1 Editor summary:

By analyzing the genome of over 9000 pig-associated isolates, this study shows that modernized agricultural systems have favored the acquisition of antimicrobial resistance genes, population expansion and global transmission of pig-enriched Salmonella over the past century.

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#### 8 **Peer Review Information:**

*Nature Food* thanks Séamus Fanning, Nabil-Fareed Alikhan and the other, anonymous, reviewer(s) for their contribution to the peer
 review of this work.

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#### 13 **1. Extended Data**

Figure or Table #	Figure/Table	Filename	Figure/Table Legend
Please group Extended Data items by type, in sequential order. Total number of items (Figs. + Tables) must not exceed 10.	title One sentence only	Whole original file name including extension. i.e.: Smith_ED_Fig1.jpg	If you are citing a reference for the first time in these legends, please include all new references in the main text Methods References section, and carry on the numbering from the main References section of the paper. If your paper does not have a Methods section, include all new references at the end of the main Reference list.
Extended Data Fig. 1	Circular presentation of the maximum- likelihood phylogeny in Figure 1A.	Extended_Data_Fig_1 .eps	Outer rings: The clade, source, and geographic origin of each strain. Colored arcs underneath the tree show the cluster assignments as in the Key.
Extended Data Fig. 2	Evaluation of the presence of temporal signal in <i>S. enterica</i> serovar Choleraesuis.	Extended_Data_Fig_2 .eps	The analysis was performed on 587 genomes. (A) Linear regression between root-to-tip distances of strains and the sampling years with a coefficient of determination (R <sup>2</sup> ) of 0.67. (B) Substantially lower R <sup>2</sup> values were obtained for ten date-randomisation datasets. (C) The average (dots) and standard deviation (error bars) of the substitution rates for actual data

			(black) and ten date-randomization datasets (red), estimated by BactDating.
Extended Data Fig. 3	Assessing the existence of temporal signal randomization test in pig-enriched ceBGs	Extended_Data_Fig_3 .eps	(A) Coefficients of determination (R <sup>2</sup> ) for the ten date- randomisation tests were obtained by linear regression between root-to-tip distances of strains and the sampling years in pig- enriched ceBGs. (B) The average (dots) and standard deviations (error bars) of the substitution rates for actual data (black) and ten date-randomization datasets (red) by BactDating. Pig-enriched ceBGs including ceBG3 (n=3136), ceBG10 (n=622), ceBG17 (n=155), ceBG35 (n=516), ceBG37 (n=1012), ceBG40 (n=176), ceBG459 (n=1441), ceBG621 (n=787), ceBG1272 (n=586). The ancient sample was not included in ceBG1272 in both (A) and (B).
Extended Data Fig. 4	The geographic states of the ancestral nodes in the Choleraesuis population after downsamplings.	Extended_Data_Fig_4 .eps	<ul> <li>(A) Downsampling tests of up to ten strains per country/region.</li> <li>(B) Downsampling tests of up to five strains per country/region.</li> <li>Both: the geographic states were predicted using TreeTime. Each test was run in 100 parallels. The pie charts illustrate the proportions of the best-supported geographic states in the 100 parallels for the corresponding ancestral nodes.</li> </ul>
Extended Data Fig. 5	Reconstructed ancestral host associations for all nodes in nine pig- enriched ceBGs	Extended_Data_Fig_5 .eps	The corresponding ceBGs for each panel are: (A) ceBG3 (Derby), (B) ceBG1272 (Choleraesuis), (C) ceBG17 (Chailey), (D) ceBG35 (Worthington), (E) ceBG37 (London), (F) ceBG40 (Cerro), (G) ceBG459 (Johannesburg), (H) ceBG621 (Ohio), (I) ceBG10 (Adelaide). The mean values of effective population sizes with time were also shown for (A) and (B), with 95% confidence intervals in grey shapes. The orange and grey boxes show the periods of population expansion (A, B) or the periods of host transfers into pigs (C-I).
Extended Data Fig. 6	The host transmission frequency of nine pig- enriched ceBGs.	Extended_Data_Fig_6 .eps	The corresponding ceBGs for each panel are: (A) ceBG10 (Adelaide), (B) ceBG1272 (Choleraesuis), (C) ceBG17 (Chailey), (D) ceBG3 (Derby), (E) ceBG35 (Worthington), (F) ceBG37 (London), (G) ceBG 40 (Cerro), (H) ceBG 459 (Johannesburg),

