

Yellow Rail in Alberta's Oil Sands Region

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October 18, 2019

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1 Introduction

Yellow Rails (*Coturnicops noveboracensis*) are one of the most secretive and poorly understood bird species in North America. They are migratory, spending the months of May until September at their breeding grounds throughout Canada, and the rest of the year in wetlands along the southeast coast of the United States. The remoteness of their wetland breeding habitats and their nocturnal activity patterns render them poorly sampled by standard bird monitoring efforts. A lack of information regarding distribution, population size, population trends, and basic biology has been a primary reason for conservation concern. The purpose of this report is to summarize findings from monitoring efforts in the Oil Sands Region (OSR) of Alberta, synthesize available knowledge into tools for future management, and highlight priorities for further research.



Figure 1: Yellow Rail. Photo credit Audobon Society.

1.1 At Issue

Current knowledge of the breeding habits of Yellow Rails suggests that they primarily breed in graminoid fens, with breeding territories characterized by 0 to 30-cm of standing water and dense cover of grasses and sedges (Stenzel, 1982; Bookhout and Stenzel, 1987; Austin and Buhl, 2013; Leston and Bookhout, 2015). Much of this breeding territory is in remote areas of the boreal natural region (Wells and Blancher, 2011).

The two main threats facing the Yellow Rail in the OSR are:

- the **direct effects** of surface mining, in which their habitats are removed;
- the **indirect effects** of altered hydrology due to development, which may affect the suitability of habitat well beyond the footprint of development (Environment Canada, 2013).

1.2 Management Goals

Yellow Rail abundance and occupancy can fluctuate from year to year at a wetland, which is thought to be driven by inter-annual variation in water levels. Nevertheless, some wetlands in the OSR are reliably occupied by large numbers of Yellow Rails every year (dozens of individuals, E.Bayne *unpublished*). As such, a management goal for this species in the OSR is to identify Yellow Rail breeding sites and prioritize these for conservation. As part of this, monitoring must be focused on understanding both the direct and indirect effects of development on key habitats, such as the mineable regions around McClelland Lake (as required by the Environmental Protection and Enhancement Act).

2 Monitoring and Research Objectives

- **Identify key breeding sites**

Currently, Yellow Rails have been found at approximately 200 survey points in the OSR. A habitat map constructed from these data can be used to predict additional breeding sites and estimate population sizes and potential threats. Predicted sites should be surveyed when possible to verify presence/absence. Regions that are potentially important but which have not been thoroughly surveyed include the wetlands surrounding Lake Clair in Wood Buffalo National Park, the entire “western panhandle” of the OSR, and most wetlands not within 10-km of a road.

Identification of new sites can be accomplished by visiting sites of high predicted habitat suitability to confirm presence/absence of Yellow Rails. In particular, visiting areas with large expanses of predicted suitable habitat is important, as these locations are likely to harbour significant populations of Yellow Rails.

- **Refine population estimates**

Existing population estimates put the population of Yellow Rail at 10,000 - 25,000 individuals globally. The population in Alberta has been estimated at 500 pairs. However, this is likely an underestimate, because recent surveys have found nearly 300 males (with an assumed equal number of females) in the surveyed areas of the OSR, which itself covers only about 20% of the province (E.Bayne, unpublished data). The degree of underestimation remains unknown and is the focus of ongoing work. In this report we present preliminary results from Hedley et al. (*in prep*) that report a new regional population estimate for the species based on monitoring from 2013-2018.

- **Continue research on movement ecology**

Yellow Rails migrate from Canada to the southeastern United States each year. Beyond this, little is known about their movements. The consensus view regarding the conservation of migratory species is that successful conservation efforts must focus on the full annual cycle.

Populations in Quebec are thought to undertake a molt migration in the late summer, moving dozens of kilometers from their breeding grounds to molt. It is not known if Yellow Rails in Alberta do the same, but if they do, it may mean their habitat needs extend well beyond their breeding territories.

Yellow Rails are also notorious for their lack of site fidelity. Rates of recapture of the same individual in successive years are $<1\%$ (K. Drake, Pers. Comm.), suggesting that the rails move around between years. This behaviour is thought to have evolved as an adaptation to ephemeral wetland habitats, which can become unsuitable if water levels are too high or too low. The low ($<1\%$) interannual recapture rate is a practical barrier to long-distance tracking, since most tracking devices require recapture. Those that remotely transmit data via satellite are currently too large to attach to Yellow Rails. An intermediate option is a GPS tag with the option of data download via short-range radio receivers, and this option is currently being explored.

- **Assess threats posed in the OSR**

Several oil sands mines (or proposed mines) abut or overlap significant patches of potential Yellow Rail habitat. Research is ongoing to place these threats within regional and global contexts. This is proceeding in two main ways: first, by continuing to survey suitable habitat on and near leases to determine if the predicted habitat is actually occupied; and second, by estimating the percentage of predicted habitat that occurs on, near, and off lease, and using these percentages to estimate proportion of the regional and global population that are threatened by development. Additionally, existing water depth data will be used to examine how Yellow Rails respond to changes in water levels between years, and findings can be used to develop better mitigation strategies.

- **Develop tools for Yellow Rail management**

Finally, research findings can be distilled into tools for land managers to improve Yellow Rail conservation in the future. In this report we present a predictive habitat suitability map (30-m raster resolution) that can be used to assess threats to Yellow Rail in the region and identify new potential breeding sites.

3 Data Collection

The status of Yellow Rails in the oilsands region has been poorly understood historically because they are not well surveyed by standard monitoring efforts. In 2012, the now-defunct Ecological Monitoring Committee for the Lower Athabasca began targeted surveys for Yellow Rails throughout the oilsands region. In the first year, human point counts and autonomous recording units (ARUs) were both employed in surveys, but it was quickly determined that ARUs are as good or better than humans at detecting Yellow Rails, and have the added benefit that they do not require humans to venture to remote areas at night. ARUs have been the sole survey method since 2013.

Yellow Rails are surveyed through listening to recordings made at 2:00am during peak breeding season, which runs from roughly May 20 to July 15 each year. At 2:00am, we have found that Yellow Rails are highly vocal and easily detected, such that a 1-minute survey has a $\sim 50\%$ probability of detecting a Yellow Rail, given that one is present. Therefore, at each station surveyed in a given year, four 2:00am recordings are listened to to detect the presence of rail. The four recordings are randomly sampled from the available days between June 1 and July 15. Conducting multiple surveys per station allows estimation of both occupancy rate and detection probability via occupancy analysis (discussed in the results section below).

