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Cordeiro JLP, Hofmann GS, Fonseca C, Oliveira LFB. 2018. Achilles heel of a powerful invader: restrictions on distribution and disappearance of feral pigs from a protected area in Northern Pantanal, Western Brazil. PeerJ 6:e4200 <https://doi.org/10.7717/peerj.4200>

# Achilles heel of a powerful invader: restrictions on distribution and disappearance of feral pigs from a protected area in Northern Pantanal, Western Brazil

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This paper focus a rare case of natural disappearance of feral pigs (*Sus scrofa*) in an extensive area without using traditional methods of eradication programs. The study was conducted both in the Private Reserve of Natural Heritage (PRNH) Sesc Pantanal and in an adjacent traditional private cattle ranch. In 1998 feral pigs were abundant and widely distributed in the PRNH. However, the feral pigs were gradually disappeared from the area and currently the absence of pigs in the PRNH contrasts with the adjacent cattle ranch where the species is abundant. To understand the current distribution of feral pigs in the region we partitioned the effects of variation of feral pigs presence considering the habitat structure (local), landscape composition and the occurrence of potential predators. Additionally, we modeled the distributions of feral pigs in Northern Pantanal, projecting into the past using the classes of vegetation cover before the PRNH implementation (year 1988). Our results show areas with more suitability for feral pigs in region are a landscape dominated by pastures and permeated by patches of Seasonal Dry Forest. The species tends to avoid predominantly forested areas. Additionally, we recorded that the environmental suitability for feral pigs decreases exponentially as the distance from water bodies increases. The disappearance of feral pigs into PRNH area seems to be associated with changes in the landscape and vegetation structure after the removal of the cattle. In the Brazilian Pantanal the feral pigs occurrence seems strongly conditioned to environmental changes associated to livestock activity.

# **Achilles heel of a powerful invader: restrictions on distribution and disappearance of feral pigs from a protected area in Northern Pantanal, Western Brazil**

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# ABSTRACT

This paper focus a rare case of natural disappearance of feral pigs (*Sus scrofa*) in an extensive area without using traditional methods of eradication programs. The study was conducted both in the Private Reserve of Natural Heritage (PRNH) Sesc Pantanal and in an adjacent traditional private cattle ranch. In 1998 feral pigs were abundant and widely distributed in the PRNH. However, the feral pigs were gradually disappeared from the area and currently the absence of pigs in the PRNH contrasts with the adjacent cattle ranch where the species is abundant. To understand the current distribution of feral pigs in the region we partitioned the effects of variation of feral pigs presence considering the habitat structure (local), landscape composition and the occurrence of potential predators. Additionally, we modeled the distributions of feral pigs in Northern Pantanal, projecting into the past using the classes of vegetation cover before the PRNH implementation (year 1988). Our results show areas with more suitability for feral pigs in region are a landscape dominated by pastures and permeated by patches of Seasonal Dry Forest. The species tends to avoid predominantly forested areas. Additionally, we recorded that the environmental suitability for feral pigs decreases exponentially as the distance from water bodies increases. The disappearance of feral pigs into PRNH area seems to be associated with changes in the landscape and vegetation structure after the removal of the cattle. In the Brazilian Pantanal the feral pigs occurrence seems strongly conditioned to environmental changes associated to livestock activity.

## INTRODUCTION

The different morphotypes of *Sus scrofa* Linnaeus - wild boar (javali), domestic (different breeds) and wild pigs (feral) - are the most widespread exotic ungulates in the world, with populations in demographic and spatial expansion in almost all Eurasian countries (Fonseca & Correia, 2008 ) and in most of the regions where they were introduced (Australia, South and North America). The species have achieved success in the conquest and occupation of foreign lands for centuries. Pig management and domestication probably began sometime between the 10th to 8th millennium BP in western Eurasia, and from then domesticated pigs were dispersed widely around the globe by humans (Larson et al. 2007). Currently, pigs are considered one of the world's worst invasive alien species (Lowe et al. 2000) and are present on all continents except Antarctica, and many oceanic islands (Barrios-Garcia & Ballari 2012; Long 2003). *Sus scrofa* have several biological traits and strong invasive abilities that allow them to occupy different habitat types throughout their exotic distribution range, thus making the eradication of this species (feral pigs) very difficult and expensive (McCann and Garcelon 2008; Morrison et al. 2007; Parkes et al. 2010). When compared to other ungulate species, wild boar show several attributes that are typical of r-strategists (Geisser and Reyer 2005). They have the highest reproductive rate among ungulates, and their local density can double in one year (Massei et al. 1997). Additionally, the species has high ecological plasticity, a very opportunistic feeding behavior and a generalist approach to landscape use (Gabor and Hellgren 2000; Geisser and Reyer 2005).

In the Brazilian Pantanal (one of the largest continuous wetlands on the planet, covering approximately 140,000 km<sup>2</sup>), *S. scrofa* introduction is believed to have occurred in the second half of the eighteenth century through traditional breeding of domestic pigs (Alho and Lacher 1991). As reported in other areas of the world, pigs escaped from the ranches and became feral in a few generations through free reproduction in the wild (Barrios-Garcia and Ballari 2012; Bieber and Ruf 2005; D'Eath and Turner 2009; Dexter 1998; Nogueira et al. 2009). In 2000, the population of feral pigs was estimated at 10,000 individuals distributed throughout Pantanal (Mourão et al. 2002). In the Pantanal, the feral form is known as *porco-monteiro*. The species occurs primarily in open areas in seasonally flooded plains and near permanent lakes (Alho et al. 2011; Desbiez and Keuroghlian 2009; Desbiez et al. 2009; Keuroghlian et al. 2009; Oliveira-Santos 2013). The species is strongly dependent on water bodies due to heat stress, which has been observed in other hot regions with periods of severe drought throughout the year (Baber and Coblentz 1986;

Choquenot and Ruscoe 2003; Dexter 1998, 1999; Mayer and Brisbin 2009). Although water is an environmental resource whose importance is obvious to most animal species, identifying important environmental parameters bounding species distributions is a complex task because animals respond to the environment at a range of spatial scales (Turner et al. 1997). Ungulates like feral pigs make foraging decisions both within and across a variety of spatial scales, making it difficult to relate species to specific habitats across their entire range (Turner et al. 1997). Therefore, the description of the species-habitat relationships is an important first-step towards understanding the linked ecological processes, that can direct conservation decision-making, since the agents that determine population viability may include factors related to habitat or elements that transcend spatial scales, such as dynamically linked variables or unlinked elements (Hutchinson 1978; Peterson et al. 2011).

We present a rare case of natural disappearance of feral pigs in an extensive area without using traditional methods of control (eradication) programs. The drastic reduction in population of feral pigs occurred in a 15-year period (1998-2012) due to the transformation of cattle ranches into a Protected Area (PA). However, the current absence of pigs in PA area contrasts with the adjacent cattle ranch where the species is abundant. To understand the current distribution of feral hogs in the region we partitioned the effects of variation of feral pigs presence considering the habitat structure (local), landscape composition and the occurrence of potential predators (jaguar and puma). Additionally, we modeled the distributions of feral pigs in Northern Pantanal, projecting into the past using the classes of vegetation cover before the PA implementation (year 1988). Our goal includes (i) identifying the spatial distribution patterns of feral pigs and (ii) inferring about the effect of landscape change, due to the implantation of a Protected Area (PA), in the occurrence of the species.