			(I) ceBG 621 (Ohio). Different arrows represent the direction of host transmission, with darker colors indicating higher transfer frequency. "*" marks the most contributing host sources for the transmissions.
Extended Data Fig. 7	A 5 X 5 table showing the summarised international transmission events of all nine pig-enriched ceBGs in <i>Salmonella</i> in the past 50 years.	Extended_Data_Fig_7 .eps	The maximum-likelihood phylogeny was reconstructed based on SNPs in the core genome of each ceBG and the date of origin was estimated using BactDating. TreeTime was applied to reconstruct the country sources for all nodes in the tree. A transmission was recorded when the ancestral node and descending node of a branch were different. All transmissions were then summarized and grouped based on their associated continents.
Extended Data Fig. 8	Pearson's correlations analysis of sub- classification for pig- related products.	Extended_Data_Fig_8 .eps	The Sub classifications involved include (A) Pork offal, frozen (021011); (B) Pork, frozen (020649); (C) Pork, frozen cut (020329); (D) Pork, preserved (020322); (E) Pork offal, fresh (020630); (F) Pig fat (020910); (G) Pork, fresh cuted (020912); (H) Pork, fresh (020319); (I) Pig carcasses (020310); (J) Pig, live breeding (010391); (K) Pig, live, less 50kg (010392); (L) Pig, live, over 50kg (020311). The codes in parentheses represent the Harmonized System Codes of the products. Analyzing the correlation between the intercontinental dissemination of each pig-related commodity and the intercontinental transmission of pig-enriched ceBGs. R: Pearson's correlation coefficient.

# **1. Supplementary Information:**

### 16 A. PDF Files

Item	Present?	Filename	A brief, numerical description of file
		Whole original file name including extension. i.e.: Smith_SI.pdf. The extension must be .pdf	contents. i.e.: Supplementary Figures 1-4, Supplementary Discussion, and Supplementary Tables 1-4.

Supplementary Information	Yes	Supplementary_Info rmation.pdf	Supplementary Tables 1-4.
Reporting Summary	Yes	6823_1_attach_25_3 0962.pdf	

## **B. Additional Supplementary Files**

Туре	Number Each type of file (Table, Video, etc.) should be numbered from 1 onwards. Multiple files of the same type should be listed in sequence, i.e.: Supplementary Video 1, Supplementary Video 2, etc.	Filename Whole original file name including extension. i.e.: <i>Smith_</i> <i>Supplementary_Video_1.mov</i>	Legend or Descriptive Caption Describe the contents of the file
Supplementary Table	Additional Supplementary Files Table 1	Additional_Supplementary_ Files.xlsx	In the manuscript and Additional Supplementary Files Table 1
Supplementary Table	Additional Supplementary Files Table 2	Additional_Supplementary_ Files.xlsx	In the manuscript and Additional Supplementary Files Table 2

**3. Source Data** 

Parent Figure or	Filename	Data description
Table	Whole original file name including extension. i.e.: Smith_SourceData_Fig1.xls, or Smith_ Unmodified_Gels_Fig1.pdf	i.e.: Unprocessed western Blots and/or gels, Statistical Source Data, etc.
Source Data Fig. 1	SourceData_Figure_1.xlsx	Statistical Source Data
Source Data Fig. 2	SourceData_Figure_2.xlsx; SourceData_Figure_2D_and_2F.t xt; SourceData_Figure_2F.txt	Statistical Source Data
Source Data Fig. 3	SourceData_Figure_3A_and_Exte ndedData_Figure_5.zip; SourceData_Figure3_and_Extend edData_Figure6.xlsx	Statistical Source Data
Source Data Fig. 4	SourceData_Figure4BC_and_Exte ndedData_Fig7.xlsx; SourceData_Figure4A_and_4DEFG _ExtendedData_Figure_8.xlsx	Statistical Source Data
Source Data Extended Data Fig./Table 1	SourceData_ExtendedData_Figur e1.txt	Statistical Source Data
Source Data Extended Data Fig./Table 2	SourceData_ExtendedData_Figur e2_and_Figure4.xlsx	Statistical Source Data

