

Within-farm spread of infectious salmon anemia virus (ISAV) in Atlantic salmon *Salmo salar* farms in Chile

F. O. Mardones^{1,2,*}, P. A. Jansen³, P. Valdes-Donoso¹, M. Jarpa⁴, T. M. Lyngstad³,
D. Jimenez³, T. E. Carpenter^{1,5}, A. M. Perez^{1,6}

¹Center for Animal Disease Modeling and Surveillance (CADMS), Department of Medicine and Epidemiology, School of Veterinary Medicine, University of California, Davis, California 95616, USA

²EpiVet Consulting, Av. Chile-Español 218, Santiago 7770494, Chile

³Norwegian Veterinary Institute, PO Box 750, Sentrum, 0106 Oslo, Norway

⁴National Fisheries Services (Sernapesca), Victoria 2832, Valparaíso 2340159, Chile

⁵EpiCentre and Infectious Disease Research Centre, Massey University, Palmerston North 4442, New Zealand

⁶CONICET and Facultad de Ciencias Veterinarias UNR, RA-2170 Casilda, Santa Fe, Argentina

ABSTRACT: Spread of infectious salmon anemia virus (ISAV) at the cage level was quantified using a subset of data from 23 Atlantic salmon *Salmo salar* farms located in southern Chile. Data collected from official surveillance activities were systematically organized to obtain detailed information on infectious salmon anemia (ISA) outbreaks. Descriptive statistics for outbreak duration, proportion of infected fish, and time to secondary infection were calculated to quantify the magnitude of ISAV incursions. Linear and multiple failure time (MFT) regression models were used to determine factors associated with the cage-level reproduction number (R_c) and hazard rate (HR) for recurrent events, respectively. In addition, the Knox test was used to assess if cage-to-cage transmissions were clustered in space and time. Findings suggest that within farms, ISA outbreaks, on average, lasted 30 wk (median = 26 wk, 95 % CI = 24 to 37 wk) and affected 57.3 % (95 % CI = 47.7 to 67.0 %) of susceptible cages. The median time to secondarily diagnosed cages was 23 d. Occurrence of clinical ISAV outbreaks was significantly associated with increased R_c , whereas increased HR was significantly associated with clinical outbreaks and with a large number of fish. Spatio-temporal analysis failed to identify clustering of cage cases, suggesting that within-farm ISAV spread is independent of the spatial location of the cages. Results presented here will help to better understand ISAV transmission, to improve the design of surveillance programs in Chile and other regions in which salmon are intensively farmed, and to examine the economic impact of ISAV and related management strategies on various cost and demand shifting factors.

KEY WORDS: Infectious salmon anemia virus · ISAV · Within-farm transmission · Salmon farming · Chile

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INTRODUCTION

On June 2007, infectious salmon anemia (ISA), a highly infectious viral disease, was confirmed in southern Chile and resulted in the single largest ISA

epidemic the world had ever experienced. Since then, ISA has had a profound negative economic impact on the Chilean salmon industry through job losses and decreased revenue. Subsequent outbreaks were spatially and temporally aggregated

*Email: fomardones@ucdavis.edu

during the first year of the epidemic (Mardones et al. 2009). In addition, the difficulty of controlling outbreaks was demonstrated particularly in densely populated areas, due to a substantial fraction of super-shedding farms (Mardones et al. 2011). At the time of the epidemic, the official authority for fish health (National Fisheries Service, Sernapesca) along with the Chilean Salmon and Trout Growers Association (private representative body, Salmon-Chile) established husbandry measures aimed at controlling ISA, including early detection and depopulation (on a cage-by-cage basis), establishment of control zones, increased biosecurity, and control and treatment of processing wastes. Although such measures may have helped to reduce the number of reported infected farms, ISA virus (ISAV) continued to spread and persisted throughout southern Chile for almost 3 yr, in spite of the depleted number of susceptible farms (Mardones et al. 2009, 2011).