Just 2 Yellow Rails were detected at 302 survey stations in 2012 (0.007 individuals per station); these findings initiated an iterative process whereby detections were used to refine our understanding of habitat preferences, which was then used to identify additional sites to survey. As evidence of the effectiveness of this process, at 102 stations that were visited for the first time in 2018 and had high predicted suitability, we found 22 Yellow Rail individuals (0.22 individuals per station, more than 30 times the rate of detections in 2012).

Once a wetland has been selected for surveys, multiple ARUs are usually placed within the wetland. The most common deployment scheme is to place five ARUs in a square with 600m edges: one unit is placed at each corner, and one in the middle. Variations on this theme have been used, with the general intent of placing ARUs sufficiently far (>500m) from their nearest neighbours to increase spatial independence. Each ARU placement is considered a ‘site’ in the analysis below, and displayed on the map.

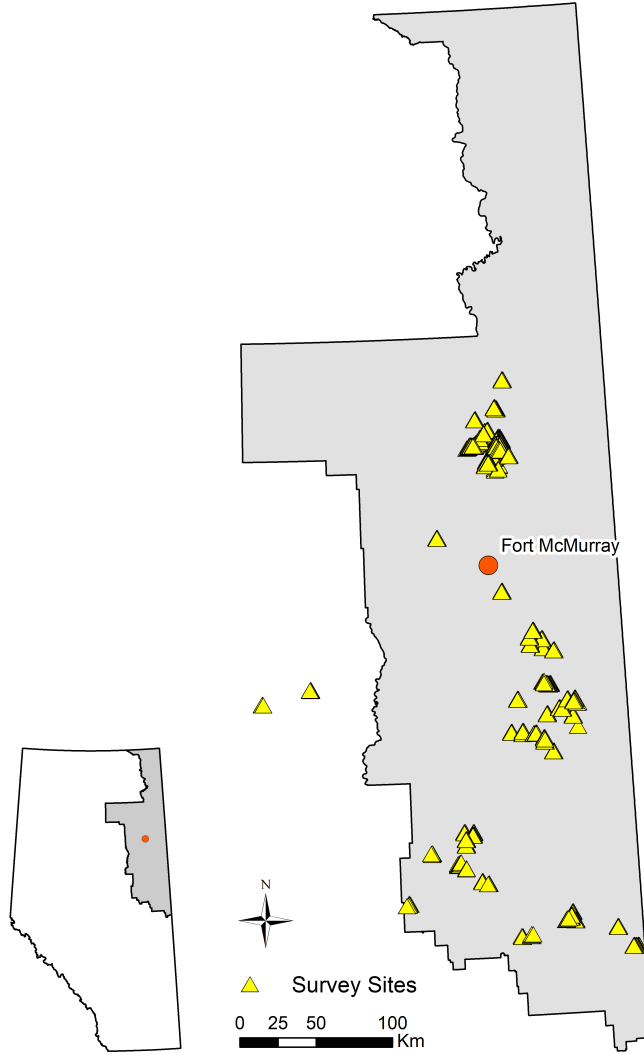
In addition to visiting new sites, we have resurveyed previous survey locations, which will allow an assessment of inter-annual variation in site occupancy and analysis of trends over time. As of 2017, 143 survey stations with at least one Yellow Rail detection had been surveyed in multiple years.

4 Results

4.1 Key Breeding Sites in the OSR

We set out to identify and monitor key Yellow Rail breeding sites in the OSR, as per our first objective.

In the map below, the reader can filter the data in several ways, including by survey year (2013-2018), regionally important wetland habitat, or whether a Yellow Rail was detected at a particular site. The seven regionally important wetlands (or wetland complexes) listed here are the source of 249 (87%) of the 286 individuals (males) detected from 2012 to 2018 via acoustic surveys in the study region. No other wetland site has so far been found to contain more than 10 individuals. For smaller wetlands, the number of detected males may represent a reasonable population estimate of males at the wetland; however, for larger wetlands where only a portion of the wetland has been sampled, this is likely an underestimate.



4.2 Trend Analysis

4.2.1 Methods

For this analysis we estimated a dynamic site-occupancy model (MacKenzie et al., 2003), which allows for inference about the occurrence of Yellow Rail at collections of sites, and about how changes in occurrence are driven by colonization and local extinction. These models are dynamic in the sense that they are applied to multiple “periods” (years, in our case) and allow for between-period occurrence dynamics (i.e. a rail may be present one year, but not the next). In a monitoring context such as ours, site occupancy probabilities can be used as a metric reflecting the current state of the population of interest (MacKenzie et al., 2003).

Dynamic occupancy models are also able to account for imperfect detection probability (i.e., a rail