Source Data	SourceData_ExtendedData_Figur	Statistical Source Data
Extended Data	e3.x1sx	
Fig./Table 3		
Source Data	SourceData_ExtendedData_Figur	Statistical Source Data
Extended Data	e2_and_Figure4.xlsx	
Fig./Table 4		
Source Data	SourceData_Figure3A_and_Exten	Statistical Source Data
Extended Data	dedData_Figure5.zip	
Fig./Table 5		
Source Data	SourceData_Figure3_and_Extend	Statistical Source Data
Extended Data	edData_Figure6.xlsx	
Fig./Table 6		
Source Data	SourceData_Figure4BC_and_Exte	Statistical Source Data
Extended Data	ndedData_Figure7.xlsx	
Fig./Table 7		
Source Data	SourceData_Figure4A_4DEFG_and	Statistical Source Data
Extended Data	_ExtendedData_Figure8.xlsx	
Fig./Table 8		

# Centralized industrialization of pork in Europe and America contributes to the global spread of *Salmonella enterica*

27 Heng Li<sup>1,2</sup>, Yilei Wu<sup>1,3</sup>, Dan Feng<sup>1,2</sup>, Quangui Jiang<sup>1,2</sup>, Shengkai Li<sup>1</sup>, Jie Rong<sup>1</sup>, Ling Zhong

- <sup>1</sup>, Ulrich Methner <sup>4</sup>, Laura Baxter <sup>5</sup>, Sascha Ott <sup>6</sup>, Daniel Falush<sup>7</sup>, Zhenpeng Li<sup>8</sup>, Xiangyu Deng<sup>9</sup>,
- 29 Xin Lu<sup>8</sup>, Yi Ren<sup>10</sup>, Biao Kan<sup>8</sup>, Zhemin Zhou<sup>1,2,8\*</sup>

#### 30 Affiliations

- <sup>31</sup> Key Laboratory of Alkene-carbon Fibres-based Technology & Application for Detection of
- 32 Major Infectious Diseases, MOE Key Laboratory of Geriatric Diseases and Immunology,
- 33 Pasteurien College, Suzhou Medical College, Soochow University, Suzhou, China

<sup>34</sup> <sup>2</sup> Suzhou Key Laboratory of Pathogen Bioscience and Anti-infective Medicine, Jiangsu Province

35 Engineering Research Center of Precision Diagnostics and Therapeutics Development, Soochow

- 36 University, Suzhou, China
- <sup>37</sup> <sup>3</sup> Department of Biological Sciences, Xi'an Jiaotong-Liverpool University, Suzhou, China
- <sup>38</sup> <sup>4</sup> Institute of Bacterial Infections and Zoonoses, Friedrich-Loeffler-Institut, Jena, Germany
- <sup>39</sup> <sup>5</sup> Warwick Bioinformatics Research Technology Platform, University of Warwick, Coventry,
- 40 UK
- 41 <sup>6</sup> Warwick Medical School, University of Warwick, Coventry, UK
- 42 <sup>7</sup> The Center for Microbes, Development and Health, CAS Key Laboratory of Molecular
- 43 Virology and Immunology, Shanghai Institute of Immunity and Infection, Chinese Academy of
- 44 Sciences, Shanghai, China
- 45 <sup>8</sup> National Key Laboratory of Intelligent Tracking and Forecasting for Infectious Diseases,
- 46 National Institute for Communicable Disease Control and Prevention, Chinese Center for
- 47 Disease Control and Prevention, Beijing, China
- 48 <sup>9</sup> Center for Food Safety, University of Georgia, Griffin GA, USA
- 49 <sup>10</sup> Iotabiome Biotechnology Inc., Suzhou, China
- 50

