

Evaluation of effectiveness and efficiency of wild bird surveillance for avian influenza

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Abstract – This study aimed to assess which method of wild waterbird surveillance had the greatest probability of detecting highly pathogenic avian influenza (HPAI) H5N1 during a period of surveillance activity, the cost of each method was also considered. Lake Constance is a major wintering centre for migratory waterbirds and in 2006 it was the site of an HPAI H5N1 epidemic in wild birds. Avian influenza surveillance was conducted using harmonised approaches in the three countries around the lake, Austria, Germany and Switzerland, from 2006–2009. The surveillance consisted of testing birds sampled by the following methods: live birds caught in traps, birds killed by hunters, birds caught in fishing nets, dead birds found by the public and catching live Mute Swans (*Cygnus olor*); sentinel flocks of Mallards (*Anas platyrhynchos*) were also used. Scenario tree analysis was performed including sensitivity analysis, followed by assessment of cost-effectiveness. Results indicated that if HPAI H5N1 was present at 1% prevalence and assuming HPAI resulted in bird mortality, sampling dead birds found by the public and sentinel surveillance were the most sensitive approaches despite residual uncertainty over some parameters. The uncertainty over the mortality of infected birds was an influential factor. Sampling birds found dead was most cost-effective, but strongly dependent on mortality and awareness of the public. Trapping live birds was least cost-effective. Based on our results, we recommend that future HPAI H5N1 surveillance around Lake Constance should prioritise sentinel surveillance and, if high mortality is expected, the testing of birds found dead.

scenario tree analysis / surveillance / avian influenza / wild bird / cost-effectiveness

1. INTRODUCTION

The threat posed to human health by zoonotic influenza viruses has been a cause for great concern [6]. In addition, outbreaks of highly pathogenic avian influenza (HPAI) have a big impact on the health of domestic poultry worldwide and have required costly control measures [2].

Compared to other birds, waterbirds are commonly infected with avian influenza (AI) viruses [2, 22, 23]. HPAI subtype H5N1, unlike other subtypes, causes mortality in wild birds and there is a concern that it may be sufficiently maintained within wild bird populations to allow long distance transmission from wild birds to poultry, although the evidence is unclear on this latter point [2, 19]. Migratory waterbirds in particular are thought to play a key but poorly understood role in the transmission of HPAI H5N1. Transmission within the

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poultry sector (without the involvement of wild birds) is also important [1, 16].

In Europe, wild birds were heavily involved in HPAI H5N1 outbreaks in 2006 with 861 wild bird cases and suspected epidemiological links of wild birds to many of the 205 outbreaks in domestic birds [7]. Austria, Germany and Switzerland were among the countries affected, with 86 infected wild birds found near Lake Constance [9], which is surrounded by these three countries.

Lake Constance is an important migratory waterbird site, with over 200 000 waterbirds present during winter. To aid wild bird AI surveillance in the area, a tri-national cooperative programme was initiated (the Constanze Project¹). Within this programme, six different Surveillance System Components (SSC) were used, each using a different method to sample waterbirds.

Due to competing demands for limited resources, there is a need to identify optimal approaches to surveillance. Evaluation of a SSC cannot be based on its ability to detect outbreaks alone, the cost must also be considered.

The sensitivity of a SSC is the probability that it detects the disease or infection of interest when it is present in the population under surveillance. The aims of this study were to apply scenario tree analysis to estimate and compare the sensitivity of the different SSC under particular conditions, to identify important parameters that influence sensitivity and to assess the cost-effectiveness of the SSC. Only HPAI H5N1 surveillance of wild waterbirds was considered.

2. MATERIALS AND METHODS

Scenario tree analysis is a quantitative methodology that has been used for analysing complex veterinary surveillance systems since it was developed in 2007 [17, 18]. In this method, trees are developed to describe the chain of events that must occur for a bird to become infected and detected by a SSC.

¹ Swiss Federal Veterinary Office, Constanze Project, [on line] www.bvet.admin.ch/gesundheit_tiere/00276/00280/index.html [consulted 6 December 2009].

Each event is represented by a node in the tree with more than one possible outcome. For each node a probability is given for each possible outcome. These probabilities are obtained from data, literature or expert opinion. The probabilities are then combined to estimate the sensitivity of the SSC. This was done for each of the six methods of sampling wild birds considered in this study (see below).

Cost-effectiveness relates the performance of public health interventions to their cost [12]. Providing the ratio of the direct cost of a SSC to the sensitivity (i.e. cost per 1% sensitivity) provides a valuable measure of efficiency by which to compare SSC.

Abbreviations used are shown in Table I.

2.1. Surveillance system components

Within the Constanze Project, six different methods of sampling wild birds to then test for avian influenza were implemented at Lake Constance.

- (a) *Bycatch*: Waterbirds accidentally caught in commercial fishing nets were submitted to the veterinary authorities.
- (b) *Live trapping (Trap)*: Two traps positioned at strategic locations around the lake were used to catch live waterbirds, one in Switzerland and one in Germany.
- (c) *Catching of live swans (Swan Catch)*: During the moulting period, live Mute Swans (*Cygnus olor*) were caught (August–September). During the moult, swans lose their flight feathers and are unable to fly making them easier to catch.
- (d) *Found dead*: Birds found dead and reported by members of the public were collected. No active patrolling for dead birds was performed during the period of study.
- (e) *Hunted (Hunt)*: Some birds killed by hunters were sampled.
- (f) *Sentinel surveillance (Sentinel)*: Three separate flocks of approximately 12 sentinel Mallards (*Anas platyrhynchos*) were kept, close contact between sentinel and wild birds was possible. Sentinel birds were sampled fortnightly.

2.2. Sampling and laboratory tests

Tracheal and cloacal swabs were taken from all birds and analysed as described by Globig et al. [8]. Briefly, RT-PCR tests were performed in series to confirm if a sample was HPAI H5N1 virus positive. Sequencing was attempted on H5 positive

Table I. Glossary of abbreviations.