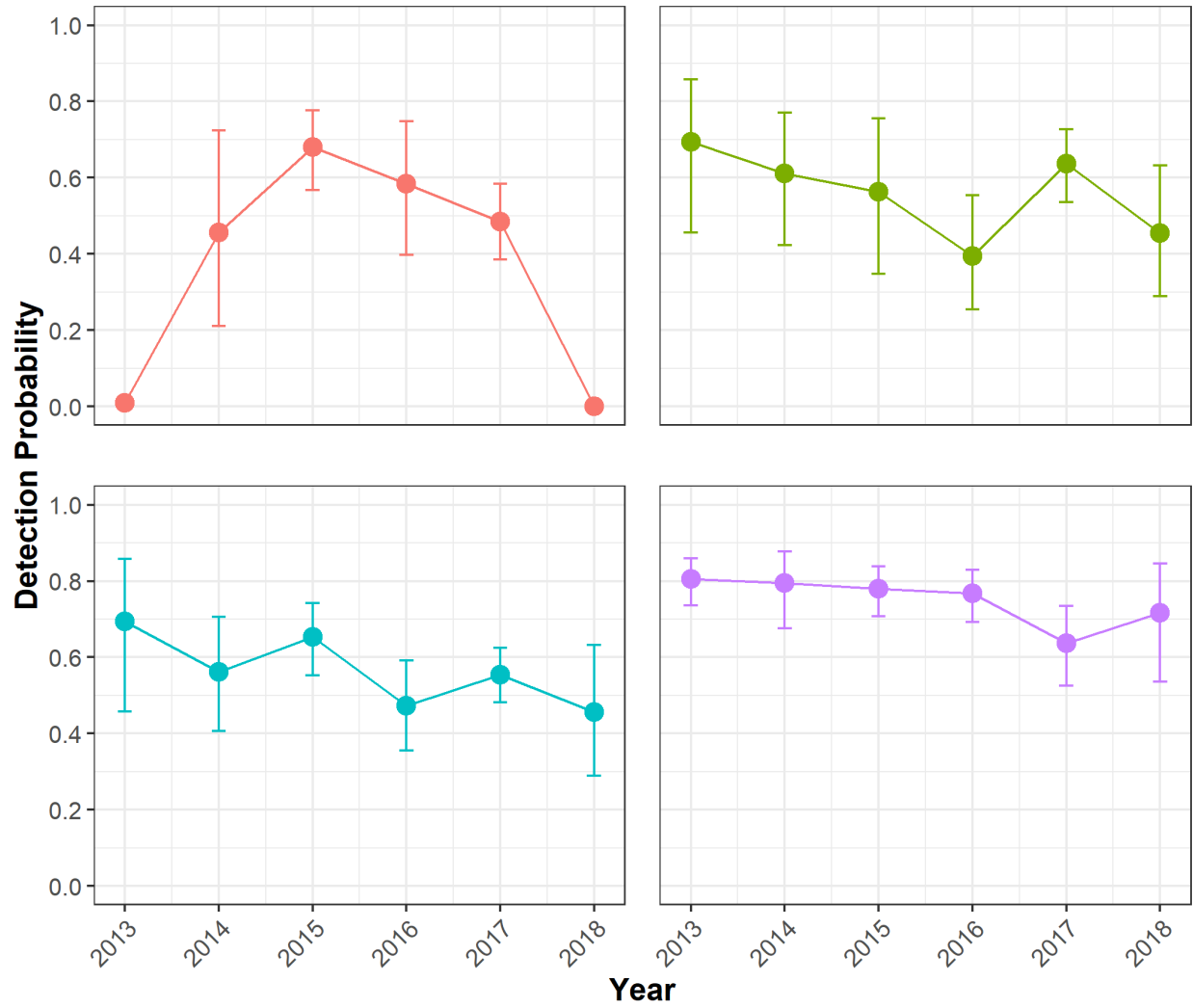
can go unobserved at a site during a particular survey, even if it is there). An occupancy model may be seriously biased if detection error is unaccounted for (Moilanen, 2002; Royle and Dorazio, 2008). This bias is manifested as underestimates of site occupancy and inflated estimates of species turnover rate, where apparent recolonization of a site is actually just due to non-detection of a species actually present.

We use the package `unmarked` (Kery and Chandler, 2016) to fit a dynamic occupancy model to our Yellow Rail data using the function `colext()` in R v3.6.1 (R Core Team, 2019). To better understand variation within the region, we subset our data into four geographic areas and occupancy analysis is conducted on each: the Eastern McClelland Fen Mine ($n = 140$), Western McClelland Fen Mine (71), all Mineable Areas (226), and Non-Mineable Areas (269). The analysis is conducted using all sites together as well (Full Region).

4.2.2 Detection, Colonization, and Extinction

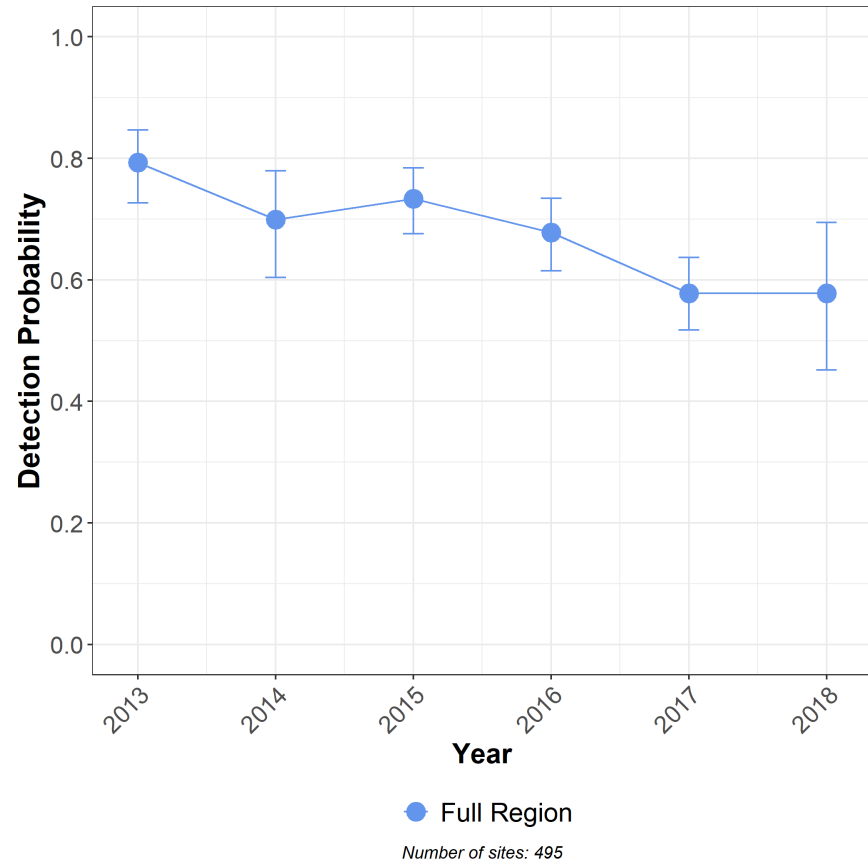
Detection is the proportion of visits to a site where a species is detected. Rather than using this straight proportion, this model accounts for imperfect detection probability using the method described in MacKenzie et al (2003).

Detection probability by subset is displayed in the figure below, followed by the full region. The error bars represent 90% confidence intervals in the estimated detection parameter.