## METHODS

### Study area

The study was conducted in the municipality of Barão de Melgaço, state of Mato Grosso (MT), in the northeastern Brazilian Pantanal. The climate in the region is savanna type, "Aw," according to the Köppen's classification system (Hasenack et al 2010; Hofmann et al 2010). Rainfall is concentrated in the austral summer and severe drought prevails in the rest of the year (Nimer 1979).

The region presents a flooding period from December through April, due to the accumulation of local rainfall and flooding of the headwaters of the Upper Paraguay River Basin (Gonçalves *et al.* 2011). The herbaceous and woody vegetation in the region are influenced by the flooding regime adding variability to the landscape, characterized by a plain with low relief variability.

The data were collected in the Private Reserve of Natural Heritage (PRNH) SESC Pantanal, the largest private Protected Area (PA) in Brazil (with 1076 km<sup>2</sup>) and in a traditional private cattle ranch (approximately 800 km<sup>2</sup>). The two areas are adjacent and separated by the São Lourenço River (Fig.1). The PA was established in 1998, after a long period of extensive livestock. Therefore, as other ranches in the region, PRNH contains exotic pastures cultivated in former areas of savanna or in forested areas cleared for pasture and artificial ponds for cattle (Cordeiro 2004). However, after the removal of cattle in 1999, continuous monitoring of the landscape showed the gradual expansion of native forests in areas previously used by cattle (e.g. scrublands, pastures and earthmounds savannas) (Nunes da Cunha and Junk 2004; Oliveira *et al.* 2013). Furthermore, with the removal of cattle and control of fire by PA staff, the open areas have undergone a succession process with a large increase in herbaceous\scrub vegetation density and biomass. In this context, feral pigs gradually “disappeared” from the PRNH. Park rangers report that visual records of feral pigs were extremely rare and the species is seldom recorded (RPPN Park rangers, pers. comm; Cordeiro and Oliveira, pers. obs).

### **Feral pigs relationships with landscape and habitat structure**

We used two complementary methodologies, Variation Partitioning and Species Distribution Models (SDMs), to quantify the importance of environmental variables and to understand the reasons that led to the disappearance of this species in the PRNH. Variation Partitioning approach allowed us to compare the relative contribution of the variables (conditional or partial effect) and their independent effect (marginal effect) explained by factors distributed in scales that are hardly addressed directly by methods such as SDMs (e.g. predation and structural components of vegetation measured at the local scale). On the other hand, SDMs approach allowed us to generate current (2010) and past (1988) potential distribution range using environmental factors associated with the areas actually occupied.

## Occurrence Data

Camera traps Reconyx PC90 High Output (Reconyx ®, Inc., Holmen, WI, USA) were used to record feral pigs in the PA and in the cattle ranch (2010 and 2012). The cameras were programmed to operate in their standard module of motion sensitivity and pictures per trigger (3 pictures, 1 second interval, no quiet period). No bait was used. The installation of camera trap sites was chosen randomly by direction and distance to be traveled (maximum of two kilometers) from roads (rivers, roads and trails) and considering the minimum distance of 600 m between sites. In the total, 180 sampling units were established (118 in the PA and 62 in the cattle ranch). The sampling effort per station varied from 15 to 28 days, totaling 3,862 trap days (2,559 in the reserve and 1,503 in the cattle ranch) and 92,688 hours. Data were collected in both dry and rainy seasons. Additionally, we monitored 20 artificial ponds and 19 natural licks throughout 90 consecutive days, and we recorded all type of feral pigs signs along the sampling campaigns.

## Landscape Characterization

We generated two land cover maps, for 1988 and 2010, based on satellite images classification (LANDSAT 5 TM, 27-Jul-1988 and 12-Oct-2010, with a spatial resolution of 30 meters). The geoprocessing tasks were performed in Idrisi Taiga software (Clark Labs©). Ten land cover classes were identified (Table 1; Fig. 1A and 1B). Two types of landscape descriptors were used: (i) the proportions of each land cover class; and (ii) the average distance to rivers or others water sources. The values were calculated by extracting the proportion of each class of cover or the average distances in the area formed by the buffers with a 500 m radius centered in each sampling unit.

## Variation Partitioning Analysis

We created an Index of Use (IU), for each species (*S. scrofa*, *Puma concolor*, puma, and *Panthera onca*, jaguar) at each site, considering the ratio between the time the species was recorded and the number of days the camera trap was active. After testing different time intervals (15, 30 minutes and 1 hour) as a criterion for the independence of the records, we recognized that the longer periods resulted in an inflated index. We then considered consecutive shots of the same species at a maximum interval of 15 minutes as independent records. Likewise, at each sampling unit we evaluated the vegetation structure in five plots of 100 m<sup>2</sup>, the first centered on the camera trap and the others at a 50 meters distance in the four cardinal directions. We measured 11 attributes in each



square (more details of the variables and methods used are provided in Table 2). The average values of the five plots were used to characterize habitat structure in the sampling unit.

We evaluated the size of the gradient through Detrended Canonical Correspondence Analysis (DCCA; ter Braak 1986; ter Braak & Smilauer 2002), considering the feral pigs IU as a response variable in each sample unit and the predators IU, and habitat structure and landscape classes of cover (only data of 2010 land cover map) as environmental data. Based on the length of the gradients we opted for RDA (Redundancy analysis), a linear method (ter Braak 1986; ter Braak & Smilauer 2002). We used the variation partitioning approach described by Cushman & McGarigal (2002). Principal Component Analysis (PCA) was used to reduce the habitat structure and landscape data sets to seven and five uncorrelated components, respectively. The latent root criterion was considered to define the number of PCA axes to be used in the analysis (Cushman & McGarigal 2002). We then subjected the entire data set to forward selection in CANOCO and dropped all variables that were not significant at  $p=0.05$  to reduce collinearity among explanatory variables (Cushman & McGarigal 2002; ter Braak 1986; ter Braak & Smilauer 2002). Noisy temporary predictive variables as burned areas were deleted from the analysis. The PCA analyses were performed using Statistica 6.1 (StatSoft ©). RDA's analyses were performed in CANOCO for Windows 4.5 (ter Braak & Smilauer 2002).

### Species Distribution Models

We used maximum entropy niche modelling approach, as implemented in the MAXENT version 3.3.3k to describe environmental suitability, potential feral hog distributions and estimate the past distribution considering the environmental conditions. The method considers the requirement of the species based on the presence and on the set of environmental variables (Phillips et al. 2006), providing environmental variable response curves indicating how each variable affects the predicted distribution (Phillips and Dudík 2008). We ran Maxent under the 'auto-features' mode and the default settings, with 10-fold replicates generated by bootstrap (Phillips and Dudík 2008). The logistic output was used (habitat suitability on a scale of 0-1), with higher values in the Environmental Suitability Map (ESM) representing more favorable conditions for the presence of the species (Elith et al., 2006; Phillips & Dudík, 2008). For the *S. scrofa* potential distribution binary maps (suitable/unsuitable), we applied the Minimum Training Presence (MTP) as a

threshold value for model, because it is the most conservative threshold, identifying the maximum predicted area possible while still maintaining a zero omission rate for both training and test data.