#### 51 Abstract

52 Salmonella enterica (S. enterica) causes severe foodborne infections through contamination of 53 the food supply chain. Its evolution has been associated with human activities, especially animal husbandry. Advances in intensive farming and global transportation have substantially reshaped 54 55 the pig industry, but their impact on the evolution of associated zoonotic pathogens such as S. 56 enterica remains unresolved. Here we investigated the population fluctuation, accumulation of 57 antimicrobial-resistant genes, and international serovar Choleraesuis transmission of nine pig-58 enriched S. enterica populations comprising more than 9000 genomes. Most changes were found 59 to be attributable to the developments of the modern pig industry. All pig-enriched salmonellae 60 experienced host transfers in pigs and/or population expansions over the past century, with pigs 61 and pork having become the main sources of S. enterica transmissions to other hosts. Overall, our analysis revealed strong associations between the transmission of pig-enriched salmonellae 62 63 and the global pork trade.

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65

#### 66 **Main**

67 Salmonella enterica infiltrates food supply chains through the contamination of food, water, or

68 food-processing facilities<sup>1</sup>, resulting in life-threatening foodborne infections with 108.1 million

69 illnesses and 291,000 deaths annually<sup>2</sup>. Pork and pigs are prominent sources of S. *enterica* 

70 infections, accounting for ~31.1% of salmonellosis and 9.3% of disease outbreaks in the

71 European Union<sup>3</sup>. Despite its acknowledged role in mediating transmissions and outbreaks of

viral diseases<sup>4,5</sup>, the contribution of pigs to the global dissemination of bacterial pathogens,

73 including S. enterica, remains insufficiently explored within the framework of the "One Health"

strategy.

75 The developments of intensive farming and global trade over the past century have drastically

<sup>76</sup> transformed pig agriculture<sup>6</sup>, giving rise to two industrial hubs, Europe and the US, that

collectively represent >32% of international pork and pig breed trades<sup>7,8</sup>. While most of

the >2000 populations in S. enterica, recognized by their serovars, eBGs, or ceBGs based on the

79 genomic sequences<sup>9</sup>, are ubiquitous, some populations predominantly comprise strains

80 associated with pigs<sup>10</sup> and are found to spread regionally through movements of pigs and/or wild

81 boars<sup>11</sup>. Nonetheless, it remains unclear how pathogens, especially these pig-enriched

82 salmonellae, have disseminated globally and how their population dynamics have been recrafted

83 by modern agriculture.

#### 84 **Results**

#### 85 Landscape of pig-enriched *Salmonella enterica* populations

86 Systematic investigation of all 362,931 *Salmonella* strains publicly accessible in EnteroBase

87 (July 2022) showed that pigs/pork accounts for 17,623 strains (4.9%) in 252 ceBGs and is the 2<sup>nd</sup>

88 most frequent livestock source of *S. enterica* after poultry over the past century (Fig. 1A, B).

89 There are 61 major ceBGs that each contains  $\geq$  20 pig-related strains, of which nine have  $\geq$  40%

90 of their strains from pigs/pork (Fig. 1C, D; Additional Supplementary Files Table 1), including

91 prominent pig-enriched populations such as ceBG1272 (Choleraesuis) and ceBG3 (Derby), and

92 others like ceBG10 (Adelaide) and ceBG459 (Johannesburg). Pig is the primary source (4393;

93 49%) of strains in these 9 pig-enriched ceBGs, followed by humans (2482; 28%) and other

