz et al., 2010; Sellers et al., 2013; Bizley et al., 2015; Yu et al., 2015; Zhou et al., 2016b).

Here, we aimed to identify sensory and default mode RSNs in the ferret. We hypothesized that the ferret brain would exhibit RSNs comparable to those found in humans and nonhuman primates. To do this, we performed group-level independent component analysis (gICA), a data-driven approach to identify spatially independent functional networks, on anesthetized ferret resting state scans. Regions of interest composing the gICA functional networks were then compared to histological sections for identification of anatomical brain regions. Network connectivity measured by correlation analysis further validated withinnetwork connectivity, and revealed the presence of interconnected somato-motor and putative default mode networks. We subsequently used graph theory analyses to demonstrate that the ferret brain network topology resembles that of a small-world network. As a whole, these findings add to the wealth of studies arguing for homologous cross-species RSNs (Vincent et al., 2007; Lu et al., 2012; Belcher et al., 2013; Hutchison et al., 2013; Mechling et al., 2014; Miranda-Dominguez et al., 2014; Sforazzini et al., 2014; Barks et al., 2015; Kyathanahally et al., 2015; Liang et al., 2015; Pan et al., 2015), and support the notion that ferrets are a robust animal model for translational research.

#### **MATERIALS AND METHODS**

#### Subjects

A total of six adult (16–19 weeks old) female ferrets (weighing 0.7 to 1kg, group housed in a 12 hr light/12 hr dark cycle; Marshall BioResources, North Rose, NY) were included in this study. All animal procedures were performed in compliance with the National Institutes of Health guide for the care and use of laboratory animals (NIH Publications No. 8023, revised 1978), and approved by the Institutional Animal Care and Use Committee of the University of North Carolina at Chapel Hill and the United States Department of Agriculture (USDA Animal Welfare).

#### **Animal Preparation**

Ferrets were initially anesthetized with intramuscular injection of ketamine/xylazine (30 mg/kg of ketamine, 1–2 mg/kg of xylazine) for subsequent intubation and setting of an intravenous (IV) line in the right saphenous vein. To control for the variability in eyelid position after anesthesia induction, the skin above and below the eyes were sutured individually such that the eyelids remained open throughout the scans. Lights within the

scanner room were turned off for the duration of the experiment. The animal was then moved and placed into a custom-made, MRI-compatible stereotaxic holder. The holder was lined with a heating pad to maintain the rectal temperature of the animal at 38–39°C. Animals were stabilized using custom ferret-compatible ear-bars and a tooth-bar. Animals were mechanically ventilated through an MRI compatible ventilator (0.5% to 0.75% isoflurane, 8–10cc, 50 bpm, medical grade air) and administered 5% dextrose lactated ringer's (4.264mL/hr), xylazine (1.5 mg/kg/hr), and vecuronium bromide paralytic (0.0769mg/kg/hr) via IV. The end-tidal CO<sub>2</sub> (EtCO<sub>2</sub>; maintained around 3%), oxygen saturation, heart rate (estimated through the pulse oximeter), and rectal temperature were closely monitored through the procedure. EtCO<sub>2</sub> values from this system were previously calibrated against invasive sampling of arterial blood gas in rats, reflecting a pCO<sub>2</sub> level of ~35 mmHg (Shih et al., 2012; Shih et al., 2013). Paralube and saline drops were applied to protect the eyes.

#### fMRI Protocol

All data were acquired in a Bruker 9.4 Tesla scanner (Bruker AVANCE, Billerica, MA). A 72 mm volume coil and four-channel phased array coil were used for excitation and signal reception, respectively. Anatomical images were acquired with the following Rapid Acquisition with Relaxation Enhancement (RARE) sequence: repetition time (TR) = 3500 ms, echo time (TE) = 35 ms, RARE factor = 8, matrix size =  $280 \times 280$ , FOV =  $2.8 \times 2.8$  cm², slice thickness = 1 mm. Blood-oxygenation level dependent (BOLD) functional resting state scans were acquired with the following gradient-echo planar imaging (EPI) sequence: TR = 2000 ms, TE = 13 ms, matrix =  $80 \times 80$ , field of view (FOV) =  $2.8 \times 2.8$  cm², slice thickness = 1 mm. For both anatomical and functional scans, 24 adjacent slices were acquired with the same geometric positioning. Ten-minute resting state scans were acquired for all animals; for two animals, two additional resting state scans were acquired.

#### MR Data Pre-processing

Images were preprocessed using the Analysis of Functional NeuroImages software suite (AFNI v2011-12-21-1014, Bethesda, MD) and FMRIB's Software Libraries (FSL v5.0, University of Oxford, Oxford, UK). Briefly, the anatomical data workflow included removal of non-brain tissue (skull-stripping) and tissue segmentation. The anatomical data were skull-striped automatically (AFNI 3dautomask) and then hand-corrected for errors on a case-by-case basis. Tissue segmentation (FSL fast) was performed on the skull-stripped datasets to produce volumes representing cerebral spinal fluid (CSF) and white-matter (WM) for nuisance signal regression.

The functional data workflow included discarding volumes collected during scanner disequilibrium, slice-timing correction, motion correction, alignment to a pre-existing high-resolution T2-weighted template, spatial smoothing, band-pass filtering, and orthogonalization of nuisance signals including motion-derived parameters. Specifically, the first 10 volumes were excluded and the remaining data underwent slice- timing correction (AFNI 3dTshift). Then, the data were motion corrected using the first functional volume post-exclusion as the target image (AFNI 3dvolreg). Next, the data were smoothed (FWHM = 2.5 mm), filtered (0.01–0.10 Hz), and effectively regressed of whole-brain, white matter

(WM), cerebral spinal fluid (CSF), and six motion parameters corresponding to roll, pitch yaw, and displacement in the superior, left, and posterior directions (AFNI function: 3dBandpass). Note, the inclusion of motion vector orthogonalization was likely redundant given that the estimated motion in these anesthetized animals was negligible (e.g. the derivative of all motion parameters < 0.001). Within-animal alignment was performed via rigid body transformation of the functional data to the anatomical images (AFNI 3dAllineate). Between-animal alignment was performed by co-registering each animal's anatomical dataset to a separate template via a combination of linear (AFNI 3dAllineate) and non-linear (AFNI 3dQwarp) transformations. Each step in the pre-processing pipeline (tissue segmentation, alignment, etc.) was visually inspected for quality assurance.