The model was developed using 69 occurrence points (sampling units with *S. scrofa* presence) (Table S1) and ten (10) environmental variables (landscape descriptors). The program was configured to use 80% of occurrence data (56 points) for training and 20% (13 points) for test. The final models for feral pigs were based on the mean of the 10 replicated models. For the projection of the model to the environmental conditions of the past, before the PA implementation, we used a 1988 land cover map (Fig. 1A). The Area Under Curve (AUC) of the Receiver Operating Characteristics (ROC) analysis was used as a measure of model performance (Fielding and Bell 1997; Manel et al. 2001; Peterson et al. 2007; Phillips et al. 2006). For comparative purposes, the ESM images resulting (2010 model and 1988 past projection), with continuous values from 0 to 1, were reclassified into five environmental suitability zones, (1) an Unsuitable Zone (USZ; value pixel suitability < Minimum Training Presence, MTP), (2) a Low Suitability Zone (LSZ, value pixel suitability between MTP value and 0.25), (3) an Intermediate Suitability Zone (ISZ, value pixel suitability between 0.25 and 0.50), (4) a High Suitability Zone (HSZ, value pixel suitability 0.50 and 0.75), and (5) a Very High Suitability Zone (VHSZ, value pixel suitability > 0.75).

Additionally, in order to quantify the spatial similarity between the model (2010) and its projection into the past (1988), we used Fuzzy index for continuous ESM, and Kappa index for binary maps (suitable/unsuitable). Both indices were implemented in Map Comparison Kit software, version 3.2.3 (Visser & Nijs 2006) and express the pixel similarity for a value between 0 (fully distinct) and 1 (fully identical).

## RESULTS

### Variation partitioning

Abrupt changes in the landscape mosaic (DCCA; longest gradient shorter than 3.0) may affect the distribution of feral pigs. Landscape features and habitat structure explained 27.9% of the variation in feral pigs use in the study region (RDA model,  $P = 0.001$ ) (Fig. 2). However, only one variable which describes habitat structure (first PCA axis related to sky view factor, basal tree area and canopy height) and three axis related to landscape features (Pasture, Scrubland and Seasonally

Flood Forests; first, second and third, respectively) were included in the RDA model, based on the forward selection criterion ( $P \leq 0.05$ ). Feral pigs do not seem to be conditioned on the use of the region by predators and this variable were not selected in the model. The first tier of the decomposition separated only habitat structure and landscape. The second tier decomposed feral pigs use variation, partitioning the landscape-level conditional effects by quantifying the unique explanatory power provided by each landscape variable: Pasture 19.7%, Scrubland 1.8% and Seasonally Flood Forests 1.7% (Fig 2).

### Species Distribution Models

The model showed a very good overall performance, presenting high AUC values for both training (AUC= 0.932; SD= 0.010) and test data (AUC= 0.893; SD= 0.025), indicating that the modeled distribution performed better than the random one; high AUC denotes a good observation/prediction fit of the test points in the spatial distribution model (Lobo et al. 2008). The most important environmental variable explaining the occurrence of feral pigs was Pasture (PAS), followed by scrubland (SCR) and Seasonal Dry Forest (SDF) (Fig. 3). The gain decreased most when the distance to water (WAT) was omitted, indicating that this variable contained most of the information absent from the other variables (Fig. 3).

Feral pigs “prefer” (more suitability) a landscape dominated by Pastures (Fig. 4A), permeated by patches of Seasonal Dry Forest (Fig. 4C), with small portions of Scrubland areas (Fig. 4B), and areas with proximity to water sources (Fig. 4D). The species tends to avoid predominantly forested areas (SCH, RIP and SFF), and Termite Savannas (TSV).

The model indicates that the most suitable zones for feral pigs in 2010 are those in large cattle ranches located in the east, northeast and northwest of the protected area (Fig. 5A). Within the PA area, a Low Suitability Zone (LSZ) predominates and there are only a few isolated patches of ISZ and HSZ. Moreover, the 1988 Environmental Suitability Map shows a different scenario (Fig. 5C); the current PA area was filled with intermediate and high suitability zones contrasting with 2010. Figures 5B and 5D represents the potential distribution binary map (suitable/unsuitable) based on the MTP cutoff criteria (MTP = 0.09).

Between 1988 and 2010, there was a reduction of 84.1% in the suitable areas (suitability >MTP) within the PA area (Table 3), contrasting with the reduction of area occupied by these categories

in the cattle ranch, which was less than 10%. The spatial and temporal similarities are shown in Table 3. Thereby, taking into account different criteria (Fuzzy for continuous values of suitability, and Kappa for binary maps- suitable/unsuitable), the PA area had the highest rate of change when compared to the cattle ranch and other areas of the study region.

## DISCUSSION

### Disappearance of feral pigs

The low number of records of feral pigs in the PA was intriguing, considering that we have been studying ungulates in the region since 1999 and we have many records of the species. *S. scrofa* is recognized for having large fluctuations of density and population size in native and exotic areas of occurrence (Mayer & Brisbin 2009). Birth and mortality rates of young and adults are directly affected by the availability of food and environmental variations (Baber & Coblentz 1986; Bieber & Ruf 2005; Geisser & Reyer 2005; Jedrzejewska et al. 1997; Massei et al. 1997; Melis et al. 2006; Keuling et al. 2013). However, due to their high reproductive potential, wild pigs are resilient, quickly recovering from such dramatic population reductions (Mayer & Brisbin 2009). Sampling bias were discarded because both areas are part of a relatively similar ecological system in northern Pantanal, suggesting that the differences are not due to a drastic reduction in the ability to detect the species generating pseudo-absences (Engler et al. 2004; Morrison et al. 2007). Nevertheless, despite a large additional sampling effort being put in areas potentially attractive for feral pigs we did not obtain any record of this species. In 2004, even with a much lower sampling effort feral pigs were recorded by camera traps in natural licks in this region (Coelho 2006). Additionally, throughout the sampling campaign we traversed hundreds of kilometers across the area and we did not find any evidence or signs of feral pigs, such as wallowing sites, feces or tracks. We then assume that the lack of records in the PRNH Sesc Pantanal area is a real absence of feral pigs and not a pseudo-absence generated by the detection or sampling effort. Since we got only two records of feral pigs in the PRNH and 261 records in the cattle ranch area between June and September 2012, we performed an intensive sampling campaign in areas potentially attractive for feral pigs in the PA monitoring 20 artificial ponds and 19 natural licks throughout 90 consecutive days. However, this sampling did not result in a single record of feral hog.