Abbreviation	Explanation
SSC	Surveillance System Component
<i>D/G/M</i>	Bird group “Diving ducks, Grebes and Mergansers”
<i>Pr_i</i>	Proportion of birds within bird group <i>i</i> , where <i>i</i> represents <i>Swan</i> , <i>D/G/M</i> or <i>Other</i>
<i>P*_u</i>	Probability that a bird was infected (Design Prevalence)
<i>P_{Dies_i}</i>	Probability that a bird died given it was infected, where <i>i</i> represents the Bird group
<i>TestSe_{Dead}</i> or <i>TestSe_{Live}</i>	Sensitivity of diagnostic tests for dead and live birds respectively
<i>PSamp_i</i>	Proportion of birds sampled for each bird group, where <i>i</i> represents the Bird group
<i>N_{Samp_i}</i>	Number of birds sampled (<i>Hunt</i> and <i>Found dead</i>)
<i>Surv_i</i>	Normal yearly survival for each bird group
<i>SeSent_i</i>	Probability of detecting an infected bird by sentinel surveillance given it had not died, where <i>i</i> represents the Bird group
<i>PrInfect</i>	Proportion of sentinel birds infected at the time of testing given that the flock was infected
<i>PInf_{ij}</i>	Probability that an infected wild bird visitor infected the sentinel flock, where <i>i</i> represents Bird group and <i>j</i> represents Expert 1 or Expert 2
<i>CSe_i</i>	Component sensitivity, where <i>i</i> represents the different SSC
<i>Pr_j</i>	Proportion of “ <i>Other</i> ” birds that are “ <i>Mallard</i> ” or “ <i>Non_Mallard</i> ”
<i>PVisit_i</i>	Proportion of birds that visited the sentinel flocks, where <i>i</i> represents the Bird group
<i>FlockTestse</i>	Diagnostic test flock level sensitivity for a sentinel flock
<i>Cost_i</i>	Cost of surveillance, where <i>i</i> represents the different SSC
SR	Sensitivity ratio

samples. The suitability of serological tests of sentinel birds for HPAI was unclear, they were therefore not considered. Tests were conducted by laboratories routinely involved in AI surveillance in the regions around the lake in the three countries. Test results were obtained from the Constanze Project database, maintained by the Friedrich-Loeffler-Institute, Insel Riems, Germany.

2.3. Scenario tree models

In order to estimate the sensitivity of the different SSC, scenario trees were created [18]. In all trees, the first node (*Bird group*) describes how the wild bird population was split into different groups; *Swans* (*Cygnus* sp.) in one group, diving ducks (*Netta* sp. and *Aythya* sp.), grebes (*Tachybaptus* sp. and *Podiceps* sp.) and mergansers (*Mergus* sp.) as another group (referred to as *D/G/M*) and all remaining waterbirds were grouped as *Other* (see [Tab. II](#)). These

groupings were based on differences in factors that affect detection between the bird groups. The next two nodes for all trees represent the design prevalence (*Unit infection status*), followed by whether or not the infected bird died (*Bird dies*). Except for sentinel, the subsequent nodes represent the bird being sampled and correctly testing positive, see [Figures 1 and 2](#).

For sentinel surveillance, after the node *Bird dies*, the bird group “*Other*” was further categorised as *Mallard* (*Anas platyrhynchos*) or *NonMallard*. Subsequent nodes represent the bird visiting the sentinel, infecting the sentinel flock and this infection being detected, see [Figure 3](#).

Because wild bird populations vary over the year, particularly for migratory birds, trees were parameterised to represent an average month from May–August 2007 as well as for an average month from September 2006–April 2007; months were grouped to represent periods when these differences were

Table II. Scenario tree node values for the different Surveillance System Components (SCC) used for HPAI H5N1 surveillance in wild waterbirds on Lake Constance. Branch probabilities are either a single point value or a distribution; @RISK distributions are shown when appropriate, otherwise the expected value is shown. Where applicable, branch probabilities are shown for the different wild waterbird groups: diving ducks, grebes and mergansers as one group (*D/G/M*), *Swans* and *Other*. The relevant scenario trees are shown in [Figures 1–3](#).

Tree	Node name	Branch name	Branch probability
All SSC: May–August	Bird group	<i>Swans</i>	0.0177 (number of birds 208)
		<i>D/G/M</i>	0.189 (number of birds 2 943)
		<i>Other</i>	0.797 (number of birds 12 633, 16% dabbling ducks and 58% Gulls (<i>Laridae</i>))
All SSC: September–April	Bird group	<i>Swans</i>	0.0143 (number of birds 1 912)
		<i>D/G/M</i>	0.541 (number of birds 72 620)
		<i>Other</i>	0.444 (number of birds 59 525, 30% dabbling ducks, 56% Eurasian Coots (<i>Fulica atra</i>))
All trees	Unit infection status	<i>Infected</i>	0.01
All trees	Bird dies	<i>Dies</i>	<i>Swan</i> ~ Uniform (0.8, 0.99); <i>D/G/M</i> ~ Uniform (0.2, 0.8); <i>Other</i> ~ Uniform (0.2, 0.6)
<i>Bycatch, Swan Catch, Hunt & Trap Found dead</i>	Test positive	<i>Yes</i>	BetaPert (0.7, 0.8, 0.9) – for live birds
		<i>Yes</i>	Uniform (0.9, 0.99) – for dead birds
<i>September–April trees Bycatch Trap</i>	Bird sampled	<i>Sampled</i>	<i>Swan</i> = 0; <i>D/G/M</i> = 1.89E ⁻⁵ ; <i>Other</i> = 2.31E ⁻⁵
	Bird sampled	<i>Sampled</i>	<i>Swan</i> = 3.27 E ⁻⁴ ; <i>D/G/M</i> = 6.20 E ⁻⁵ ; <i>Other</i> = 4.82 E ⁻⁵
<i>Swan Catch Found dead</i>	Bird sampled	<i>Sampled</i>	<i>Swan</i> = 0.197; <i>D/G/M</i> = 0; <i>Other</i> = 0
	Bird sampled	<i>Sampled</i>	Expected values: <i>Swan</i> = 0.0123; <i>D/G/M</i> = 1.46 E ⁻⁴ ; <i>Other</i> = 5.23 E ⁻⁴
<i>Hunt</i>	Bird sampled	<i>Sampled</i>	Expected values: <i>Swan</i> = 9.81 E ⁻⁴ ; <i>D/G/M</i> = 5.16 E ⁻⁵ ; <i>Other</i> = 5.24 E ⁻⁵

continued on next page

Table II. Continued.