Introduction of ISAV into a salmon holding may have different sources and may affect a variable proportion of fish in different cages (McClure et al. 2004). In general, when fish in one or more cages are initially infected, ISAV spreads among susceptible cages directly through seawater (Løvdal & Enger 2002) via the excretion or secretion of infected fish mucus, blood, tissues, or feces (Thorud & Djupvik 1988, Nylund et al. 1994, Totland et al. 1996, Rimstad et al. 1999). Epidemic duration and cumulative mortality can be highly variable, with durations ranging from <1 mo to several months and cumulative mortalities exceeding 95% (Hammell & Dohoo 2005a, Rimstad et al. 2011). Few studies have evaluated factors associated with the spatial and temporal patterns of ISAV spread within a farm. However, a study of 3 ISA-outbreak farms in Maine, USA, found no significant association between cage adjacency and disease timing (Gustafson et al. 2007). This suggests that manifestations of ISA, subsequent to ISAV exposure, are affected by certain local conditions. A better understanding of the dynamics of aquatic infectious disease outbreaks within a farm, and particularly ISAV, is fundamental to salmon farm management. Such knowledge would allow a better estimate of the severity of an incursion, e.g. duration and the total number of infected cages and fish, which is needed to identify efficient control strategies that will diminish the consequences of disease in terms of costs and animal welfare.

The aims of the present study were to (1) describe and quantify the magnitude of an ISAV incursion in a typical Atlantic salmon *Salmo salar* farm of Chile, (2) identify factors associated with cage-to-cage trans-

mission and incidence rates, and (3) assess spatio-temporal cage-to-cage transmission. Results presented here will help to understand the intra-farm dynamics of ISAV infection in cultured salmon and to parameterize transmission and spread models for disease prevention and control.

MATERIALS AND METHODS

Data source

Data were collected from Sernapesca's official surveillance program for the detection of highly infectious diseases or reported during the ISA epidemic (ISAV-specific active surveillance, Sernapesca 2008) that affected southern Chile from June 2007 through December 2009. At the time of the epidemic, data were provided mostly by public and private diagnostic laboratories, sanitary and production records from many salmon farms and companies during their internal monitoring activities, and epidemiological questionnaires carried out by veterinarians. This information was systematically compiled and organized to generate a unique dataset that contained specific farm-level information on ISA outbreaks. A unique identification number (ID), which was the reference code used for most laboratories to identify sampled fish, was assigned to each salmon farm. Surveillance information included data on date of sampling, number of fish, and production unit (cage or tank) sampled as well as the diagnostic test used and the test result (positive or negative). In addition, industry representatives willing to participate in the project provided historical information from past outbreaks.

Case-definition and ISAV spread

A list of infected farms was readily available (Mardones et al. 2011). Of these farms, only farms that reported raising Atlantic salmon as a single species (monoculture) and excluding broodstock, that were located in seawater, and that provided a cage-layout of the farm were included in the present study. Specifically, farms were restricted to those that reported using the predominant technology (FAO 2007), i.e. a marine floating system of square-metal frame cages (in a grid arrangement) at the time of the epidemic.

Within-farm ISAV spread was estimated from sampling and testing data as part of the monitoring activ-

ities carried out in many laboratories in Chile. According to Sernapesca, immediately after detection of ISAV in a particular farm, all farms that were within 5 km (farms at high risk) of a case were intensively sampled as part of the active surveillance plan (Sernapesca 2008). Veterinarians visited all high-risk farms and collected 30 fish from ≥ 1 targeted cages and handled samples as follows: tissues (brain, kidney, liver, or spleen), from individual or a pool of 5 fish, were submitted to a laboratory from the laboratory network and tested using one or more of the official diagnostic tests (real time RT-PCR, immunofluorescent antibody test, or cell culture). Accordingly, a farm was suspected of being subclinically infected if it had positive results using official diagnostic tests. Clinical infection was confirmed if, in addition to a positive test result, fish on a farm had clinical signs and/or post-mortem features attributable to ISA. The index cage (IC) was identified as the first test-positive cage at each infected farm and was considered as the earliest detection for ISAV infection at the cage level. Sampling and testing were continued every 15 d if a farm had a positive test, or 30 d if not, until the fish were completely harvested. Recurrent or secondary ISAV-positive cages were recorded until there was no positive test result or until complete depopulation of the farm. The time from the earliest detection until depopulation was referred to here as the outbreak duration. Although no additional information was available on the magnitude of the outbreak at the cage level (e.g. affected proportion of fish or mortalities), it was possible to confirm the presence of mortalities or clinical signs attributable to ISA and, in some cases, the highly polymorphic region (HPR) pattern contained in the hemagglutinin-esterase (HE) gene of ISAV, which is believed to be important for the pathogenicity of ISAV (Rimstad et al. 2001, Aspehaug et al. 2005, Markussen et al. 2008), was provided. In addition to surveillance activities, results from internal monitoring carried out by private veterinarians were available and complemented the official data.