#### **Anatomical Labeling**

Brain structures of regions of interest in the 24 slices of the MR scans were determined using the relevant plates of a ferret brain atlas (included both histological and MRI structural sections of separate animals; Radtke-Schuller et al., unpubl.) as reference. Each in vivo MR slice (from the resting state data) was related to the corresponding atlas in vivo MRI image and histology section stained for cells (Nissl). The nomenclature of anatomical structures used is based on so far published data on the ferret and/or other carnivores (mainly cat and dog). Nissl stained sections of the brain atlas series (50  $\mu$ m thick cryostat sections) referenced to the 24 MR slices of this study are shown with the anatomical and functional labels relevant for this study.

#### **Connectivity Analysis**

Following preprocessing, rsfMRI connectivity analyses were carried out using AFNI, FSL, and the Brain Connectivity Toolbox (Rubinov and Sporns, 2010). First, RSNs were produced using a data-driven gICA approach (FSL melodic). The number of independent components was set to 10. This number was chosen based on the observation that in humans, about 10 RSN can be consistently identified (Smith et al., 2009) and because we were using pre-processed data; thus we expected a smaller number of 'meaningful' components. The IC maps were thresholded (voxel-wise Z-score >= 1.96, i.e. two standard deviations) using an alternative hypothesis test based on fitting a Gaussian/gamma mixture model to the distribution of voxel intensities within spatial maps (Beckmann and Smith, 2004; Beckmann et al., 2005). The IC maps were then visually inspected and certain RSNs were selected for further analyses. RSNs were selected based on the following criteria, 1) consisted of relatively large continuous regions, 2) were largely bilateral, and/or 3) could be referred to anatomical landmarks comparable to well-known structures in existing literature of ferrets and other mammals. For identification of brain regions within gICA connectivity maps, main foci were defined as regions that exhibited high connectivity strength (labeled in yellow) and satisfied the above criteria.

Ferret rsfMRI network connectivity properties were further analyzed using a graph theory approach. Graph measures (GMs) were computed using a graph representation of rsfMRI connectivity measures. Regions-of-interest (ROIs), representing the graph nodes, were defined within the pre-selected gICA networks (N = 7). For each network, spherical ROIs (radius = 1 mm, spatially non-overlapping) were defined as the top five local maxima (AFNI

3dExtrema, minimum distance = 3 mm) resulting in a semi-dense (# of nodes = 35) coverage of the brain. The minimum distance was based on a smoothness estimate from all animals ([X,Y,Z] = 2.80, 2.96, 2.20 mm; AFNI 3dFWHMx). The strength of connection between nodes was computed via temporal correlation analysis using each ROI as a seed region (AFNI 3dNetCorr). Fisher-Z transformed temporal correlation values, characterizing the connection strength between each pair of ROIs, were generated for each animal and then used to calculate various GMs. Within (average connectivity within a set of nodes) and between (average connectivity between sets of nodes) were compared across animals for each RSN. Within- and between-network connectivity was statistically validated across animals using standard t-tests. Significance was determined using a combined approach; P < 0.05 (uncorrected) and  $\mu_{z\text{-Corr}}$ . 0.1. The small-world (SW) metric—a common brain network signature across species—was also computed. SW was computed using the clustering coefficient (CC; BCN Toolbox function) and characteristic path length (PL; BCN Toolbox function) and was determined by comparing the average CC and PL of the actual data (CCA and PLA) against random (CCR and PLR) permutations (BCN ToolBox function, n = 1000 permutations;

$$SW = [CC_A/CC_B]/[PL_A/PL_B]$$

where values > 1 are indicative of a small world network. The SW parameter was calculated using thresholded (Z-correlation > 0.1) connectivity matrices. Distance measures (required for the PL measure) were computed as one minus the temporal correlation (i.e. high correlation values were represented by shorter distances). The ratio measures (log-transformed CC, PL, and SW) were also compared across animals using t-tests (h<sub>0</sub>; log  $[X_A/X_R] = 0$ ).

#### **RESULTS**

#### Identification of resting state network (RSNs) in the ferret brain

We used gICA to derive RSNs in the ferret brain (Figs. 1–3). Pre-processed BOLD rsfMRI data collected from lightly anesthetized (0.5–0.75% isoflurane with xylazine, an anesthetic regimen studied in previous ferret studies (Sellers et al., 2013; Sellers et al., 2015)) female ferrets (N = 6) were used for the analysis. The components—or putative networks—were visually inspected and those not meeting our selection criteria (Fig. 3, N = 3 networks) were excluded and the remaining networks (Figs. 1 & 2, N = 7 networks) were further evaluated. These networks were topological consistent with RSNs observed in other species, and included the motor/somatosensory (#1 and #9), somatosensory (#2), auditory (#3), visual (#4) and putative default mode (DMN) (#5 [anterior] & #6 [posterior]) networks. The functional (bolded) and anatomical structures that exhibited high connectivity strengths (main foci) in each of these networks are listed as follows:

The main connectivity foci of the motor/somatosensory network (Fig. 1, IC[#1]) included primary motor cortex (M1) of the posterior sigmoid gyrus (PSG), premotor cortex (PM) of anterior sigmoid gyrus (ASG), primary somatosensory cortex (S1) in posterior sigmoid gyrus (PSG) and coronal gyrus (CNG), higher order somatosensory cortex namely the

tertiary somatosensory area (S3) of suprasylvian gyrus (SSG) and caudate nucleus (NC) of the basal ganglia.

