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TITLE: Analysis of Swine Movements in a Province in Northern Vietnam and Application in the Design of Surveillance Strategies for Infectious Diseases

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27 Summary

While swine production is rapidly growing in South-East Asia, the structure of the swine 28 29 industry and the dynamic of pig movements have not been well-studied. However, this 30 knowledge is a pre-requisite for understanding the dynamic of disease transmission in swine populations and designing cost-effective surveillance strategies for infectious diseases. In this 31 32 study, we assessed the farming and trading practices in the Vietnamese swine familial farming sector, which accounts for most pigs in Vietnam, and for which disease surveillance is a major 33 challenge. Farmers from two communes of a Red River Delta province (Northern Vietnam) were 34 interviewed, along with traders involved in pig transactions. Major differences in the trade 35 structure were observed between the two communes. One commune had mainly transversal 36 37 trades, i.e. between farms of equivalent sizes, whereas the other had pyramidal trades, i.e. from 38 larger to smaller farms. Companies and large familial farrow-to-finish farms were likely to act as major sources of disease spread through pig sales, demonstrating their importance for disease 39 40 control. Familial fattening farms with high pig purchases were at greater risk of disease 41 introduction and should be targeted for disease detection as part of a risk-based surveillance. In 42 contrast, many other familial farms were isolated or weakly connected to the swine trade network limiting their relevance for surveillance activities. However, some of these farms used 43 44 boar hiring for breeding, increasing the risk of disease spread. Most familial farms were slaughtering pigs at the farm or in small local slaughterhouses, making the surveillance at the 45 46 slaughterhouse inefficient. In terms of spatial distribution of the trades, the results suggested that Northern provinces were highly connected and showed some connection with Central and 47 48 Southern provinces. These results are useful to develop risk-based surveillance protocols for 49 disease detection in the swine familial sector, and to make recommendations for disease control. Keywords: network analysis, swine movements, infectious disease, disease surveillance, South-50

51 East Asia, Vietnam

52 Introduction

South-East Asia is considered as a hotspot for the emergence of zoonotic infectious diseases 53 54 mostly due to anthropogenic factors (Coker et al., 2011, Jones et al., 2008). Swine is a host, 55 mixing vessel or reservoir for many viral (e.g. Influenza, Japanese encephalitis, Nipah virus, Hepatitis E) and bacterial (e.g. Streptococcus suis) zoonoses which are major public health 56 concerns in South-East Asia (Smith et al., 2011, Jones et al., 2013). The 2009 H1N1 influenza 57 58 pandemic confirmed the importance of swine in the generation process of new influenza 59 reassortants from avian, human, and swine influenza viruses. It also stressed the need for having 60 an effective systematic surveillance of influenza viruses circulating in pigs at the global level (Vijaykrishna et al., 2011). The pig and poultry populations have at least doubled since 1990 in 61 many South-East Asian countries, including Vietnam (Coker et al., 2011). Vietnam is the 62 world's 13th most populous country with 88.8 million inhabitants (GSO, 2012), 4th largest pig 63 producer with 26.2 million heads, and 10th largest poultry producer with 315.0 million heads 64 (FAO, 2014). However, no sustainable surveillance program focusing on zoonotic diseases in 65 swine such as swine influenza viruses (SIV) has been implemented so far; only short term 66 67 research projects were carried out. Also, only a limited passive surveillance system is established for very contagious swine diseases such as Porcine Reproductive and Respiratory Syndrome 68 69 (PRRS).

The knowledge of the structure and the dynamic of the pig value chain is a pre-requisite 70 71 for understanding infectious disease transmission dynamics and for the development of cost effective surveillance systems. In Vietnam, the structure of the swine industry and its implication 72 for disease surveillance has not been extensively studied. There are three main different types of 73 farms: familial farms (hộ chăn nuôi), companies (Doanh Nghiệp) and state-owned farms (Trại 74 Nhà nước). Familial farms are held by households, and often characterized as small (Nông hộ), 75 medium (gia trai), or large farms (Trang trai); the actual size of each farm category may differ 76 across the locations. Company farms are very large farms with a different legal status and 77

78 ownership. They are owned by foreign or Vietnamese companies, and usually under the 79 management of several people; some companies own many farms. They also practice contract 80 farming (Gia công) by providing financial and technical support to farmers. These farms are 81 usually larger than the average familial farms. The company farms are mainly located around 82 Hanoi and Ho Chi Minh City. Finally state-owned farms are large farms which often keep exotic 83 breed great grandparents and grandparents. The familial small and medium holders (described as 1-100 fattening pigs or 5-20 sows) consisted of 84% of national pig herds in 2006, with a decline 84 in the number of smallholdings and an increase in the number of medium-size holdings since 85 86 1999 (Fisher and Gordon, 2008). Indeed, the government promotes intensification of pig production, and as the smallholdings are often less robust to disease outbreaks, many small 87 farmers stopped raising pigs, while other familial holdings converted to large scale pig 88 89 production. In most familial farms and in some companies, the biosecurity level is low, promoting interspecies transmission of diseases such as influenza, and within- and between-herd 90 91 transmission of swine diseases of economic importance, such as PRRS, Classical Swine Fever 92 (CSF), and Foot and Mouth Disease (FMD) (Kamakawa et al., 2006).