Tree	Node name	Branch name	Branch probability
<i>Sentinel</i>	Mallards	<i>Yes</i>	0.154 (number of Mallard ducks 9 206)
	Bird visits sentinel	<i>Visits</i>	Expected values: <i>Swan</i> = 0.003; <i>D/G/M</i> = 0; <i>Non_Mallard</i> = $5.0E^{-4}$; <i>Mallard</i> = 0.0348
	Infests sentinel <i>Expert 1 or</i> <i>Expert 2</i>	<i>Yes</i>	<i>Swan</i> ~ Betapert (0.2, 0.5, 0.8) or Betapert (0.2, 0.7, 1); <i>D/G/M</i> ~ Betapert (0.1, 0.2, 0.5) or BetaPert (0.2, 0.4, 1); <i>Other_Non_Mallard</i> ~ Betapert (0.1, 0.2, 0.5) or Betapert (0.2, 0.6, 1); <i>Other_Mallard</i> ~ Betapert (0.2, 0.5, 1) or Betapert (0.2, 0.9, 1)
	Flock test positive	<i>Yes</i>	Expected value: 0.999
<i>May–August trees</i>			
<i>Bycatch</i>	Bird sampled	<i>Sampled</i>	<i>Swan</i> = 0; <i>D/G/M</i> = 0; <i>Other</i> = $1.98 E^{-5}$
<i>Trap</i>	Bird sampled	<i>Sampled</i>	<i>Swan</i> = $2.68 E^{-3}$; <i>D/G/M</i> = $8.49 E^{-4}$; <i>Other</i> = $1.35 E^{-3}$
<i>Swan Catch</i>	Bird sampled	<i>Sampled</i>	<i>Swan</i> = $6.08 E^{-3}$; <i>D/G/M</i> = 0; <i>Other</i> = $6.29 E^{-6}$
<i>Found dead</i>	Bird sampled	<i>Sampled</i>	Expected value: <i>Swan</i> = 0.0714; <i>D/G/M</i> = $3.80 E^{-3}$; <i>Other</i> = $5.45 E^{-3}$
<i>Hunt</i>	Bird sampled	<i>Sampled</i>	<i>Swan</i> = 0; <i>D/G/M</i> = 0; <i>Other</i> = 0
<i>Sentinel</i>	Mallard	<i>Yes</i>	0.150 (number of Mallard ducks 1 898)
	Bird visits sentinel	<i>Visits</i>	Expected value: <i>Swan</i> = 0; <i>D/G/M</i> = 0; <i>NonMallard</i> = $1.4 E^{-3}$; <i>Mallard</i> = 0.12
	Infests sentinel	<i>Yes</i>	As for sentinel September–April
	Flock test positive	<i>Yes</i>	As for sentinel September–April

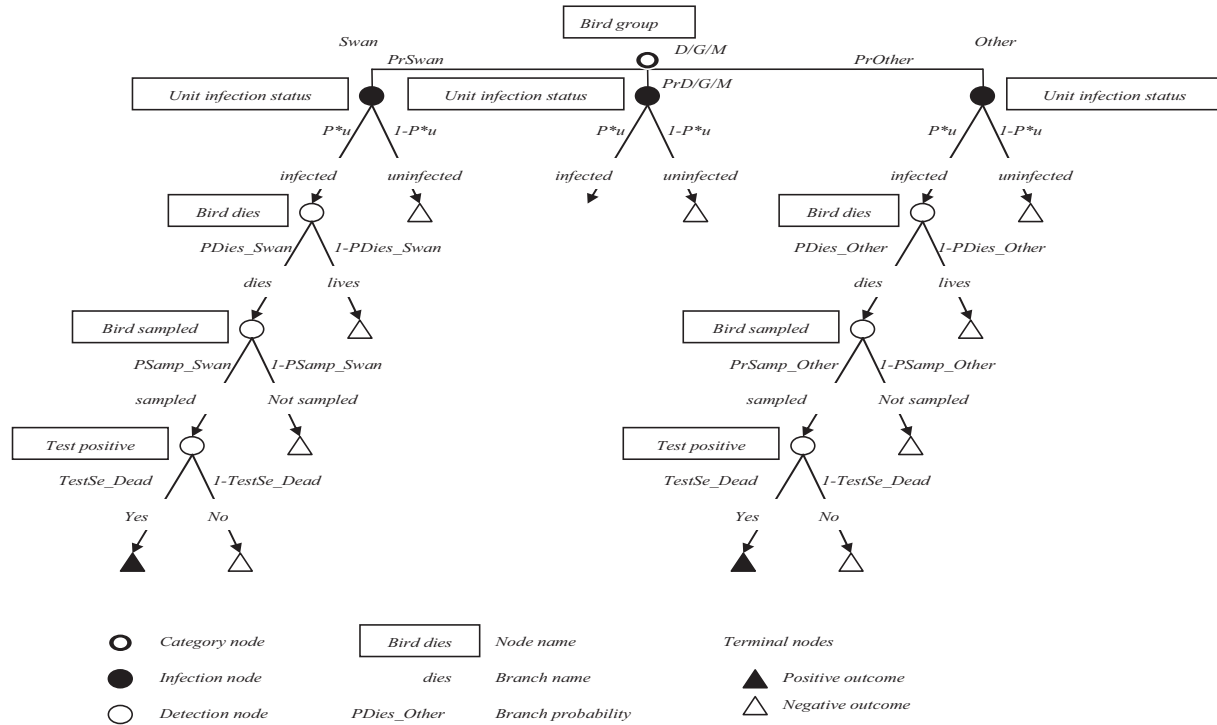


Figure 1. Scenario tree for the surveillance of HPAI H5N1 in wild waterbirds on Lake Constance by sampling birds *Found dead*. Branch for *D/G/M* is not completed but would have the same structure as the branch for *Swan*.