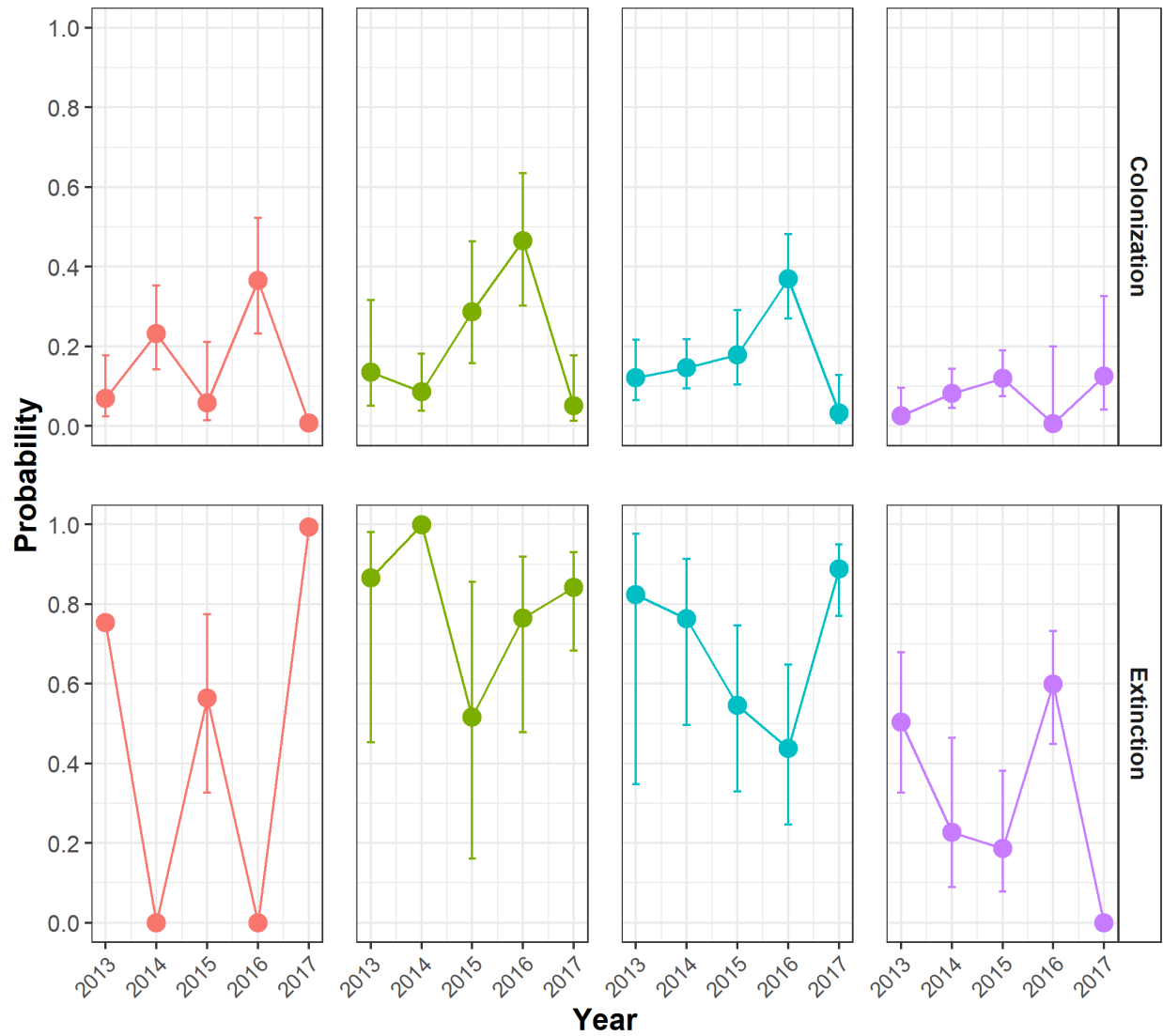
● Western McClelland Fen Mine ● Eastern McClelland Fen Mine
● Mineable Areas ● Non-Mineable Areas

Number of sites: 71 (West), 140 (East), 226 (Mineable), 269 (Non-Mineable)



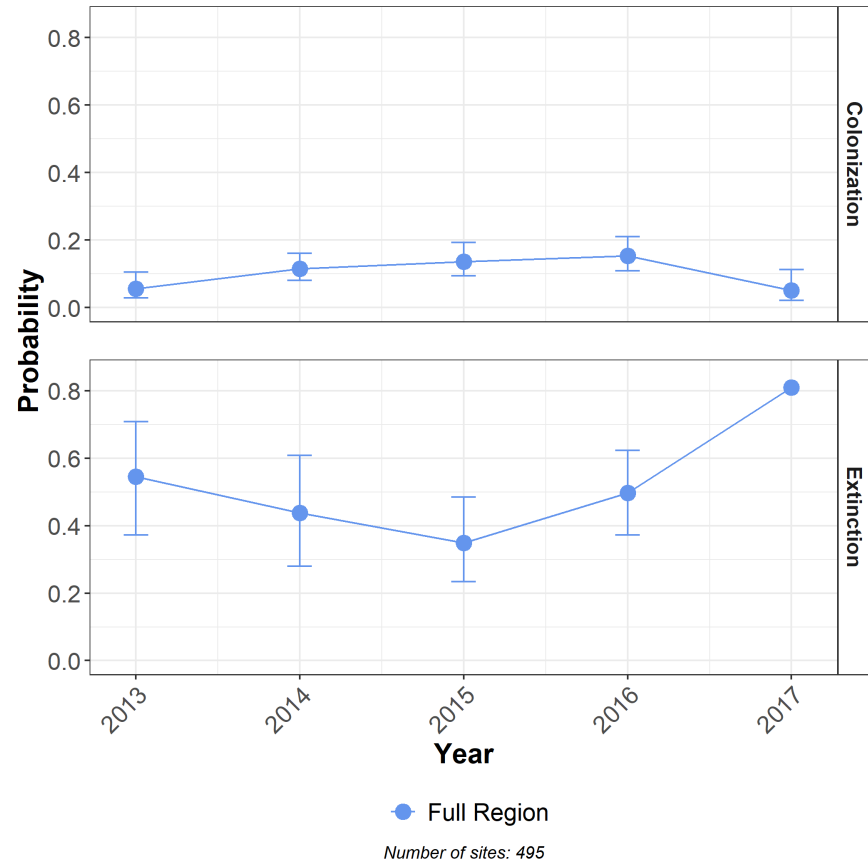
Changes in occurrence of a species can be driven by rates of both colonization and extinction at a set of local sites. Colonization is probability that an unoccupied site becomes occupied in the next period; conversely, extinction (or alternatively, survival) describes the probability that an occupied site continues to be occupied in the next period.