Commercial movements of live animals are known to be a major pathway for disease 93 transmission between domestic animal populations (Fevre et al., 2006). Therefore, a description 94 of the pig value chain and the analysis of the network of commercial movements of pigs between 95 farms would provide insights in the potential transmission dynamics of influenza and other swine 96 97 diseases between farms. Analysis of this network would provide essential elements for the development of targeted surveillance strategies. Indeed, network analysis has been applied in 98 99 preventive veterinary medicine since the early 2000s, and used to assess the influence of the 100 distribution of contacts between animal populations from different stages of the value chain – such as farms, markets or slaughterhouses - on the disease transmission dynamics (Martinez-101 102 Lopez et al., 2009b). The position of these premises in the network are assessed, allowing the identification of the premises at higher risk of becoming infected, or of transmitting infection 103

104 (Dube et al., 2011). In Vietnam, there is no record of live pig movements and only a limited 105 number of publications addressing this topic is available. Some studies described the pork value 106 chain in Vietnam focusing on the distribution of meat (Lapar et al., 2003, ILRI, 2014), and the 107 cross-border movements of live pigs and other livestock in South East Asia (Cocks et al., 2009). 108 To our knowledge, no study of the live pig trade network in Asian countries has been done, 109 while a few studies have been carried out in European countries and Canada since 2007 using commercial or governmental databases (Smith et al., 2013, Dorjee et al., 2013, Buttner et al., 110 2013, Rautureau et al., 2012, Noremark et al., 2011, Martinez-Lopez et al., 2009a, Bigras-Poulin 111 112 et al., 2007, Thakur et al., 2014). In contrast, network analysis on poultry movements in Vietnam (Fournie et al., 2013, Soares Magalhaes et al., 2010), China (Soares Magalhaes et al., 2012, 113 114 Martin et al., 2011), Cambodia (Van Kerkhove et al., 2009), and developing countries in other parts of the world such as Madagascar (Rasamoelina-Andriamanivo et al., 2014) were carried 115 out. These studies conducted in Asia have pointed out the role of live bird markets in the 116 117 dissemination of Highly Pathogenic Avian Influenza (HPAI) and provided useful insights for the surveillance and control of the disease in poultry. 118

The objective of the present study was to describe farming and trading practices in the 119 120 familial swine sector in the Red River Delta region (RRD) in Northern Vietnam. Farmers in two 121 communes in the RRD and traders involved in pig trades were interviewed. The geographical 122 scale and the structure of the networks of contacts between farms resulting from pig trade were 123 assessed. Hypotheses on the risk of disease transmission across the pig value chain were formulated for a comprehensive risk assessment that could be carried out in a separate future 124 125 study. The identification of at-risk trading behaviors of premises was useful in the design of risk-126 based surveillance protocols for the detection of infectious diseases such as swine influenza. 127

Material and methods

129 Study area

130 The study was implemented in Northern Vietnam in the RRD, where the capital city Hanoi is 131 located. The RRD alone includes about a quarter of the human, pig and poultry populations of the country in just 6.4% of its area (GSO, 2011b, GSO, 2011a, GSO, 2012). Hung Yen province 132 was selected based on the following criteria: high density of pigs, economic importance of the 133 pig production in the area, diversity of familial farming systems and trading practices. Following 134 the same criteria as above, the study area was then narrowed down to two communes, Dinh Du 135 (Com1) and Me So (Com2), within two adjacent districts, Van Lam (Dist1) and Van Giang 136 (Dist2) located in the North of the province. These communes had similar characteristics such as 137 138 the surface area (4.5 and 6.6 sq. km respectively), human population (7,100 and 9,600 inhabitants) (GSO, 2014), number of villages (four and six), and number of familial farms (158 139 140 and 141) (May 2012 data). These two communes were especially chosen as they differed in the ratio of the large familial farms over small-medium familial farms: Com2 had 3.5 times more 141 large farms and 1.4 times less small-medium farms compared to Com1. Indeed, the dynamic of 142 143 farming intensification was different in the two communes, and this may have an impact on trading networks. 144

145 Selection of farmers and data collection

146 Participatory interviews were carried out to collect preliminary data on the study areas, and inform the design of the questionnaires. Different pig categories were mentioned. Pigs for 147 slaughtering, later mentioned as slaughter pigs, included fattening pigs which were from five to 148 149 six months old, and incidentally cull pigs which were retired sows and boars. Weaners were about 2-month-old pigs that were fattened, and breeders included sows and boars for 150 reproduction. The familial farms were categorized into small farms including Nông hô (<100 151 152 fattening pigs per cycle and <10 sows) and large farms including Gia trai and Trang trai (≥ 100 fattening pigs per cycle or ≥ 10 sows). All the large farms were interviewed as their number was 153 154 limited in each commune, whereas all the small farms from only one selected village in each 155 commune were interviewed. Indeed, from the participatory interviews, it was estimated that the

156 farming and trading practices in each commune were homogeneous across the villages, and the 157 village with the highest number of small farms in each commune was selected.

158 Through questionnaire-based individual interviews, farmers were asked detailed 159 information on the structure of the farm, their breeding practices, and their purchases and sales of pigs from January 2011 to June 2012. Indeed, at least one year of trading period was chosen 160 161 because of the duration of fattening pig production (around six months) and to account for the potential seasonal increase in pig production due to the Tết holiday, the Vietnamese New Year, 162 occurring in January or February (during which consumption of meat increases). During the 163 164 interviews, free recall and free choice approaches were used to identify all the persons they had traded with during the specified period of time; no a-priori list of stakeholders was provided. 165 166 Farmers with a larger number of trades were more likely to forget some of them, and also trades of smaller sizes may have been omitted more frequently. This recall bias may have led to an 167 under-estimation of the number of trades and pigs, especially for large farmers with many trades. 168 169 The reports of trades between interviewed actors were checked for consistency later on.

170

Selection of traders and data collection

The interviewed farmers mentioned different pig buyers and sellers. Within a snow-ball 171 172 sampling approach, a sample of the actors involved in the trade of weaners and fattening pigs 173 (the most important trades in term of volume) was chosen for additional interview. This included 174 companies and traders such as traders owning or working in slaughterhouses, middlemen buying 175 and selling pigs directly between farmers, and middlemen buying pigs from farmers and selling them in the live pig market in Com1. For each category, the most mentioned actors with 176 177 sufficient contact information were selected in priority across Hung Yen, Hanoi and the 178 surrounding provinces. Traders were asked general and detailed information on their activity, including questions about the number of trades and pigs exchanged from January 2011 to June 179 180 2012. Contrary to farmers, traders could not provide a detailed list of their trades as there were 181 too many. Therefore, the total volume of trades and pigs traded over the study period were asked, and then matrix scorings (Jost et al., 2010), a participatory method using proportions, was used
to estimate the number of pigs traded and trades performed with each category of actor and
location for both purchases and sales. All farmers and traders interviews were performed

between June to September 2012.