Estimation of the cage-level reproduction number (R_c)

The Martingale method, which uses cumulative incidence data with removal of infective population over time, was used to derive the threshold parameter or R_c (Becker 1989). In the present study, R_c refers to the mean number of secondary infections that result from a single infected cage. This approach has

been applied to derive the value of R_c in single epidemics in finite communities from the sizes of outbreaks among households, assuming homogenous mixing and closed populations. In a given farm f of size $s + i$, there are initially, at time $T = 0$, i infected and s susceptible cages. The R_c value was then estimated for each farm f as follows:

$$R_{cf} = s\hat{\theta} = s \left[\frac{1}{s} + \frac{1}{(s-1)} + \dots + \frac{1}{S(T_N)+1} \right] / R(T_N) \quad (1)$$

where $S(T_N)$ denotes the number of susceptibles at the time when the infection process of the epidemic ends (T_N), i.e. when its intensity process becomes zero and there is no positive test result, and $R(T_N)$ is the cumulative incidence of diagnosed infected cages when $S(T_N) > 0$ (i.e. sum of new cases plus i).

Finally, assuming uniform random mixing, the infection potential associated with ISAV for a farm f ($\hat{\theta}$) was estimated. For example, if a farm with 15 susceptible cages had 1 infective cage and a cumulative incidence of 10 infected cages,

$$R_c = 15\hat{\theta} = 15 \left[\frac{1}{15} + \frac{1}{(14)} + \dots + \frac{1}{7} \right] / 10 \quad (2)$$

where $\hat{\theta} = 0.087$, and $R_c = 1.3$. Subsequently, R_{cf} was computed for each farm f . Additional details about the method of inference, equations and derivations are described elsewhere (Becker 1989, Chap. 7).

Estimation of the HR for cage recurrences

A multiple-failure time (MFT) model was constructed as a generalization of the Cox proportional hazards model in which the hazard function is continued beyond a farm's IC to second and subsequent ordered and identical outbreaks (Prentice et al. 1981). This approach, also known as a conditional risk set model, uses recurrence data to produce a proportional hazards model with time-dependent strata, in which the dependence between event times is handled by stratifying the prior number of infected cages. Here, recurrence refers to a cage infection occurring after the IC in a given farm. Considering recurrences are not mutually independent observations and that they are ordered events, a conditional model was constructed by estimating robust standard errors. Because it is possible that more than one cage or event was diagnosed at the same time, ties were handled by specifying Efron's method (Efron 1977). All statistical analyses and methodological specifications were implemented in the statistical software STATA v. 11 (StataCorp).

Association between epidemiological factors and R_c and HR

Values for hypothesized explanatory variables and confounders (Table 1) for R_c and HR were obtained from surveillance data and previous spatial estimations (Mardones et al. 2011). Associations between these factors and R_c and HR, computed at each farm f , were estimated using linear regression and an MFT model, respectively. Factors potentially associated with the dependent variables were selected in a univariate analysis ($p \leq 0.2$) and then incorporated into a preliminary, candidate model. For the MFT model, the number of fish and biomass at the farm were evaluated as temporally varying effects. The best-fitting models were defined after using forward and backward stepwise variable selection as the one that included significantly ($p \leq 0.05$) associated variables and that minimized the value of Akaike's information criterion. For the linear model, evaluation of the major assumptions was based on graphical methods by representing standardized residuals with fitted values (evaluation of homoscedasticity) and the model's quantiles versus quantiles of the normal distribution (evaluation of normality) (Dohoo et al. 2009). For the MFT, the assumption of proportionality of risks was assessed using Schoenfeld's residuals analysis and test of proportional hazards assumptions for each significant variable retained in the final model (Grambsch & Therneau 1994).