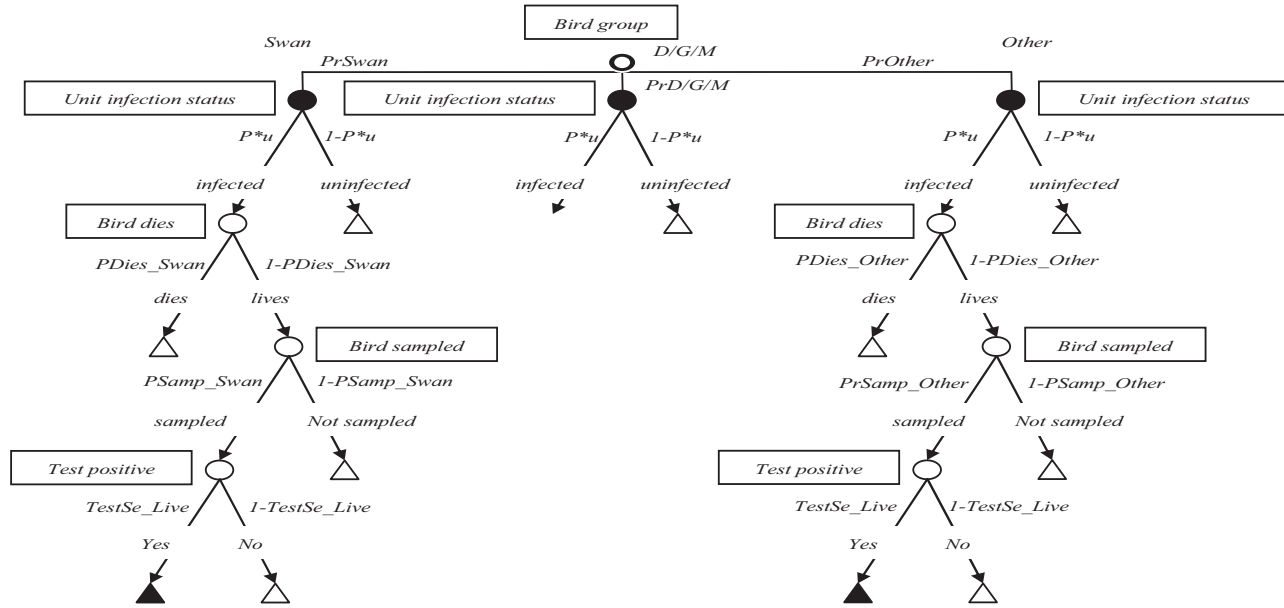


Figure 2. Scenario tree for the surveillance of HPAI H5N1 in wild waterbirds on Lake Constance by sampling live birds i.e. sampling birds by *Bycatch*, *Trap*, *Swan Catch* or *Hunt*. Branch for *D/G/M* is not completed but would have the same structure as the branch for *Swan*.

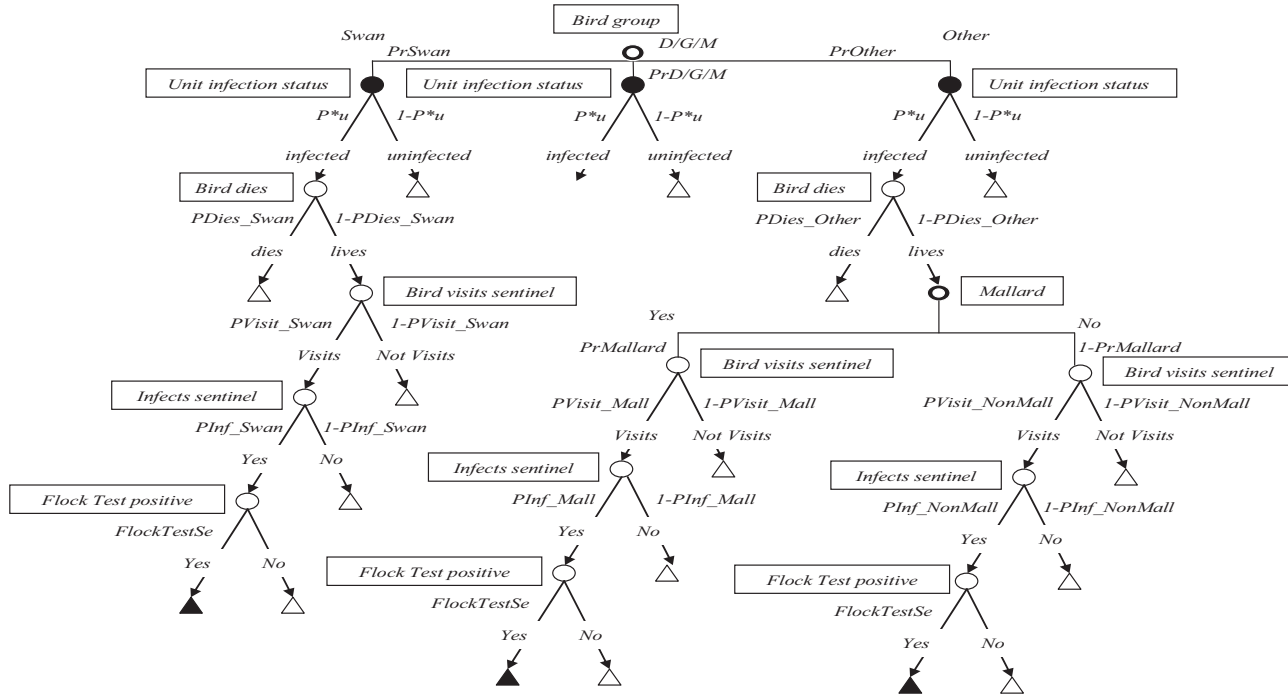


Figure 3. Scenario tree for the surveillance of HPAI H5N1 in wild waterbirds on Lake Constance using sentinel flocks of Mallard ducks (*Anas platyrhynchos*). Branch for *D/G/M* is not completed but would have the same structure as the branch for *Swan*.

most pronounced. Values that showed seasonal variation included numbers and proportions present for each bird group and the proportion of birds that were sampled or that visited sentinel flocks.

2.4. Node values

Nodes in a scenario tree represent events that must occur for infection and subsequent detection of disease, or they describe how the population is split into different groups with differing probabilities of infection and/or detection [18]. Detailed information on values used for scenario tree nodes are provided in Table II.