186 Data processing

185

Data were entered in an access database and were cleaned and analyzed using R 3.1.1 (R, 2013). During farmers' interviews, potential inconsistencies between the answers provided to questions related to overall and specific trading activities were clarified. When important inconsistencies were noticed when cleaning the dataset, the paper form was checked, and if the error was not resolved, the interviewees were contacted again by phone for clarification.

192 **Data analysis**

193 *Farm typology*

A farm typology taking into account both the size and the type of production was carried out, as these characteristics were considered to influence farmers' trading practices. A principal component analysis followed by a hierarchical clustering was conducted. Five variables were included: number of sows and number of boars present at the time of the visit, average number of fattening pigs produced per year in the farm, and number of weaners purchased and sold from 2011 to June 2012. The farm classes resulting from the typology were then used in the rest of the analysis.

201 *Descriptive statistics*

First, we performed basic descriptive analyses of the farming and general trading practices. Then a detailed description of the trades from farmers and traders was performed for the different pig

204 production categories, i.e. slaughter pigs (fattenings and cull pigs), weaners and breeders.

205 Fattening and cull pigs were not moved from farms to farms, but to slaughterhouses; these

206 movements can be considered as dead ends for disease circulation. Greater focus was brought on

the movements of pigs between farms, directly or through middlemen, which involved weaners

208 and breeders. Cytoscape 3.2.0 was used to draw diagrams showing the movements of pigs 209 between the different categories of actors (Smoot et al., 2011). Trades were qualified as 210 transversal when performed between farms of equivalent sizes, and as pyramidal when 211 performed between farms of different size, e.g. from larger to smaller farms. For the graphs representing weaners and breeders trading from farmers in both communes, a bimodal approach 212 was used, i.e. sales and purchases were treated and represented separately. Loops were 213 eliminated by this process, and trades between interviewees were counted twice, once as sales 214 and once as purchases in order to clarify the direction of trades, i.e. transversal or pyramidal. 215 216 Analysis of egocentric networks

Commonly within an animal movement network, nodes represent individual premises part of the 217 value chain, and the links between two nodes represent animal movements. The links are called 218 arcs in a directed network where one of the node is the sender or seller and the other is the 219 receiver or buyer (Dube et al., 2011). Egocentric networks were built for each of the 137 farms 220 221 based on weaner and breeder trades using the R package igraph (Csardi and Nepusz, 2006). This analysis was chosen over the construction of one network in each commune involving all 222 interviewed and mentioned actors because about 90% of the trades were done with non-223 224 interviewed actors and the networks would have been incomplete.

225 Each egocentric network was composed by nodes representing an interviewed farmer and his trading partners, mentioned as large or small farmers, companies, middlemen, or market. The 226 227 market was considered as one node with a unique location, although many middlemen would 228 also be present in the market. Ideally a node should be defined by a premise where pigs would 229 stay at least a few hours like in slaughterhouses and markets, but some middlemen carried pigs 230 directly from farms to farms. However the farms of origin or destination were not known for middlemen trades, and therefore it was not possible to replace these middlemen by arcs to farm 231 232 nodes. The arcs represented the movements of weaners and/or breeders from nodes selling to 233 nodes buying the pigs. For each interviewed farmer, two egocentric networks were built with

arcs characterized by two different weights, being the number of trades and the number of pigs
traded from January 2011 to June 2012. Thus 274 egocentric networks were built.

236 For each interviewed farmer, different values of degrees were calculated. The in- and outdegrees were the number of actors selling pigs to and purchasing pigs from this farmer, 237 respectively. Similarly, the pig weighted in- and out-degrees were the total number of pigs a 238 239 farmer purchased and sold respectively. And finally, the trade weighted in- and out-degrees were the total number of trades a farmer performed for purchase and sale. Clustering coefficients 240 could not be calculated as most of the trades were done with non-interviewed actors and 241 242 therefore in the majority of the egocentric networks, the links between the actors mentioned by the farmer were missing. Based on these six values of degrees, a network typology was carried 243 out using the same methodology as for the farm typology. The correlation coefficients between 244 the different variables were calculated, and when they were above 0.8, one of the two variables 245 involved was excluded. As a result, the networks were grouped into different classes according 246 247 to their degree values. Finally a descriptive analysis of the networks and of these different classes was done in relation with the farm classes and other practices related to pig movements such as 248 boar hiring. 249

250 *Description of the geographical distribution of the trades*

First, the spatial distribution of the trades generated by farmers was compared at the province 251 level between Com1 and Com2. Then, middleman trades were analyzed to see if they were likely 252 253 to link different provinces through pig movements. Finally, the general movements of live pigs were described geographically for all pig categories based on farmers and traders interviews. A 254 255 map of all these trades across Vietnam was drawn using ArcGIS® 10.1; for this purpose the 256 trades mentioned by the farmers with the interviewed traders were deleted as it was considered that these trades were included in the traders' transactions. For the trades done with middlemen 257 258 and markets, the trader origins were taken into account as the locations of the farms of origin or destination were unknown. 259

260 **Results**

261 **Study sample**

A total of 158 farmers were listed by the village veterinarians including all the large farms in both communes and the small farms in both selected villages. However, some pig farmers were not listed, some farmers had stopped their activity by the time the study started, and some were not available or refused the interview. Finally, 137 farmers were interviewed, including nine large and 40 small farmers in Com1, and 41 large and 47 small farms in Com2.