Predicted colonization and extinction parameters are displayed below for each regional subset, followed by the two parameters for a full regional model. Error bars represent a 90% confidence interval in the estimated colonization and extinction parameters.



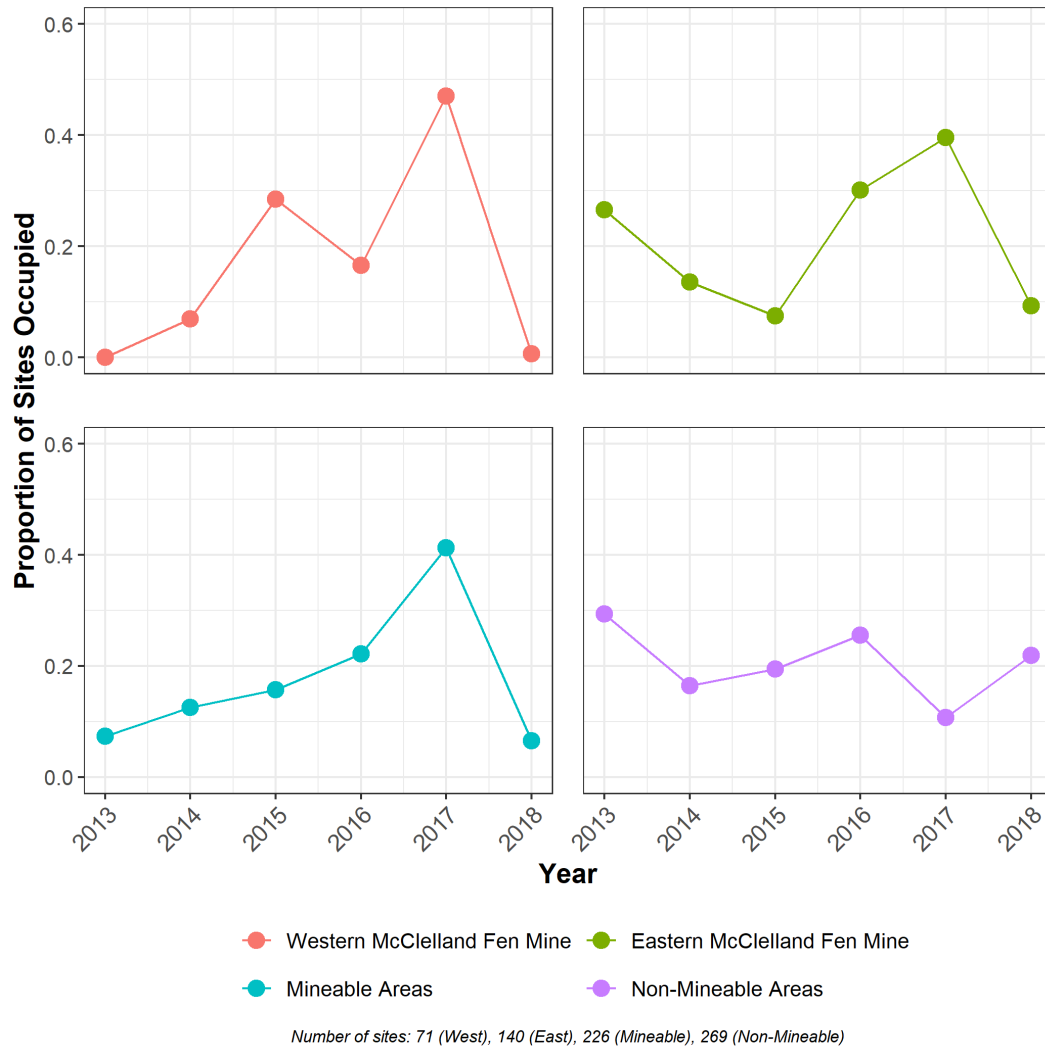
● Western McClelland Fen Mine
 ● Eastern McClelland Fen Mine
 ● Mineable Areas
 ● Non-Mineable Area

Number of sites: 71 (West), 140 (East), 226 (Mineable), 269 (Non-Mineable)

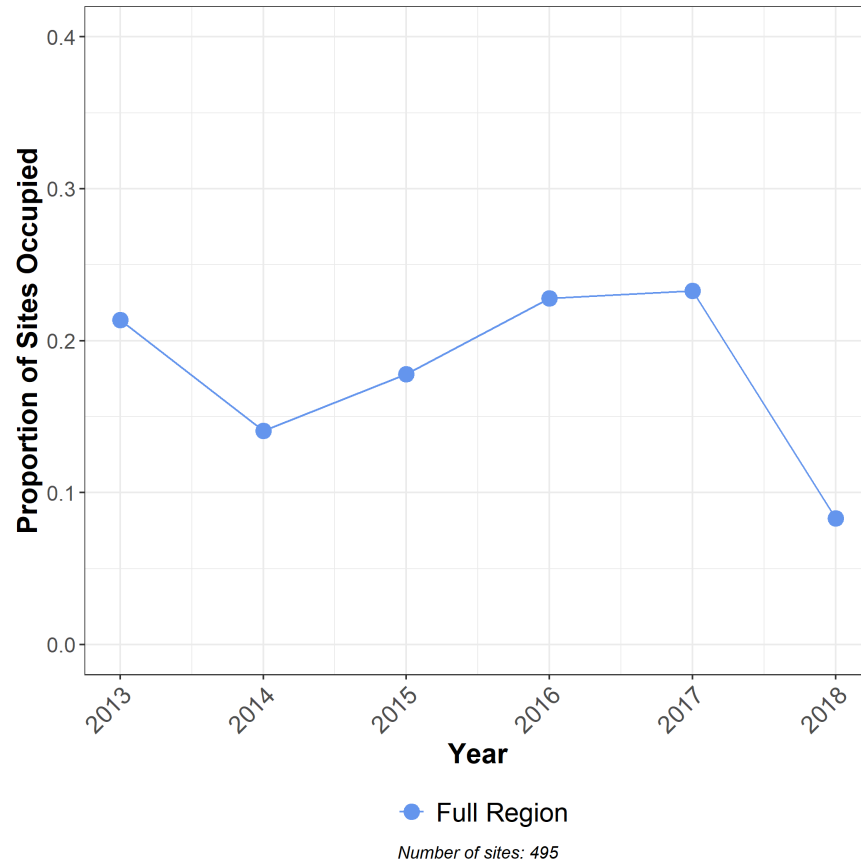


4.2.3 Occupancy

Occupancy, adjusted for imperfect detection, is estimated for each of the four regional subsets between 2013 and 2018.