Spatio-temporal analysis of cage-to-cage ISAV spread

To assess if cage-to-cage transmission were clustered in space and time, the null hypothesis of a random spatio-temporal distribution of cases was tested using the Knox test (Knox 1964). This test has been applied to a number of infectious terrestrial animal diseases (Ward & Carpenter 2000), and in aquaculture, it has been previously used to assess time-space clustering of white sturgeon iridovirus outbreaks in hatcheries (Georgiadis et al. 2001). Briefly, the Knox test requires preliminary assumptions about the maximum incubation period (time from infection to appearance of clinical signs) and the maximum transmission distance at which viral transmission may occur between cages in the marine site. Here, it was assumed that infected fish from a single sea cage were able to shed and transmit ISAV to cages either adjacent or diagonal to the cage; according to the dimension of the standard marine salmon site included in this study, this distance had a hypotenuse of 43 m. The incubation period ranges from 13 and 31 d after experimental inoculation of the virus (Dannevig et al. 1994, Totland et al. 1996, Rimstad et al. 1999, Simko et al. 2000). Consequently, 43 m and 31 d were considered as the maximum (critical) spatial and temporal distances, respectively. The Knox routine was simulated to estimate confidence intervals around the calculated statistic (Levine 2006), using the CrimeStat software (Levine 2010).

Table 1. Description of group variables evaluated in 2 regression models using retrospective data of cage diagnoses from 23 Atlantic salmon *Salmo salar* farms in southern Chile that experienced infectious salmon anemivirus (ISAV) outbreaks between August 2007 and October 2008

Category	Variable	Type	Description
Spatio-temporal	Time	Continuous	Time (wk) from the beginning of the largest ISAV epidemic (June 2007)
	Nearest	Continuous	Time-varying seaway distance (km) to the nearest and concurrent ISAV-infected farm
	Radius	Continuous	Time-varying number of concurrent ISAV infectious farms evaluated within a radius of 5, 10, and 15 km
On-farm	Initial population	Continuous	Fish number stocked
	No. of fish	Continuous	Time-varying number of fish ($\times 100\,000$)
	Smolt weight	Continuous	Average weight smolts stocked (g)
	No. at ISAV	Continuous	Fish number at the ISAV first diagnosis
	Biomass	Continuous	Biomass at the ISAV first diagnosis
	Following	Dichotomous	Farm followed >1 mo between production cycles (reference) or not
	Supply	Continuous	Number of smolt suppliers (farms)
Outbreak	Origin	Dichotomous	Fish were imported (reference) or were national strains
	Outbreak	Dichotomous	Outbreak was based solely on positive test results (subclinical, reference) or on developed mortalities attributable to ISAV
	Early detection Surveillance	Dichotomous Dichotomous	Index cage (IC) was 1 (early, reference) or >1 (delayed detection) Diagnoses were carried out by official campaigns (reference) or based on company's submissions of samples to private laboratories

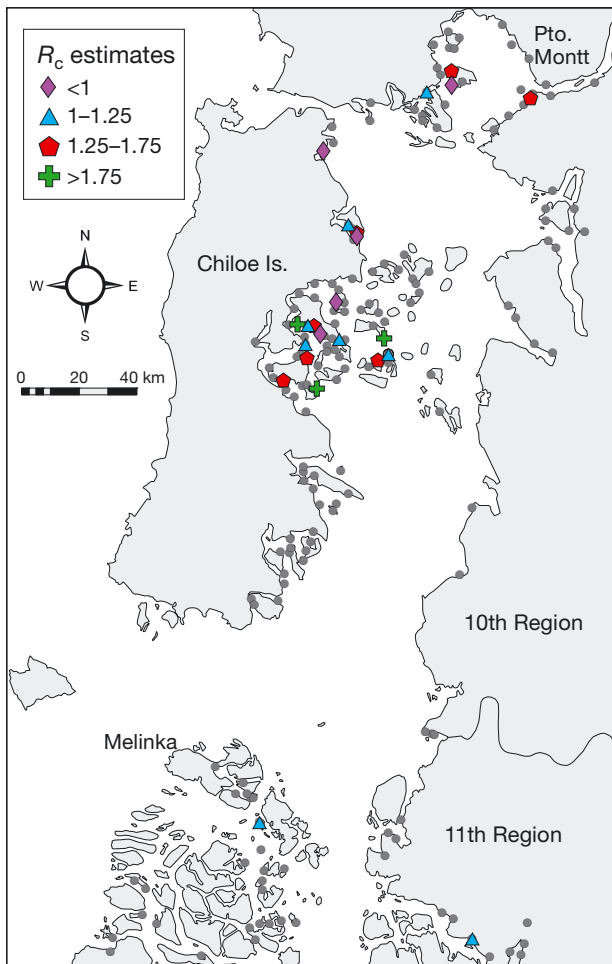


Fig. 1. Study area and cage-level reproduction numbers (R_c) for infectious salmon anemia virus (ISAV) estimated for 23 Atlantic salmon farms in southern Chile. Grey dots are the reported ISAV-infected farms from 2007 to 2009