- animals (1279; 14%). The other ceBGs have lower levels of pig- associated strains (0.2-38%)
- and exhibit no clear host preference, including ceBG2 (Typhimurium) which has only 6% (4612)
- 96 of pig-associated strains (Fig. 1C, D).
- 97 The HC5 clusters in EnteroBase, namely clusters of strains with  $\leq$ 5 allelic differences in their
- 98 core genes, have been extensively used in epidemiological investigations for designating
- 99 genetically almost identical bacteria such as those from disease outbreaks<sup>12</sup>. Unexpectedly, while
- 100 most HC5s in the pig-enriched ceBGs are from single countries, there are 35 HC5s each
- 101 consisting of strains from  $\geq 2$  countries, including 15 HC5s with strains from different continents
- 102 (Supplementary Table S1), indicating very recent international or even cross-continental
- 103 transmissions. Notably, all these international HC5s contain at least one pig strain, prompting the
- 104 importance of pigs for these long-range transmissions.
- 105

#### 106 Europe as the main genetic repository of serovar Choleraesuis

107 We reconstructed a maximum-likelihood phylogeny of serovar Choleraesuis based on 21,948 non-108 repetitive, non-recombinant single nucleotide polymorphisms (SNPs) in the core genome and used it 109 to divide strains into three lineages of CS1, CS2, and CS3 from the root that were separated by 2932 110 to 12,435 SNPs (Additional Supplementary Files Table 2). Except for CS3 which contained only two 111 strains, the other two lineages were subdivided into clades and clusters (Fig. 2A and Extended Data 112 Fig. 1). CS1 consists of 8 clusters in two clades of CS1.1 and CS1.2, and CS2 consists of 19 clusters 113 in three clades of CS2.1 to CS2.3. High geographic and host specificities were found in certain clades 114 and clusters. For example, most of the strains in Chinese mainland and Vietnam fell into Clade 1.2, 115while many of the British strains were from Clade 1.1. In addition, 92% of the US strains grouped 116 with those from Chinese Taiwan in Clade 2.2, while >60% of European wild boar strains were from 117 Clades 2.3.

118 We evaluated the genetic diversity of Choleraesuis in different regions worldwide. The Simpson's

119 diversity index (SDI) for the presence of clades in different regions (Fig. 2E) showed that West

and North European regions had the greatest levels of diversities (0.66 - 0.7), followed by South

121 America and East Asia (0.63). In contrast, Africa and North America had the lowest SDIs (0.14

122 and 0.17, respectively). Furthermore, to minimize the impact of oversampling in developed

- 123 countries, we performed a country-level comparison, which also showed that the countries from
- 124 North Europe exhibited greater levels of SDIs than those from other regions (Supplementary Table
- 125 S2). This suggested Europe as the main genetic repository and probably the origin of serovar
- 126 Choleraesuis (Fig. 2E).
- 127

#### 128 Host-specific ARGs accumulation in Choleraesuis

129 Choleraesuis strains carried many more antimicrobial resistant genes (ARGs) than its human-

130 specific analog, Paratyphi C (Fig. 2B, C), which was separated from serovar Choleraesuis only

131 ~4000yrs ago, suggesting an association between hosts and ARGs. Furthermore, significant

132 differences in ARG levels were found between Choleraesuis strains from different hosts and

133 countries/regions. In particular, strains from humans and livestock carried ~9-fold more ARGs

- 134 than those from wild boars (Fig. 2C), and strains from Chinese Taiwan and Vietnam carried more
- 135 ARGs than those from others (Fig. 2D).

136 Moreover, Choleraesuis isolated from pigs exhibited high resistance against aminoglycoside,

137 sulfonamide, tetracycline, and beta-lactam, which were all common feed supplements for

138 intensive farming<sup>12</sup> (Fig. 2A). In contrast, resistances against clinical antimicrobials including

139 guinolone, trimethoprim, and cephalosporins were much fewer, and often found only in human

- strains. Notably, the colistin-resistant genes, mcr-1 and mcr-3, commonly detected in pigs<sup>13</sup>, were
- 141 found in eight human/pig strains from the UK, China, Brazil, and Germany, underscoring their

142 global presence (Supplementary Table S3). Additionally, continuous increases in ARG carriages

143 over time were spotted in CS1 and CS2 strains isolated after the 1970s (Fig. 2B), except that the

