Double-Crested Cormorant Populations in San Francisco Bay from 1985–2017

Draft of Analyses

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# Background

This manuscript describes options for analyzing trends in DCCO populations in the San Francisco Bay Area from 1985–2017.

# Approach 1: Exponential and logrithmic growth models

## Method description

Following the methods of Manuwal et al (2000), I plotted raw regional counts using loess and standard error shading. If there were multiple counts for a colony within a given year, I used the maximum count. I identified which regions followed exponential growth and which followed logistic growth by visualizing the ln-transformed regional counts and comparing the r-squared and p-values for both models. For the regions of the Bridges and South Farallon Islands, I identified subsets of years where data followed distinct trajectories and fit independent exponential models for each data subset. I fit logistic growth equations for the regions of the Outer Coast and South Bay.

The logistic growth equations took the following form:

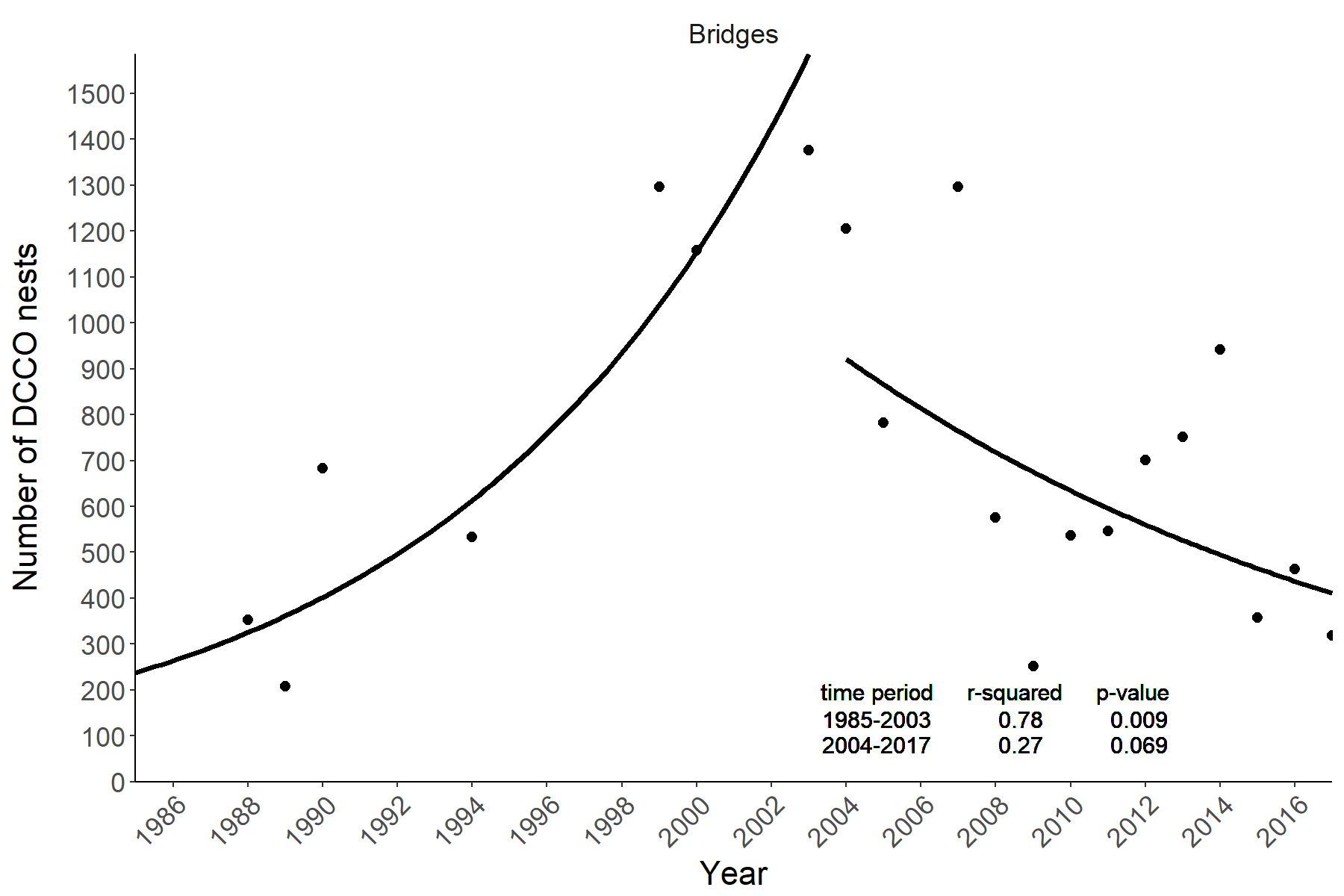
count~K/(1+((K-N0)/N0)*exp(-r*(Year-1986)))

where K is the carrying capacity, N0 is the initial population size, and r is the rate of increase (Gotelli 2008). I used the nls function in R to estimate K, N0, and r.

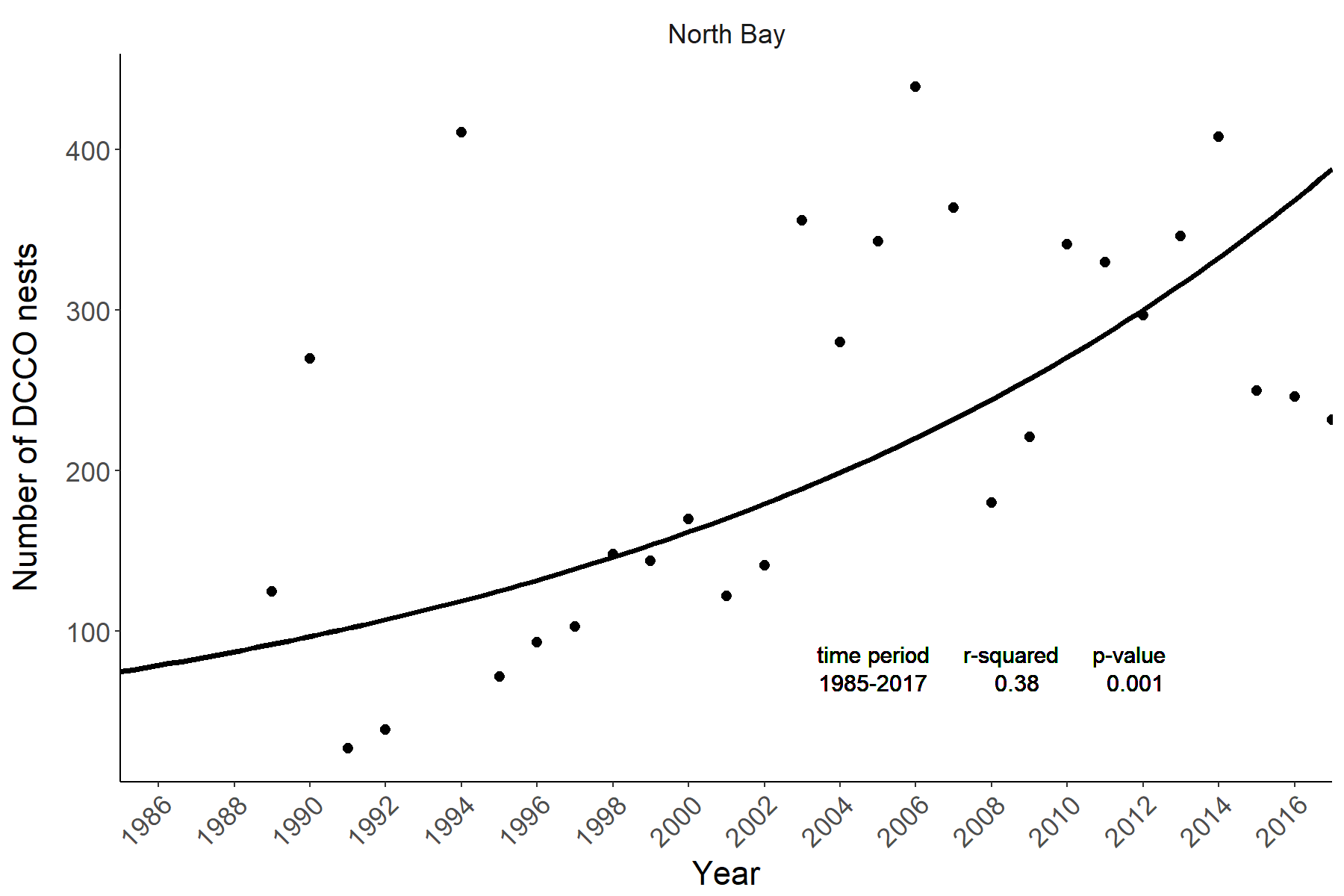
## Results

Table 1. Percent annual change in estimated nest counts by region. Estimates are based on log-linearized functions for discrete time periods.