RESULTS

Within-farm spread

Only 38 of the 251 infected Atlantic salmon farms provided information useful to trace back and describe ISAV spread within farms. Of these 38 farms, 15 were excluded from further analysis because they raised >1 species and/or included broodstock ($n = 6$), were located in estuarine waters ($n = 5$), or reported inconsistent data ($n = 4$). Ultimately, data from a subset of 23 Atlantic salmon farms were traced back to describe ISAV spread within farms. Most farms (21) were located in the 10th region (Fig. 1), and all reported ISAV infections that occurred between August 2007 and October 2008 (Table 2). Of all farms, 18 (78.3%) experienced mortalities or the presence of

moribund fish with clinical signs attributable to ISAV, i.e. clinical outbreaks. Additional demographic and epidemiologic features of each farm are shown in Table 2. Selected statistical indicators that describe the within-farm spread are shown in Table 3. Each infectious cage during an epidemic was found to infect (R_c) between 0.5 and 2.1 other cages (mean = 1.24, median = 1.2; SD = 0.404) (Fig. 1, Table 2).

Regression and space-time analyses

Results from the final fitted models are presented in Tables 4 & 5. After the model-building process, only the category for outbreak type (subclinical versus clinical) was retained in the final model, where clinical outbreaks were significantly associated with increased R_c ($p = 0.042$, $R^2 = 0.18$, 95% CI = 0.02–0.79) (Table 4).

In the MFT model, the numbers of fish as well as outbreak type were retained in the final model. Unfortunately, ISAV diagnoses after the fifth recurrence were not well captured in the model, resulting in a lack of power to detect additional differences. The global HR in the MFT model associated with clinical outbreaks was 3.19 ($p = 0.022$), and an overall Mantel-Haenzel estimate of the hazard ratio, controlling for time, of 2.8 ($p = 0.015$) was computed. The model also predicted a 1.17-fold greater HR for recurrences with every 100 000 increment in the number of fish at the farm ($p = 0.028$). The interaction term between these 2 significant variables was only tested in the MFT model and was not statistically significant ($p = 0.24$). The test using the scaled Schoenfeld residual showed no evidence of violating the proportional hazard assumption ($p \geq 0.69$) (Table 5). The variable ISAV strain was not evaluated due to considerable missing values (43% of data, Table 2).

The Knox test failed to identify an overall time-space clustering of cases ($p = 0.38$).

DISCUSSION

Results from the present study indicate that following an ISAV incursion, the virus was spread to more than half of the cages in standard marine Atlantic salmon farms, ranging from 16 to 89% cumulative cage incidence of infection. Clinical outbreak status and number of fish at the farm were significant predictors of the magnitude of within-farm ISAV spread. The pattern of ISAV spread described here is similar to previous investigations regarding the distribution

Table 2. Demographics and epidemiological features of 23 Atlantic salmon *Salmo salar* farms in southern Chile that experienced infectious salmon anemia virus (ISAV) outbreaks between August 2007 and October 2008. Outbreak duration was time from first infection date (diagnosis) of the index cage to final depopulation date. Outbreak type was classified as subclinical if it had positive results under official diagnostic tests (virus isolation, reverse transcriptase polymerase chain reaction or immunofluorescent antibody technique) in any cage but no fish with clinical signs. Clinical infection was confirmed if, in addition to a positive test result, a farm had clinical signs and/or post-mortem features attributable to ISA in at least 1 sea cage. R_c : cage-level reproductive number; HPR: highly polymorphic region group; nd: no data