144 ARG carriages in CS2 dropped after the 2010s due to an increase of strains from wild boars.

145

#### 146 International transmission of serovar Choleraesuis

147 Significant temporal signals were detected in serovar Choleraesuis, with and without the ancient

148 genotype (Extended Data Figs. 2 and 3). Bayesian inferences predicted that the most recent

149 common ancestor (MRCA) of Choleraesuis had probably been circulating in Europe before 2394

150 BP (CI95% 2276-2521 BP) and diverged there into CS1 and CS2 in 1785 and 1870, respectively

151 (Fig. 2F). The first predicted transmission outside of Europe occurred before 1893 (CI95% 1891-

152 1896) and resulted in Clade CS2.2 in the US. Soon after, the effective population size of

153 Choleraesuis was predicted to experience an expansion in the early 20<sup>th</sup>, coincident with the rapid

development of intensive pig farming, and reached its first peak in the 1930s, before the

155 commercial use of synthetic sulphonamides and other antimicrobials in animals<sup>14</sup>.

156 After 20 years of stale, a second expansion of Choleraesuis was predicted between the 1950s and

157 the 1980s (Fig. 2G). The frequencies of international transmissions also increased, possibly

associated with the rapid expansion of global agricultural trade as part of the post-war waves of

159 livestock revolution and trade globalization<sup>15</sup>. Europe and the US were the major sources of

160 international transmissions. For example, European CS1 strains were repetitively transmitted to

161 Chinese mainland and Southeast Asia (Fig. 2F). Furthermore, CS2.2 strains were transmitted from

162 the US to Chinese Taiwan (Fig. 2F, CS2.2.4) in 1962 (CI95% 1957-1968) and became endemic

163 there for more than 50 years, causing major human outbreaks between 1996 and  $2002^{16}$ . The

164 population size of Choleraesuis reached its peak in 1985 and underwent continuous decreases

afterward (Fig. 2G). This was also accompanied by a decrease in long-range transmissions,

although the local transmissions in Europe remained frequent, partially attributed to the movement

167 of wild boars<sup>17</sup>.

168 The majority of the Choleraesuis genomes were isolated from North European countries, which

169 could lead to sampling bias in the analyses. Therefore, we performed phylogeographic

170 reconstructions by downsampling at most ten random genomes from each country (Extended Data

171 Fig. 4 and Supplementary Table S4). Summarising 100 downsampling results together, we found

172 that the MRCA of Choleraesuis, as well as the MRCAs of all major clades except for Clade 2.1,

173 were still from North Europe (Extended Data Fig. 4A). Downsampling to at most five genomes

174 per country still proposed North Europe as the origin of the whole population but made Peru the

175 origin of Lineage 1 (Extended Data Fig. 4B). These differences likely resulted from the fact that

there was only one cluster of strains for each of Peru and Cameroon near the basal of Clade 2.1

177 and Lineage 1, respectively.

#### 179 Intensive farming in establishments of pig-enriched serovars

180 We further evaluated the role of pigs in the evolution of all nine pig-enriched populations. To this 181 end, we demonstrated the presence of temporal signals in all nine populations by date 182 randomisations (Extended Data Fig. 3) and estimated their temporal phylogenies and ancestral 183 host transfers. Notably, apart from ceBG40 (Cerro) which originated around 1954, the MRCAs for other populations were all predicted to be present before the 19<sup>th</sup> century (Fig. 3A and Extended 184 Data Fig. 5). However, except for ceBG3 (Derby) and ceBG1272 (Choleraesuis), other 185 186 populations were originally present in hosts other than pigs, and only transferred into pigs after 187 1930. Furthermore, we evidenced at least eight human-to-pig transmissions in ceBG3 (Derby) 188 during 1906-1942, resulting in the establishment of the contemporary pig-enriched lineages and 189 major population expansion (Extended Data Fig. 5A). Thus, all pig-associated salmonellae, apart from Choleraesuis, likely experienced host transfers in the 20<sup>th</sup> century (Fig. 3A). Furthermore, the 190 191 accumulation of pseudogenes has been associated with a drastic change, such as host adaptation of 192 the bacteria. However, we did not evident an accumulation of pseudogenes in any population (Fig. 193 3D), except for the pig-adapted Choleraesuis which has >17.3% of its genes disrupted<sup>7</sup>.