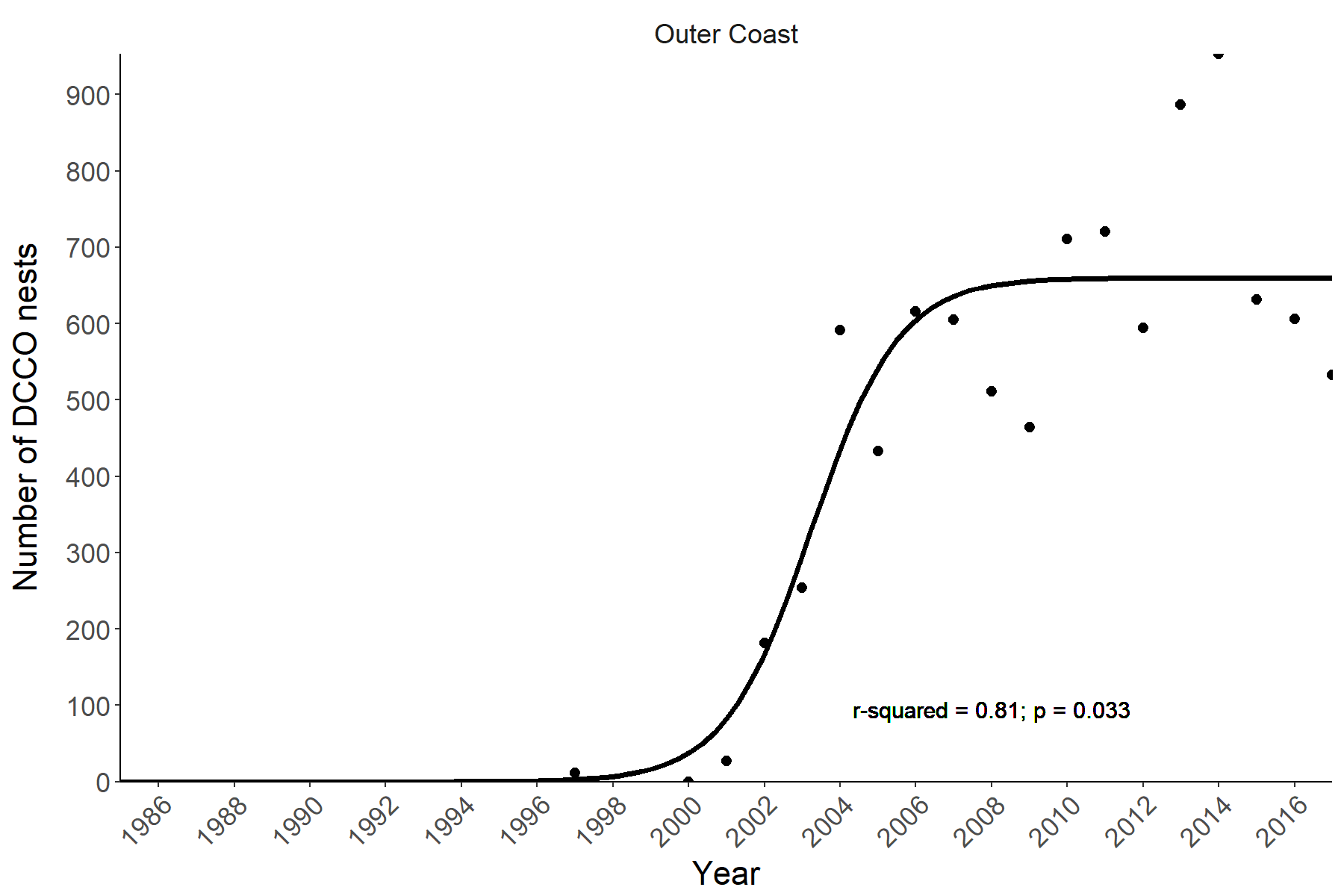
|  |  |  |  |  |  |
| --- | --- | --- | --- | --- | --- |
| Region | Time period | slope | se | pvalue | percent.annual.increase |
| Bridges | 1985-2004 | 0.11 | 0.025 | 0.009 | 11.14 |
| Bridges | 2004-2017 | -0.06 | 0.031 | 0.069 | -6.02 |
| North Bay | 1985-2017 | 0.05 | 0.013 | 0.001 | 5.28 |
| Outer Coast | 1985-2017 | 0.28 | 0.089 | 0.006 | 31.88 |
| South Bay | 1985-2017 | 0.11 | 0.016 | 0 | 11.99 |
| South Farallon Islands | 1985-2002 | 0.06 | 0.017 | 0.004 | 5.8 |
| South Farallon Islands | 2002-2017 | -0.07 | 0.027 | 0.019 | -6.97 |

 Fig 1. Regional counts over time in the Bridge region with fitted model (fitted as linear model on ln-transformed data).

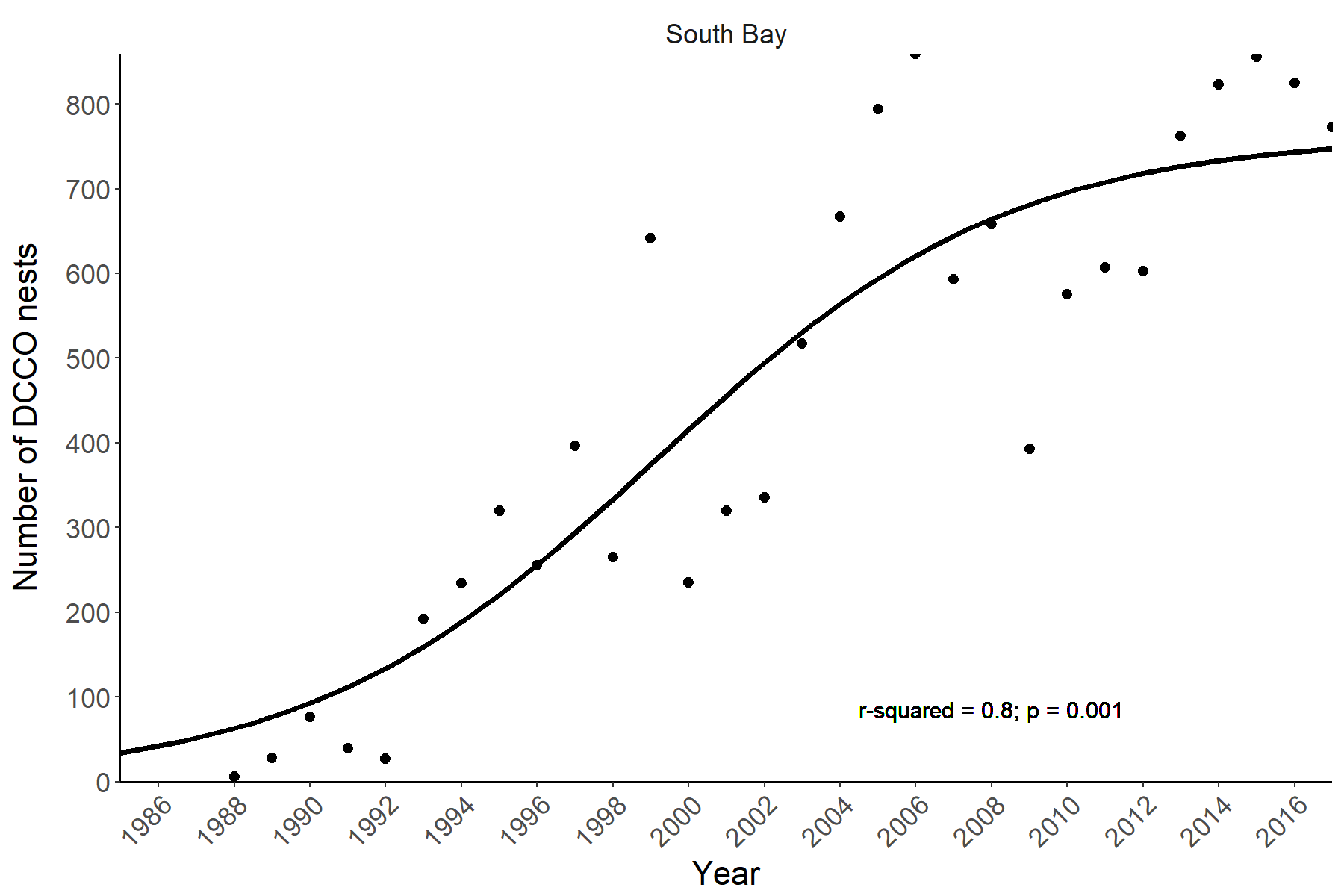
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 Fig 2. Regional counts over time in the North Bay region with fitted exponential model.

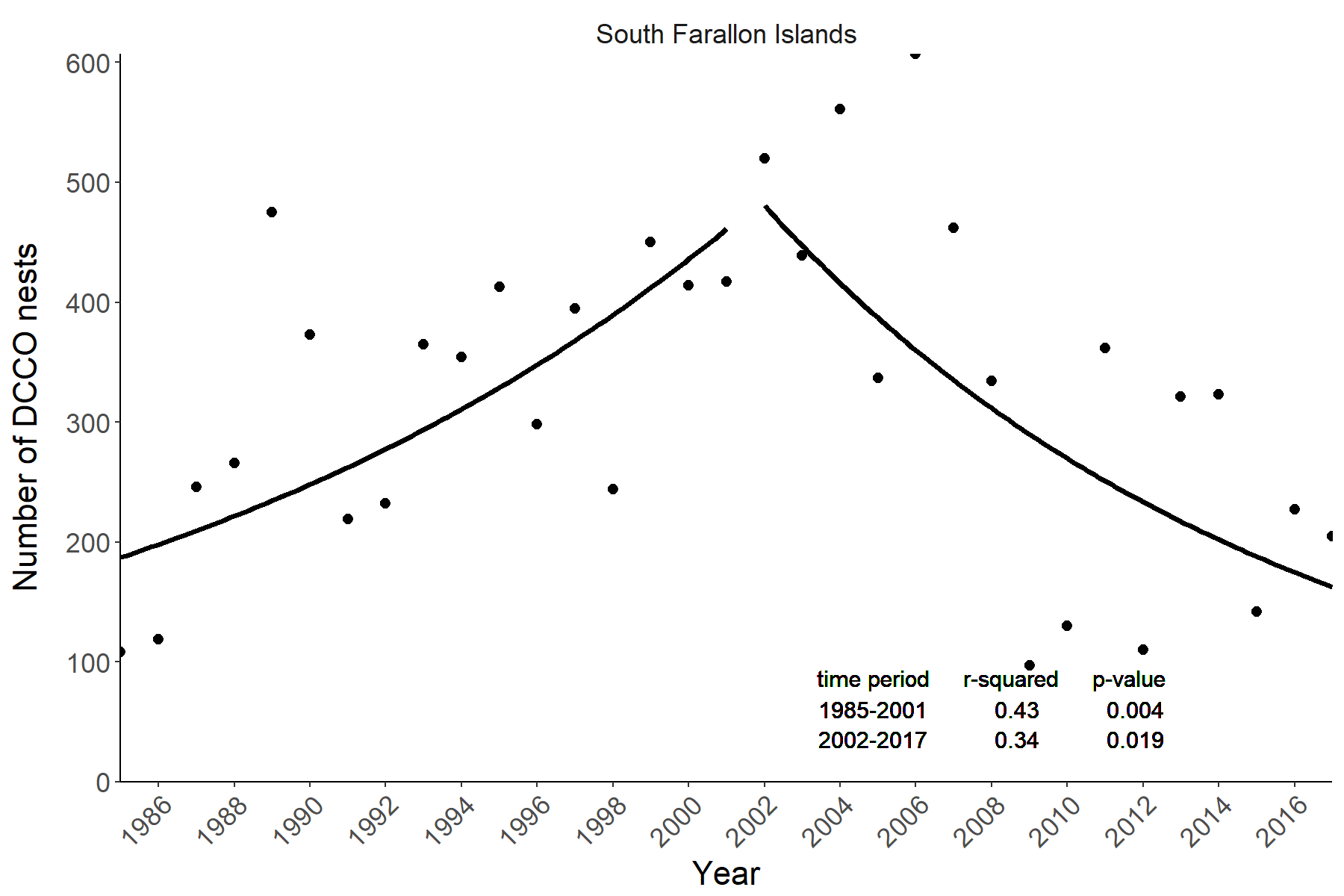
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 Fig 3. Regional counts over time in the Outer Coast region with fitted logistic model.

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 Fig 4. Regional counts over time in the South Bay region with fitted logistic model.