## Suitable habitats and limiting factors

Pastures were the most important land cover class related to the landscape feature, and they explain the distribution of feral pigs in the study region (RDA and SDM). This herbaceous class is maintained by grazing pressure (e.g. native grasses intensively grazed by cattle, exotic pastures, grasslands with very small earthmounds and bare soil areas). The intensive use of grasslands and pastures had already been described in southern Pantanal and in other regions (Barrett 1982; Baubet et al. 2004; Choquenot & Ruscoe 2003; Desbiez et al. 2009; Dexter 1998, 1999; Graves 1984; Oliveira-Santos 2013), and plants like grass, herbs and forbs usually represent a considerable part of the feral pigs and wild boar diets (Baber & Coblenz 1986; Cuevas et al. 2013a; Cuevas et al. 2013b; Giménez-Anaya et al. 2008; Hellgren 1993; Taylor & Hellgren 1997). Furthermore, the SDM approach showed that habitats with greater suitability for feral pigs are those predominantly herbaceous (around 80% coverage), interspersed with patches of seasonally dry forest (optimum between 35 and 40% coverage) and not too far from water bodies (around one kilometer). Feral pigs are known for their generalist habitat use (Ilse & Hellgren 1995; Mayer & Brisbin 2009) and by the preference for patchy habitats (Acevedo et al. 2006; Gabor et al. 2001; Oliveira-Santos 2013). The forest patches associated with a predominantly herbaceous matrix are very important because the dense vegetation is used as shelter from potentially lethal heat and as resting sites (Choquenot & Ruscoe 2003; Dexter 1998; Graves 1984; Huynh et al. 2005a; Huynh et al. 2005b).

*S. scrofa* has a low tolerance to high temperature in nature due to the lack of sweat glands or other efficient physiological cooling mechanisms (Baber & Coblenz 1986; Choquenot & Ruscoe 2003; Collin et al. 2001; Huynh et al. 2005b), and low ability to concentrate urine (Gabor et al. 1997; Zervanos and Naveh 1988), being dependent on shaded habitats and reservoirs of water to avoid dehydration and promote thermoregulation (Baber & Coblenz 1986; Cuevas et al. 2013b; Dexter 1998; Ilse & Hellgren 1995). Data available for southern Pantanal shows that the species has a high fidelity, returning to resting sites where they stay during the hottest hours of the day (Oliveira-Santos 2013). We observed that away from forest patches feral pigs use small aggregations of trees (e.g. *Licania parvifolia*, *Couepia uiti* and *Calophyllum brasiliense*) and isolated micromounds with woody vegetation as thermal shelters.

The environmental suitability for feral pigs decreases exponentially as the distance from water bodies increases, as has already been observed for populations inhabiting arid and semiarid regions

(Baber & Coblenz 1986; Cuevas et al. 2013b; Ilse & Hellgren 1995; Mayer & Brisbin 2009). In arid regions of Australia the species cannot persist in areas more than 10 km away from water sources, suggesting that at the margin of their range is associated to inland river systems. Such areas vary temporally, acting as sources, pseudosinks and sinks (Choquenot & Ruscoe 2003).

However, areas closer than 500m to water bodies were not identified as highly suitable, particularly those close to rivers, reflecting the absence of feral pig records near the riverbanks within the study area. The low activity of feral pigs in riparian forests was already observed in southern Pantanal (Keuroghlian et al. 2009). Habitats with close links with natural water bodies such as lakes and natural riparian forests were those with high records of jaguar in our study region. Jaguars have a close association with water in the Pantanal (Crawshaw & Quigley 1991) and predation therefore could be an explanation for the lack of records of feral pigs in these habitats. The relationships could not be explored through the analysis, since predators were excluded through the variable selection process. In any case, the existence of dozens of artificial ponds in the midst of extensive areas of pastures in cattle ranch region probably reduces the need of feral pigs to access riparian forests where predation risk is higher, or even these areas can act as sinks. Likewise, the species showed negative relationships with structural features of the vegetation associated with forest habitats, such as tree density, and areas with closed canopy. The low biomass of grasses and herbs due to high shading caused by increasing canopy cover may be an additional explanation for the low utilization of riparian and the seasonally flood forests.

### **Changes in the landscape features and loss of suitability areas for feral pigs**

In Brazilian Pantanal the occurrence of feral pigs seems to be closely associated with the environmental changes resulting from the land use by traditional livestock. The management system employed in the PA must have been the main factor that led to the drastic reduction of suitable habitats and to the disappearance of feral pigs in this area. Important changes have been recorded over the last 40 years in plant communities and in the landscape of the Brazilian Pantanal by several authors (Junk et al. 2006; Nunes da Cunha et al. 2007; Pott et al. 2011; Scremin-Dias et al. 2011). As from the seventies, the succession of wet years and large floods have favored the colonization of tree and bush species into the grasslands and pastures (Nunes da Cunha & Junk 2004; Nunes da Cunha et al. 2007; Pott et al. 2011). Within this scenario, *Vochysia divergens* (Vochysiaceae) is the species whose expansion in the study region is most evident, although other



species such as *L. parvifolia*, *Combretum lanceolatum*, *C. uiti*, *Byrsonima orbignyana* and *Ipomoea fistulosa* also have advanced over old open areas (Nunes da Cunha & Junk 2004; Oliveira et al. 2013; Pott et al. 2011). Since then, deforestation and ‘controlled’ fires have been the main forms of clearing land used by Pantanal ranchers to increase cattle stocking rates (Harris et al. 2005; Junk et al. 2006; Seidl et al. 2001; Wilcox 1992). After the creation of the PA in 1999, thousands of cattle were removed from the area and a well-equipped fire brigade was established so as to control fires throughout the dry season (Brandão et al. 2008). With the absence large fires and grazing, the grasslands and other vegetation classes in the PA contrasted sharply with adjacent areas. (Oliveira et al. 2013). However, the environmental changes resulting from the traditional livestock are not restricted to the landscape scale, as they also affect the vegetation structure. Experiments of exclusion of cattle in the Pantanal showed that the absence of grazing pressure leads to strong growth of woody species (Nunes da Cunha & Junk 2004). In the central area of the PA there was a huge increase in the biomass of grasses. These grasses reach about 1.5 meters high and the access to many areas is difficult or almost impossible on foot or on horseback. In regions where grasses predominated a few years ago, in the floodplain of the Cuiabá River (western boundary of PA), shrubs dominate the landscape. In other words, nowadays the grasslands in the PA differ greatly from those occupied by feral pigs in the cattle ranch.

### **Implications for conservation and management**

Feral pigs are strongly associated with livestock. Over 80% (118,000 km<sup>2</sup>) of Pantanal lands are cattle ranches and only 2.5% is formally protected in national and state parks and in private protected areas (Harris et al. 2005; Seidl et al. 1999). Historically, many authors argue that traditional livestock plays an important role in the maintenance of the parkland physiognomy of the Pantanal and low density cattle ranching is considered an ecologically sound and sustainable management method (Alho et al. 1988; Junk et al. 2006; Pott & Pott 2004). Therefore, it is impossible to make an efficient plan for the conservation of the Pantanal without the inclusion of ranchers and their properties (Harris et al. 2005). Nevertheless, over the past 30 years the traditional livestock practices have been replaced by more intensive ones and ranchers have planted exotic pastures in forest areas cleared in order to increase cattle stocking rates (Alho et al. 1988; Oliveira et al. 2013; Seidl et al. 2001). In the long run, however, these actions may be reversed against the ranchers. The reduction of natural areas and increase of environmental

degradation due to the intensification of livestock in the region has certainly favored the growth of feral hog populations and this should result in large economic losses by damaged crops and husbandry (Barrios-Garcia & Ballari 2012; Bieber & Ruf 2005; Gabor et al. 2001). Feral pigs are known in the Pantanal and in other regions to cause damage to large areas of grassland by foraging activity (Desbiez et al. 2009; Mayer & Brisbin 2009; Sicuro & Oliveira 2002). In the study area, large extensions of native and exotic pastures were completely wiped out, with virtually no fodder for cattle or native grazers remaining in some regions. Additionally, the high predation of eggs and native animals certainly are just some of the direct consequences of the increased density of feral pigs in these pasture areas (Barrios-Garcia & Ballari 2012).