Occupancy is also estimated for the full region, including all sites.



One aspect of the data worth noting is the drop in occupancy rates in 2018 in the Western McLelland fen. Occupancy rates were ~0.4 in 2017, and dropped to 0 in 2018. This may be a cause for concern from a conservation perspective, as this section of wetland is adjacent to ongoing developments (Suncor Fort Hills mine). However, a causal link cannot yet be drawn for a few reasons. First, consistent with the existing literature on this species, yellow rail occupancy fluctuates a lot in individual wetlands. Linking changes in occupancy to causal mechanisms is complicated by the inherent noisiness of the data. Second, the potential decline occurred only in the most recent year. Additional years of data would be helpful to assess whether this represents a change in habitat suitability or simply natural fluctuations. In fact, data from 2013 also showed low occupancy rates in the western fen, suggesting 2018 may not have been anomalous. Data from 2019 have been collected and will help answer these questions, but monitoring in 2020 and beyond will likely be needed to draw strong conclusions.

4.2.4 Further Analysis

To better understand the between-year dynamics of Yellow Rail occupancy, certain environmental conditions or attributes of each site could be added as covariates to the occupancy model. Evidence suggests that Yellow Rail are sensitive to changes in water levels, and even modest changes in hydrology may render habitat unsuitable as a breeding site (Austin and Buhl, 2013; COSEWIC, 2009). Where oil sands development (or potential development) encroaches upon Rail habitat (such as around McClelland Lake), changes to hydrology may pose as big a threat as direct habitat

removal. Adding measurements of water depth levels taken during field sampling to the occupancy model may help explain variation in occupancy rates both between years and between sites.

Preliminary work has been done to include water measurements in a model of Yellow Rail occupancy, which will be presented in an updated version of this report. Below is displayed boxplots of the distribution in water depth measurements taken throughout the monitoring period (2013-2018), subsetting by three regions of interest: the Eastern McClelland Fen Mine, Western McClelland Fen Mine, and unmineable sites¹.

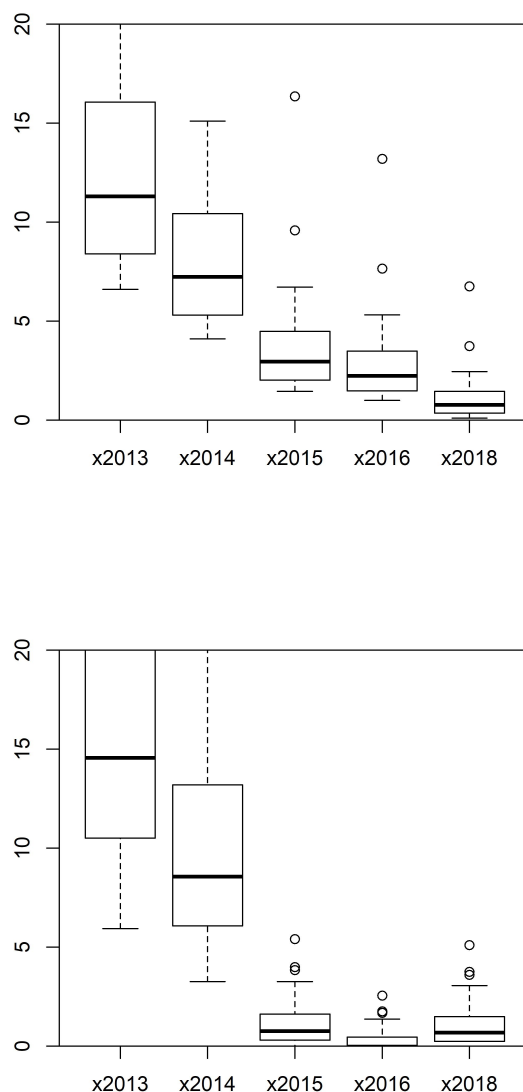


Figure 2: Water depth in the Western (left) and Eastern (right) McClelland Fen Mine, by year.

¹Note that this regional population estimate applies to the area covered by the habitat suitability map, not the OSR as a whole.

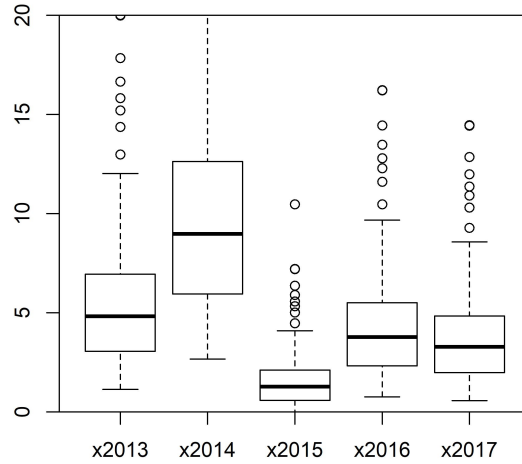


Figure 3: Water depth in the unmineable region.

Distance to mine edge has also been hypothesized as an important predictor of Yellow Rail occupancy at surveyed sites. The map below outlines how mine footprint (ABMI, 2017) has changed near McClelland Lake (both west and east portions of the fen) throughout the study period, along with variation in site occupancy. Mine encroachment does not appear to alter spatial patterns of rail occupancy, as detections are found both close to and far from mine edges. However, further work will be required to test this effect.

4.3 Threats to Known Breeding Sites

Several oil sands leases overlap with important breeding sites for Yellow Rails in the OSR, most notably the west and east areas of the McClelland Lake Fen. This interconnected fen complex contains a vast area of suitable habitat and large numbers of breeding individuals each year. The reader can view this overlap in the above map through the ‘Nearby Oil Sands Lease Sites’ layer.