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 Fig 5. Regional counts over time in the South Farallon Islands region with fitted model (fitted as linear model on ln-transformed data).

# Approach 2: General Additive Mixed Models (GAMMs)

## Method description

Count data are frequently used to estimate population trends, but are subject to biases in data collection. Notably, raw counts are strongly affected by survey effort and survey dates and long-term trends can be biased by short-term annual shifts due to environmental variation. Our raw counts are likey subject to these effects. The North Bay and South Bay regions contain multiple (12+) DCCO nesting colonies, but not all sites were visited in each year and more sites were visited in the later years compared to the early years of the study. Site occupation also depends on day of the season. Birds arrive to breed in April, peak breeding occurs in June, and they depart in August. Nest counts increase and then decrease as the season progresses, so day of the season is an important covariate when inferring colony size. Other potential covariates are survey type (aerial, boat, or ground) and the observing organization. To account for potential biases, we included notable covariates in our estimates of regional trends. Long-term population dynamics are frequently non-linear, so we used an approach that would allow for nonlinear trends.

General additive mixed models are superior to using exponential and logistic growth equations because it is possible to include an interaction term between colony and year, which allows each colony to growth nonlinearly over time. Estimating the regional counts by summing colony counts and weighting those counts by estimated error corrects for years when certain colonies were not visited. This method also allows for additive terms to inform colony size, so I was able to test the effect of count date and survey type on colony counts. Both these covariates were likely to confound our estimates of regional population size.

Methods follow those of Shadish et al. 2014. GAMMs were devoped using the gam function in R. I compared multiple models and selected the model with the lowest AIC. The best model took the following form:

count ~ year\*colony + colony + survey type

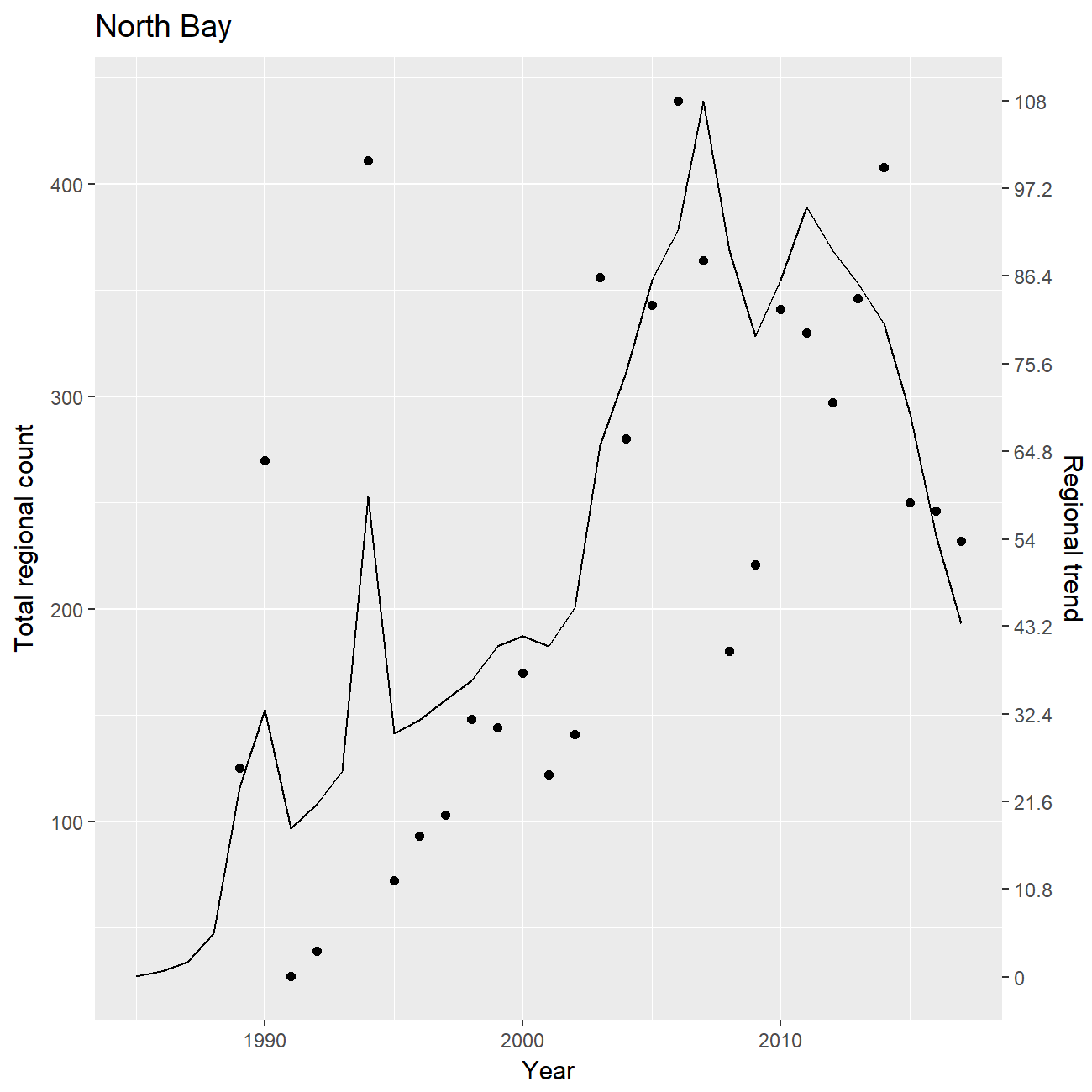
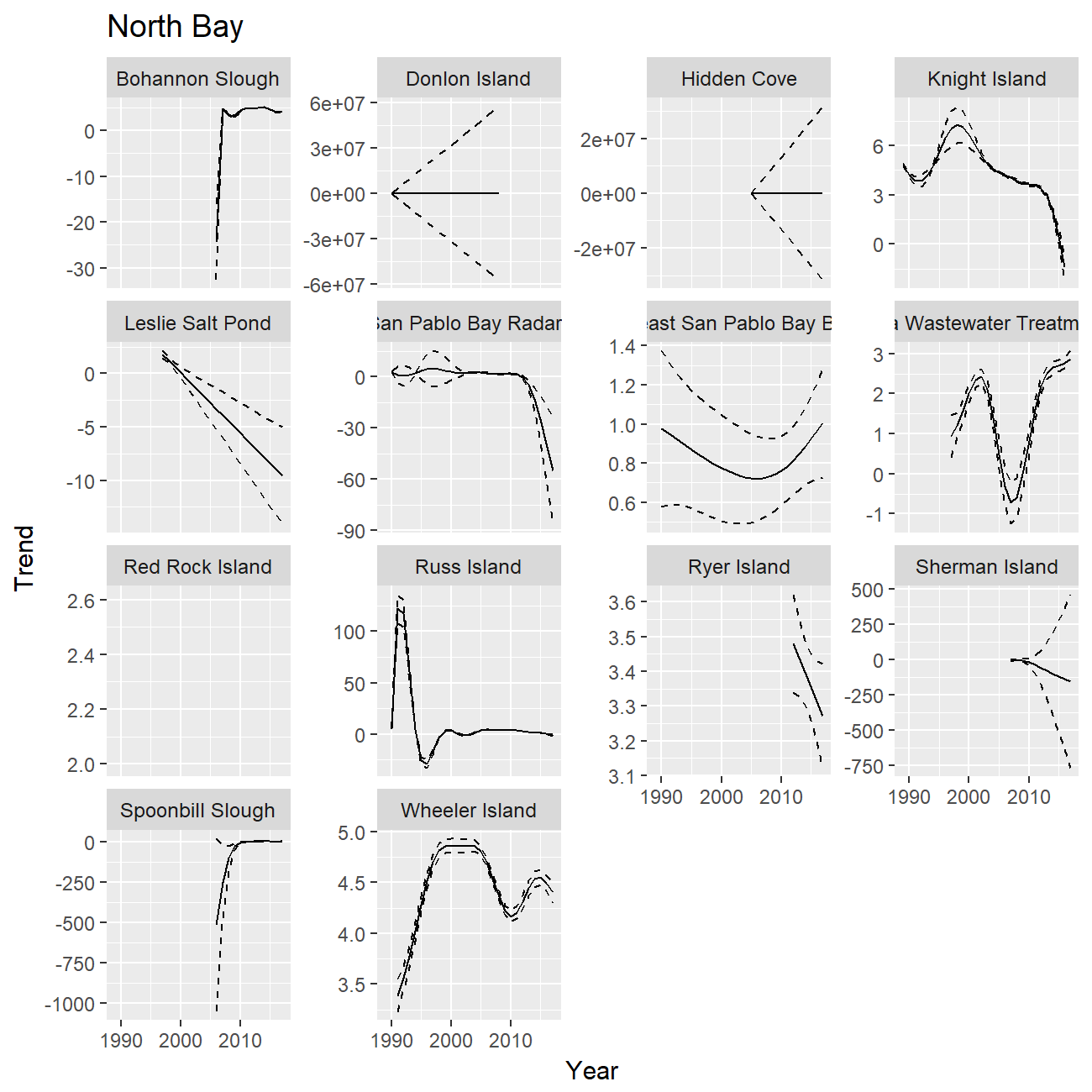
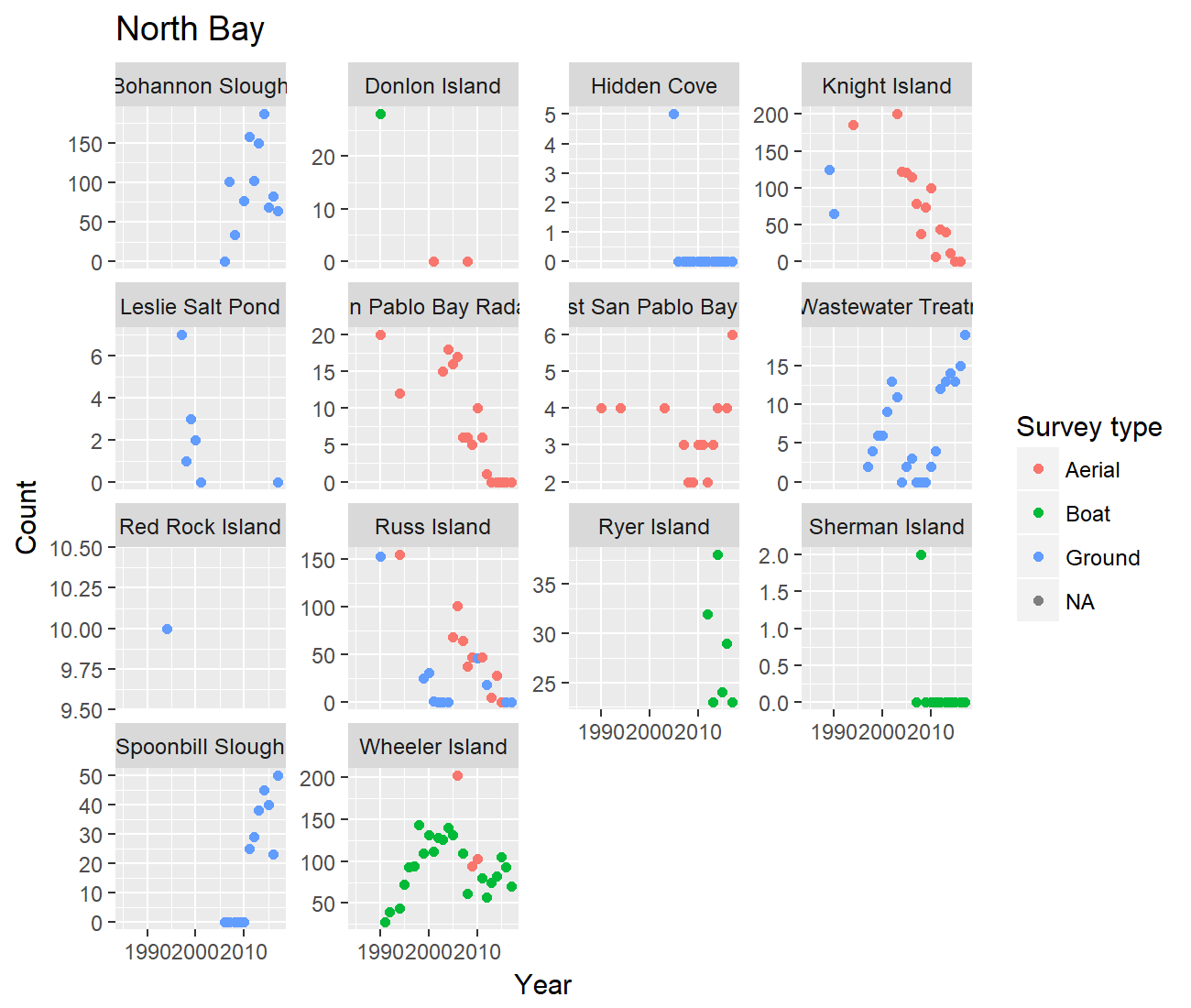
I modeled regional counts by assuming that the regional count in a given year is equal to the sum of the estimated colony counts. The estimated colony counts were weighted by colony size (relative to the overall regional size) and the standard error of the estimate, such that:

E(x) = sum(p \* c / r / s)

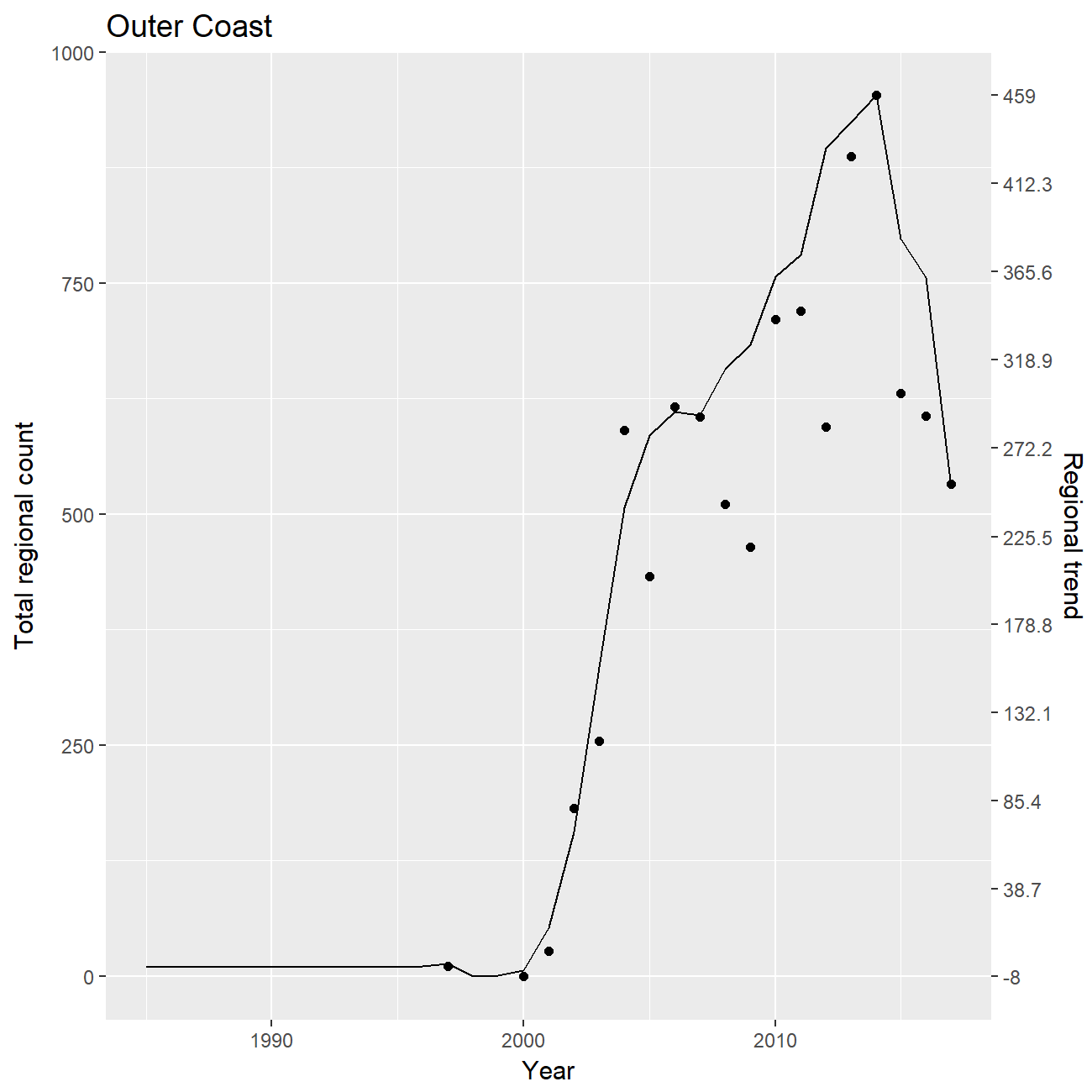
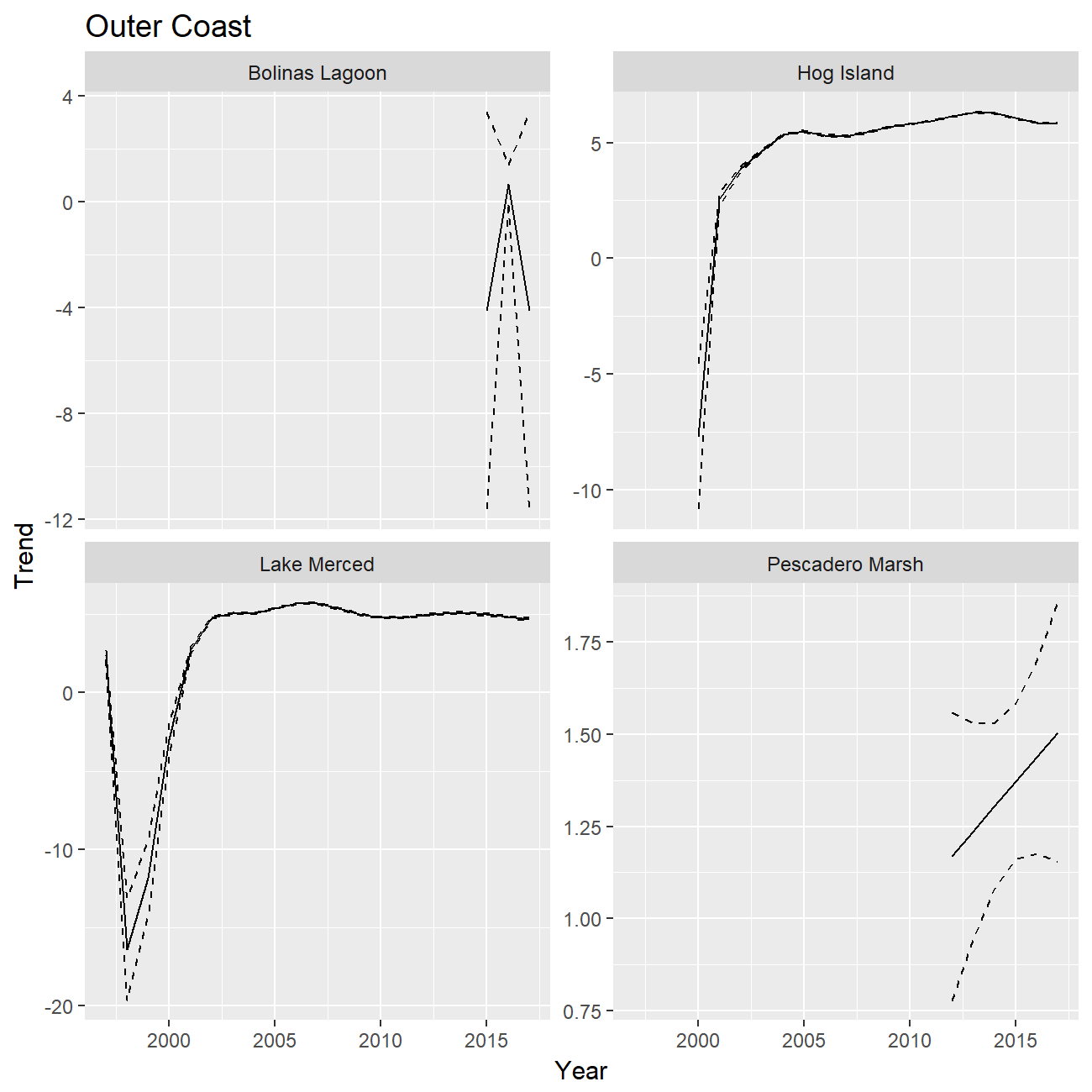
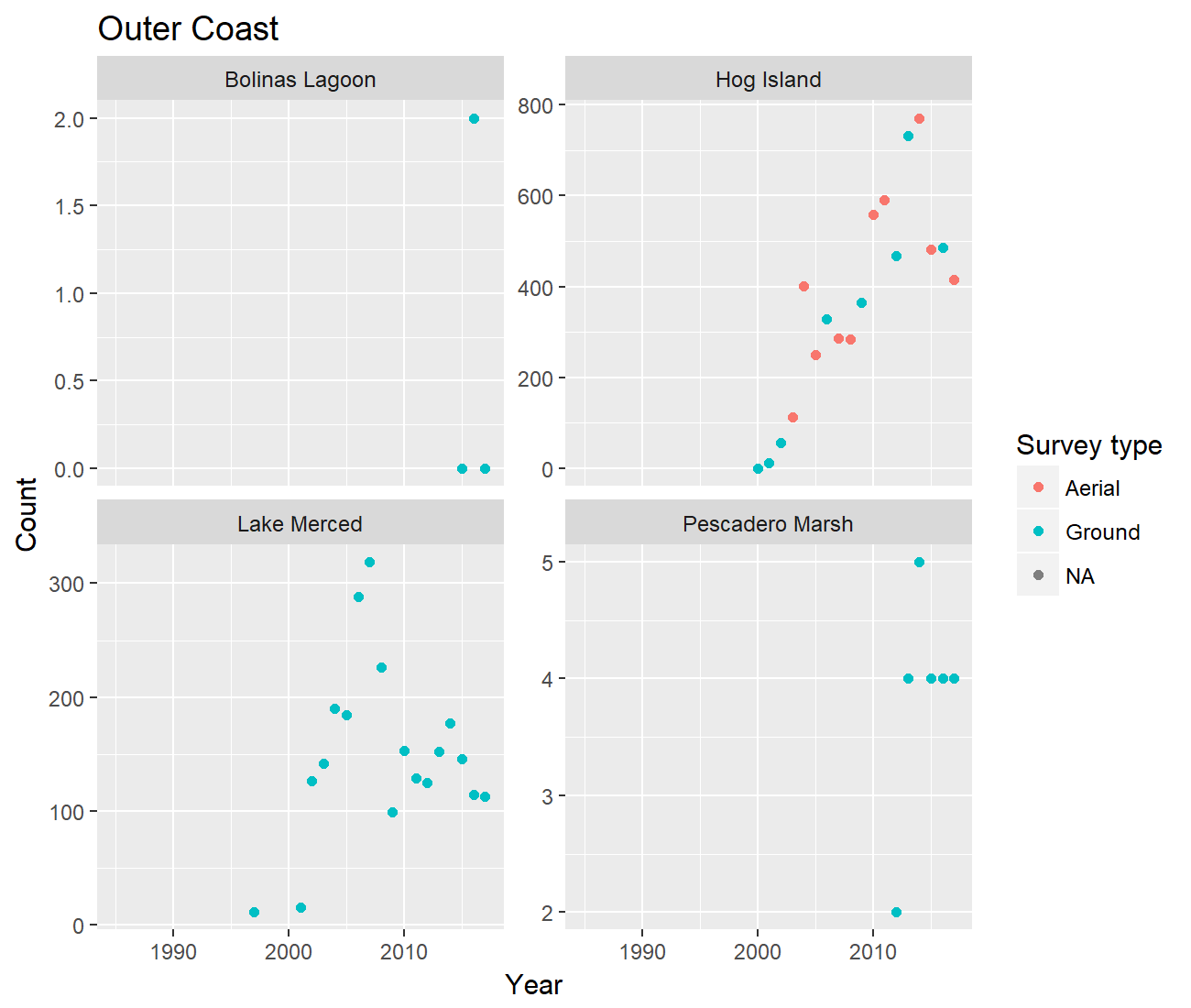
where E(x) is the estimated regional count in year x, the sum occurs across all colonies in that region, p is the estimated colony count in year x, c is the mean estimated colony count across all years, r is the mean regional count across all years, and s is the standard error of the estimated colony count in year x.