The second motor/somatosensory network (Fig. 1, IC[#9]) also included the main foci primary motor cortex (M1) in PSG, premotor cortex (PM) in ASG and higher order somatosensory cortex namely tertiary somatosensory area (S3) in lateral gyrus (LG), but the relative positions of these main foci were medial to that of IC[#1], and the primary somatosensory cortex and caudate nucleus were not included.

Main connectivity foci of the somatosensory network (Fig. 1, IC[#2]) included primary somatosensory cortex (S1) of PSG and CNG, higher order somatosensory cortex namely the tertiary somatosensory area (S3) of CNG, multisensory cortex in the medial bank of rostral suprasylvian sulcus (MRSS) of CNG, rostral part of posterior parietal cortex (PPr) of SSG and functionally unidentified cortex rostrally adjacent to S1 in PSG, pro-PSG and CNG.

Main connectivity foci of the auditory network (Fig. 1, IC[#3]) included primary auditory cortex (A1) in medial ectosylvian gyrus (MEG), secondary and higher order auditory cortex namely the anterior auditory field (AAF) in MEG, the posterior suprasylvian field (PSF) in posterior ectosylvian gyrus (PEG), the posterior pseudosylvian field (PPF) and pro-PPF (the rostral border region of PPF) of PEG, anterior ventral field (AVF) of the anterior ectosylvian gyrus (AEG), anterior dorsal field (ADF) of AEG, ventroposterior field (VP) in PEG, multisensory cortex in the medial bank of rostral suprasylvian sulcus (MRSS) of CNG, lateral bank of rostral suprasylvian sulcus (LRSS) of AEG, pseudosylvian sulcal cortex (PSSC) of AEG and PEG, higher order visual cortex in the anteromedial lateral suprasylvian cortex (AMLS) of SSG and anterolateral lateral suprasylvian cortex (ALLS) of MEG.

Main foci of the visual network (Fig. 1, IC[#4]) included primary visual cortex (area 17), secondary and higher order visual cortex namely area 18/19, area 21 of SSG, the anteromedial lateral suprasylvian cortex (AMLS) of SSG and anterolateral lateral suprasylvian cortex (ALLS) of MEG, the suprasylvian cortex (SSy), the caudal part of posterior parietal cortex (PPc) of SSG and LG, postsplenial cortex (PSC), functionally undefined cortex in rostral ventral PEG (vPEG) and NC of the basal ganglia.

We labeled the network #5 (Fig. 2, top, IC[#5]) as a putative anterior default mode network as it was composed of main foci in medial prefrontal cortex namely prelimbic cortex (PL), medial dorsal prefrontal cortex (dPFC) in PRG and premotor cortex (PM) in ASG.

Additionally network #6 (Fig. 2, bottom, IC[#6]) was deemed a putative posterior default mode network as it composed of main foci in posterior parietal cortex namely rostral posterior parietal cortex (PPr) in SSG and LG, caudal posterior parietal cortex (PPc) in SSG and LG, posterior cingulate cortex (CG), higher order somatosensory cortex tertiary somatosensory area (S3) in CNG, multisensory cortex of the medial bank of rostral suprasylvian sulcus (MRSS) in CNG and primary motor cortex (M1) in PSG.

Table 1 summarizes the location of each RSN in the corresponding anatomical regions in the ferret brain where main foci were defined as areas with strong correlation (labeled in yellow). All labeled brain areas spanned at least two consecutive slices.

#### **Anatomical Labeling of RSN brain regions**

Main foci structures of high connectivity within networks were referenced to the relevant plates of a ferret brain histology atlas (Radtke-Schuller et al., unpubl.). The sections of the histology atlas (Nissl-stained) were selected based on the corresponding in vivo atlas MR slices. Therefore, the structural template used for registering the resting state MR images was directly comparable to the sections of the atlas (Fig. 4). The nomenclature of anatomical structures used in the atlas was based on so far published data on the ferret and/or other carnivores. We used the references in the following paragraph to define brain regions within the gICA networks.

To localize the ferret's somatosensory cortex we used the following references for S1: Leclerc et al. (1993); Rice et al. (1993); McLaughlin et al. (1998); MRSS, LRSS: Keniston et al. (2009); S2,S3: Foxworthy and Meredith (2011); Meredith and Allman (2015); for posterior parietal cortex (PPr and PPc): Manger et al. (2002); Foxworthy and Meredith (2011); Foxworthy et al. (2013b); for visual cortex area 17: Rockland (1985); Henderson (1987); Law et al. (1988); Innocenti et al. (2002) (also for areas 18, 19 and 21); area 20 (20a, 20b): Manger et al. (2004); SSy and other areas: Cantone et al. (2005). The region of SSy has been renamed by several authors, for example see Homman-Ludiye et al. (2010). For AMLS, ALLS we used Manger et al. (2008); for auditory cortex (primary and higher order cortex) we used Bizley et al. (2005); Bajo et al. (2007); Atiani et al. (2014); for PSSC we used Ramsay and Meredith (2004). For frontal cortex (dPFC, PM and CG; also for primary motor cortex) we referenced Mustela and Cercoleptes (Brodmann, 1909), dog (Kreiner, 1961), ferret PFC (Duque and McCormick, 2010; Fritz et al., 2010) studies; for PL (cat) (Room et al., 1985). For RSG and PSC we referred to the cat (Olson and Musil, 1992).