About 100 companies and traders in 11 provinces were identifiable by their name, and 267 were mentioned in 350 trading occasions. In 58 occasions, the information given by the 268 interviewed farmer was not sufficient to identify the trading partner, 95% of these being 269 270 slaughterhouses. Finally, a total of 11 slaughterhouses, 22 middlemen, and two companies were 271 interviewed in five provinces, accounting for over 30% of all buyers and sellers mentioned and half of the trading occasions. The 22 interviewed middlemen included 17 middlemen exclusively 272 273 trading weaners, with nine of them operating in weaner markets, three middlemen exclusively trading fattening pigs, and two middlemen trading both weaners and fattenings. Only 10% of the 274 275 companies mentioned were interviewed accounting for about 20% of the trading occasions with companies. 276

277 General production and trading practices

Four classes of farms were obtained from the farm typology (Additional file 1 Figure 1). Three 278 279 classes represented a total of 41 large farms of different production types (farrow-to-finish and fattening), while the fourth class grouped 96 small farms without discriminating the production 280 type. The class containing the 96 small farms was then divided into two production types 281 282 equivalent to the production types obtained for the large farms. Thus, the 137 farmers were divided into five classes. A summary of the typology variables for each of the farm classes is 283 presented in Table 1. A total of 62.8% of the farms were specialized in a finishing activity, i.e. 284 fattening 2-month-old weaners until slaughtering, and were divided in two classes defined as 285

large fattening farms (LF) and small fattening farms (SF). The three other classes were farrow-286 287 to-finish farms of different sizes with very large farms (VB), large farms (LB), and small farms 288 (SB). Contrary to fattening farms, they didn't need to purchase weaners due to their breeding 289 practice. Among the LB farms, three had a farrowing activity only. Although they were all 290 familial farms, the VB farms had a very high number of pigs similar to some companies. Most of 291 the large farms (VB, LB, LF) were found in Com2, while in Com1 and Com2 a similar number of small farms were interviewed in each village (SB, SF). These results show that the familial 292 farms of different sizes have a specialized pig production which may influence their trading 293 294 behaviors.

A descriptive analysis of trading practices was performed for the different pig categories 295 in each commune (Table 2). Farmers in Com2 were trading more pigs (over 50,000 pigs traded) 296 compared to Com1 (about 8,000 pigs traded). This was especially true for weaners which were 297 mainly purchased by local farmers in Com1, whereas in Com2 weapers were both purchased and 298 299 sold in high quantities by the interviewees. Pig farming was the most important source of income for the majority of the interviewees, so they usually remembered the trades they had done within 300 the last 1.5 year. However, for the trades done between interviewees, involving breeders and 301 302 weaners, three quarters (37/49) of the links were only reported by one out of the two 303 interviewees involved in the exchange. The exchanges of larger numbers of pigs were usually 304 better remembered as compared to smaller volume of trades. No other differences were found 305 between the trades that were forgotten or remembered.

Trading practices for slaughter pigs

The analysis of the sales of slaughter pigs among the farmers showed important differences between the two communes (Figure 1). In Com1, farmers sold about three quarters of the pigs to traders slaughtering at the farm, while in Com2 a similar proportion of the pigs were sent to slaughterhouses. The farmers mentioned several categories of traders involved in fattening pig transactions. Two traders in collective slaughterhouses in Hanoi, nine local slaughterhouses and 312 five middlemen in Hung Yen and adjacent provinces were interviewed, and their trading 313 practices were described (Additional file 1 Table 1). In the collective slaughterhouses, several independent traders were slaughtering pigs from many farms every night, mainly companies and 314 315 large farms. In local slaughterhouses, pigs from only one or two farms were slaughtered per 316 night, mostly from familial farms. Some seasonal variations were observed with an increase of the number of pigs slaughtered for a few days during the Tết holiday. However this seasonal 317 effect for pig trade was not acknowledged by farmers or middlemen and was probably limited. 318 319 These practices will have a direct impact in term of disease surveillance. Collective 320 slaughterhouses seem the most suitable for sampling pigs from a high number of farms. On the opposite side, pigs slaughtered at the farm will not be easily accessible for sampling. 321

322 Trading practices for weaners and breeders

323 The distribution of the trades for weaners and breeders according to the trading partner activities were represented in Figure 2 for each pig category in each commune. In the two communes, 324 325 mostly fattening farms were responsible for the purchases of weaners. These pigs were mainly purchased indirectly through middlemen and the market (61.7%) by the small fattening farms in 326 Com1, and directly from other farmers (86.6%) by the large and small fattening farms in Com2. 327 Farrow-to-finish farms in Com1 were selling only a few hundreds of weaners, while the one in 328 329 Com2 were responsible for the sale of above 16,000 weaners. Overall, the large farms in Com1 330 were almost completely inactive in term of weaner trades, while the three VB farms in Com2 331 accounted for 61.4% of weaners sales in that commune.

The trades were qualified as pyramidal when the pigs were going from farms of larger sizes (companies, large farms) to farms of smaller sizes (large farms, small farms), and transversal when the pigs were exchanged between farms of same size. In Com1 the interviewed middlemen (n=10) mentioned trading with many actors (Figure 3a), while the traders interviewed in the market (n=9) reported purchasing weaners mainly from small farmers (Figure 3b). Therefore, in Com1, the trades appeared to be mainly transversal between small farms,

directly or through the market. In Com2, an important part of the trades were clearly pyramidal
for both purchases (60.6%) and sales (50.1%). The companies interviewed reported selling
64.6% of their weaner production to familial farmers, confirming the strong pyramidal structure.

Regarding the breeder trades, only a few hundreds were purchased and only a few dozens were sold altogether. In both communes, most of these trades were done directly between farms. The breeders were mainly purchased from companies, including breeding companies, and in general the purchases were almost exclusively pyramidal trades. The sales were done only locally in the same commune between familial farms.

346 Analysis of egocentric networks

Ninety-eight egocentric networks in Com1 and 176 in Com2 were built from the interviewed farmers; they were describing the trades of weaners and breeders between actors. An additional 67 actors in Com1 and 139 actors in Com2 were mentioned by the farmers and composed the networks, accounting for a total of 97 and 261 arcs respectively. The network sizes, i.e. the number of nodes, varied from one to 13 in Com1 and one to 22 in Com2 with a median of 3.0 and 3.5 respectively. VB and LB farms in Com2 had larger networks compared to other farms in Com1 and Com2, confirming the higher trading dynamism of these farm classes in Com2.