Bird group: The proportion of birds in the different bird groups (*PrSwan*, *PrD/G/M* and *PrOther*) for September–April was calculated as the mean monthly count of birds in a group divided by the mean monthly total bird count, taken from the Lake Constance winter bird counts for September 2006–April 2007². For May–August the bird group proportions were assumed to be those observed in the Lake Constance breeding bird count data for 2000 [3].

Unit infection status: The probability that a bird was infected (*P*_u*) was defined as a set design prevalence. The design prevalence was 1% unless stated otherwise.

Bird dies: The probability that a bird died given that it was infected (*P_{Dies}_i*, where *i* represents the Bird group *Swan*, *D/G/M* or *Other*) was estimated from mortality rates observed in birds exposed to HPAI H5N1 [4, 5, 13–15, 20]. Uncertainty distributions for these parameters were increased in light of expert opinion expressed by EFSA [7] and wild bird AI surveillance findings in the EU in 2006 and 2007 [10, 11].

Test positive: Expert opinion was used to estimate the probability that an infected, sampled bird tested positive. Different estimates were used for live birds and dead birds (*TestSe_{Dead}* or *TestSe_{Live}*). Test specificity was assumed to be 100% as all positives would be subjected to confirmatory testing.

Bird sampled: Data on sampling numbers were obtained from the actual Constanze Project surveillance data. For *Bycatch*, *Trap*, *Swan Catch* and *Hunt* the mean monthly number of birds sampled was divided by the number of birds observed on Lake Constance. This gave the proportion of birds that were sampled (*PSamp_i*, where *i* represents the Bird group).

Only samples taken around the lake shore should be included as the reference population counts were from the shore. However, recorded sampling locations for *Hunt* and *Found dead* were unreliable and uncertainty distributions of the mean monthly number of samples taken (*N_{Samp_i}*) were created using the @RISK distribution Integer Uniform, from the number of samples reported as taken within 200 m of the shore to half of all samples taken.

To estimate the proportion of dead birds that were sampled by *Found dead*, the denominator was an estimate of the mean monthly number of birds that die in the reference population. This was derived as follows:

- (1) Uncertainty distributions of normal yearly survival (*Surv_i*) were estimated from literature [21]. The yearly survival distributions used for September–April and May–August were

$$Surv_Swan \sim Uniform(0.6, 0.85),$$

$$Surv_D/G/M \sim Uniform(0.36, 0.76) \text{ and}$$

$$Surv_Other \sim Uniform(0.36, 0.76).$$

- (2) These were adjusted to provide monthly normal mortality estimates, thus:

$$1 - Surv_i^{(1/12)}. \tag{1}$$

- (3) This was multiplied by the number of individuals in the bird group to estimate the number of deaths per month in a group under normal conditions.

The numerator (the mean monthly number of dead birds sampled) was divided by this estimated monthly number of deaths to give the proportion of dead birds that were sampled.

2.4.1. Further Sentinel tree nodes

The proportion of birds that visited the sentinel flocks was estimated from recorded waterbird visitors to the German sentinel flock between January–December 2007. This was based on observations made for 30 min every 5 days by ornithologists running the sentinel facility³. The number of visitors to the Swiss and Austrian sentinels were each estimated by multiplying the number of visitors to the German

² Unpublished data from the Swiss Ornithological Institute, Sempach, Switzerland.

³ Unpublished data from the Max Planck Institute for Ornithology, Radolfzell, Germany.

flock by Uniform(0.5, 1.5). The number of visitors to all sentinels was summed and put as a proportion of all waterbirds on Lake Constance for the different Bird groups ($PVisit_i$, where i represents Bird group).

The probability that a bird infected the sentinel flock when it visited was derived from the opinions of two experts in avian influenza virology ($PInf_{ij}$, where i and j represent Bird group and which expert respectively). For each bird group, each expert was asked to give the minimum, most likely and maximum probability that an infected bird transmitted infection to the sentinel flock when visiting; using these opinions, distributions were constructed (i.e. Betapert (minimum, most likely, maximum) – see Tab. II). When implementing the model experts were given equal weighting.

The probability of detecting infection in one or more sentinel birds given that infection had been transmitted to the sentinel flock ($FlockTestSe$) was estimated as follows:

- (1) The test Sensitivity for one live bird tested was $TestSe_Live \sim \text{Uniform}(0.9, 0.99)$.
- (2) The Proportion of sentinel birds assumed to be infected at the time of testing given that the flock was infected, was $PrInfect \sim \text{Uniform}(0.06, 1)$, based on minimum and maximum values observed for all AI viruses from Swiss and Austrian sentinel data.
- (3) Given that the number of sentinel birds sampled was 10 (the modal number of sentinel birds sampled), the probability that at least one sentinel bird was infected and tested positive was

$$1 - ((1 - (TestSe_Live \times PrInfect))^{10}). \quad (2)$$

Uncertainty relating to testing and transmission parameters was reflected in the scenario tree simulations.

2.5. Cost of surveillance

Direct cost estimates for running each SSC for one year were provided by Switzerland. Germany provided cost estimates for *Sentinel*, *Trap*, and *Swan Catch*. These estimates were adjusted to represent one month's surveillance. Where lacking, SSC cost for a country was assumed to be the mean cost for countries from which data was obtained (adjusted for the number of samples taken). See Table III for cost estimates.

Table III. Estimate of the mean monthly cost of AI surveillance in wild waterbirds on Lake Constance from September 2006 to August 2007 (€). The cost is shown for the different Surveillance System Components (SSC) used.

SSC	September–April	May–August
<i>Bycatch</i>	96	9
<i>Trap</i>	7 047	7 255
<i>Swan Catch</i>	3 079	4 070
<i>Found dead</i>	243	356
<i>Hunt</i>	874	0
<i>Sentinel</i>	7 981	7 981

2.6. Analysis

2.6.1. Component sensitivity

For each SSC the probability of detection for one month's surveillance was calculated (CSe). An estimate for the average month's surveillance between September–April was calculated, as well as for the average month's surveillance between May–August.