## Results Fig 6. Colony counts (top), GAM colony trends with SE (middle), and GAM regional trend (bottom) for Bridges region.

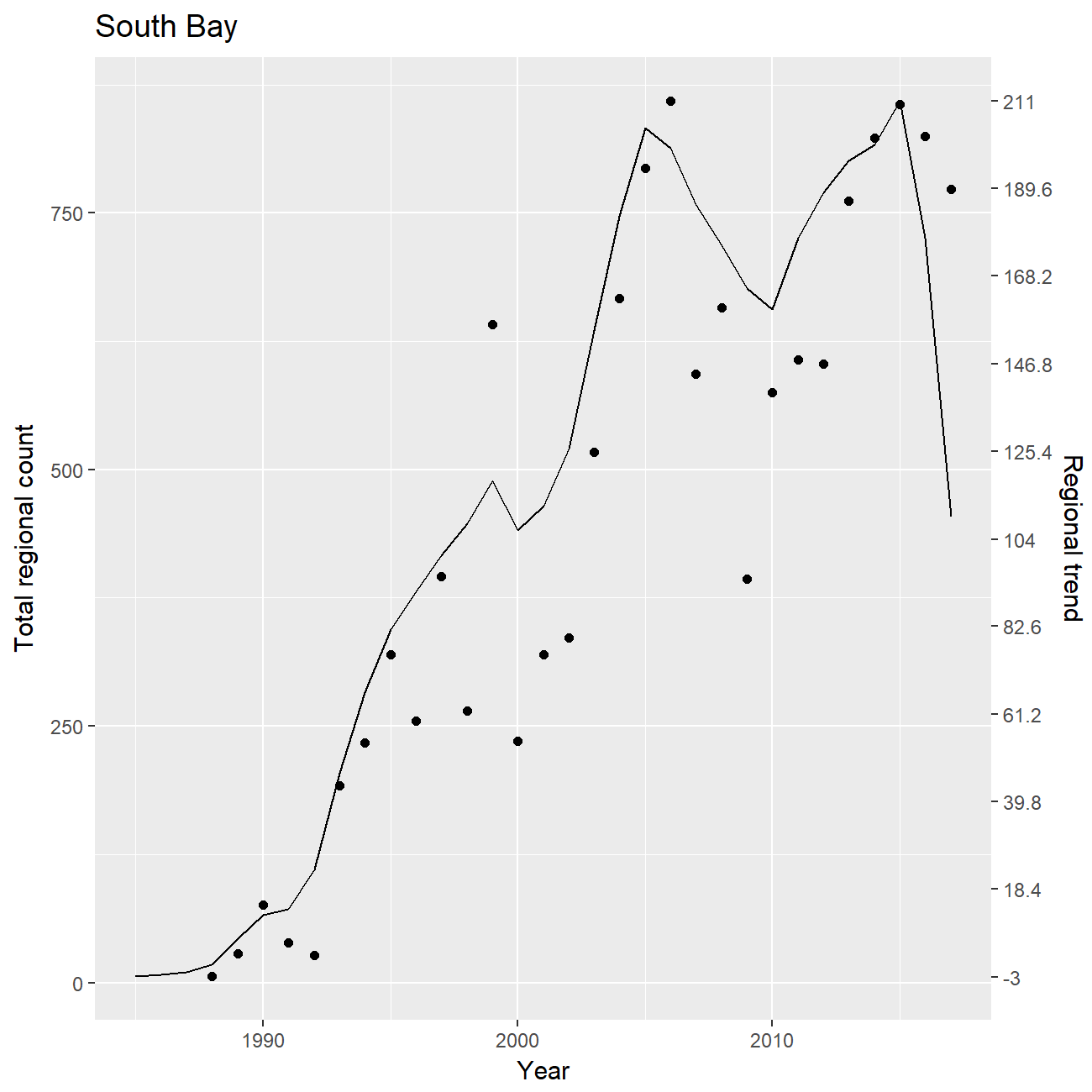
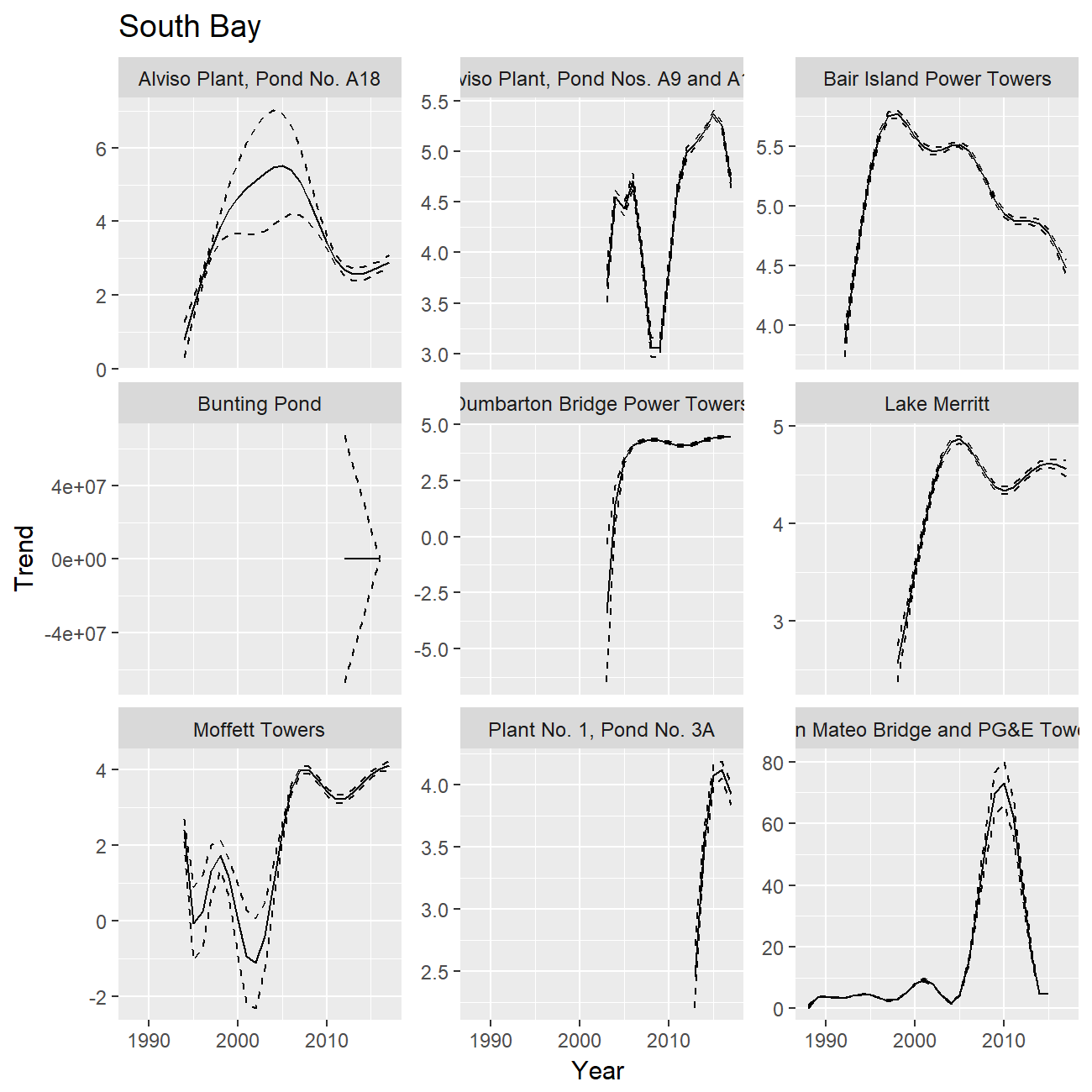
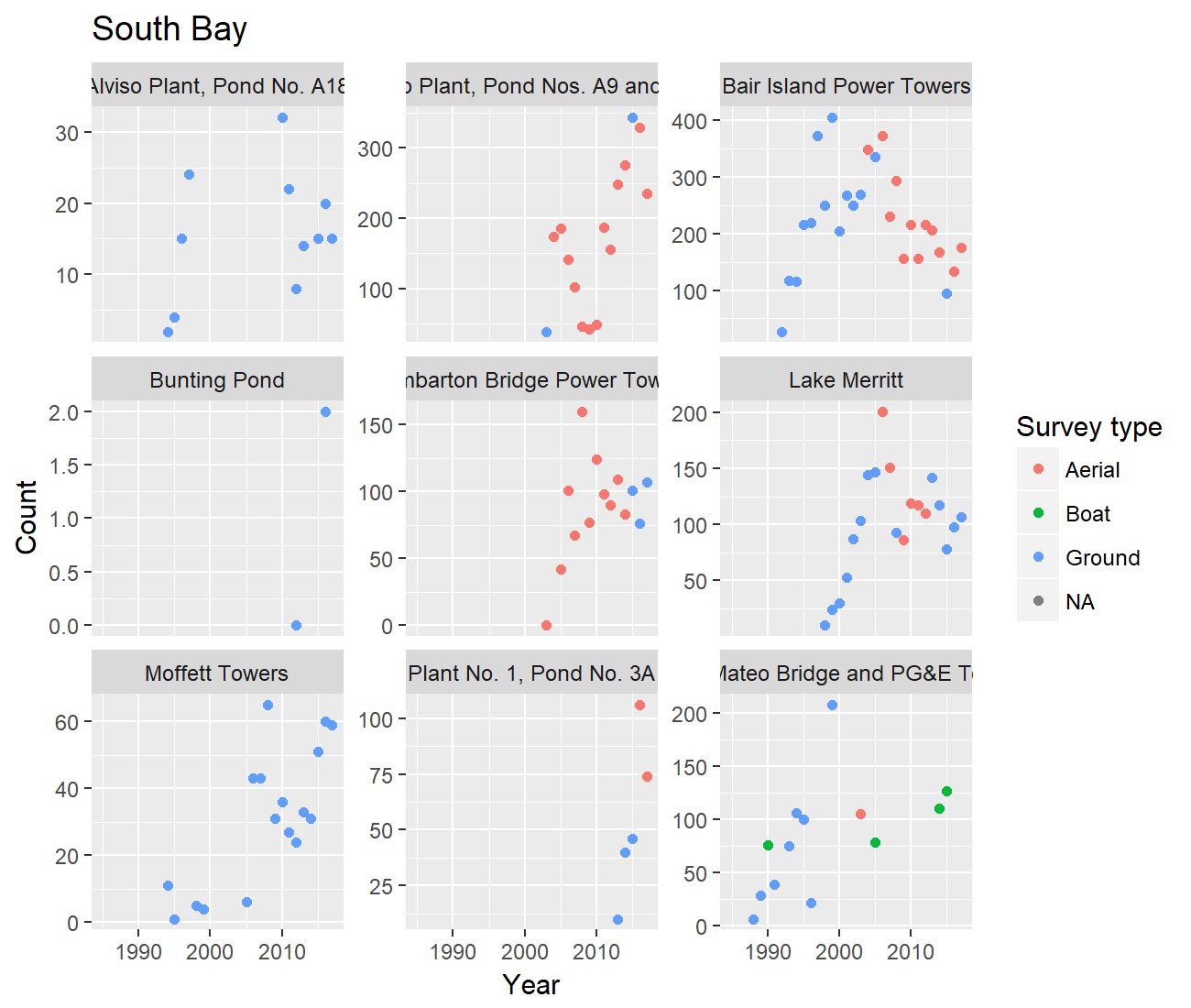
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 Fig 7. Colony counts (top), GAM colony trends with SE (middle), and GAM regional trend (bottom) for North Bay region.