354 For the network typology, five variables were kept after exclusion of the trade weighted out-degree variable because of its high correlation coefficient with the pig weighted out-degree 355 356 (0.97) and the out-degree variables (0.82). Four classes were identified (Additional file 1 Figure 357 2), and a summary of all the variables is available in Table 3. The first group was designated as 358 isolated farms as they had null to low in-degree measures with null to medium out-degrees, i.e. 359 they had limited trading interactions with other farms. The farms named as primary and 360 secondary sinks had null to low out-degrees and respectively high and medium in-degrees, therefore they were receiving pigs but not redistributing. Finally, farms with high out-degrees 361 362 were classified as sources, as they were at the origin of many sales; they also had medium in-363 degrees making them act as mediators for the movements of pigs, comparatively to the other

farm classes. The companies were not included in the typology as a focus was done on familial farms. However, they could also be considered as sources for the familial farms. The sources were VB and LB farms in Com2, while these same farm classes in Com1 were either sinks or isolated farms (Table 4). LF farms and about half of SF farms were primary sinks due to their important finishing activity. The remaining SF farms were mostly secondary sinks, i.e. with less important purchases. Most SB farms were isolated as they had limited trades, probably due to their small size and self-sufficiency in term of weaner supply with reproduction on the farm.

Boar hiring and its impact on the swine movement networks

372 Boar hiring was also mentioned as pig movements other than trades. About half of the farms with sows (42 farmers) reported hiring boar from other familial farmers. This practice was the 373 374 most common in small farms, and in Com1 where about 90% of farms with sows hired boars compared to about 50% in Com2 (Additional file 1 Table 2). The network classes affected were 375 the isolated farms and primary and secondary sinks. The degree variables for the farms hiring 376 377 boars, originally based only on sales and purchases, were recalculated including and excluding the boar movements, to assess the impact of this practice on the classification of the farms 378 (Additional file 1 Table 3). In general, the number of pigs did not increase dramatically as only 379 380 one boar was exchanged at a time, while the frequency of exchanges or trades increased 381 consequently, connecting many originally isolated farms with others.

382 Spatial analysis of swine movements

Differences were observed in the spatial distribution of the farmer trades between sales and purchases, between communes, and between pig categories (Additional file 1 Figure 3). In general, farmers in Com2 were trading with actors from multiple different provinces (4 to 7 provinces) compared to Com1 (2 to 4 provinces). The largest proportion of pigs was traded with Hung Yen for slaughter pigs (87.0% and 56.5% for sales) and weaners (93.2% and 94.6% for sales, 75.2% and 36.2% for purchases) for Com1 and Com2. Most of the slaughter pigs trades involved a limited number of provinces all located around Hung Yen. Weaners were traded

between more provinces in the RRD and North Vietnam. Breeder trades involved the highest
number of provinces, including provinces from Southern Vietnam, probably due to the high
genetic quality of the breed offered in that region. Breeders were purchased in majority from
Hanoi (51.2% in Com1 and 67.0% in Com2).

Thirteen provinces in the RRD and the North were mentioned by the traders for weaner trades and 13 provinces in the RRD, the North and the South for fattening trades (Additional file 1 Figure 4&5). However, most of the traders were trading pigs within the RRD, and especially Hung Yen and the three adjacent provinces. Among weaners and fattening middlemen, three mentioned buying and selling in only one province (Hung Yen), while for 19 middlemen, the provinces used for purchases were not all the same than those mentioned for sales. This demonstrated that they were involved in pig movements between different provinces.

Overall, the trades generated by all interviewed traders and farmers for all pig categories
involved the movement of a total of about 900,000 pigs across 22 provinces including Hung Yen
over the 1.5 year study period (Figure 4). They were distributed all over Vietnam, with a focus
on the North, and especially the RRD. Trades including the South were related to breeder
purchases.

406

407 **Discussion**

This study provided a detailed descriptive analysis of the farming systems and live pig 408 409 movements in two communes of the RRD in Northern Vietnam. The farm typology and the analysis of the farm networks provided important information for the identification of trading 410 behaviors at risk for contagious disease spread, and for the development of targeted surveillance 411 strategies. Cost-effective surveillance protocols are needed which allow the monitoring of 412 diseases at a reasonable and therefore sustainable cost. Risk-based surveillance is the best 413 approach and may have different goals (Cameron, 2012). Disease detection is a common goal for 414 example for virus characterization, in the case of SIV in order to study the zoonotic potential of 415

416 the viruses or for PRRS to develop vaccines matching the circulating strains. Another goal is to 417 demonstrate freedom from disease; this is more often used in developed countries for trading purposes, while in Vietnam most of the major swine diseases are endemic. Finally, early 418 419 detection of a disease is often sought in order to contain its spread by implementing different 420 control measures (e.g. trade restrictions), for example in the case of a PRRS outbreak. Disease 421 mitigation can also be done by implementing preventive measures such as the increase of the general biosecurity level. Due to limited resources, farming systems at high risk of disease 422 spread to an important number of other farms need to be targeted in priority. The design of risk-423 424 based surveillance protocols and control measures require the identification of farm categories 425 with a higher risk of disease introduction and maintenance on one hand and disease spread on the 426 other hand, and the identification of suitable focal points for targeted sampling is also valuable.

427 Although the study sample was limited as it was designed to be exhaustive at the local level, our data analysis showed an important diversity of practices among familial farms. 428 429 Moreover, as the study province is one of the most dynamic in terms of pig production in the RRD, it could be considered that most of the different trading behaviors found in this region 430 were also found and documented in the study area. The study provided insights in the dynamic 431 432 of local pig production and trades. However, as the study focused on familial farms, the company 433 sector was not thoroughly investigated and additional studies should focus on this sector to fully 434 apprehend its role in terms of pig movements and risk in disease spread between sectors. It was 435 pointed out that trades were sometimes forgotten by farmers, especially when small, therefore 436 the swine commercial exchanges may have been under-estimated. In addition, because of the 437 lack of detailed contact information in some instances, it was not possible to interview all of the 438 trading partners mentioned by the interviewees and to perform an analysis of the complete trading network. Therefore in future studies, we recommend that movement network analysis be 439 440 carried out by asking farmers and traders to keep written records of all sales and purchases. In 441 the current study, only traders near Hung Yen and Hanoi were interviewed, as most of the traders

442 mentioned were located in that area. The geographical extent of the trades may therefore have 443 been underestimated, however many provinces were mentioned suggesting that provinces in Northern Vietnam are highly connected through the pig trade. Since traders were not able to 444 445 provide the exact number of pigs traded by actor category and location, only general trends were investigated using matrix scoring. This method does not provide precise numbers but it provides 446 reasonable estimates particularly of the relative proportions for the volume of pigs by actor and 447 location. This analysis allowed a reasonable description of the farming systems, of their trading 448 practices, and allowed farm classification according to the direction and volume of pig 449 450 movements which could be interpreted in term of risk of disease introduction and spread. The 451 risk of disease introduction and spread in low biosecurity settings such as Vietnam familial 452 farming is likely to be linked to trading behaviors and the corresponding animal and human 453 movements.