Different from the long-term trend of human-to-pig transfers, the majority (30-60%) of the recent host transfers in these populations, including those into humans, have been contributed by pigs in the past 50 years (Fig. 3B and Extended Data Fig. 6). Conversely, pigs contribute much less to host transfers in eight populations that had lower proportions (7-38%) of pig strains (Fig. 3C),

demonstrating the importance of pigs from intensive farming as a hub of host transfers in the pig-

199 enriched populations.

200

#### 201 Dispersal of Salmonella enterica from Europe and America

202 The reconstructed international transmissions in all nine populations showed that 68-96% of

203 transmissions into each continent were from either Europe or America (Fig. 4A), exhibiting

similar patterns to the trade data of the pork-related products in the Harvard database (Fig. 4B).

205 We then summarized the cross-continental trades for each of the 5,014 product categories in the

- Harvard database. The transmission of pig-enriched salmonellae was shown in a 5×5 table, in
- 207 which rows and columns represented the continental sources and targets, and each cell showed the
- 208 percentage contribution of a source continent to the influx of the target (Extended Data Fig. 7).
- 209 This resulted in a dataset for trade/transmissions, of which the pairwise Pearson's correlations
- 210 were calculated and projected to a 2-D space using an unsupervised method, the uniform manifold
- 211 approximation and projection (UMAP)<sup>18</sup> (Fig. 4C).
- 212 The trade data for most of the animal-related products fell into two clusters in the projection. The
- 213 first cluster consisted of almost all bovine and poultry products as well as live pigs, and the second
- 214 cluster consisted of five pig-related products and one poultry product. Impressively, the
- transmission of the pig-enriched salmonellae also fell in the second cluster, exhibiting 0.87-0.96
- 216 correlation coefficients to the pig-related products (p<0.0001) (Fig. 4C). Detailed investigation of
- 217 the products in the 2<sup>nd</sup> cluster suggested that they were either frozen or processed pork or offal and
- 218 fat that could be transported over long distances and used for pig feeding<sup>19</sup>. Pig-enriched
- salmonellae exhibited greater correlation with these products than that of fresh pork and live pigs
- 220 (Fig. 4D-G), which also correlated to pathogen transmissions with lower, yet significant
- 221 coefficients of 0.46-0.72 (Fig. 5 and Extended Data Fig. 8).
- 222

#### 223 **Discussion**

- The modern agriculture system, including intensive farming and global transportation, has
- significantly recrafted the daily life of not only livestock animals but also ourselves<sup>6</sup>. But how
- 226 much has it modified the life of bacteria, particularly, the zoonotic pathogens? Here based on
- 227 genomic analysis of >9000 pig-associated strains, we demonstrated that the modernization and
- 228 globalization of agriculture in the past century had driven the emergences, population expansions,
- 229 ARG acquisitions, and global transmissions of pig-enriched salmonellae.
- 230 We initiated the investigation in Choleraesuis, a prominent serovar that has been specifically
- infecting both pigs and humans for >2000 years<sup>11</sup>. Compared to previous studies that focused on
- 232 either its ancient divergence or regional dissemination<sup>11</sup>, we compiled a global dataset of
- 233 Choleraesuis strains to give a comprehensive overview of its recent evolution. We demonstrated

234 the high occurrences of cross-continental transmissions with a peak in the 1950s-1980s, a period of accelerated globalization before the use of specific vaccines<sup>20</sup>. The most obvious example is 235 236 between the Chinese mainland and Taiwan. Despite their geographic closeness, almost all strains 237 in the Chinese mainland were in Clade 1.2 and imported from Europe, whereas strains in Chinese 238 Taiwan were in Cluster 2.2.4 and imported from the US. We attributed this to the different trading 239 partners between the two regions. The Chinese mainland mostly imported pork and pig breeds such as Yorkshires and Landraces from Europe during 1950-2000<sup>21</sup>, whilst Chinese Taiwan traded 240 more frequently with the  $US^{22}$ . 241