The western portion of the McClelland Lake Fen is overlapped by the Fort Hills Oil Sands Project lease. About 55% of the identified suitable habitat in the area lies within the lease, a portion which includes 66% (35 of 53) of the Yellow Rails detected in the western McClelland Lake Fen since 2012.

A number of developments, or proposed developments, overlap with Yellow Rail habitat on the eastern portion of the McClelland Lake fen as well. Rails have been detected in the proposed footprint of both the Jackpine Mine Phase 2 and Kearl Oil Sands Projects (30% of individuals detected in the area since 2012). Yellow Rails were also detected in Aurora Mine South, and although no detections have been recorded recently, past surveys have recorded Rails in the Muskeg River Mine Project lease area (Hatfield Consultants, 2008). The next section discusses the potential Yellow Rail habitat in each lease area, much of which has yet to be surveyed.

5 Planning Tools

5.1 Habitat Suitability Map

Results from Yellow Rail site surveys between 2012-2017 were used to produce a map of preferred habitat across a subset of the OSR. Four mapping products were used to build this final ‘fusion’ model:

- Alberta Biodiversity Monitoring Institute (ABMI) 2010 Landcover Classification. This product is an Alberta-wide (‘wall-to-wall’) provincial land cover based on digital classification of Landsat satellite imagery and enhanced using GIS datasets obtained from the Government of Alberta. It consists of 15 classes, including water, shrubland, grassland, agriculture, exposed land, developed land, and various forest types.
- Ducks Unlimited Enhanced Wetland Classification. This is a western boreal product based on a combination of Landsat and Radarsat. Using object-based supervised classification methods this product identifies 19 boreal plans wetland classes and 10 other land cover classes.
- Landcover Classification of Canada. Based on MODIS satellite observations from 2005, the product identifies 39 classes of landcover.
- Alberta Vegetation Inventory. AVI is a photo-based digital inventory developed to identify the type, extent and conditions of vegetation. Human observers digitize polygons into a series of forest type classes that include various non-forested categories. Environment and Climate Change Canada (Edmonton) created a classification system from the AVI that converted the underlying attributes into 37 unique classes of which nine represent wetland types.

Each of the four products were either available in, or converted to, a 30-m raster. We used a resource selection function approach based on the logistic discriminant approach (Manly et al. 2002) to determine whether each land-cover class within four distinct mapping products was avoided, neutral, or selected. A land-cover class that was avoided had a beta coefficient that was negative and a 95% confidence interval that did not include zero. A land-cover class that had a beta coefficient that was positive and 95% confidence interval that did not include zero was selected. All other land-cover classes were declared neutral. For each mapping product, we then ranked avoided habitat as 0, neutral as 1, and selected as 2. We mapped the predicted selection class for each land-cover class in each mapping product. To combine these four maps into a composite map (the fusion map), we took the sum of the four RSF maps for each 30-m cell across the region. An 8 was a spatial location where all products agreed that Yellow Rail selected that area while a 0 was a spatial location where all products agreed was avoided. Mapped values between 1 and 7 indicate the degree of consistency and the direction of selection with intermediate values being spatial locations where there was more uncertainty between mapping products in terms of whether the land-cover was selected or avoided.

In order for a habitat map to be considered predictive, higher occupancy rates should be found in areas identified as more suitable. Targeted monitoring was undertaken in 2018 at previously unsurveyed locations to assess whether the habitat map could reliably predict Yellow Rail occupancy. Using occupancy modeling, it was confirmed that locations with higher predicted suitability had higher occupancy rates (Hedley et al, *in prep*). Only three individuals were detected at two locations in habitat classes zero through six, while 20 were detected in classes seven (4) and eight (16) (Hedley et al, *in prep*). By restricting future survey effort to the most suitable habitats, Yellow Rails can be encountered more efficiently in the future with more successful site identification.

The interactive map below displays the predicted habitat suitability for Yellow Rail in the subset of the OSR. The area of the map is restricted to the area covered by each of the four input mapping products. Note that although the mapping product was developed at a 30-m resolution, it is displayed here at larger resolution to improve rendering speeds.

The distribution of habitat classes in each of seven mining lease sites is displayed in the figure below. Jackpine Mine Phase 2 contains the most high quality (classes 7 & 8) habitat within its boundaries, primarily in the northern portion of the lease where it overlaps with the Eastern McClelland Fen.