#### Quantification of within- and between-network connectivity

We noticed two interesting features in our data set: first, gICA analysis revealed two separate components embodying the anterior and posterior DMNs. Previous studies have shown that the DMN is composed of dissociate, yet interconnected subnetworks (Andrews-Hanna et al., 2010; Lu et al., 2012; Kyathanahally et al., 2015). Second, we found an abundance of motor and somatosensory related gICA components, which seemed to be unique to our dataset. To shed light on these two features and to further quantify the connectivity patterns present within our dataset, we computed within- and between-network connectivity using correlation analysis. The ferret brain was subdivided into a set of non-overlapping nodes or regions-of-interest (ROIs, Fig. 5A) using the included RSNs detailed above (Fig. 1: IC's #1-4 & #9, and Fig. 2; IC's #5 & #6]). Temporal correlation was used to define the strength of connection between nodes and the total pair-wise representation, or correlation matrix, was used to compute graph measures. The mean Fisher's-Z transformed correlation matrix (Fig. 5B) was typified by strong within network connectivity (main diagonal) and moderate between network connectivity. Within and between RSN connectivity was quantified using the average correlation measures for each set of nodes (Fig. 5C within-white and betweengrey). All RSNs had significant (Fig. 5C; \* represents P < 0.05 uncorrected,  $\mu_{Z\text{-}Correlation}$ 0.10) within-network connectivity. Significant between-network connectivity was also detected for a subset of networks including somatosensory/motor (IC #1 and #2; P = 0.011),

anterior DMN and posterior DMN (IC #5 and #6; P = 0.015), and motor with both anterior DMN (IC #9 and #5; P = 0.014) and posterior DMN (IC #9 and #6; P = 0.012).

#### Graph measures confirm "small-world" brain network behavior in ferrets

The human brain exhibits network properties that are characterized by optimal spatial and metabolic efficiency for global and local parallel information processing (Bullmore and Sporns, 2012; Uehara et al., 2014). To determine if the ferret brain also displays this economic network organization, we used graph theory to quantify the efficiency of ferret brain connectivity. Overall brain network architecture was assessed in each animal using the "small-world" (SW) graph measure (Table 2), a metric based on the clustering coefficient (CC) and characteristic path length (PL) of the actual data versus random simulations (see methods for full details). Small-world networks (SW > 1) are characterized by a short overall PL and a high CC. The PL was similar between the actual and random data however the CC was statistically different (P = 0.002) resulting in an average SW significantly greater than 1 (P = 0.003). Taken together, these results indicate that the functional connectivity patterns within and between networks in the ferret brain are optimized for efficient local and long-range communication.

#### DISCUSSION

Due to the ability to acquire data from both animals and humans in the same manner, rsfMRI has emerged as a powerful translational method for bridging preclinical and human studies. In conjunction with data-driven gICA and graph theory analysis methods, rsfMRI has proven to be a robust approach to identify and characterize similar brain networks across species. Here we report the presence of seven networks (two motor/somatosensory, somatosensory, auditory, visual, anterior DMN, and posterior DMN) in the ferret brain similar to those previously shown in human and animal data (Damoiseaux et al., 2006; Vincent et al., 2007; Lu et al., 2012; Belcher et al., 2013; Mechling et al., 2014; Stafford et al., 2014; Kyathanahally et al., 2015). We found interconnected motor and somatosensory networks, and interconnected DMN sub-networks using correlation analyses. We further explored the network topology using graph theory analysis and found that the ferret brain is economically organized in a small-world manner. Together, our data supports the presence of modular and stereotyped resting state networks, including a DMN, conserved across species. Further, these results argue for the study of the ferret as an animal model for translational research, and provide a foundation for future ferret brain mapping.

#### Comparison to human and animal resting state literature

Previous resting state functional connectivity studies have reported a breadth of canonical resting state networks stable across species and sessions. Consistent with existing studies, we observed the presence of multiple sensory and motor networks (Damoiseaux et al., 2006; Lu et al., 2012; Belcher et al., 2013). Fractionation of sensory and motor networks is observed in human and non-human primate literature (Damoiseaux et al., 2006; Belcher et al., 2013), perhaps indicative of distinct primary and higher-order networks. We found several somatosensory and motor networks similar to studies in mice, rats, and non-human primates (Hutchison et al., 2010; Belcher et al., 2013; Mechling et al., 2014; Gozzi and

Schwarz, 2016); however, we found a single network for the visual regions, contrasting the primary and higher-order separations seen in the aforementioned studies. This may be explained by the limited coverage of V1 in our scans (due to constrained field of view parameters), or that the ferret visual system is integrated in its functional connectivity. The fractionation of sensory areas may arise from a structural basis: for example, S1, S2, and S3 of rats, ferrets, monkeys receive inputs from distinct regions of thalamus (Friedman and Murray, 1986; Spreafico et al., 1987; Foxworthy and Meredith, 2011). Thalamic subdivisions encode and relay unique information (Marlinski and McCrea, 2008), and may synchronize with cortical subregions in different communication channels (ie. functional networks).

The DMN, which has been extensively characterized in several other animals and the human, is of particular interest due to its involvement in states of self-reference and rest and its relevance to mental disorders (Raichle and Snyder, 2007; Buckner et al., 2008; Raichle, 2015). Human and non-human primate studies consistently show that the DMN is comprised of the medial PFC, posterior cingulate cortex (PCC), inferior parietal cortex, lateral temporal cortex, and the hippocampus (Damoiseaux et al., 2006; Buckner et al., 2008). Similar connectivity patterns have been observed in animal studies with medial PFC and PCC showing up the most consistently in the reported DMNs (Vincent et al., 2007; Andrews-Hanna et al., 2010; Lu et al., 2012). We found in the ferret a putative anterior DMN that included the medial and dorsal PFC, and a posterior DMN that included the posterior cingulate and posterior parietal cortex. Key differences between the ferret and rodent DMNs lie in the presence of the orbitofrontal cortex and hippocampus (Lu et al., 2012; Sforazzini et al., 2014; Zerbi et al., 2015). The orbitofrontal cortex is present in the DMN of both rodents but not the ferret, and the hippocampus is present in the rat, but not the ferret and mouse. The absence of orbitofrontal cortex in the ferret DMN may not be a surprising observation as it seems to form its own network in higher order animals (Belcher et al., 2013), and occupies a functional role in reward-related behavior rather than rest and quiescence (Kringelbach, 2005). Despite these differences, our results overall support the presence of defined and consistent resting state networks, invariant of animal species.