If the size of the reference population of wild birds was n then CSe , the probability that at least one bird was infected, sampled and tested positive for *Found dead* was

$$1 - \left(1 - \sum_{i=1}^3 (Pr_i \times P^*u \times PDies_i \times PSamp_i \times TestSe_Dead) \right)^n \quad (3)$$

where i represents the Bird group.

The formula for CSe for SSC that sampled live birds (*Bycatch*, *Hunt*, *Trap* and *Swan Catch*) was

$$1 - \left(1 - \sum_{i=1}^3 (Pr_i \times P^*u \times (1 - PDies_i) \times PSamp_i \times TestSe_Live) \right)^n \quad (4)$$

For *Sentinel*, if $SeSent_i$ was the probability of detecting one infected bird given it had not died, from Bird group i , then $SeSent_i$ was

$$PVisits_i \times Pinf_i \times FlockTestSe. \quad (5)$$

For Bird group “Other” this was different for *Mallards* and *NonMallards*

$$SeSent_Other = \sum_{j=1}^2 (Pr_j \times PVisits_j \times Pinf_j \times FlockTestSe) \quad (6)$$

Table IV. Number of wild waterbirds sampled around Lake Constance by the different methods used for AI surveillance of wild waterbirds from September 2006 to August 2007. (*D/G/M* = diving ducks, grebes and mergansers).

	September–April			May–August			Total for year (all bird groups)
	<i>Swan</i>	<i>D/G/M</i>	<i>Other</i>	<i>Swan</i>	<i>D/G/M</i>	<i>Other</i>	
<i>Found dead</i>	19	12	35	8	6	52	132
<i>Trap</i>	5	36	23	3	10	68	145
<i>Hunt</i>	47	10	93	0	0	0	150
<i>Swan Catch</i>	93	0	3	221	0	0	317
<i>Bycatch</i>	0	11	11	0	0	1	23

where *j* represents “*Mallard*” or “*Non_Mallard*” and *Pr_j* is the proportion of “*Other*” birds that are “*Mallard*” or “*Non_Mallard*”. Given this, *CSe* is

$$1 - \left(1 - \sum_{i=1}^3 (Pr_i \times P^*u \times (1 - PDies_i) \times SeSent_i) \right)^n \quad (7)$$

2.6.2. Sensitivity analysis

Design prevalence (*P*_u*) values of 0.1%, 1% and 5% were evaluated separately. Changes in *CSe_Sentinel* (September–April) caused by having half as many and a third as many wild bird visitors to sentinels (reducing *PVisit_i*) were examined. The effect of halving and doubling the number of birds sampled in September–April was investigated for SSC other than *Sentinel*. The effect of including all *Hunt* and *Found dead* samples instead of only those thought to come from the lake shore (and thus the reference population) was also investigated.

Multivariate stepwise regression was used to assess the variation in output *CSe* caused by variation in the different input parameters (using @RISK sensitivity analysis); normalised regression coefficients for each input are reported.

2.6.3. Comparative sensitivity ratio (SR)

Comparative sensitivity ratios, the ratio of one *CSe* to a reference, were calculated with the *CSe* for *Trap* as the reference. Thus *SR* was

$$\frac{CSe_j}{CSe_{Trap}} \quad (8)$$

CSe_Trap was chosen as the baseline as it had a narrow uncertainty distribution.

2.6.4. Cost-effectiveness

Cost-effectiveness was calculated as the mean cost per percent *CSe* for the different SSC as follows

$$\frac{Cost_i}{CSe_i} \quad (9)$$

where *i* represents the different SSC, and *CSe* is given as a percentage.

Models were implemented in Excel (Microsoft Corporation) using @Risk (Palisade Corporation). Stochastic simulation with 10 000 iterations for each model simulation was performed using Latin hypercube sampling with a randomly selected random number seed.

3. RESULTS

3.1. Reference population and SSC samples

The wild bird population counts used in the analysis are shown in Table II. Between September 2006–April 2007, 398 birds that were eligible for the study were sampled by SSC other than *Sentinel*. For May–August 2007, the equivalent figure was 369 samples (see Tab. IV for details of sampling). It was not possible to determine the SSC for four samples. Throughout the results the mode is reported with the 5th and 95th percentiles in brackets.

3.2. Probability of detection and sensitivity analysis

The probability of detecting HPAI H5N1 for the different SSC (*CSe* as a proportion not a percentage) is shown in Table V.

Table V. The probability of detection (CSe) of HPAI H5N1 by different methods of wild waterbird surveillance, if infection was present in wild waterbirds on Lake Constance at 1%, 5% and 0.1% prevalence (P^*u) from September 2006 to August 2007. Probabilities are shown as proportions and not percentages. The mode is shown with 5th and 95th percentiles in brackets.

	P^*u	1%	5%	0.1%
September–April	<i>Bycatch</i>	0.01 (0.01–0.02)	0.06 (0.04–0.08)	0.00 (0.00–0.00)
	<i>Trap</i>	0.03 (0.02–0.04)	0.12 (0.10–0.20)	0.00 (0.00–0.00)
	<i>Swan Catch</i>	0.00 (0.00–0.02)	0.07 (0.02–0.09)	0.00 (0.00–0.00)
	<i>Found dead</i>	0.30 (0.14–0.53)	0.95 (0.52–0.98)	0.03 (0.01–0.07)
	<i>Hunt</i>	0.01 (0.01–0.03)	0.09 (0.03–0.15)	0.00 (0.00–0.00)
	<i>Sentinel</i>	0.73 (0.43–0.89)	1.00 (0.94–1.00)	0.12 (0.05–0.20)
May–August	<i>Bycatch</i>	0.00 (0.00–0.00)	0.01 (0.00–0.01)	0.00 (0.00–0.00)
	<i>Trap</i>	0.08 (0.06–0.11)	0.42 (0.28–0.45)	0.01 (0.01–0.01)
	<i>Swan Catch</i>	0.03 (0.01–0.08)	0.32 (0.04–0.34)	0.01 (0.00–0.01)
	<i>Found dead</i>	0.37 (0.19–0.66)	1.00 (0.64–1.00)	0.04 (0.02–0.10)
	<i>Hunt</i>	0.00 (0.00–0.00)	0.00 (0.00–0.00)	0.00 (0.00–0.00)
	<i>Sentinel</i>	0.56 (0.33–0.80)	1.00 (0.86–1.00)	0.08 (0.04–0.15)

For September–April with P^*u of 1%, when the number of visitors to the sentinel flock was halved, the mode for CSe changed from 0.73 (0.43–0.89) to 0.44 (0.25–0.67), and when it was divided by three CSe became 0.28 (0.17–0.52).