The disappearance of feral pigs in the PA area after the implementation of the management plan shows the vulnerability of the species and opens new possibilities for an eradication program in the region. The decline of feral pigs in this area appears to be intimately associated with the drastic reduction and fragmentation of pasture areas, a natural consequence of the fast succession of the vegetation after the cattle exclusion. Therefore, the loss and fragmentation of habitats by human actions which are pointed major factors that lead to the extinction of species in global scale (Banks-Leite et al. 2012; Cushman 2006; Dobrovolski et al. 2013; Fahrig 2002), in this case seem to have helped expel a powerful invader in a PA. The increased density and height of grasses due to the suspension of grazing cattle may also have a negative effect on feral pigs. Questions are open if the species disappearance is related to the reduction of habitat quality, low detection of predators or reduction of foraging efficiency. In any case, changes in the form of land use, particularly in grasslands, can increase the chances of feral hog management. Furthermore, a key factor to reduce feral pigs in areas with hot and dry season climate or semi-arid regions is to restrict their access to water sources (Baber & Coblenz 1986; Choquenot & Ruscoe 2003; Dexter 1998; Mayer & Brisbin 2009). Although it is virtually impossible to restrict the feral hog access to all water sources in a wetland like the Pantanal, increasing hunting in these places (especially those near to pastures and grasslands in dry seasons) can be a major factor in limiting the size of the populations, especially if targeting females and piglets, keeping the population in sub-optimal areas and thus facilitating the management. The reduction in birth and survival rates by hunting focused on females and piglets can have a direct impact on local populations (Bieber & Ruf 2005). *S. scrofa* is a highly cooperative and cognitive species. When subjected to high hunting pressure survivors avoid techniques and sites targeted by hunters (Morrison et al. 2007) using their spatial memory to habitat



selection, considering factors such as predation risk, thermal comfort and forage quality (Oliveira-Santos 2013). Permanent hunting pressure near artificial ponds in pasture areas forces feral pigs to seek other water sources, increases energy expenditure and reduces time spent in thermoregulation, hence forcing the use of less suitable habitats such as riparian forests, and increasing the risk of predation. Synergic interaction between several factors may be more important in limiting the population growth of the species in remote areas like Pantanal, other than simply directing efforts to a single method of population control.

## CONCLUSION

The disappearance of feral pigs after the conversion of old cattle ranches into a protected area was associated with changes in the landscape and vegetation structure after the removal of the cattle and the implementation of the management plan for the area. In the Brazilian Pantanal the feral pigs occurrence seems conditioned to environmental changes associated to livestock activity, particularly related to the proportion of pastures available, although the availability of forest patches and water sources are also important. They are rare in continuous and riparian forests. Occurrences of potential predators are not significant. However, predation cannot be completely ruled out as an important factor in conditioning the distribution of this species in Pantanal. Under current conditions the chances of recolonization of the protected area are low, particularly by the absence of suitable habitats. For the same reason it is hard to believe in a "resurgence" of feral pigs via "Lazarus effect" (Morrison et al. 2007). Thus, our results suggest a point of weakness in the exotic distribution of *S. scrofa*, directly related to the regeneration of grazed areas. The distribution of the species in the Brazilian Pantanal is the result of the effect of human activity on the structure and spatial arrangements of plant formations in the region.

## ACKNOWLEDGEMENTS

The authors would like to thank Sesc Pantanal (for providing logistic support and funding), and to all employees for their help with the collection of samples. We are especially grateful to Sesc managers Leopoldo G. Brandão, Maron E. Abi-Abib, Waldir Valutki, Cristina Cuiabália, and Silvia Kataoka. We thank Gustavo Staut for support and permission to work on the Sta. Lucia Ranch. J.L.P. Cordeiro (Pós doc. Estágio Sênior no Exterior, Processo: BEX 1302/15-9), G.S. Hofmann, and I.P. Coelho are grateful to Coordenação de Aperfeiçoamento de Pessoal de Nível

Superior – Brasil (CAPES) for the scholarship. This work was partially funded by CNPq (grant 400713/2013-6).

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**Table 1:** Description of land cover classes of the study area.

Land Cover Class	Acronyms	Description
Scrubland	SCR	Open areas dominated by <i>Byrsonima orbygniana</i> , <i>Hibiscus furcellatus</i> and <i>Combretum lanceolatum</i>
Seasonally Flooded Forest	SFF	Monospecific forests dominated by <i>Vochysia divergens</i> “cambarazais” or by <i>Licania parvifolia</i> “corixos”
Termite Savanna	TSV	Fields with <i>Curatella americana</i> and rounded earthmounds covered by woody vegetation “murundus”
Seasonal Dry Forest	SDF	Forests with a predominance of deciduous trees such as <i>Anadenanthera colubrina</i> , <i>Cedrela fissilis</i> , <i>Enterolobium contortisiliquum</i> and <i>Cordia glabrata</i>
Scheelea Forest	SCH	Semideciduous forests where the understory is dominated by “Acuri” palm tree ( <i>Scheelea phalerata</i> )
Bamboo Forest	BAM	Forest physiognomy with an emergent tree stratum and sparse understory dominated by “taboca” ( <i>Guadua</i> sp.)
Riparian Forest	RIP	Unflooded forests that occur mainly on the banks of the São Lourenço River
Pasture	PAS	Herbaceous vegetation associated with intensive livestock , e.g. native and exotic grasses, and bare soil areas
Water	WAT	Water bodies such as rivers and lakes
Burned areas	BRN	Burned areas by the ranchers in order to clear land and increase the cattle stocking rates