While there is evidence that anesthesia alters the dynamic properties of functional connectivity (Barttfeld et al., 2015; Liang et al., 2015), resting state networks persist during anesthesia, albeit slightly diminished in connectivity magnitude (Vincent et al., 2007; Hutchison et al., 2013). Signatures of functional networks in awake states, such as anatomically-confined and bilateral connectivity patterns, remain prominent under low levels of isoflurane anesthesia (Grandjean et al., 2014). Nevertheless, the use of anesthesia is a potential confound and limitation for our study (Sellers et al., 2013; Sellers et al., 2015).

The functionally connected brain regions that comprised the gICA network maps ultimately depend on the analysis method and the level of thresholding applied to the dataset (Hutchison et al., 2013). We opted for a conservative approach to identify brain regions that contribute to the gICA networks. Brain regions were defined by areas in the gICA connectivity map that passed the criteria of 1) Z-Correlations > 1.96, 2) strong, contiguous correlation values, and 3) labels spanning at least two consecutive slices. Using these

criteria, we identified functional network maps that were both anatomically relevant and stringently defined.

#### Significance of the ferret DMN

Several studies have reported that the DMN exhibits modular organization; in other words, the DMN is composed of sub-networks centered on key hubs. Comparative anatomy in monkeys and humans suggest that the medial PFC and PCC serve as hubs due to their rich connectivity patterns with other association areas that are also present in the DMN (Buckner et al., 2008). Indeed, we found two distinct interconnected networks that contained the PFC and PCC, suggesting that ferrets possess a subset of resting state networks that resemble the DMN in higher-order animals.

Lu and colleagues highlighted that the rat DMN runs along the length of the midline from medial PFC to the PCC, as opposed to a focal localization in the monkey (Lu et al., 2012). Taking into account the motor sub-network connected with the DMN, we observed a similar pattern of posterior to anterior spread. Cat PCC receives input from higher-order sensory and premotor areas (Olson and Musil, 1992), and is active during visually-guided eye movements (Olson and Musil, 1992; Vogt and Gabriel, 1993). Given that cats and ferrets are both in the order Carnivora, it may be possible that PCC of both species share similarities in connectivity, explaining the inclusion of the midline motor regions in ferret DMN. The conclusions we are able to draw regarding the relationship between structural and functional connectivity are restricted by the limited number of ferret brain anatomical, and especially connectivity, studies. Future work may address this gap in the literature using diffusion tensor imaging and tract tracing.

While the functional relevance of the DMN in animals is debated, some studies shed light on how such a network could be important in animal behavior. One study showed that the homologous DMN in chimpanzees is most active at rest, moderately active during social tasks, and minimally active during non-social tasks (Barks et al., 2015). Additionally, the DMN sub-network centered on the posterior cingulate and mPFC is active during self-relevant affective cognition (Andrews-Hanna et al., 2010). Social behavior is evolutionarily conserved across animals and is beneficial to species survival. It may be possible that collective DMN brain activity relates to social, affective cognition known to be present in rodents, non-human primates, and potentially ferrets (Poole, 1978; Trezza et al., 2011; Gunaydin et al., 2014; Harris, 2015). Given these previous findings, the DMN poses as a prime target for the study of brain pathologies and impairments in social cognition. Although our study lacked targeted manipulation of the resting state networks, such perturbation would be the logical progression for future translational studies.

#### Small-world network properties of the ferret brain

This modular organization of the DMN and, more broadly, complex networks subserves efficiency and optimization of information transfer across brain regions. Highly complex natural networks that require a balance between metabolic cost and information processing exhibit a large degree of local clustering and few random, long-range connections (Watts and Strogatz, 1998; Achard et al., 2006; Bullmore and Sporns, 2012). Such organization

facilitates specialization within local nodes, as well as efficient parallel processing of distributed sub-networks. Several studies have utilized graph theory metrics, such as small-world and rich-club properties, to show that human and animal brain networks exhibit pronounced local clustering with sparse long-range connections (Hosseini and Kesler, 2013; Baliki et al., 2014; Collin et al., 2014; Miranda-Dominguez et al., 2014). We used the small-world graph theory metric to similarly measure how efficiently the ferret brain is connected. We found that, consistent across all recorded animals, the ferret brain network exhibits small world properties of high clustering coefficients. The characteristic path length was longer than expected of a small world network; however, recent studies have shown that path length increases with loss of consciousness (Monti et al., 2013; Uehara et al., 2014). As a whole, these data concur with previous reports of small-world characteristics of human and animal resting state networks. Our results add to the growing evidence that optimal brain metabolism and information processing benefit from highly-connected, specialized local nodes and distributed long-range wiring patterns.