For other SSC, the probability of detection changed in an approximately linear fashion if the number of birds sampled was halved or doubled, i.e. sampling more birds increased the probability of detection, except for doubling the number of dead birds sampled, in which case the probability of detection less than doubled (data not shown).

When all samples were included, instead of only those thought to come from the shore, the CSe for *Hunt* was still zero in May–August and 0.06 (0.05–0.08) in September–April. For *Found dead* it was 0.90 (0.69–0.96) in May–August and 0.75 (0.59–0.86) in September–April.

The regression sensitivity analysis (data not shown) revealed that in September–April, mortality rate in the bird group “*D/G/M*” was the most influential parameter for *Bycatch* and *Trap*. In May–August mortality rate in the bird group “*Other*” was the most influential input for *Bycatch* and *Trap*, this parameter was the second most influential parameter for these SSC in September–April. Mortality rate of

infected birds in the bird group “*Swan*” was perfectly negatively correlated with the probability of detection for *Swan Catch* for both September–April and May–August. For *Found dead* in September–April number of swans sampled had a coefficient of 0.75 and annual survival in swans had a coefficient of 0.38. *Found dead* in May–August was influenced by the number of *Other* birds sampled and their annual survival. *Hunt*, only performed in September–April, was heavily influenced by the number of *Other* birds hunted. *Sentinel* was mostly influenced by whether opinion from Expert 1 or Expert 2 was chosen for the probability of transmission from a visiting bird to the sentinel flock, and by the mortality rate in *Other* birds.

3.3. Comparative sensitivity ratio

Looking at the mode (with the 5th and 95th percentiles in brackets) of the SR of the SSC (the ratio of CSe_i to CSe_{Trap}); *Sentinel* had the highest value, 19.97 (12.62–35.37) in September–April and 6.42 (3.52–10.41) in May–August then *Found dead* with $SR = 9.55$ (4.13–19.24) for September–April and 4.60 (2.03–8.36) in May–August. *Swan Catch* had a lower SR than *Bycatch* in September–April, 0.19 (0.11–0.72) versus 0.34 (0.23–0.63) but

Table VI. Cost-effectiveness of the different methods of surveillance for HPAI H5N1 in wild waterbirds on Lake Constance from September 2006 to August 2007; calculated as the mean monthly cost divided by the mean monthly probability of detection (Euros/%CSe); mode with 5th and 95th percentiles in brackets are shown.

	September–April		May–August	
<i>Found dead</i>	603	(507–1 446)	831	(531–1 416)
<i>Trap</i>	194 285	(165 000–336 000)	59 071	(53 100–93 200)
<i>Hunt</i>	50 249	(41 587–56 021)	–	–
<i>Sentinel</i>	9 786	(8 990–18 600)	11 073	(10 000–24 400)
<i>Swan Catch</i>	164 231	(158 000–857 000)	51 736	(50 400–476 000)
<i>Bycatch</i>	7 340	(6 050–11 700)	6 248	(5 540–10 600)

in May–August this was reversed with *Bycatch* having a *SR* of 0.013 (0.01–0.02) and *Swan Catch* a *SR* of 0.61 (0.10–1.03).

3.4. Cost-effectiveness

Ratio of cost in Euros to percentage CSe when *P*u* was 1% is shown in Table VI. A high value represents poor cost-effectiveness. *Found Dead* was the most cost-effective. *Trap* was the least cost-effective.

4. DISCUSSION

With an assumed prevalence of HPAI H5N1 of 1% in waterbirds on Lake Constance, our results indicate that during winter months, surveillance using *Bycatch*, *Trap*, *Swan Catch* or *Hunt* would be very unlikely to detect infection. The probability of detection by *Found dead* was estimated to be between 0.14 and 0.53 and for *Sentinel* between 0.43 and 0.89. Similarly, for summer months, surveillance based on *Found dead* or *Sentinel* was more likely to detect HPAI H5N1 than any of the other strategies.

Even with a reduced number of bird visitors to sentinels the predicted CSe was still much higher than that estimated for other SSC except *Found dead*, confirming that the results are fairly robust against errors made in these estimates. It also suggests that a poorly placed sentinel, attracting fewer visitors, still has a relatively high probability of detecting HPAI

H5N1. Including all samples for *Found dead* and *Hunt*, and not just those from the lake shore, increased the CSe, but did not alter conclusions drawn about which SSC had the highest probability of detecting infection.

No hunting was allowed in summer; hence the probability of detection by hunting at that time was zero. Swan catching was only conducted in August and September and therefore the probability of detection during other months would be zero. Averaging the probability of detection for September to April and May to August gives an overall measure of performance but hides any short term variation within these periods.

The sensitivity analysis indicated that *Bycatch*, *Swan Catch* and *Trap* CSe were heavily influenced by the level of mortality in HPAI H5N1 infected birds; when estimating mortality in the field from small, controlled studies, uncertainty is unavoidable. As the SSC sample only dead or only live birds, post-infection mortality is crucial. Obviously swan mortality is pivotal for swan catching and mortality in Mallards is important for sentinel surveillance as most sentinel visitors were Mallards. For sentinel, which of the two experts' opinion was used to estimate the probability of a visiting *Mallard* infecting the sentinel was the most influential parameter. This correctly reflects the uncertainty over this value.

The *SR* indicated that *Trap* was more likely to detect HPAI H5N1 than *Hunt*, *Swan Catch* and *Bycatch*; there was insufficient evidence to say that *Sentinel* had a greater chance of

detecting HPAI H5N1 than *Found dead*. The population counts for wild birds are estimates; the potential for inaccuracies mean that caution should be exercised when making very precise comparisons between SSC. The fact that the *SR* for both *Found dead* and *Sentinel* were smaller in May–August was in part due to the increased *CSe* of *Trap* in May–August and independent of the performance of *Sentinel* and *Found dead*. Due to lack of published data, the same value for estimated normal survival of wild birds was used for September–April and May–August, derived from annual survival estimates. This factor reduced the ability of the study to detect differences between these two time periods for *Found dead* surveillance, pushing estimates towards the yearly average.