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 Fig 8. Colony counts (top), GAM colony trends with SE (middle), and GAM regional trend (bottom) for Outer Coast region.

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 Fig 9. Colony counts (top), GAM colony trends with SE (middle), and GAM regional trend (bottom) for South Bay region.

###### Page break Fig 10. Colony counts (top), GAM colony trends with SE (middle), and GAM regional trend (bottom) for South Farallon Islands region.

# Approach 3: Generalized Additive Mixed Models (GAMMs) with decomposed long-term and short-term trends

## Method description

In addition to the important covariates mentioned in the previous section, breeding attempts are likely dependent on site and food availability, which may show annual fluctuations that cause nest counts to deviate from the long-term population trend. To account for short-term fluctuations that deviate from the long-term trend, we estimated regional trends in nest counts using Generalized Additive Mixed Models (GAMMs) in the poptrend package in R (Knape 2016). The count for a given colony in a given year was modeled as a function of a temporal random effect (year), a random site effect, and a fixed day of the season effect (except in the case of the Bridges region, which comprises only two sites so could not accomodate a day of the season effect). We compared this model to three alternatives: (1) temporal fixed effects, (2) temporal random effects, and (3) temporal random effects and a random site effect. Error estimates were drawn from the maximum likelihood table. For the purpose of applying the model, we assumed that the effect of covariates does not change over time (e.g. the day of the season effect is consistent across years). A complete description of the model is available in Knape (2016).

The selected model included the random effects of site and year and a day of the season fixed effect. The selected full model resulted in better model fit in all cases where it could be applied (it minimized residual error). Other covariates, such as survey method (aerial, boat, or ground) and distance to the bridges, had little effect on the qualitative results and did not improve model fit, so were excluded from the model.

## Results

Table 2. Percent annual change in estimated nest counts by region according to poptrend models (GAMM with longg-term and short-term trends modeled discretely).