Indeed our typology of the familial farms performed within this study allowed going 454 beyond the simple distinction between small and large farms. Our results showed that farms had 455 a very specialized pig production, as in industrialized countries, with farrow-to-finish and 456 fattening farms of different sizes (Table 1). However, very few farms had an exclusive farrow-to-457 458 grower activity, and no farms had a nursery activity (pigs from three to 10 weeks of age) as it is described in western countries (Noremark et al., 2011, Dorjee et al., 2013, Rautureau et al., 459 460 2012). On the overall farmers in Com1 had less dynamic trading practices as compared to those 461 in Com2 (Table 2), where a higher level of intensification of the familial pig production was observed (with a higher number of large and very large farms). The trading practices were very 462 463 different between the two communes and the different types of production. The structure of the 464 trades differed between Com1 with mostly transversal trades (between farms of same size), and Com2 with mainly pyramidal trades (between farms of different size) (Figure 2). Moreover, the 465 466 pyramidal structure of the pig production had a double sense here, with pig movements going 467 from larger to smaller farms, but also from farms with a farrowing activity to fattening farms.

468 This type of trade structure is found in industrialized countries as well as described in the network analysis studies cited previously. Due to these trade structures, transmission of diseases 469 470 through live pig movements is more likely to occur between farms of similar size through 471 transversal trades and from larger farms toward smaller farms through pyramidal trades. In the absence of appropriate biosecurity measures, the companies could play an important role as 472 473 sources of disease spread to the familial sector through the sales of breeders and weaners. Specific types of production also had specific trading practices and thus different risk of disease 474 spread. In terms of disease transmission risk through trade, sources are generally considered at 475 476 high risk of disease spread to other farms, and sinks have a high risk of receiving the disease. Here, the farms defined as sinks were fattening farms with important purchases of weaners; they 477 478 are potentially at higher risk of disease introduction due to pig movements, but probably have a lower chance of spreading the disease through trade due to their limited number of sales to other 479 farmers, as pigs are mainly sent to slaughterhouse (Tables 3&4). The source farms, which were 480 481 large farrow-to-finish farms with moderate purchases (replacement of breeders) and important 482 sales to other farmers (mainly weaners and some breeders), would have a non-negligible risk of disease introduction, and a high risk of spreading the disease to other herds. On the opposite, the 483 484 small farrow-to-finish farms in both commune and the large ones in Com1 were considered as 485 isolated farms and would therefore play a limited role in disease transmission risk through pig trading networks. No farms showed both high in- and out-degrees, and therefore they are not at 486 487 high risk of disease introduction and spread (act as a hub), as it was described for nursery farms 488 in a study in Canada (Dorjee et al., 2013).

Therefore, one could consider that farms in Com1 would be less at risk for disease spread, having a more limited number of trades. However, other at-risk practices, also shared with some farms in Com2, were identified through the study. Firstly, middlemen and market were more frequently involved in Com 1 swine purchase activities which increase their risk of disease introduction (Figures 1&2). Indeed, middlemen often kept traded pigs in their house

494 where they also sometimes raise pigs. In the market pigs would stay for a few hours next to other 495 pigs with different origins, sometimes being transported back and forth to the trader's house and 496 potentially to other markets if unsold. The risk of transmission by fomites and people during 497 these trades could also be important. Farmers in Com2 preferred buying pigs directly from other 498 farmers so they could check the health status of the herd. Secondly, in Com1, more farmers were 499 hiring boars for reproduction, being more popular among small farmers in general (Additional file 1 Figures 4&5). This practice may increase the role in disease transmission of farms 500 considered as isolated regarding the other types of trades, through boar infection or fomite 501 502 contamination.

The spatial distribution of the trades observed in this study highlighted the geographic 503 504 extent of the pig movements, although most of pigs were usually traded within the RRD region (Figure 4). Overall, over 20 provinces in all Vietnam, i.e. about a third of the provinces in the 505 country, were mentioned for trades described in this study which involved 173 actors 506 507 interviewed in a limited geographical area. Based on these data, swine diseases are likely to spread easily and quickly within the RRD and Northern Vietnam as controls and health 508 certificates requirements are not well regulated and because of the occurrence of asymptomatic 509 510 diseases such as swine influenza.

511 According to the study results, fattening farms with high numbers of pigs purchased (i.e. sink farms) should be targeted in the design of a risk-based surveillance for disease detection and 512 513 virus isolation for genetic characterization. Indeed targeting these farms would increase the 514 sensitivity of surveillance compared with a randomized sample including all farms. This is probably true for fattening companies with low biosecurity as well. The large farrow-to-finish 515 516 farms buying breeders and selling weaners seemed the most at risk for disease spread. They should be targeted along with companies for implementing disease prevention and control 517 518 measures because of their high potential to spread diseases to other farms. This could be done by 519 improving the general biosecurity level of these farms, and also by the early detection of diseases

in these swine herds before it spreads down to the chain. Since these farms are large and with 520 521 constant renewal of the susceptible pig population, disease persistence might be high; they could 522 also be considered in a risk-based surveillance design for disease detection, together with the 523 fattening farms. Studying the disease transmission dynamics within these farms may be of interest to support the decision to include them in risk-based surveillance protocols. Similarly, 524 525 larger fattening farms may show a higher persistence of viruses and may be more of interest compared to smaller farms. Developing risk-based surveillance protocols in areas like Com1 526 may be more difficult as no farms with high risk were identified, and few large farms were 527 528 present. Although other risky behaviors were more frequent in this commune like boar hiring, the chances of isolating viruses might be low as the window of infection in such small pig herd 529 530 would be short, and therefore the surveillance program might not be cost effective.