Found dead had a high probability of detecting HPAI H5N1 infection because the probability of a dead bird being sampled by *Found dead* was much greater than the probability of a live bird being sampled via other SSC and the proportion infected was greater for dead birds than live birds. *Swan Catch* had the added problem that it targeted a bird species that has been shown to have a higher mortality rate [5, 14] and so were not available for live bird sampling. This was not an issue for *Sentinel* as it targeted *Mallard* visitors who often survived infection [4, 15] and thus were a good target for live bird sampling. In addition *Sentinel* sampled very large numbers of visiting birds and had a high probability of detecting infection in spite of the fact that detection required transmission to the sentinel. *Bycatch* sampled too few birds to have a high sensitivity.

Cost-effectiveness should be viewed together with *CSe* and total cost. For example, although *Bycatch* appeared to be cost-effective the *CSe* was poor and although *Sentinel* was fairly cost-effective it requires a relatively large investment. *Swan Catch* and *Trap* performed poorly on all three measures. Cost-effectiveness results apply to the specific surveillance performed and cannot be extrapolated; with different levels of expenditure cost-effectiveness will change. To predict cost-effectiveness at different sample sizes the complex relationships between cost and sample size, and sample size and sensitivity would have to be accounted for.

For example, *Hunt* may have fixed set-up costs, with extra costs varying linearly with the number of birds sampled; for live bird trapping set up costs could be high and then extra manning of a trap may increase sample size linearly until additional traps are required. Although sensitivity on the whole increased linearly with sample size this was due to the low sensitivities obtained. As the number of birds sampled increases, eventually additional sampling will yield diminishing additional sensitivity (as seen for *Found dead*), thus reducing the sensitivity per bird sampled and possibly cost-effectiveness. With additional economic data, curves plotting estimated cost against estimated sensitivity over a range of values for each SSC could be made to help select future surveillance strategies, although it should be noted that one trap may perform better than another due to factors other than cost, e.g. location.

The complexities of detecting infection by sentinel surveillance may be more accurately described by other modelling techniques; however, scenario tree analysis provides a transparent and consistent way of comparing the different SSC. Another factor in the interpretation of results for *Sentinel* is that it was assumed that 10 sentinel birds were always tested fortnightly. Although 10 was the most common number of birds tested, this did vary and on rare occasions none were tested. Testing 10 birds achieved good sensitivity, however, if no birds are tested the sensitivity will be zero. In sub-optimal field conditions *CSe* may be more variable than described. Interpretation of sentinel HPAI serological tests was unclear and would provide minimal additional sensitivity as flock sensitivity was high based on RT-PCR alone.

A low design prevalence (P^*u) was chosen in line with findings in wild birds [10, 11]. The design prevalence assumes that there are a constant proportion of infected live animals and a fixed sub-group of dead animals of which a constant proportion are infected. During an outbreak the actual prevalence will vary, this is catered for by assessing performance with different design prevalences. *Sentinel* and *Found dead* had the highest probability of detection for all scenarios and at 0.1% design prevalence the probability of detecting

HPAI H5N1 was less than 0.01 for all other SSC.

All Bird groups were assumed to have the same risk of infection. Although this may not be the case there is a lack of quantitative data required to assign different risks to the Bird groups. If during an outbreak the prevalence varied between bird groups it could alter the performance of the SSC depending on which group they target. Spatial clustering of disease on Lake Constance was not incorporated as the birds are not segregated to the same extent as animals on different farms [17]. Some degree of clustering may exist but is hard to define [9].

In early 2006, far more birds were reported by the public for *Found dead* sampling than subsequently, this was seen across Europe [10, 11]. This period was deliberately excluded as it represents “abnormal” sampling activity done at an “abnormally” low cost. This may never be repeated. It highlights the lack of control that veterinary services have over sampling by *Found dead* and it would be interesting to consider the cost-effectiveness of active patrolling for dead birds.

A strength of *Sentinel* over *Found dead* is that it does not depend on HPAI H5N1 causing high mortality in order to detect it, in fact as live birds visit the sentinel, the lower the probability of an infected bird dying the greater the probability of detection; thus it can detect low pathogenic avian influenza (LPAI). On the other hand it does rely on infection occurring in *Mallards*, who were by far the most frequent visitor. To fully assess the value of the different SSC, their performance in surveillance of LPAI viruses should be considered. *Hunt* and *Trap* were thought to be an “effective method” for monitoring LPAI, with 2.7% of these samples LPAI positive⁴, however, Globig et al. believed that

LPAI surveillance using live bird trapping was inferior to sentinel surveillance [8].

By having several SSC that perform well under different circumstances, overall surveillance system sensitivity will be maintained over a wider range of scenarios, the cost being the expense of maintaining several different SSC. It may be desirable to spend more to maximise sensitivity at perceived high risk periods and locations. *Found dead* by active patrols, *Swan Catch*, *Hunt* and *Bycatch* may provide useful periodic boosts to sensitivity. The value for money of these forms of surveillance is heavily dependent on the financial arrangements with those collecting the samples.

This study provides useful insights into the relative performance of the different SSC. However, when trying to generalise it must be remembered that in different settings, with different levels of sampling intensity, different wild bird populations and different costs, the results will vary.

In conclusion, *Found dead* seemed to be sensitive and highly cost-effective in a situation where mortality is high. *Sentinel* was also highly sensitive and reasonably cost-effective, and it allows the detection of AI when it causes low mortality as long as *Mallards* are infected. Although halving the number of dead birds sampled and sentinel visitors reduced the sensitivity of *Found dead* and *Sentinel*, they were still more sensitive than other SSC with all samples included. Live bird trapping had a low probability of detection and very low cost-effectiveness due to the small number of live birds sampled for the amount of expenditure. When trying to detect a disease that causes high mortality, live bird sampling may be ineffective unless the sample size is large.

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