|  |  |  |  |  |
| --- | --- | --- | --- | --- |
| Region | Year | Perc\_Chg | CI\_lower | CI\_upper |
| Bridges | 1989 | -2.93 | -25.02 | 27.11 |
| Bridges | 1990 | -1.55 | -21.70 | 24.43 |
| Bridges | 1991 | 1.29 | -15.05 | 20.17 |
| Bridges | 1992 | 4.14 | -7.02 | 15.04 |
| Bridges | 1993 | 6.98 | -2.59 | 17.44 |
| Bridges | 1994 | 9.06 | -2.02 | 20.16 |
| Bridges | 1995 | 10.26 | -1.89 | 23.40 |
| Bridges | 1996 | 10.95 | -1.75 | 24.79 |
| Bridges | 1997 | 10.86 | -1.16 | 24.07 |
| Bridges | 1998 | 10.05 | -1.05 | 22.07 |
| Bridges | 1999 | 8.29 | -1.47 | 19.86 |
| Bridges | 2000 | 6.41 | -5.94 | 21.05 |
| Bridges | 2001 | 3.72 | -10.86 | 20.91 |
| Bridges | 2002 | 0.62 | -13.16 | 17.01 |
| Bridges | 2003 | -2.99 | -13.25 | 8.63 |
| Bridges | 2004 | -6.88 | -17.76 | 5.62 |
| Bridges | 2005 | -10.38 | -23.40 | 4.88 |
| Bridges | 2006 | -13.46 | -24.08 | -0.84 |
| Bridges | 2007 | -14.24 | -24.74 | -2.63 |
| Bridges | 2008 | -13.44 | -24.97 | -0.69 |
| Bridges | 2009 | -9.31 | -20.97 | 2.27 |
| Bridges | 2010 | -3.62 | -17.72 | 13.22 |
| Bridges | 2011 | 1.66 | -9.65 | 16.33 |
| Bridges | 2012 | 4.60 | -10.27 | 21.41 |
| Bridges | 2013 | 2.43 | -10.82 | 18.32 |
| Bridges | 2014 | -2.47 | -16.78 | 15.07 |
| Bridges | 2015 | -5.11 | -19.52 | 11.31 |
| Bridges | 2016 | -5.66 | -23.51 | 15.10 |
| Bridges | 2017 | -5.79 | -28.78 | 23.05 |
| North Bay | 1990 | -47.21 | -68.61 | -11.65 |
| North Bay | 1991 | -41.59 | -62.06 | -9.82 |
| North Bay | 1992 | -28.48 | -45.96 | -4.42 |
| North Bay | 1993 | -6.52 | -26.19 | 17.06 |
| North Bay | 1994 | 12.57 | -18.32 | 51.69 |
| North Bay | 1995 | 20.86 | -12.91 | 65.86 |
| North Bay | 1996 | 15.42 | -7.62 | 44.32 |
| North Bay | 1997 | 1.38 | -20.80 | 35.38 |
| North Bay | 1998 | -6.54 | -33.87 | 32.08 |
| North Bay | 1999 | -6.55 | -28.21 | 18.82 |
| North Bay | 2000 | -0.43 | -25.09 | 27.95 |
| North Bay | 2001 | 5.28 | -28.20 | 47.39 |
| North Bay | 2002 | 8.51 | -17.44 | 40.68 |
| North Bay | 2003 | 8.63 | -14.90 | 41.17 |
| North Bay | 2004 | 4.05 | -23.50 | 46.55 |
| North Bay | 2005 | -5.01 | -25.21 | 26.01 |
| North Bay | 2006 | -15.31 | -32.66 | 11.66 |
| North Bay | 2007 | -18.72 | -39.83 | 13.83 |
| North Bay | 2008 | -13.99 | -33.34 | 11.49 |
| North Bay | 2009 | -2.40 | -24.70 | 22.96 |
| North Bay | 2010 | 6.11 | -24.26 | 44.41 |
| North Bay | 2011 | 7.48 | -19.52 | 37.87 |
| North Bay | 2012 | 2.85 | -19.49 | 30.14 |
| North Bay | 2013 | -1.65 | -29.81 | 33.13 |
| North Bay | 2014 | -4.71 | -26.86 | 24.12 |
| North Bay | 2015 | -6.56 | -26.66 | 18.75 |
| North Bay | 2016 | -7.70 | -37.91 | 35.41 |
| North Bay | 2017 | -8.26 | -43.58 | 45.41 |
| Outer Coast | 1998 | 53.68 | -10.57 | 162.70 |
| Outer Coast | 1999 | 56.12 | -7.84 | 162.82 |
| Outer Coast | 2000 | 54.07 | -2.81 | 137.42 |
| Outer Coast | 2001 | 54.51 | 5.10 | 121.04 |
| Outer Coast | 2002 | 54.42 | 13.85 | 103.62 |
| Outer Coast | 2003 | 51.77 | 19.69 | 93.09 |
| Outer Coast | 2004 | 39.89 | 17.74 | 67.26 |
| Outer Coast | 2005 | 23.30 | 4.50 | 45.65 |
| Outer Coast | 2006 | 10.28 | -3.59 | 27.27 |
| Outer Coast | 2007 | 2.68 | -12.29 | 20.13 |
| Outer Coast | 2008 | 2.30 | -10.77 | 15.58 |
| Outer Coast | 2009 | 6.05 | -7.99 | 23.51 |
| Outer Coast | 2010 | 10.37 | -2.74 | 24.23 |
| Outer Coast | 2011 | 13.65 | -1.95 | 33.13 |
| Outer Coast | 2012 | 14.27 | 1.40 | 28.80 |
| Outer Coast | 2013 | 9.18 | -4.45 | 27.15 |
| Outer Coast | 2014 | -1.61 | -12.69 | 10.46 |
| Outer Coast | 2015 | -9.50 | -21.13 | 5.16 |
| Outer Coast | 2016 | -12.27 | -23.25 | 3.46 |
| Outer Coast | 2017 | -13.15 | -30.64 | 11.74 |
| South Bay | 1989 | 23.10 | -2.73 | 54.61 |
| South Bay | 1990 | 22.97 | -1.43 | 51.12 |
| South Bay | 1991 | 22.71 | 2.02 | 47.68 |
| South Bay | 1992 | 22.29 | 5.27 | 41.92 |
| South Bay | 1993 | 21.45 | 5.41 | 38.86 |
| South Bay | 1994 | 20.08 | 6.83 | 32.99 |
| South Bay | 1995 | 18.18 | 8.06 | 28.63 |
| South Bay | 1996 | 15.52 | 5.64 | 27.67 |
| South Bay | 1997 | 11.93 | 1.88 | 24.62 |
| South Bay | 1998 | 7.51 | 0.17 | 17.03 |
| South Bay | 1999 | 3.41 | -5.65 | 11.67 |
| South Bay | 2000 | 1.17 | -8.28 | 9.62 |
| South Bay | 2001 | 0.80 | -6.38 | 8.37 |
| South Bay | 2002 | 1.62 | -5.24 | 10.10 |
| South Bay | 2003 | 1.71 | -5.89 | 11.18 |
| South Bay | 2004 | 0.74 | -5.83 | 8.02 |
| South Bay | 2005 | -1.13 | -6.88 | 4.93 |
| South Bay | 2006 | -3.11 | -10.12 | 4.06 |
| South Bay | 2007 | -4.93 | -11.58 | 1.15 |
| South Bay | 2008 | -6.51 | -11.42 | -2.21 |
| South Bay | 2009 | -6.72 | -12.83 | -0.44 |
| South Bay | 2010 | -4.83 | -10.60 | 1.84 |
| South Bay | 2011 | -0.78 | -5.88 | 4.14 |
| South Bay | 2012 | 3.45 | -2.91 | 10.10 |
| South Bay | 2013 | 5.19 | -1.87 | 12.60 |
| South Bay | 2014 | 4.16 | -1.05 | 9.93 |
| South Bay | 2015 | 1.53 | -4.65 | 9.17 |
| South Bay | 2016 | -0.37 | -9.39 | 11.10 |
| South Bay | 2017 | -1.31 | -11.78 | 12.30 |
| South Farallon Islands | 1986 | 9.67 | -1.58 | 21.58 |
| South Farallon Islands | 1987 | 9.32 | -0.82 | 19.68 |
| South Farallon Islands | 1988 | 8.63 | 0.17 | 17.10 |
| South Farallon Islands | 1989 | 7.61 | 1.01 | 14.18 |
| South Farallon Islands | 1990 | 6.30 | 0.09 | 12.85 |
| South Farallon Islands | 1991 | 4.78 | -0.86 | 11.63 |
| South Farallon Islands | 1992 | 3.06 | -2.01 | 8.53 |
| South Farallon Islands | 1993 | 1.26 | -3.16 | 6.38 |
| South Farallon Islands | 1994 | 0.00 | -4.92 | 6.05 |
| South Farallon Islands | 1995 | -0.53 | -5.66 | 5.42 |
| South Farallon Islands | 1996 | -0.35 | -4.58 | 4.83 |
| South Farallon Islands | 1997 | 0.27 | -4.59 | 5.70 |
| South Farallon Islands | 1998 | 0.91 | -4.67 | 6.59 |
| South Farallon Islands | 1999 | 1.52 | -3.41 | 6.06 |
| South Farallon Islands | 2000 | 2.07 | -2.00 | 6.63 |
| South Farallon Islands | 2001 | 2.18 | -2.66 | 7.34 |
| South Farallon Islands | 2002 | 1.69 | -3.21 | 6.84 |
| South Farallon Islands | 2003 | 0.61 | -4.05 | 4.98 |
| South Farallon Islands | 2004 | -0.83 | -5.74 | 4.36 |
| South Farallon Islands | 2005 | -2.16 | -7.72 | 3.17 |
| South Farallon Islands | 2006 | -3.33 | -8.07 | 1.41 |
| South Farallon Islands | 2007 | -4.34 | -8.33 | 0.52 |
| South Farallon Islands | 2008 | -5.10 | -9.84 | 0.39 |
| South Farallon Islands | 2009 | -5.55 | -10.55 | -0.22 |
| South Farallon Islands | 2010 | -5.70 | -10.07 | -1.30 |
| South Farallon Islands | 2011 | -5.67 | -9.86 | -1.53 |
| South Farallon Islands | 2012 | -5.82 | -10.58 | -0.80 |
| South Farallon Islands | 2013 | -6.21 | -11.02 | -1.42 |
| South Farallon Islands | 2014 | -6.81 | -11.90 | -0.90 |
| South Farallon Islands | 2015 | -7.41 | -13.45 | 0.35 |
| South Farallon Islands | 2016 | -7.81 | -15.49 | 1.32 |
| South Farallon Islands | 2017 | -8.02 | -16.33 | 2.02 |

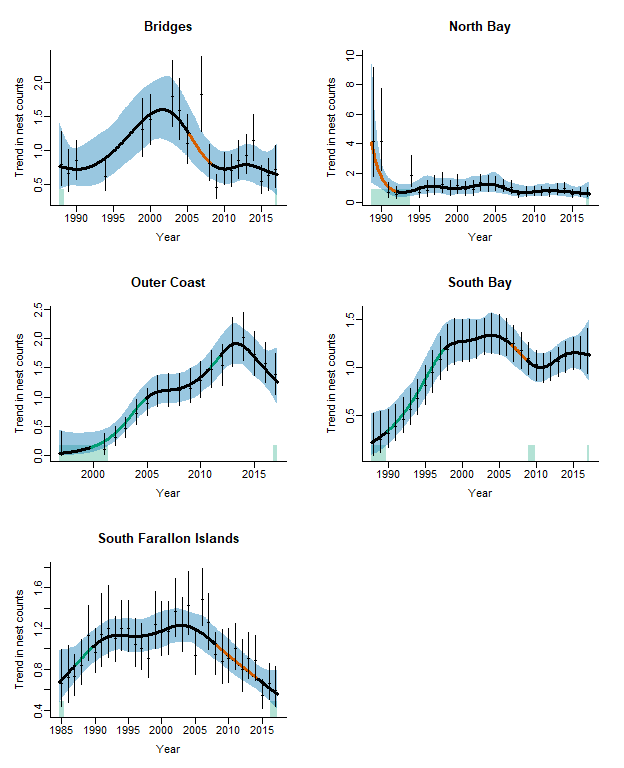


Fig 11. Trend estimates for DCCO nest count data. Trend estimates are plotted relative to the mean value (i.e. the mean value is set to 1). Estimates were generated using a GAMM that estimates nest counts as a function of year (temporal random effect), a random site effect, and a day of the season fixed effect (except in the case of the Bridge Region, which did not have enough degrees of freedom to include the day of the season effect). Points and bars indicate the mean and 95% CI for the annual count estimates. The black trendlines and blue shading indicate the mean and 95% CI for the long-term trend. Green and red lines indicate significant increases and decreases in the trend at the 5% level respectively. Green and red shading above the x-axis indicate significant increases in the second derivative (i.e. trend acceleration/deceleration) at the 5% level respectively.

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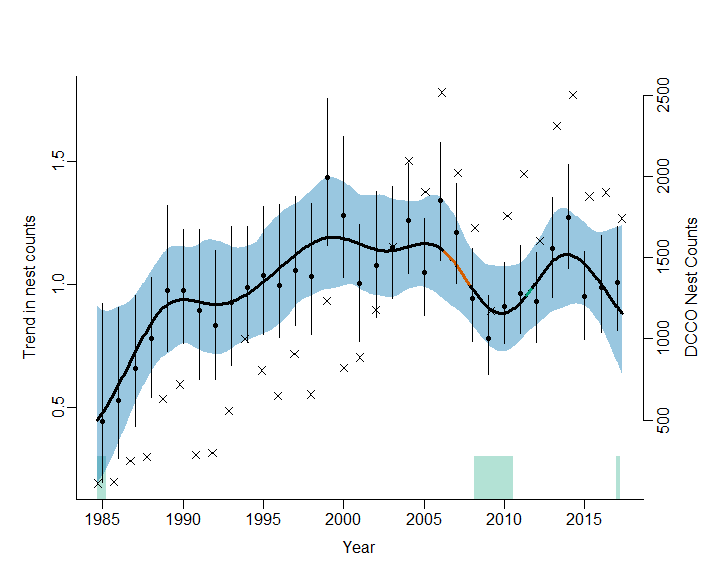


Fig 12. Trend estimate for all regions in the San Francisco Bay Area with the exception of the Bridges. DCCO nest counts appear as x’s.

