## S.2 Early stopping

## Occupancy models

All occupancy models converged to the maximum likelihood estimates (i.e., did not stop early; Figure S3). Failure to stop early sometimes happens in data sets with many observations and strong effects (see comment of Kneib in Bühlmann *et al.* 2014). This suggests that the effects of the environmental variables on sea duck occupancy are rather complex.

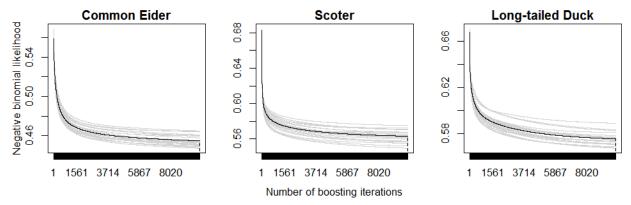


Figure S3 Bootstrapped out-of-bag empirical risk in sea duck occupancy models based on 25-fold subsampling. Gray lines indicate the out-of-bag risk on each subsample and the black line indicates the average out-of-bag risk; the optimal iteration is indicated by the dashed vertical line.

## Count models

In contrast to occupancy model, bootstrapping prescribed early stopping for both parameters in all count models (Figure S4).

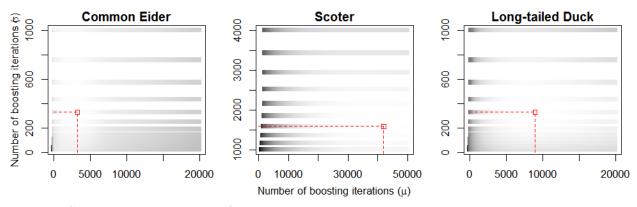


Figure S4 Bootstrapped out-of-bag empirical risk in sea duck conditional count models based on 25-fold subsampling. Lighter colors indicate lower average out-of-bag risk (over the 25 samples) for a given combination of  $m_{\text{stop}}$ -values for  $\mu$  and  $\sigma$ ; the optimal combination is indicated by the red square.

## References

Bühlmann, P., Gertheiss, J., Hieke, S., Kneib, T., Ma, S., Schumacher, M., Tutz, G., Wang, C.-Y., Wang, Z. & Ziegler, A. (2014). Discussion of 'the evolution of boosting algorithms' and 'extending statistical boosting'. *Methods of Information in Medicine*, **53**, 436–445.