498 SUPPLEMENTAL MATERIALS

⁴⁹⁹ (available online as Supporting Online Information Appendix at <URL>).

500 Camp, R.J., D.L. Miller, S.T. Buckland, and S.J. Kendall. Soap film smoothers to estimate bird abundances.

⁵⁰¹ The findings and conclusions in this article are those of the author(s) and do not necessarily represent the

views of the U.S. Fish and Wildlife Service. Any use of trade, firm, or product names is for descriptive

⁵⁰³ purposes only and does not imply endorsement by the U.S. Government.

504 Supporting Online Information Appendix A

In a preliminary analysis we selected among Poisson, negative binomial and Tweedie distributions to 505 model the response distribution. These analyses were performed on a TPRS smooth and the selected 506 distribution was applied to the soap film smoother. We restricted the Tweedie distribution power parameter 507 to p = (1.1,2) following recommendations provided in the mgcv, version 1.8-17, package help pages 508 and used a method of bisection to approximately identify the likelihood maximum. Sensitivity to the 509 choice of response distribution and model assumptions were checked through inspection of the deviance 510 residuals following approaches suggested by Wood (2017). Akaike's information criterion (AIC) was 511 used to select among distributions. 512

We chose the negative binomial distribution with log-link for modelling the 2002 'Akepa spatial 513 patterns. This model provided a reasonably good fit to the residuals (Supporting Online Information 514 Appendix A Figs. 1–3). The AIC value for the negative-binomial distributed model was about 2 AIC units 515 larger than the Poisson distributed model (Supporting Online Information Appendix A Table 1). Thus, 516 AIC alone could not be used to select between these two models (Burnham and Anderson, 2002). AIC 517 statistics clearly eliminated the Tweedie distribution (Supporting Online Information Appendix A Table 518 1). QQ-plots showed the negative binomial distribution did a better job of following the identity line from 519 520 the smallest through middle values than the other two models (Supporting Online Information Appendix A Fig. 1). All three models deviated at the largest values. Therefore, we based our model selection on the 521 QQ-plots. 522

Diagnostic plots for the negative binomial distribution fitted with soap film model formulation to 523 the 2002 'Akepa data indicated the model adequately fit the data. Inspection of residual diagnostic 524 plots appeared reasonable with acceptable behaviour for the deviance residuals and error distribution 525 (Supporting Online Information Appendix A Figs. 2 and 3). The diagnostics of the soap film residuals are 526 very similar to those of the TPRS model where the QQ-plot is very close to the straight line indicating 527 that the distribution is reasonable (Supporting Online Information Appendix A Fig. 2, top left panel), the 528 residuals versus linear predictor values appears to be reasonable with a strong banding pattern (Supporting 529 Online Information Appendix A Fig. 2, top right panel), the histogram of residuals approximates normality 530 with a spike at zero (Supporting Online Information Appendix A Fig. 2, bottom left panel), and the 531 diagonal pattern in the response versus fitted values draws into question the assumption of constant 532 variance (Supporting Online Information Appendix A Fig. 2, bottom right panel). Points from the 533 sorted deviance residuals seem to fall about the straight line and well within the simulated theoretical 534 quantiles band of grey lines, which provides evidence the numbers came for the theoretical distribution 535 (Supporting Online Information Appendix A Fig. 3). Effect plots for the soap film model terms are shown 536 in Supporting Online Information Appendix A Fig. 4, while a description of the effects is presented in the 537 text. 538

539

Diagnostic plots for the negative binomial distribution fitted with the TPRS model formulation to the

Supporting Online Information Appendix A Table 1. Model selection statistics for the Poisson, negative binomial and Tweedie distributions. Presented are the smoother log-likelihood (logLik), effective degrees of freedom (EDF), Akaike's information criterion (AIC), and Δ AIC.

Model	logLik	EDF	AIC	ΔAIC
Poisson	-275.961	20.754	593.432	0
negative binomial	-276.677	21.107	595.569	2.137
Tweedie	-293.101	20.920	628.043	34.611



Supporting Online Information Appendix A Figure 1. QQ plots of sorted deviance residuals (black dots) for the spatial GAM against theoretical quantiles (grey lines; 1,000 replicates) fitted with the Poisson (left panel), negative binomial (middle panel) and Tweedie (right panel) distributions to the 2002 'Ākepa *Loxops coccineus* count data from a TPRS model.

Supporting Online Information Appendix A Table 2. Effective degrees of freedom (EDF), reference degrees of freedom (rf), and basis complexity (*k*-index) for each term in the TPRS smooth spatial model.

Term		EDF	rf	k-index
s(Easting,	Northing)	18.59	126	1.02

2002 'Ākepa data (Supporting Online Information Appendix A Figs. 1 and 5). The QQ-plot is very close 540 to the straight line indicating that the distribution is reasonable (Supporting Online Information Appendix 541 A Fig. 5, top left panel), the residuals versus linear predictor values appears to be reasonable, although 542 strong banding patterns are obvious (Supporting Online Information Appendix A Fig. 5, top right panel), 543 the histogram of residuals approximates normality with a spike at zero (Supporting Online Information 544 Appendix A Fig. 5, bottom left panel), and the diagonal pattern in the response versus fitted values reveals 545 that the assumption of constant variance is questionable, again with a strong banding pattern (Supporting 546 Online Information Appendix A Fig. 5, bottom right panel). Points from the sorted deviance residuals 547 seem to fall about the straight line and well within the simulated theoretical quantiles band of grey lines, 548 which provides evidence the numbers came for the theoretical distribution (Supporting Online Information 549 Appendix A Fig. 6). 550 Effect plots for the TPRS model term is shown in Supporting Online Information Appendix A Fig. 551

7. The EDF on the Easting and Northing smooth term was greater than zero, significant and the function was nonlinear (Supporting Online Information Appendix A Table 2; Supporting Online

⁵⁵⁴ Information Appendix A Fig. 7).