#### Importance of ferret brain research

Systems neuroscience has experienced a dramatic shift away from using a broad set of model species towards the almost exclusive use of mice due to the availability of genetic tools. More recent developments in the realm of genetic engineering are now enabling a reconsideration of model species beyond the mouse. As a result, the interest in intermediate model species such as the ferret is undergoing a resurgence. For example, recent research has made considerable headway in mapping distinct anatomical and functional regions of the ferret brain. In particular, the function of the ferret visual and auditory cortices has been well characterized (Basole et al., 2003; Li et al., 2008; Bizley and King, 2009; Bizley et al., 2015; Smith et al., 2015; Town et al., 2015; Roy et al., 2016). There is substantial evidence for the sophistication of the ferret visual system through development. Specifically, the development of motion and orientation selectivity in the ferret visual cortex depends on propagating population activity dynamics within stimulus-selective columns (Li et al., 2008; Smith et al., 2015). These stimulus-property-selective dominance columns, present in cats, non-human primates, and humans, may play an expanded role in downstream visual information processing. Studies in the ferret auditory cortex have highlighted similarities between ferret and human uni-modal and multi-modal auditory processing (Bizley et al., 2012; Atiani et al., 2014; Town et al., 2015). As many neuropsychiatric disorders involve multi-modal impairments in sensory processing, the dissection of mechanisms underlying such facilities is particularly important. Additionally, recent efforts have been made to explore the role of frontal cortex regions in sensory regulation (Fritz et al., 2010; Zhou et al., 2016b). Here, ferret frontal cortex provides top-down sensory gating and stimulus selection in both auditory and visual conditions, reminiscent of the regulatory role of prefrontal cortex in monkeys and humans (Fuster, 2015). Results in our study provide functional validation for the inter-areal connections (overlapping sensory regions in networks 3 and 4) important for cross-modal cognitive processing, and may serve as a foundation for exploring new circuits involved in such processes.

#### Conclusion

In summary, we assessed whether the resting ferret brain exhibits distinct, functionally connected networks similar to those reported in humans and non-human primates. Indeed, we provided evidence for the presence of multiple, consistent sensory, motor, and higher-order networks in the ferret brain. Importantly, these results support the notion that resting state functional networks are conserved across species, and reflect the optimized brain architecture that subserves demanding cognitive computations. Our data provide a foundation for modeling psychiatric disorders through perturbation of intrinsic connectivity, and ultimately, the assessment of the mechanisms underlying these disorders.

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#### List 1. Anatomical abbreviations

AP

18	area 18
19	area 19
20	area 20
20a	area 20a
20b	area 20b
21	area 21
A	amygdala
<b>A1</b>	primary auditory cortex
AAF	anterior auditory field
ac	anterior commissure
ADF	anterior dorsal field
AEG	anterior ectosylvian gyrus
ALLS	anteriolateral lateral suprasylvian cortex
AMLS	anterior medial lateral suprasylvian cortex
AON	anterior olfactory nucleus

pretectal area

**ASG** anterior sigmoid gyrus

AVF anterior ventral field

cc corpus callosum

**Cb** cerebellum

**CG** cingulate gyrus

CL claustrum

**CNG** coronal gyrus

**dPFC** dorsal prefrontal cortex

**f** fornix

**Ent** entorhinal cortex

**Hip** hippocampus

**Hy** hypothalamus

IC inferior colliculus

LG lateral gyrus

**LGN** lateral geniculate nucleus

LRSS lateral bank of rostral suprasylvian sulcus

mPFC medial prefrontal cortex

M1 primary motor cortex

MEG medial ectosylvian gyrus

MGN medial geniculate nucleus

MRSS medial bank of rostral suprasylvian sulcus

NC caudate nucleus

**OB** olfactory bulb

och optic chiasm

**OBG** orbital gyrus, orbital cortex

opt optic tract

PAG periaqueductal grey

**PEG** posterior ectosylvian gyrus

**Pir** piriform cortex

**PL** prelimbic cortex

**PM** premotor cortex

**PN** pontine nuclei

PPc posterior parietal cortex, caudal part

**PPF** posterior pseudosylvian field

**PPr** posterior parietal cortex, rostral part

**PRG** proreal gyrus

**proCNG** CNG-like cortex bordering CNG rostrally

**proPPF** PPF-like cortex bordering PPF rostrally

proPSG PSG-like cortex bordering PSG rostrally

**PSC** postsplenial cortex

**PSSC** pseudosylvian sulcal cortex

**PSF** posterior suprasylvian field

**PSG** posterior sigmoid gyrus

**RN** red nucleus

**RSG** retrosplenial cortex

**S1** primary somatosensory cortex

**S2** secondary somatosensory cortex

**S3** tertiary somatosensory cortex

**SC** superior colliculus

**S** septal nuclei

SN substantia nigra

**SSG** suprasylvian gyrus

**SSy** suprasylvian cortex

Tha thalamus

Tu olfactory tubercle

**VP** vetroposterior field

vPEG ventral PEG

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#### **Highlights**

 We provide evidence that the ferret brain exhibits sensory, motor, and default mode resting state networks (RSNs), comparable to those found in humans and non-human primates.

- We demonstrated that the functional connectivity patterns in the ferret brain resemble that of a small-world network.
- These results support the idea of cross-species homologous RSNs, and the study of brain dynamics and impairments using ferrets as an animal model.