Farm ID	No. cages	Initial population ($\times 100\,000\,000$)	Smolt weight (g)	First infection date	Outbreak duration (wk)	Outbreak type	No. (%) of cages detected	R_c	ISAV strain
1	8	1.5	101	Aug 2007	14	Clinical	7 (88)	1.6	HPR7b
2	12	1.16	104	Aug 2007	23	Clinical	8 (67)	1.3	HPR7b
3	18	1.47	69	Aug 2007	52	Subclinical	5 (28)	0.9	nd
4	22	1.22	106	Aug 2007	43	Clinical	12 (55)	1.1	HPR7b
5	18	1.88	113	Aug 2007	15	Clinical	16 (89)	2.1	HPR7b
6	16	1.01	167	Aug 2007	29	Clinical	8 (50)	1.1	HPR7b
7	20	2.2	133	Sep 2007	47	Clinical	16 (80)	1.6	HPR7b
8	26	0.85	137	Sep 2007	30	Subclinical	12 (46)	1.2	HPR7b
9	16	1.1	130	Oct 2007	11	Clinical	14 (88)	1.8	HPR7b
10	22	1.08	113	Nov 2007	64	Clinical	7 (32)	0.8	HPR2
11	16	0.93	116	Dec 2007	58	Clinical	10 (63)	1.3	HPR2
12	18	1.17	119	Jan 2008	26	Clinical	14 (78)	1.6	HPR7b
13	15	1.2	109	Jan 2008	13	Subclinical	3 (20)	0.7	HPR7b
14	14	0.91	125	Jan 2008	43	Clinical	8 (57)	1.2	nd
15	18	1.13	121	Jan 2008	51	Subclinical	3 (17)	0.7	nd
16	28	1.91	69	Jan 2008	37	Clinical	6 (21)	0.5	nd
17	17	1.19	118	Apr 2008	17	Clinical	14 (82)	1.8	HPR7b
18	20	1.32	105	May 2008	27	Clinical	16 (80)	1.7	nd
19	23	1.38	92	Jul 2008	21	Clinical	8 (35)	1.0	nd
20	24	1.27	114	Aug 2008	12	Clinical	13 (54)	1.1	nd
21	12	1.56	189	Sep 2008	23	Subclinical	10 (83)	1.2	nd
22	19	1.07	107	Sep 2008	20	Clinical	10 (53)	1.0	nd
23	22	1.09	140	Oct 2008	24	Clinical	12 (55)	1.3	nd

Table 3. Epidemiological indicators for the within-farm spread of infectious salmon anemia virus (ISAV) from 23 Atlantic salmon *Salmo salar* farms in southern Chile that experienced outbreaks between August 2007 and October 2008

Indicator	Mean	Median	Min.–max.
Number of index cages	1.4	1	–
Outbreak duration (wk)	30.4	26	11–64
Percentage cages infected	57.4	55	17–89
Time (d) to 2nd infected cage	51.3	23	3–186

Table 4. Results of a linear regression model fitted for the threshold parameter R_c (cage-level reproduction number) estimated from 23 Atlantic salmon *Salmo salar* farms in southern Chile that experienced infectious salmon anemia virus (ISAV) outbreaks between August 2007 and October 2008. CI: confidence interval

Variable	Level	Coefficient	Lower 95% CI	Upper 95% CI	p
ISAV outbreak vs. clinical		0.41	0.02	0.79	0.042
Intercept		0.98	0.59	1.27	<0.001

of the virus within 3 Atlantic salmon grow-out farms in Maine, USA (Gustafson et al. 2007). Interestingly, in both Chile and the USA, incident cages were not spatio-temporally aggregated within farms, and limited associations with certain factors were associated with the outbreak. Here, ~9% (23 of 251) of the reportedly affected farms during the 2007 to 2010 epidemic (Mardones et al. 2009, 2011) were investigated further, providing important findings for disease planning control.