**Table2:** Description of environmental variables and their units used as habitat structure metrics.

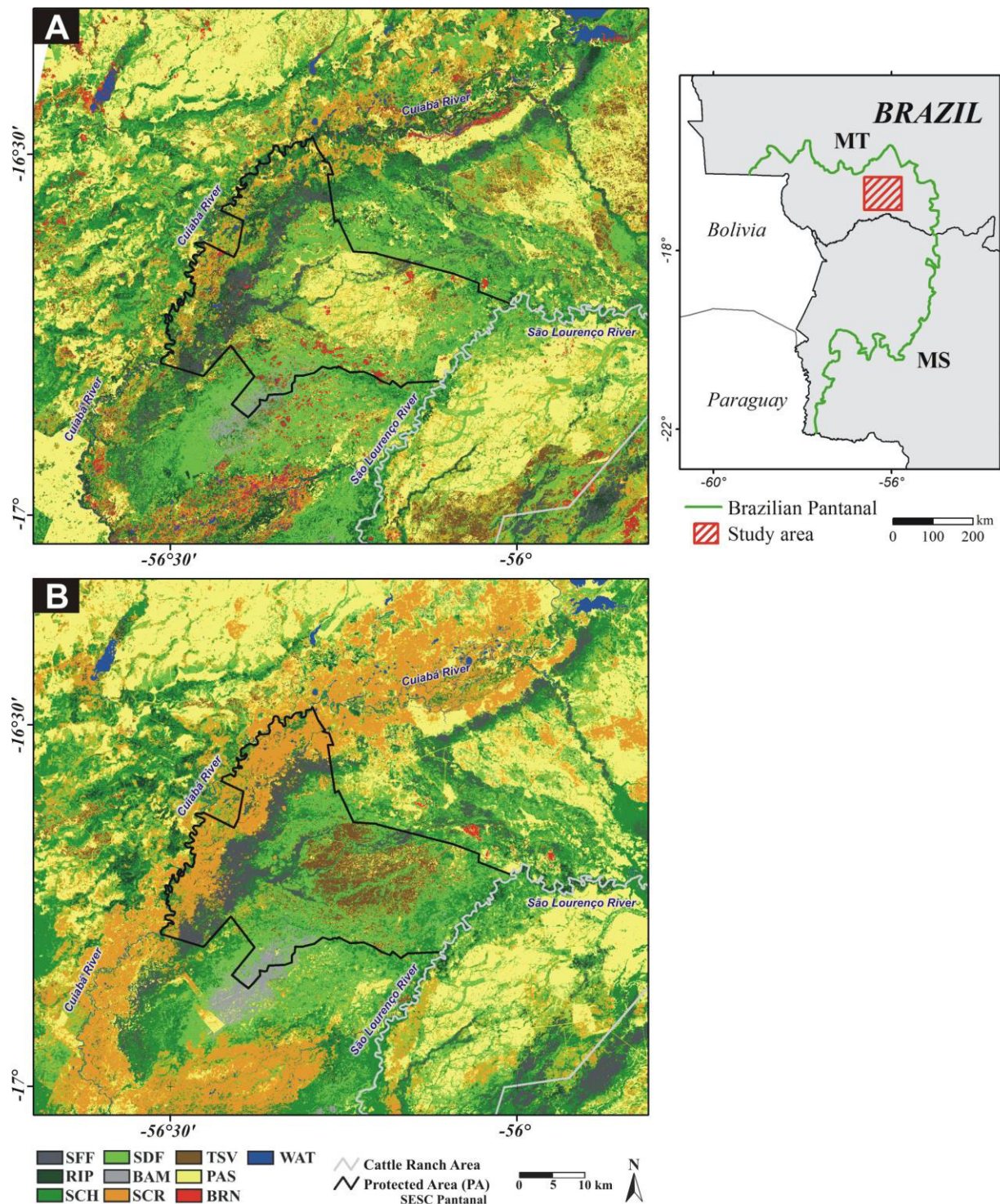
Variable (unit)	Description
Sky view factor (%)	Proportion of the sky hemisphere obscured by vegetation photographed at the center of each plot (Frazer <i>et al.</i> , 1999).
Canopy height (m)	Canopy height estimated using a clinometers.
Dicots density (ind/ha <sup>-2</sup> )	Number of individual flowering plants per unit area.
Basal area (m <sup>2</sup> /ha <sup>-2</sup> )	Area occupied by the cross-section of tree trunks and stems (CBH $\geq$ 5cm) at breast height.
Dicots fruits (%)	Estimated by record of fruit in plots 5 (absence of fruit = 0%; registration in 1 plot = 20%, to record in 5 plots = 100%).
Palm fruits (%)	Estimated by record of palm fruit in plots 5 (absence of fruit = 0%; registration in 1 plot = 20%, to record in 5 plots = 100%).
Palm density (ind/ha <sup>-2</sup> )	Number of individual palm trees per unit area.
Horizontal obstruction at ground level (%)	Average proportion of the profile board when viewed from across a distance of 5m in the four cardinal directions (Hays <i>et al.</i> , 1981).
Horizontal obstruction at a height of 50cm (%)	Average proportion of the profile board when viewed from across a distance of 5m in the four cardinal directions (Hays <i>et al.</i> , 1981).
Horizontal obstruction at a height of 1m (%)	Average proportion of the profile board when viewed from across a distance of 5m in the four cardinal directions (Hays <i>et al.</i> , 1981).
Horizontal obstruction at a height of 1.5m (%)	Average proportion of the profile board when viewed from across a distance of 5m in the four cardinal directions (Hays <i>et al.</i> , 1981).

**Table 3:** The spatial and temporal similarities of suitable areas (> MTP\*) for *Sus scrofa* in the study area.

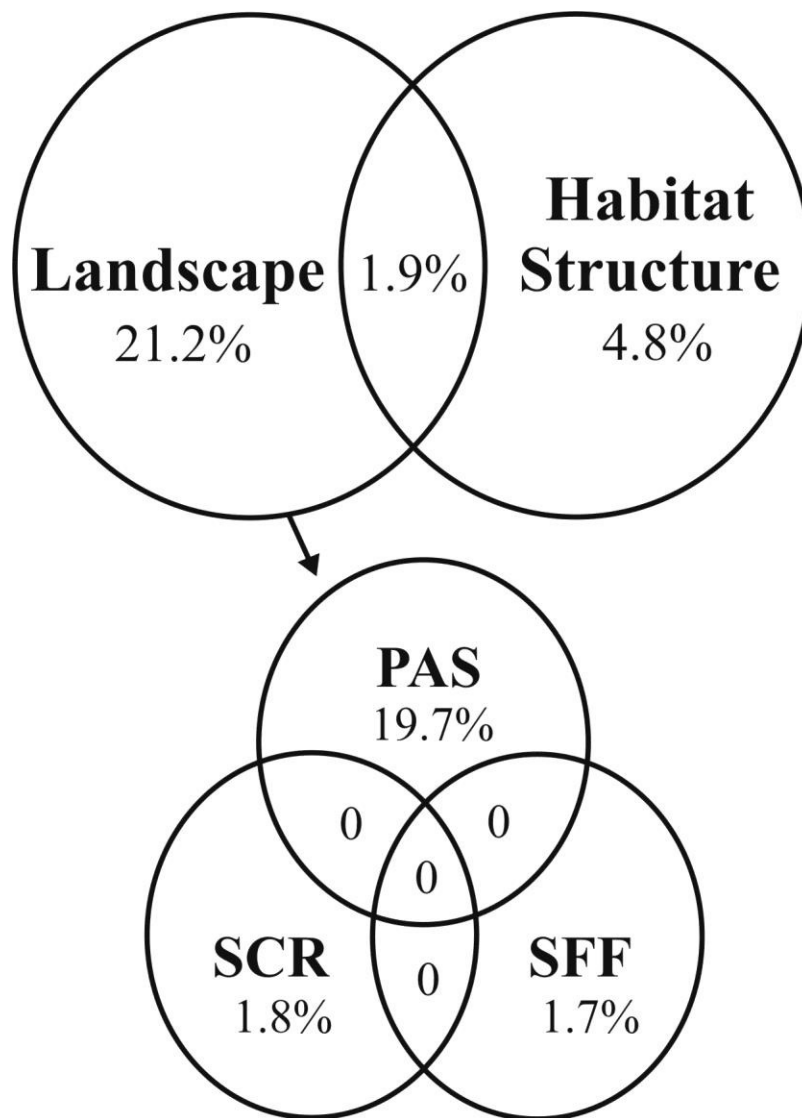
Site	Area with value pixel suitability >MTP				
	1988	2010	Change rate	Fuzzy**	Kappa
All Study Area	539,122.4 ha	332,871.8 ha	-38.3%	0.33	0.24
Protected Area	51,074.28 ha	8,123.67 ha	-84.1%	0.21	0.09
Cattle Ranch Area	78,714.5 ha	73,677.2 ha	-6.4%	0.41	0.26