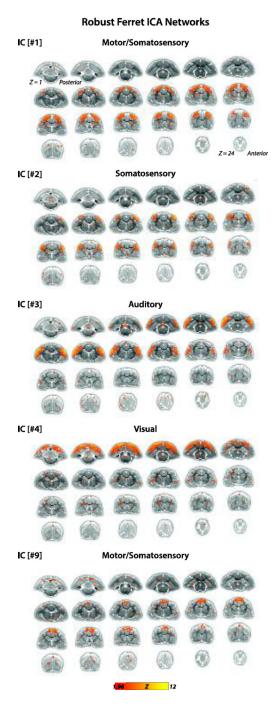
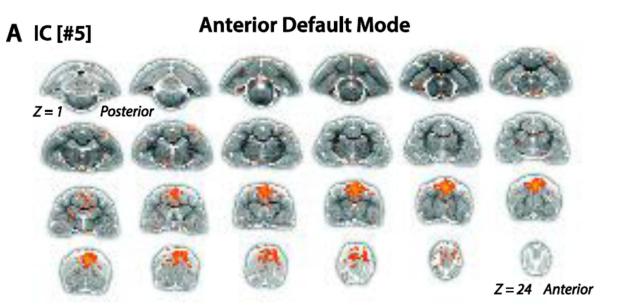


Figure 1. Ferret gICA networks. IC[#1] Motor/somatosensory network identified from the gICA analysis. Connectivity maps included primary motor cortex (M1 located on the PSG), premotor cortex (PM on ASG), primary somatosensory cortex (S1 on PSG and CNG), higher order somatosensory cortex (tertiary somatosensory area (S3 on SSG), and basal ganglia (caudate nucleus (NC)). Connectivity maps are overlaid onto T2-anatomical images with red-yellow color encoding using a 1.96 < Z-score < 12 threshold (see colorbar); same conventions for ICs #2–4. IC[#2] Somatosensory network identified from the gICA analysis.

Connectivity maps included the brain regions primary somatosensory cortex (S1 on PSG and CNG), multisensory cortex (MRSS on medial bank of rostral suprasylvian sulcus), posterior parietal cortex (PPr on SSG) and higher order somatosensory cortex (tertiary somatosensory area (S3 on SSG), and functionally unidentified cortex rostrally adjacent to S1 (on PSG, pro-PSG, and CNG). IC[#3] Auditory network identified from the gICA analysis. Connectivity maps included all primary and higher order auditory cortex fields, and adjacent multisensory and higher order visual cortex fields (summarized, see List 1 for all included regions). IC[#4] Visual network identified from the gICA analysis. Connectivity maps included the brain regions primary visual cortex (area 17), secondary and higher order visual cortex (area 18/19 on LG; area 21 on SSG; ALMS on SSG; ALLS on MEG; suprasylvian cortex (SSy), posterior parietal cortex (PPc on SSG and LG), postsplenial cortex (PSC), functionally undefined cortex (presumed higher order auditory cortex on vPEG) and basal ganglia (caudate nucleus (NC)). IC[#9] Motor/somatosensory network identified from the gICA analysis. Connectivity maps included the brain regions primary motor cortex (M1 on PSG), premotor cortex (PM on ASG), and higher order somatosensory cortex (tertiary somatosensory area (S3 on LG).

# **Ferret Default Mode RSNs**



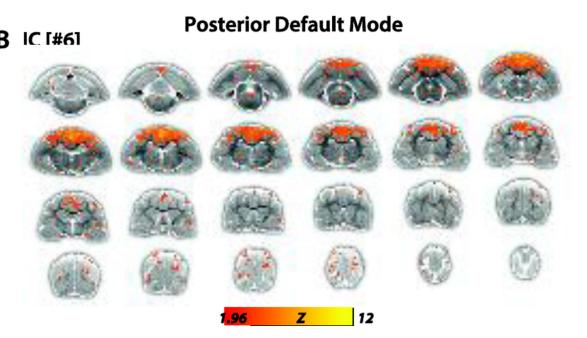


Figure 2. Anterior and posterior default mode networks of the ferret brain. (A).Putative anterior default mode network (IC[#5]) identified from the gICA analysis. Connectivity maps included the brain regions medial PFC, medial dPFC, and PM. Connectivity maps are overlaid onto T2-anatomical images with red-yellow color encoding using a 1.96 < Z-score < 12 threshold (see colorbar). (B).Putative posterior default mode network (IC[#6]) identified from the gICA analysis. Connectivity maps included the brain regions posterior parietal cortex, posterior cingulate cortex, S3, MRSS and M1.

# **Noisy Ferret ICA Networks**

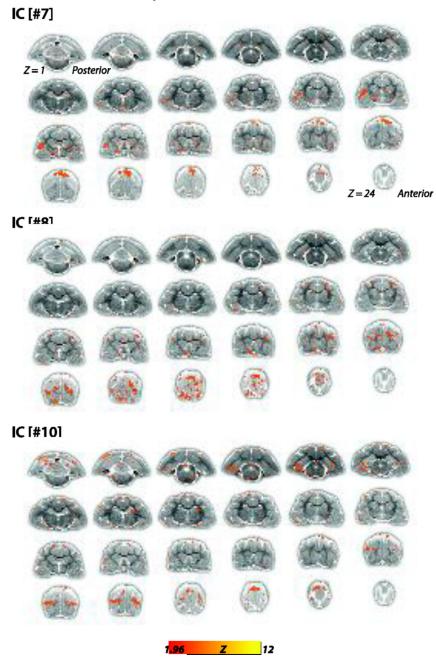


Figure 3. Excluded gICA Networks. Group-level ICA components #7, 8, and 10 were excluded from further analysis upon failing the following criteria, components 1) consisted of relatively large continuous regions with Z-Correlations > 1.96, 2) connectivity patterns were largely bilateral, and/or 3) could be referred to anatomical landmarks comparable to well-known structures in existing literature of ferrets and other mammals. Connectivity maps are overlaid onto T2-anatomical images with red-yellow color encoding using a 1.96 < Z-score < 12 threshold (see colorbar).

## **Corresponding Nissl Atlas**

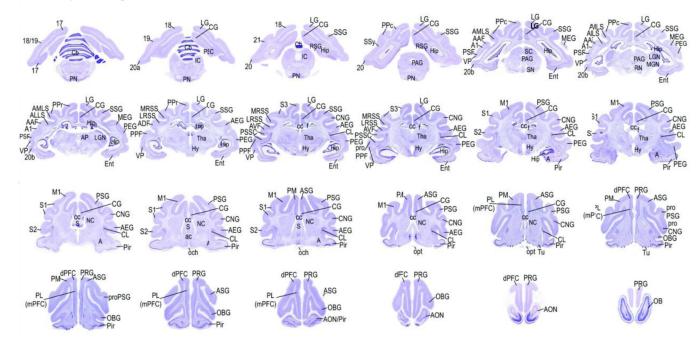


Figure 4.