Table 5. Results of an multiple-failure time (MFT) regression model fitted for the cage-level recurrences of infectious salmon anemia virus (ISAV) estimated from 23 Atlantic salmon *Salmo salar* farms in southern Chile that experienced ISAV outbreaks between August 2007 and October 2008. HR: hazard rate; CI: confidence interval

Variable	Level	HR	Lower 95% CI	Upper 95% CI	p
No. of fish ($\times 100\,000$)		1.17	1.02	1.35	0.028
ISAV outbreak vs. clinical	Subclinical	3.19	1.18	8.6	0.022

Within-farm spread was larger for farms with clinical cases of the disease compared to those in which no clinical cases were identified. This is certainly expected, given that clinically infected fish likely shed larger amounts of virus into the environment compared to subclinically infected fish. During subclinical outbreaks, clinical and macroscopic changes may be restricted solely to anemia and some minor circulatory disturbances, which can be overlooked easily if no diagnostic investigations are undertaken (Rimstad et al. 2011). In many cases, increased mortality and clinical outbreaks can be related to stressful events, such as fish handling and delousing (Hammell & Dohoo 2005b, McClure et al. 2005, Rimstad et al. 2011). Moreover, it has been shown that fish can clear the infection 25 d after exposure, where some infected fish may remain apparently healthy for long periods, becoming subclinically infected, and harbor ISAV for weeks and months, likely with shedding rates and virus loads significantly smaller than those of clinically infected fish (Mikalsen et al. 2001, Rimstad & Mjaaland 2002). In all cases, the categorization of disease outbreaks into clinical versus subclinical is merely a simplification of a complex dynamic that was not fully evaluated here, and it was assumed that both farm and authorities' veterinarians agreed in this category according to the definition stated in the sanitary program (Sernapesca 2008).

An alternative explanation is that mortality caused by ISAV may trigger husbandry and control practices that, if improperly planned and conducted, may unfortunately promote ISAV spread within the farm. During a clinical outbreak, removal of dead fish from affected cages (and sometime from the entire farm) is increased to prevent disease spread. In addition, the farmer is required by the authorities to depopulate or harvest the affected cage within 3 wk of detection to eliminate the main source of infection (Sernapesca 2008). Such procedures would involve more intense handling of dead and/or moribund fish and consequently may favor discharge of contaminated tissues or materials, particularly contaminated blood and carcasses. In fact, blood has been considered as the most infective tissue from experimental trials carried out in Atlantic salmon (Totland et al. 1996) where a large viral shedding event occurs before death (Gregory et al. 2009). Husbandry procedures during the grow-out stage, such as sharing equipment and personnel within a multiple-site company and feeding practices, modified the risk of experiencing mortalities caused by ISA at the cage level in New Brunswick, Canada (Hammell & Dohoo 2005b).

A third possibility is that clinical outbreaks are related to highly virulent strains of ISAV, increasing spread between cages due to its higher infectivity and/or pathogenicity (Johnson et al. 2008, Ritchie et al. 2009). Unfortunately, molecular information for each outbreak was only partially available, as indicated in Table 2, and no further analysis was carried out; however, it seems that the magnitude of an outbreak is at most minimally associated with the ISAV molecular type for a number of reasons. First, it has been reported that ~80% of ISAV isolates sequenced during the Chilean epidemic corresponded to the same segment 6 HPR group, which is referred to as HPR 7b (Kibenge et al. 2009), and in the present study, 11 out of the 13 (85%) reported this variant (Table 2). Second, most outbreaks were confined to the same geographic region (Fig. 1), and according to recent findings in Norway (Lyngstad et al. 2008, 2011), there is a high degree of genetic similarity between ISAV isolates from aggregated ISA sites. Third, previous analyses comparing cage-level ISAV mortality rates of different ISAV strains showed no significant differences after controlling for confounding factors related to exposure time and location of the site (Johnson et al. 2008).

The number of fish and the likelihood for additional recurrences was additionally identified as potential predictors for ISAV spread. This can be explained by the fact that with more fish, additional productive units (cages) are needed at the farm, increasing the chances of ISAV spread. The effect was identified as a time-varying covariate in the MFT model approach but not identified by the linear approach that looked at the cumulative cage incidence. This density-dependency process is in line with the expectation that as more fish become infected, the probability of spread to other cages also increases. It has been also reported that the likelihood of developing clinical outbreaks increases with fish population size (Hammell & Dohoo 2005b). However, a certain influence from simultaneously infected neighboring farms or infection pressure was expected, but neither analysis resulted in statistically significant associations to neighboring infected farms. It is well known that horizontal transmission through short seaway distances is a major transmission pathway for ISAV between sites (Mardones et al. 2009, Aldrin et al. 2011), but the magnitude and spread within-farm once fish have become infected is, to some extent, independent of the concurrent ISAV status and distance to the nearest infected farms, and likewise, is independent of the effect of having a concurrent large number of infected farms