Resids vs. linear pred.

Supporting Online Information Appendix A Figure 2. Diagnostic plots of individual parameters for spatial GAM with a negative binomial distribution fitted with soap film model formulation to the 'Ākepa *Loxops coccineus* count data for the 2002 survey. Diagnostic are QQ-plot (top left panel), residuals versus linear predictor (top right panel), histogram of residuals (bottom left panel), and response versus fitted values (bottom right panel).



Supporting Online Information Appendix A Figure 3. Sorted deviance residuals (black line) for the spatial GAM against theoretical quantiles (grey lines; 1,000 replicates) fitted to the 2002 'Ākepa *Loxops coccineus* count data for the negative binomial distribution with the soap film model formulation.

s(EASTING,NORTHING,2.98) s(EASTING,NORTHING,14.45) 2198000 2194000 2198000 NORTHING NORTHING 2194000 2190000 2190000 254000 258000 262000 254000 258000 262000 EASTING EASTING

Supporting Online Information Appendix A Figure 4. Estimated model terms for the spatial soap film fitted to the 'Ākepa *Loxops coccineus* count data. The 2D contour plots represent 0.5 unit change are shown as blue lines and the EDF is provided in the plot panel title. Estimates provided on the scale of the link function.



Supporting Online Information Appendix A Figure 5. Diagnostic plots of individual parameters for spatial GAM with a negative binomial distribution fitted with the TPRS model formulation to the 'ākepa *Loxops coccineus* count data for the 2002 survey. Diagnostic are QQ-plot (top left panel), residuals versus linear predictor (top right panel), histogram of residuals (bottom left panel), and response versus fitted values (bottom right panel).



Supporting Online Information Appendix A Figure 6. Sorted deviance residuals (black line) for the spatial GAM against theoretical quantiles (grey lines; 1,000 replicates) fitted to the 2002 'Ākepa *Loxops coccineus* count data for the negative binomial distribution with the TPRS model formulation.

s(EASTING,NORTHING,18.59)



Supporting Online Information Appendix A Figure 7. Estimated model terms for the spatial TPRS fitted to the 'Ākepa *Loxops coccineus* count data. The locations of the points are plotted as black dots on the 2D contour plots and the EDF is provided in the plot panel title. Contours represent 0.5 unit change and are shown as blue lines. Estimates provided on the scale of the link function.

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555 Supporting Online Information Appendix B
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R code for spatial soap film model fitted to counts with an offset accounting for detectability while controlling the boundary behaviour to produce a density surface. We specified the basis in two parts to ensure adequate complexity for both the boundary and interior smoother components.

```
# Load domain boundary, which is a list of two columns giving the
559
   # coordinates of points defining the boundary
560
561
   bnd <- read.csv(filename, header=TRUE, fill=TRUE)</pre>
562
   # Define the location of interior knots for the smooth
563
   # set a regular grid with locations every 730m east and 670m north
564
   # across the study area; this ensured that all knots are
565
   # either inside or outside the boundary
566
   gp <- expand.grid(EASTING=seq(from=255400, to=261500, by=730),</pre>
567
                       NORTHING=seq(from=2189000, to=2200800, by=670))
568
   names(bound[[1]]) <- c("EASTING", "NORTHING", "f")</pre>
569
   knots <- qp[with(qp, inSide(bound, EASTING, NORTHING)), ]</pre>
570
571
   # Soap film model
572
   SF <- gam(Count ~ s(EASTING, NORTHING, k=20, bs="sf",
573
                         xt=list(bnd=bnd, nmax=nmax)) +
574
                       s(EASTING, NORTHING, k=20, bs="sw",
575
                         xt=list(bnd=bnd, nmax=nmax)) +
576
                       offset(log(nu)),
577
                       family=nb(),
578
                       data=data,
579
                       method="REML",
580
                       knots=knots)
581
```

The effective area searched, ν , was calculated as the truncation distance squared times π times the detection probability. We specified the boundary and interior basis arguments for the soap film smooth separately. An alternative formulation is to use the bs="so" argument. This construct is a wrapper for the boundary and interior smooths. While the bs="so" construct is easier to use, it does not allow for checking that sufficiently large basis complexity has been selected for each soap film component.

587 Supporting Online Information Appendix C

⁵⁸⁸ Hazard-rate detection function diagnostic plots indicated that the model adequately fit the data (Supporting Online Information Appendix C Fig. 1).



Supporting Online Information Appendix C Figure 1. Detection function plots for the hazard-rate model without series expansion or covariates fitted to the 2002 'Ākepa *Loxops coccineus* detections in the forest stratum. Plots represent the average detection probability (left top panel), probability density (right top panel) and QQ-plot (bottom panel). There is moderate deviation in the histogram in the probability plots and the points seem to fall about the straight line of the QQ-plot, which provides evidence the function adequately fits the data.

589