\*Minimum Training Presence; \*\* for continuous map

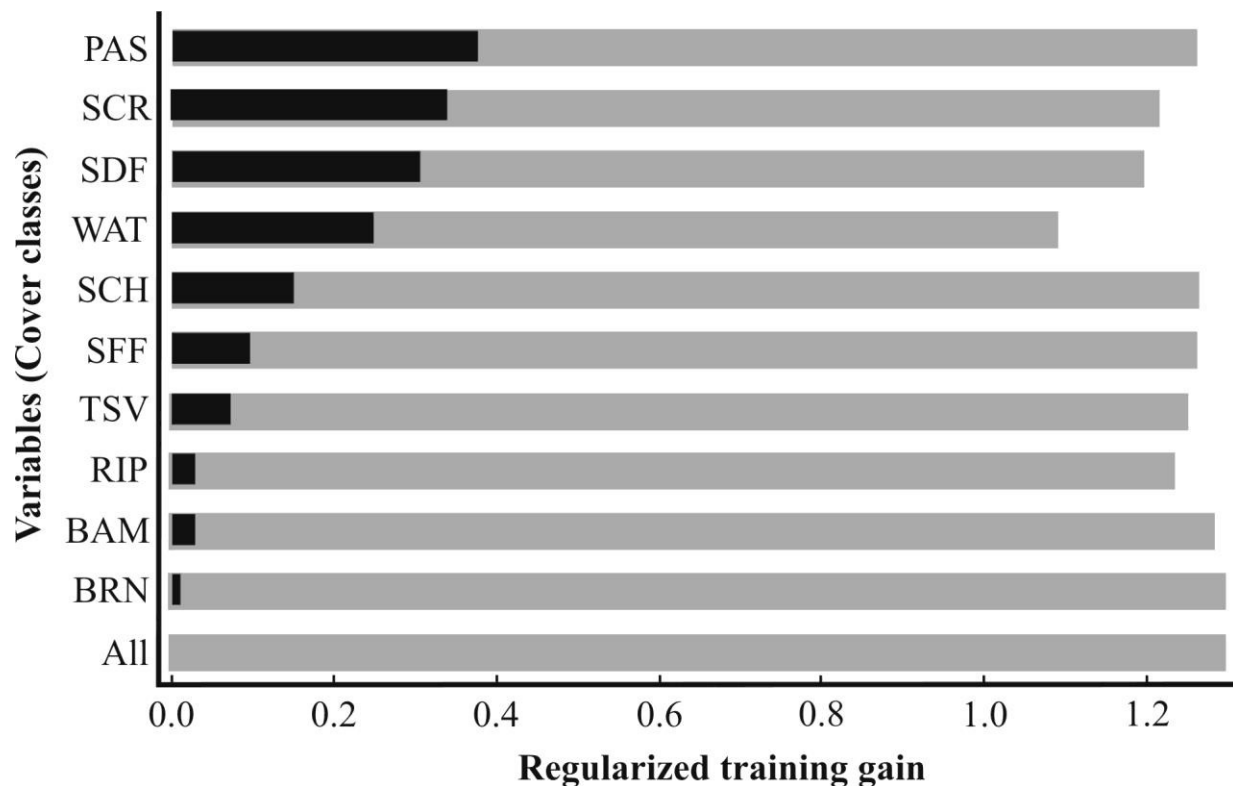




**Figure 1:** Study area location in Brazilian Pantanal, *Mato Grosso* (MT) and *Mato Grosso do Sul* (MS) states. Land cover maps generated by Landsat image classification, A) 1988 and B) 2010. Seasonally Flood Forest (SFF); Riparian Forest (RIP); Scheelea Forest (SCH); Seasonally Dry Forest (SDF); Bamboo Forest (BAM); Scrubland (SCR); Termite Savanna (TSV); Pasture (PAS); Burned areas (BRN), Water (WAT).