within variable radii (5, 10, or 15 km). While managing ISA based on its farm-level impact might be reasonable, given that most subsequently infected cages result from within-farm transmission, the farm remains a source of infection to neighboring farms, and so ISA management must also consider potential transmission to other farms and therefore must also be area-based. Alternatively, it is possible that the large number of reportedly infected farms, 65 and 50% of salmon farms located in the 10th and 11th regions, respectively, of Chile (Mardones et al. 2011), has masked the effect of distances and infection pressure. Most farms were located on the mid-east coast of Chiloe Island (Fig. 1), where space-time clustering was previously reported (Mardones et al. 2009) as well as the presence of 'super-spreaders' (Mardones et al. 2011). Although effects of nearby infected farms were not demonstrated here, it is necessary to clarify this important aspect with additional research.

One of the conclusions of a similar study conducted in Maine (Gustafson et al. 2007) was that aggressive removal of cages would be the most beneficial strategy when attempting to control ISAV. This is also a conclusion here, with a clear distinction between clinical vs. subclinical outbreak. Whenever clinical signs and/or mortalities are observed in a farm, it is probably important to allocate extra time and resources to reduce the impact of ISAV given that a farmer would expect at least 3-fold greater risk of developing a new infection in another cage or more. This scenario will be worse if more fish are at the farm.

As in all observational studies, there were limitations in the way our data were collected, and certain details about field and laboratory information, including virus and environmental characteristics, were unavailable to the researchers here. Recording the exact time of an outbreak was not feasible, as infection may not be known until a full examination of all fish for a given cage is made. However, there is no reason to believe that this imprecise estimate would have occurred differentially among farms since monitoring activities were standard for all farms. In this study, restricted sampling was adopted despite of the reduction of sample size, which resulted in only 9% of infected farms being used for statistical modeling. Although statistical models identified few predictors, suggesting that variations in the patterns of ISA outbreaks (introduction and subsequent spread) may depend upon extraneous factors not accounted for here, it is important to consider this paucity of significance cautiously since low power may limit additional findings. However, the

novelty of the present approach to estimate the R_c is likely the simplest one, which can be improved greatly by incorporating the population structure under study, for example, the level of crowdedness at the cage level, the contact structure, and/or certain interventions, e.g. vaccination, which could modify the pattern of spread (Pellis et al. 2009). Knowing the R_c can provide important insights for the design of more efficient control and surveillance programs for ISAV. First, by applying the concept of herd immunity (Fine 1993), it is possible to estimate the proportion of the population that would have to be successfully vaccinated to avoid an outbreak. This proportion can be estimated as $1 - 1/R_0$, where R_0 is the basic case reproduction number. Assuming that R_c is a good approximation of R_0 , it can be expected that, on average, $R_c = 1.24$; therefore, vaccinating at least 19% ($1 - 1/1.24$) of the population at risk against ISAV would prevent an outbreak, provided the vaccine was 100% effective. However, unknown control measures were likely established during each outbreak in this study, and consequently, this estimate may underestimate the true infection potential of ISAV, and also that achieving perfect immunization in field conditions is difficult. As with other viral fish vaccines, commercially available vaccines against ISA are based upon inactivated whole virus antigens and have questionable field effectiveness, as reflected by outbreaks reported in vaccinated fish farms (Gomez-Casado et al. 2011). There are additional formulations that take into account the different vaccine efficacies (Keeling & Rohani 2008).

Secondly, understanding the between- and within-farm transmission dynamics for ISAV is crucial to understanding the relative importance of intervention strategies at these 2 levels. Previously, the reproduction number at the farm level varied substantially between the epidemic times and geographical characteristics, requiring interventions to be more aggressive at the beginning of the epidemic (Mardones et al. 2011).

In conclusion, the present study quantified important epidemiological aspects of the within-farm spread of ISAV. Because the farm is often the fundamental unit at which control policies are targeted, this study will help to prevent and mitigate the impact of an ISAV infection and will be useful for farmers and veterinarians to quantify the impact of such infection in fully susceptible populations. Future studies should highlight the need for regular monitoring of mortalities to identify clinical outbreaks as early as possible, followed by the rapid removal of infected fish.

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