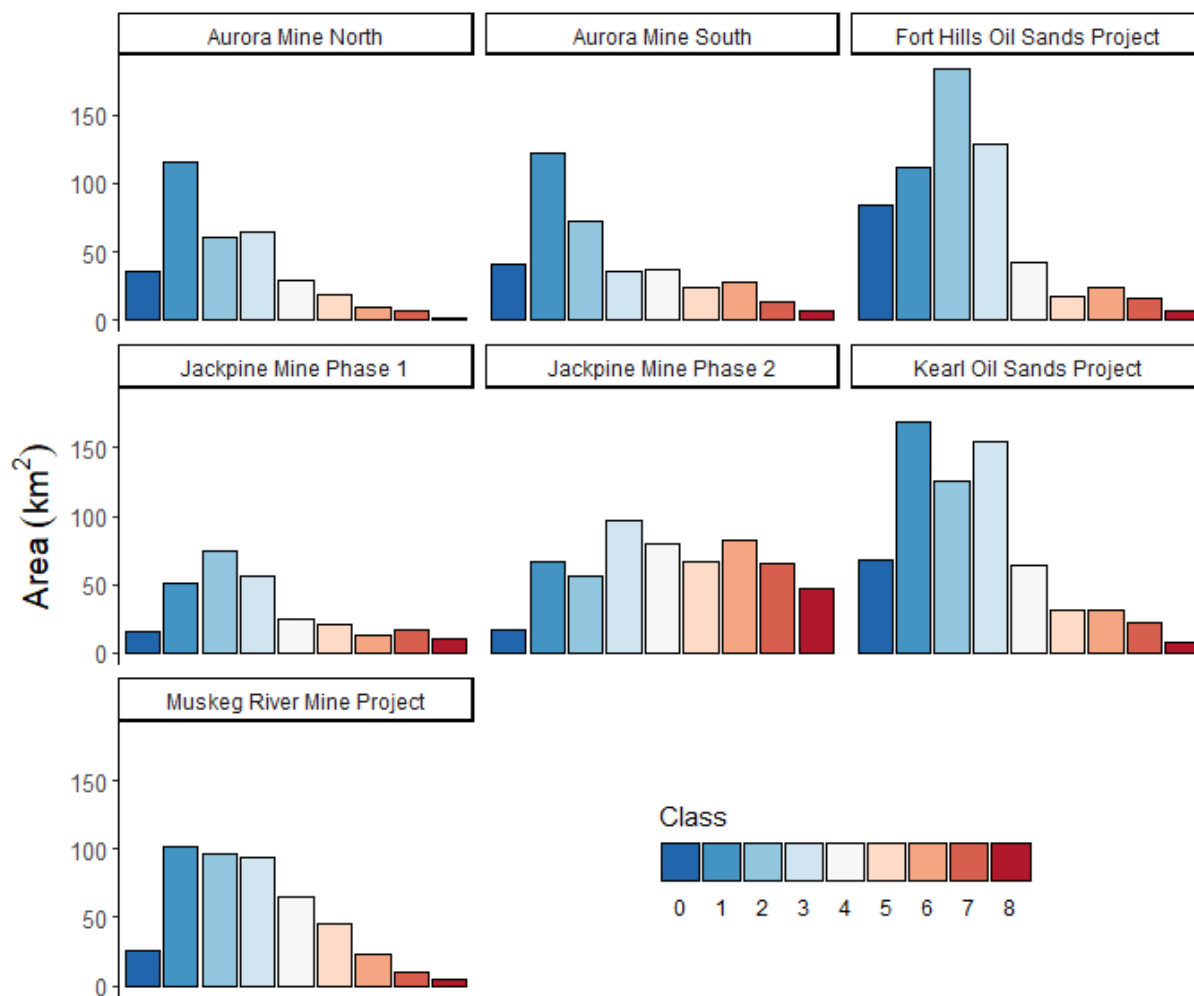


Figure 4: Distribution of habitat classes in seven mining lease sites near McClelland Lake.

5.2 Spatially Explicit Abundance Modeling Using Satellite Remote Sensing

Advancements in remote sensing technologies have dramatically increased the breadth and resolution of landcover data available for ecological modeling purposes (Cord et al., 2013). Among these advancements has been the availability of open-access satellite data (e.g. Landsat, Sentinel-1, Sentinel-2), which when combined with cloud computing power (e.g. through Google Earth Engine) and data science software has made the integration of remotely sensed data into applied ecological research possible.

McLeod (2019) used the Yellow Rail abundance data collected throughout the OSM (and more broadly, the Lower Athabasca Region) to build a distribution model with landcover information directly derived from satellite data. This information included data obtained from Sentinel-1, Sentinel-2 (Copernicus Programme, 2017) and the Advanced Land Observing Satellite (ALOS) Digital Elevation Model (DEM) (JAXA, 2019), which were then processed using Google Earth Engine. A total of 15 input variables were used in the model to predict Yellow Rail abundance, including Anthocyanin Reflectance Index (ARI), the Normalized Difference of Polarization (DPOL), a topographic wetness index, and a Red Edge Inflection Point (REIP). A boosted regression tree modeling approach was used to fit the distribution model for Yellow Rail. There are several inherent advantages to this approach of using remotely sensed data directly. First, it allows for avoidance of building models off prior models (e.g. landcover classifications), which compounds error rates (McLeod, 2019). Additionally, the continual collection of satellite data makes it possible to dynamically update a species distribution model with annual, or seasonal, remotely sensed inputs to better reflect changes within a dynamic wetland ecosystem (like those preferred by Yellow Rail) (McLeod, 2019).

Displayed below is a subset of the predictive map, which shows the predicted abundance of breeding Yellow Rail at a 10-m resolution in both the eastern and western portions of the McClelland Fen Mine area. Note that upland areas were excluded from the model’s predicted area. As McLeod (2019) explains, the predicted abundances should be interpreted as an ordered rank where higher predictions equate to an increased likelihood that more individual Yellow Rail are present during the breeding season.

The potential also exists for remote sensing techniques to help quantify water depth at survey site locations. As mentioned previously, water depth measurements were taken by field staff during the Yellow Rail monitoring program; however, in some cases, practical sampling difficulties has rendered parts of this dataset incomplete. Supplementing this information with radar data from satellites could potentially improve habitat modeling capabilities (e.g. Jiang et al., 2015).

5.3 Regional Population Estimates

Hedley et al (*in prep*) used the results of the habitat suitability map, combined with occupancy modeling, to produce a regional population estimate for Yellow Rail². Occupancy rates in each habitat class (0-8) were extrapolated to the rest of the region using a hexagon grid methodology, where a hexagon grid is simulated across the study area and points are generated at the centroid. Two grid sizes, in terms of distance between centroids, were chosen based on assumptions about the detection radius of the ARUS, territory size, and territory shape (details available in Hedley et al, *in prep*): 802-m and 605-m. Once these grids were simulated across the landscape, occupancy rate was predicted at each cell according to the habitat class at the centroid.

Using the larger grid size, which is based on an assumed effective ARU detection distance of 250-m, the total regional population size was estimated to be 1,597 males. With the smaller grid size, based on a effective detection distance of 150-m, the regional population estimate was 2,636 males. The table below summarizes these findings.

Relative to their share of the total area (13.9%), leased areas (both mining and *in situ*) account for a proportionally higher share of the estimated regional population of Yellow Rails (17%).

²Note that this regional population estimate applies to the area covered by the habitat suitability map, not the OSR as a whole.

6 Discussion

The boreal forest of Alberta was formerly considered an area of secondary importance for Yellow Rails. This is no longer the case, as bioacoustic surveys conducted in the past decade have significantly increased the number of confirmed Yellow Rails in the OSR. It now seems likely that this region hosts a significant proportion of the global population of Yellow Rails.

Yellow Rails are not evenly distributed across the boreal forest, but are concentrated in large wetland complexes. Conservation efforts should focus on minimizing the effects of development within these important habitats. New tools are available that can help visualize Yellow Rail occurrence and identify breeding sites for surveys.

Placing the threat in a broader regional and global context is also important. Regionally, surveys should be conducted in more large wetland complexes with high predicted habitat suitability to identify new significant breeding sites or confirm their absence. Globally, efforts should be made to refine population estimates by synthesizing information across known breeding hotspots in each province.

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