Nissl stain sections corresponding to MRI slices. Nissl stained sections of the ferret brain atlas (50 µm thick cryostat sections; Radtke-Schuller et al., unpubl.) corresponding to the MR images from this study are shown with relevant anatomical and functional labels for the main foci found in the gICA maps and further anatomical labels for orientation. The labeling of anatomical structures used in this atlas was based on currently published data on the ferret and/or other carnivores (mainly cat and dog). Functional and structural nomenclatures are indicated on the left and right hemisphere, respectively.

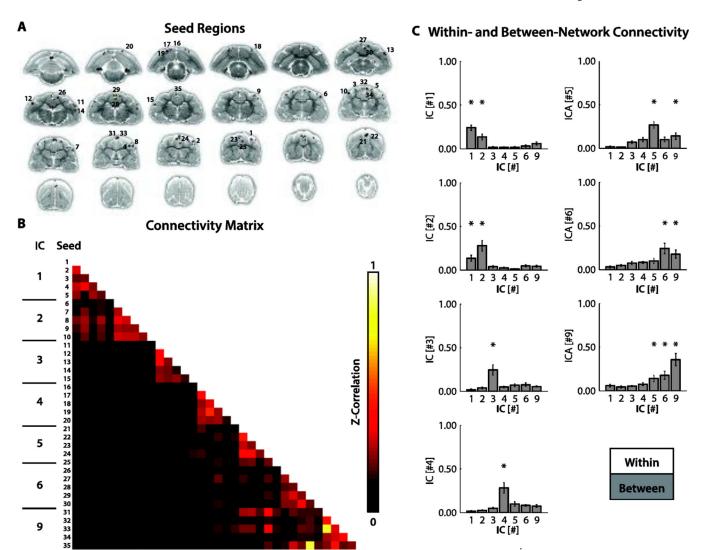


Figure 5.

Within- and between-network connectivity analysis. (A). Seeds for connectivity analysis. To compute within- and between-network connectivity, five spherical (radius of 1 mm) regionsof-interest (ROIs) were identified for each network. These ROIs were centered at the top five local maxima of the correlation map (minimum distance between each maxima was 3 mm), and served as representative samples of each network. Average BOLD time-series were extracted from each of the ROIs for subsequent correlation analysis. (B). Mean connectivity matrix. Group-level connectivity matrix of the average pair-wise correlations between the generated ROIs. Cells along the diagonal represent within-network connections and those that are off the diagonal represent between-network connections. Z-correlation strengths from 0 to 1 are represented by colors ranging from black to red to white (see colorbar). (C).Quantification of within- and between-network connectivity. To quantify the degree of within- and between-network connectivity, ROI correlation values were averaged across pairs for each network. Each bar graph represents mean correlation values relative to a particular network. White bars signify average correlation values for ROI pairs within the

network and gray bars signify average correlation values for pairs where native ROIs were connected to ROIs in outside networks. \* P < 0.05 (uncorrected) and  $\mu_{Z\text{-}Corr}$ . 0.1

#### Table 1

Main anatomical regions labeled in gICA maps. Anatomical regions that were labeled in the gICA connectivity maps are listed for each network. These main foci structures were defined by areas with strong correlation (Z-scores labeled in yellow in the gICA maps). All labeled brain areas spanned at least two consecutive slices. Additional conventions and criteria for anatomical labeling can be found in the methods. See List 1 for anatomical abbreviations.

Network #	Main anatomical regions included in gICA networks
Network 1	M1, PM, S1, S3, NC
Network 2	S1, MRSS, PPr, S3
Network 3	A1, AAF, PPF/proPPF, PSF, AVF, ADF, PSSC, VP, MRSS, LRSS, AMLS, ALLS
Network 4	Area 17, Area 18/19, Area, 21, PPc, SSy, AMLS, ALLS, PSC, vPEG, NC
Network 5	mPFC (PL), dPFC, PM
Network 6	PPr, PPc, CG, S3, MRSS, M1
Network 9	M1, PM, S3

# Table 2

randomly generated permutations (R). As small-world networks exhibit higher local clustering and similar path lengths compared to random networks, we (CC) to the relative characteristic path length (PL). Relative CC and PL were calculated as a ratio of the average values from the actual data (A) to that of would expect CC > 1 and PL = 1. A SW value significantly greater than 1 indicates that the network exhibited small-world properties.  $\mu = 1$ Consistent small-world network properties across animals. The small-world (SW) metric was calculated as a ratio of the relative clustering coefficient Standard Error.

$\begin{array}{c} SW \\ [CC_A/CC_R] \\ [PL_A/PL_R] \end{array}$	1.206	1.277	1.362	1.161	1.187	1.590	1.297	0.066
PL <sub>A</sub> PL <sub>R</sub>	1.013	1.003	1.002	1.000	1.021	1.004	1.007	0.003
PLR	0.841	0.888	0.887	0.912	0.825	0.881	0.872	0.013
$PL_{A}$	0.853	0.891	0.889	0.912	0.843	0.884	0.879	0.011
$CC_A$	1.221	1.281	1.365	1.161	1.213	1.596	1.306	0.065
$CC_R$	0.101	0.049	0.069	0.047	0.106	0.075	0.075	0.010
$CC_A$	0.123	0.063	0.094	0.055	0.129	0.120	0.097	0.013
Animal	1	2	3	4	5	9	Ħ.	SE