531 Finally, this study also allowed the identification and description of focal points that 532 concentrate pigs from many farms. Sampling in these places would require fewer resources and 533 would be more effective than sampling in individual farms. Local slaughterhouses were not considered as an efficient location for risk-based surveillance as they usually hosted pigs from 534 only a few farms in a given day (Additional file 1 Table 1). On the contrary, collective 535 slaughterhouses represented a very promising candidate for risk-based surveillance design for 536 537 disease detection because pigs slaughtered in a same night had come from many farms and many provinces. Pigs were usually transported from Northern provinces within the same day, and held 538 539 at the slaughterhouse for a few hours up to 36 hours before slaughter. Pigs from several farms were often mixed in the same pens and this may facilitate cross infection of non-immune animals 540 541 and amplification of virus within this setting. Pigs in collective slaughterhouses came mostly 542 from companies and secondarily from large familial farms. The other type of focal point identified was the weaner market. As the pigs present originated mostly from small familial 543 544 farms in the RRD, this location was considered as interesting to cover this farming sector. 545 However, this type of markets was not frequent in the region and only three were identified with

a geographic coverage much smaller compared to collective slaughterhouses. It was reported that 546 547 sick pigs were often sold for slaughter, but in the case of the market, it would be likely that middlemen would sell only healthy-looking pigs to farmers, although some diseases like 548 549 influenza may be asymptomatic. The age of the pigs sampled would also have an impact, with weaners being young pigs which might still be partially protected by maternal antibodies and 550 551 fattening pigs being older pigs that may have been infected earlier in life and not be shedding virus at the time of slaughter. In the example of swine influenza viruses, to date virus isolation in 552 Vietnam has only been reported in the company or industrial sector (Ngo et al., 2012), although 553 554 there is serological evidence for influenza circulation in the familial sector (Trevennec et al., 2012). This study highlighted the challenges brought by the structure of the pig value chain 555 which would explain this low detection rate of swine influenza in the familial sector and provide 556 new information on how to overcome such challenges for cost-effective surveillance design of 557 infectious diseases in swine. 558

559 Conclusion

This study has provided empirical data on the organization of the pig value chain in Hung Yen province in the RRD. Indeed, the analysis of animal movements represents a challenge in developing countries where systematic record keeping is not well established. This study allowed us to formulate hypotheses on disease transmission between farming systems and geographic locations, providing critical information for the design of risk-based surveillance protocols. Pilot trials of these protocols are currently ongoing to identify the most cost-effective protocols for swine influenza surveillance in Vietnam.

567

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688

690 Table 1 Median (Min-Max) of the different variables for the different classes of swine

691 farms identified

| Class | Sows | Boars | Weaners sold | Weaners purchased | Fattenings per year | No of farms (Com1;Com2) |
|-------|--------------|---------|---------------|----------------------|------------------------|----------------------------|
| VB | 185 (70-250) | 5 (3-6) | 1460 (0-6980) | 0 (0-0) | 1520 (600-2100) | 4 (1 ; 3) |
| LB | 26 (10-70) | 1 (0-5) | 112 (0-1320) | 0 (0-0) | 248 (0-700) | 22 (5 ; 17) |
| SB | 4 (1-12) | 0 (0-0) | 8 (0-61) | 0 (0-34) | 64 (20-160) | 25 (12 ; 13) |
| LF | 0 (0-4) | 0 (0-0) | 0 (0-0) | 500 (280-970) | 300 (140-900) | 15 (0 ; 15) |
| SF | 0 (0-13) | 0 (0-0) | 0 (0-0) | 80 (10-253) | 60 (15-300) | 71 (31 ; 40) |

692 VB= Very large farrow to finish farms, LB = Large farrow to finish farms, SB = Small farrow to finish farms, LF =
 693 Large fattening farms, SF = Small fattening farms.

694

695

Table 2 General trade description per pig category in both communes over a 1.5 year period

| ciiou | | | | | | |
|------------------------------------|-------|------------------|-------|------------------|----------|------------------|
| | Slau | ghter pigs | W | eaners | Breeders | |
| Type of trades in the two communes | Pigs | Trades (p/t) | Pigs | Trades (p/t) | Pigs | Trades (p/t) |
| Total No in Com1 | 6086 | 363 (12) | 1886 | 153 (12) | 86 | 16 (5) |
| Purchases (%) | 0 | 0 | 81.4 | 82.3 | 96.5 | 87.5 |
| Sales (%) | 100 | 100 | 13.1 | 11.8 | 0 | 0 |
| Trades between interviewees (%) | 0 | 0 | 5.5 | 5.9 | 3.5 | 12.5 |
| Total No in Com2 | 24243 | 1050 (26) | 26724 | 576 (40) | 597 | 62 (8) |
| Purchases (%) | 0 | 0 | 39.6 | 33.2 | 93.5 | 87.1 |
| Sales (%) | 98.6 | 98.4 | 53.0 | 55.0 | 0 | 0 |
| Trades between interviewees (%) | 1.4 | 1.6 | 7.4 | 11.8 | 6.5 | 12.9 |
| Com2/Com1 | 4.0 | 2.9 (2.2) | 14.2 | 3.8 (3.3) | 6.9 | 3.9 (1.6) |
| Com2/Com1 adj. (*) | 2.2 | 1.6 | 7.9 | 2.1 | 3.9 | 2.2 |

^{698 (}p/t) Average number of pigs per trade; (*) Ratios adjusted by the number of farms in each commune.