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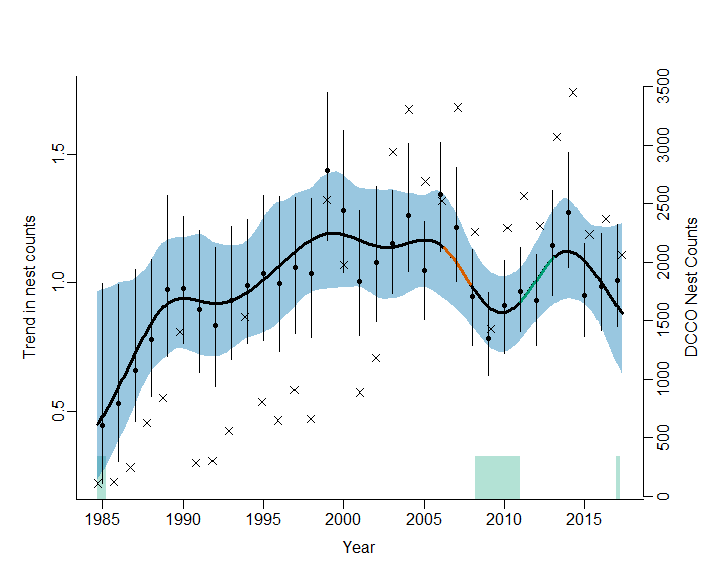


Fig 13. Trend estimate for all regions in the San Francisco Bay Area including the Bridges. DCCO nest counts appear as x’s.

# Works Cited

Gotelli, N. J. 2008. A Primer of Ecology, 4th edition. Sinauer Associates, Inc. Sunderland, MA. 290 pp.

Knape, J. (2016). Decomposing trends in Swedish bird populations using generalized additive mixed models. Journal of Applied Ecology, 53(6), 1852–1861. <https://doi.org/10.1111/1365-2664.12720>

Manuwal, D. A., Carter, H. R., Zimmerman, T. S., & Orthmeyer, D. L. (2000). Biology and Conservation of the Common Murre in California, Oregon, Washington, and British Columbia Volume 1: Natural History and Population Trends. Information and Technology Report (Vol. 1).

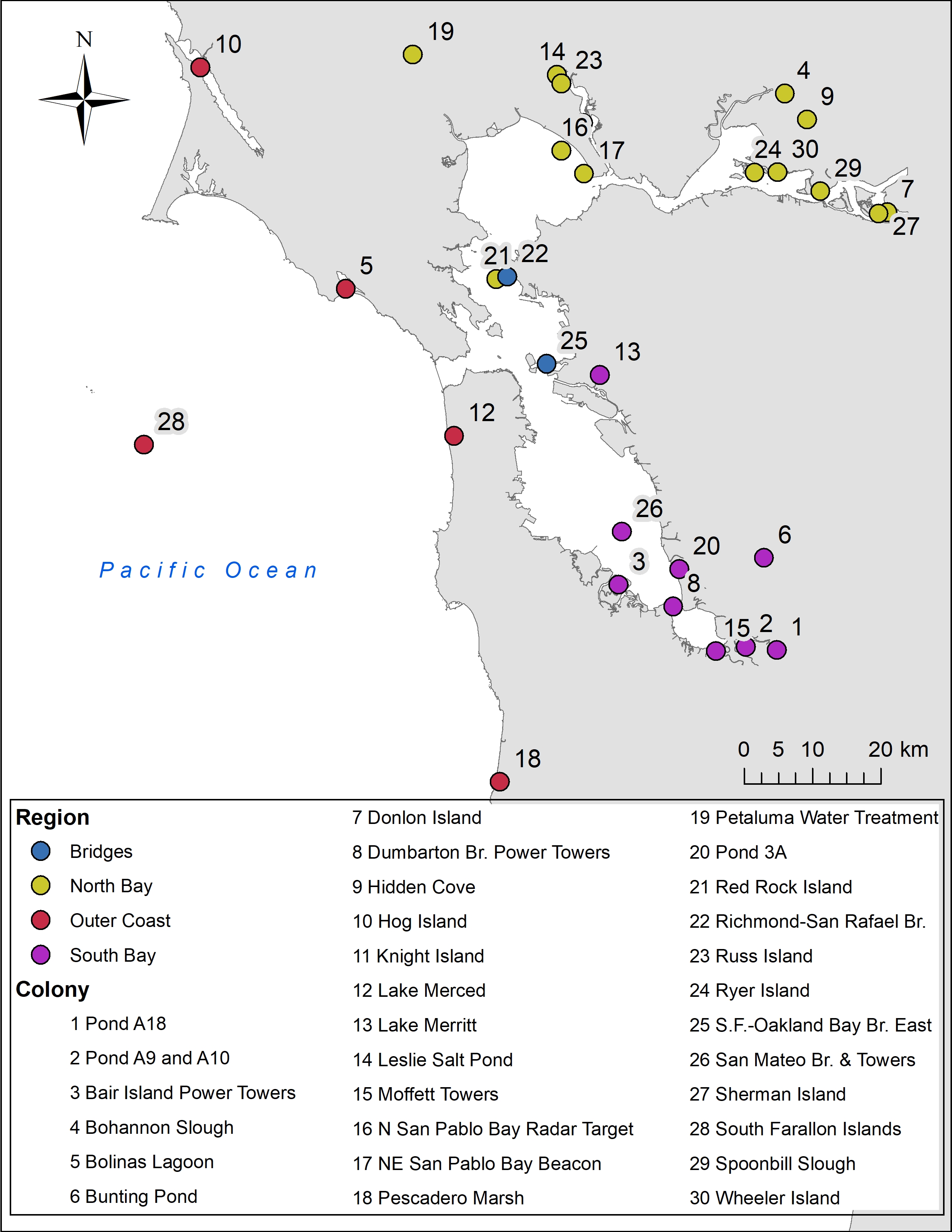
Shadish, W. R., Zuur, A. F., & Sullivan, K. J. (2014). Using generalized additive (mixed) models to analyze single case designs. Journal of School Psychology, 52(2), 149–178. <https://doi.org/10.1016/j.jsp.2013.11.004>

# Additional Tables

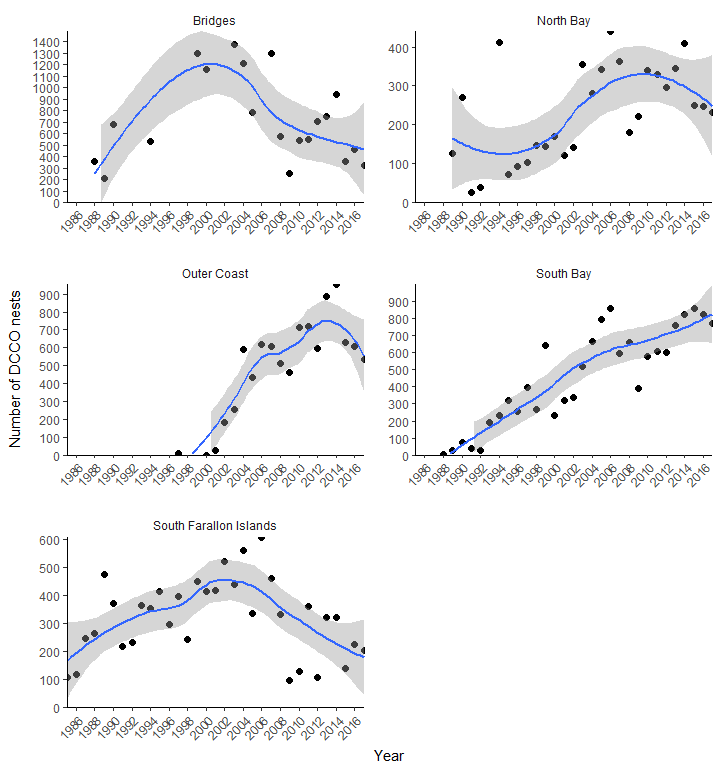
Table 3. Site descriptions, including region, coordinates, and number of years with nest counts.

|  |  |  |  |  |
| --- | --- | --- | --- | --- |
| Region | Colony | lat | long | n |
| Bridges | Richmond-San Rafael Bridge | 37.93300 | -122.4131 | 18 |
| Bridges | S.F.-Oakland Bay Br. East | 37.81999 | -122.3437 | 19 |
| North Bay | Bohannon Slough | 38.18267 | -121.9565 | 11 |
| North Bay | Donlon Island | 38.02897 | -121.7813 | 3 |
| North Bay | Hidden Cove | 38.14881 | -121.9188 | 13 |
| North Bay | Knight Island | 38.13814 | -122.2926 | 17 |
| North Bay | Leslie Salt Pond | 38.20043 | -122.3385 | 6 |
| North Bay | North San Pablo Bay Radar Target | 38.10111 | -122.3278 | 17 |
| North Bay | Northeast San Pablo Bay Beacon | 38.07133 | -122.2892 | 13 |
| North Bay | Petaluma Wastewater Treatment Plant | 38.22224 | -122.5804 | 21 |
| North Bay | Red Rock Island | 37.92950 | -122.4312 | 1 |
| North Bay | Russ Island | 38.18920 | -122.3304 | 28 |
| North Bay | Ryer Island | 38.07747 | -122.0039 | 6 |
| North Bay | Sherman Island | 38.02702 | -121.7953 | 11 |
| North Bay | Spoonbill Slough | 38.05470 | -121.8934 | 12 |
| North Bay | Wheeler Island | 38.07861 | -121.9659 | 31 |
| Outer Coast | Bolinas Lagoon | 37.91158 | -122.6815 | 3 |
| Outer Coast | Hog Island | 38.19722 | -122.9351 | 33 |
| Outer Coast | Lake Merced | 37.72170 | -122.4946 | 18 |
| Outer Coast | Pescadero Marsh | 37.26788 | -122.4042 | 6 |
| South Bay | Alviso Plant, Pond No. A18 | 37.44987 | -121.9511 | 11 |
| South Bay | Alviso Plant, Pond Nos. A9 and A10 | 37.45327 | -122.0021 | 25 |
| South Bay | Bair Island Power Towers | 37.53100 | -122.2157 | 40 |
| South Bay | Bunting Pond | 37.57067 | -121.9747 | 2 |
| South Bay | Dumbarton Bridge Power Towers | 37.50421 | -122.1234 | 20 |
| South Bay | Lake Merritt | 37.80656 | -122.2550 | 30 |
| South Bay | Moffett Towers | 37.44630 | -122.0515 | 17 |
| South Bay | Plant No. 1, Pond No. 3A | 37.55367 | -122.1153 | 6 |
| South Bay | San Mateo Bridge and PG&E Towers | 37.60112 | -122.2120 | 15 |
| South Farallon Islands | South Farallon Islands | 37.69839 | -123.0097 | 57 |

# Additional Figures

 Fig 14. Map of DCCO nesting sites from 1985-2016 in the San Francisco Bay Area.

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 Fig 15. Counts of DCCO nests in each region around San Francisco Bay from 1985 – 2017. Points show raw counts summed across sites for each region. Data are plotted with a loess curve and standard error shading.