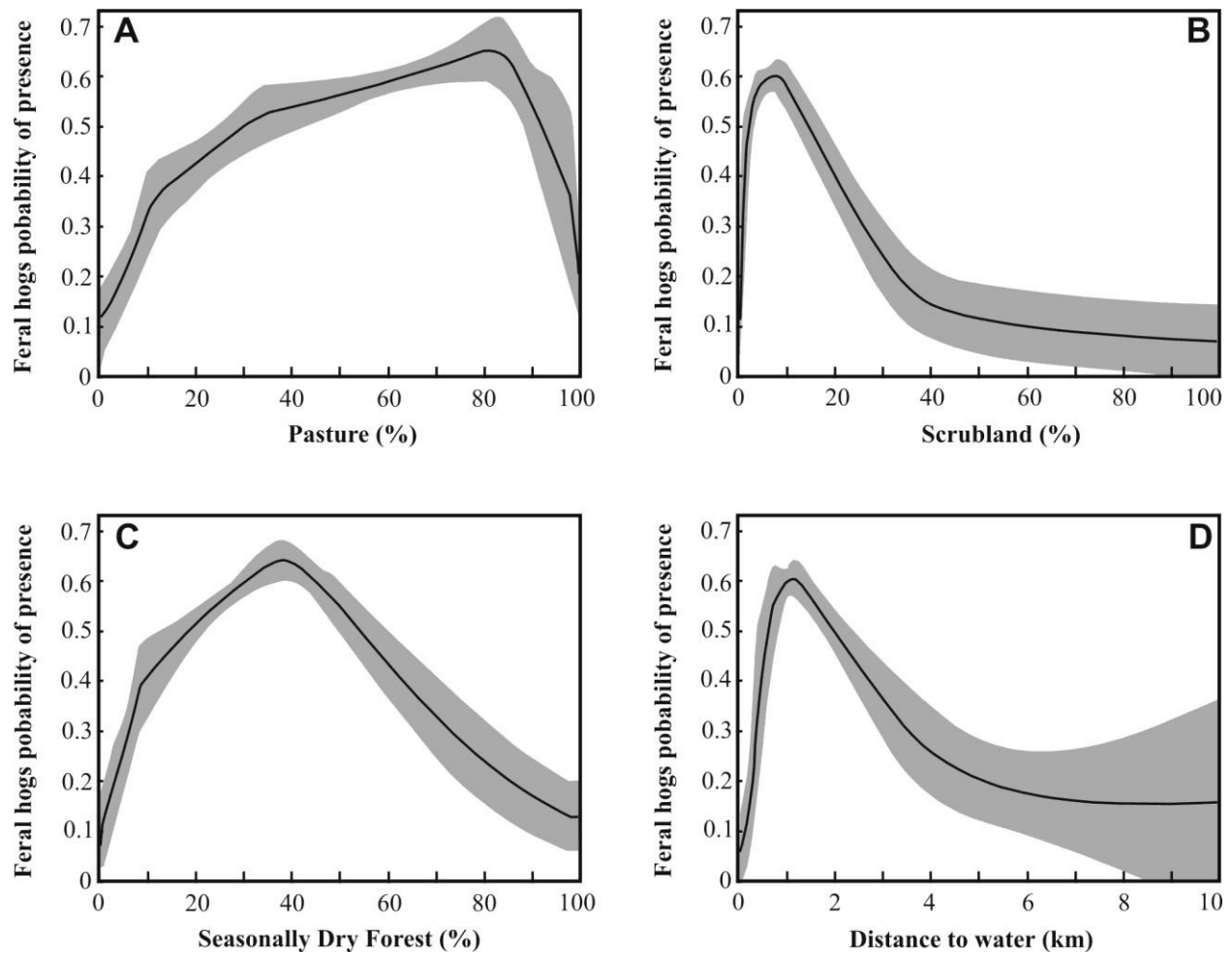


**Figure 2:** Venn diagram showing the first- and second-tier decompositions of feral hog RDA model ( $P = 0.001$ ) in the study region. The first-tier of the decomposition separates habitat structure and landscape contribution. The second-tier partitioned the landscape-level effect by quantifying the unique explanatory power provided by each landscape variable: Pasture (PAS) Scrubland (SCR) and Seasonally Flooded Forests (SFF).

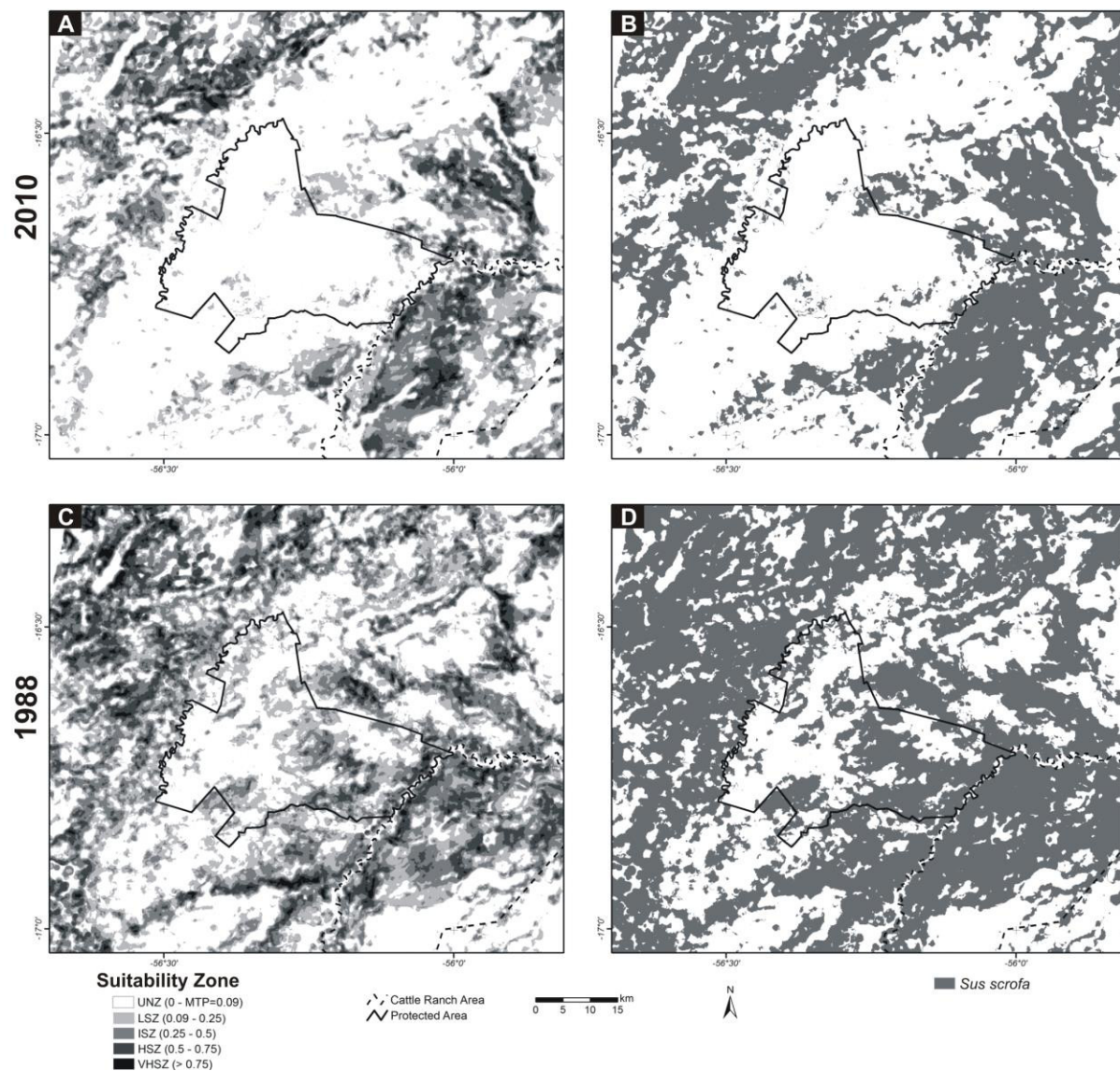


**Figure 3:** Jackknife test results of individual environmental variable importance in the development of the MAXENT model relative to all environmental variables (dark grey bar) for each predictor variable alone (black bars), and the drop in training gain when the variable is removed from the full model (gray bars). Pasture (PAS); Scrubland (SCR); Seasonally Dry Forest (SDF); (WAT) Distance to Water; Scheelea Forest (SCH); Seasonally Flood Forest (SFF); Termite Savanna (TSV); Riparian Forest (RIP); Bamboo Forest (BAM); Burned areas (BRN).





**Figure 4:** Response-curves of the variables in the *Sus scrofa* distribution model. (A) Pasture (PAS); (B) Scrubland (SCR); (C) Seasonally Dry Forest (SDF); (D) Distance to Water (WAT). These curves show how each environmental variable affects the MAXENT prediction when all environmental variables are used to build the model.



**Figure 5:** MAXENT Environmental Suitability Maps for *Sus scrofa* in Northern Pantanal. A) 2010 model, B) 2010 potential distribution binary map (suitable/unsuitable) based on the MTP cutoff criteria (MTP = 0.09); C) model project to 1988 environmental conditions and D) 1988 potential distribution binary map. Unsuitability Zone (UNZ), Low Suitability Zone (LSZ), Intermediate Suitability Zone (ISZ), High Suitability Zone (HSZ), and Very High Suitability Zone (VHSZ) identified.