700

701 Table 3 Median (Min-Max) of the different variables for the network classes identified

| Class | Out- degree | Trade weighted out-degree | Pig weighted out-degree | In- degree | Trade weighted in-degree | Pig weighted in- degree | Total no of farms |
|-----------------|----------------|---------------------------------|----------------------------|---------------|--------------------------------|-------------------------------|----------------------|
| Isolated farms | 0 (0-4) | 0 (0-5) | 0 (0-239) | 1 (0-1) | 1 (0-2) | 1 (0-40) | 34 |
| Primary sinks | 0 (0-1) | 0 (0-1) | 0 (0-1) | 3 (1-12) | 5 (3-16) | 176 (30-970) | 48 |
| Secondary sinks | 0 (0-2) | 0 (0-4) | 0 (0-85) | 2 (1-2) | 3 (1-7) | 50 (2-220) | 42 |
| Sources | 6 (4-19) | 18 (5-126) | 690 (100-6980) | 2 (1-3) | 2 (1-5) | 20 (3-117) | 13 |

702 Degree measures were based on trades of weaners and breeders only.

⁶⁹⁹

Table 4 Proportions of farm classes pertaining to the network classes

| Class | VB | LB | SB | LF | SF |
|-------------------|--------------|---------------|--------------|--------------|----------------|
| Isolated farms | - | 31.8 (3 ; 4) | 84.0 (12;9) | - | 8.4 (4 ; 2) |
| Primary sinks | - | - | - | 100 (0 ; 15) | 46.5 (12;21) |
| Secondary sinks | 50.0 (1;1) | 18.2 (2 ; 2) | 16.0 (0 ; 4) | - | 45.1 (15 ; 17) |
| Sources | 50.0 (0 ; 2) | 50.0 (0 ; 11) | - | - | - |
| Total no of farms | 4 | 22 | 25 | 15 | 71 |

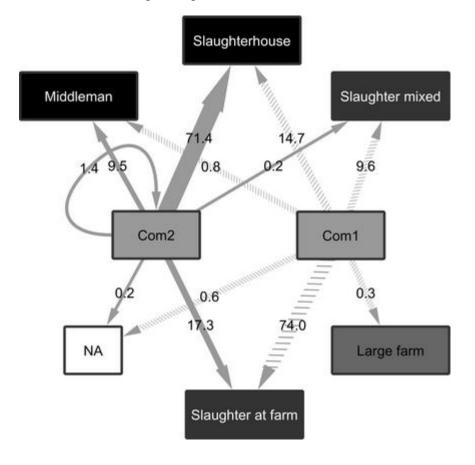
Percentage and number of farms in commune 1 and in commune 2: "Percentage (No in Com1; No in Com2)"

706

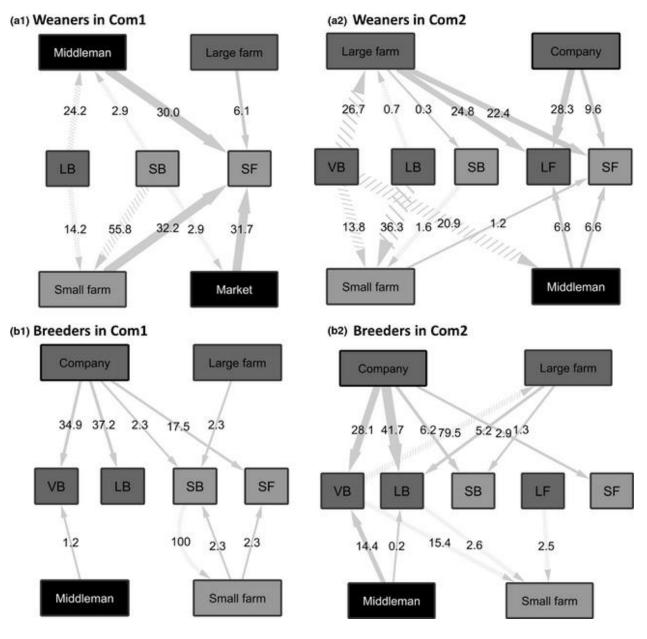
707 Figure 1 Trade distribution for slaughter pigs across actor categories in each commune

Percentages of pigs traded (n_{Com1} =6086, n_{Com2} =24243); NA = buyer activity unknown, Slaughter

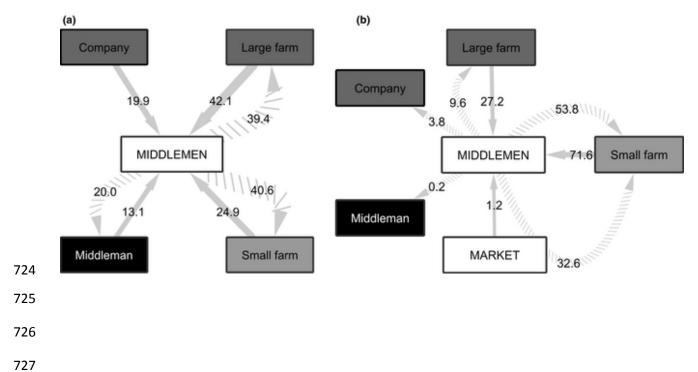
709 mixed = traders with different slaughtering activities.



- 712 Figure 2 Trade distribution for weaners and breeders between actor categories in each
- 713 commune
- Percentages of purchased weaners (n_{Com1} =1640, n_{Com2} =12563) and breeders (n_{Com1} =86 pigs,
- $n_{\text{Com2}}=597$) from the different actor categories and sold weaners ($n_{\text{Com1}}=351$, $n_{\text{Com2}}=16131$) and
- breeders ($n_{Com1}=3$, $n_{Com2}=39$) to the different actor categories; trades between interviewees are
- counted twice as sales and purchases separately. Arrow widths are proportional to the number of
- 718 pigs traded.



- 720 Figure 3 Distribution of weaner trades generated by interviewed middlemen (a) and
- 721 market traders (b)
- Percentages of weaners purchased and resold by independent middlemen (n_{middlemen}=202864
- pigs) and middlemen from the market in Com1 (n_{market} =40870 pigs).



- 728 Figure 4 Spatial distribution of the pig movements generated by interviewed farmers and
- 729 traders
- 730 The number of pigs purchased in and sold to a province is represented on the overall map of
- 731 Vietnam, and in a zoom of the RRD. The number of pigs exchanged within the same province is
- shown in a second zoom of the five provinces in the RRD where internal trades were mentioned.