242 The quinolone-resistant Salmonella has been regarded as an "Urgent threat" and is widely found in Typhi and Paratyphi A<sup>23</sup>. We found that 38% and 10.8% of Choleraesuis strains from humans 243 244 and pigs were also quinolone-resistant, mediated by either mutation in ORDR (quinolone 245 resistance-determining regions) or acquisition of ARGs (Additional Supplementary Files Table 2). 246 Furthermore, many quinolone-resistant strains, especially the human strains in Clusters 1.1.1, 247 1.2.1, and 2.2.4, also exhibit resistance to many antimicrobials extensively used in animals and 248 clinical settings and expose imminent threats to public health. For example, the strains from Cluster 2.2.4 have been epidemic in Chinese Taiwan during 1995-2003<sup>16</sup>. Particularly, compared 249 250 to those from wild boar, strains from pigs and humans had  $10 \times$  more ARGs or QRDR mutations, 251revealing a strong association between the extensive animal use of antimicrobials and the emergence of extensive-resistant pathogens<sup>24</sup> and demonstrating the importance of the "One 252253 Health" strategy in the control of antimicrobial overuse.

Nine pig-enriched *Salmonella* populations were identified from the ~362K genomes in
EnteroBase. Some Typhimurium clades were previously reported as pig-adapted based on small,
local datasets<sup>25</sup>, but not in our survey of >70K genomes (Fig. 1C). In contrast, we showed that two
prominent pig-associated serovars, ceBG1272 (Choleraesuis) and ceBG3 (Derby), have been
associated with pigs for millennia<sup>26,27</sup> and experienced significant population expansions after the

1900s. Besides, the other seven pig-enriched populations were not associated with pigs until the
1900s, during which they all experienced host jumps into pigs. We noticed the development of

intensive pig farming during the beginning of the 1900s, which could increase the pig-pig contacts

262 while reducing those between pigs and humans. Such an environment could increase the chance of

transmission among the pig populations while reducing spillover between the hosts, facilitating the

264 establishment of host-enriched pathogens. Similar host transfer and population expansion have

- 265 been observed in *Mycobacterium tuberculosis*, which was associated with increased contact
- 266 between humans after the invention of fire  $use^{28}$ . Thus, we attributed the increased host jumps and
- 267 population expansion of salmonellae in the pig population to the development of intensive pig
- farming in the 20<sup>th</sup> century, which is in need of further research.

269 We showed that the vast majority of the contemporary non-human strains from these nine 270 populations were from pig/pork, and proved that pig is the primary source of their host transfer 271events (Fig. 3B). The chance that strains from these nine pig-enriched populations being 272 transmitted by other non-human hosts, while could still occur, is low. Thus, we hypothesized that pig-related routes, including pork and pigs, the major sources of S. enterica infections<sup>29</sup> were the 273 274 dominant ways for the transmission of these *salmonellae*. International salmonellosis outbreaks 275due to global transportation of end products have been extensively reported, such as those by hams<sup>30</sup> or chocolates<sup>31</sup>. However, most of these events resulted in infections in humans, which 276 represents a sink of the pathogen and rarely mediated population expansion or secondary 277 278 transmissions into animals<sup>32</sup>. In contrast, transmissions via poultry breeding stocks<sup>33</sup> or animal 279 feeds<sup>30</sup> could lead to long-term epidemics or permanent establishment of the bacteria in the target 280 regions. Furthermore, transmission of pig pathogens has been more frequently associated with the end products due to the common application of swill feeding<sup>19</sup>, as evidenced in foot-and-mouth 281 disease virus (FMDV) outbreaks<sup>4</sup>, African swine fever virus (ASFV)<sup>5</sup>, and trichinosis<sup>34</sup>. Based on 282 283 the UMAP analysis, we revealed strong associations between the global pork trade and the 284 transmissions of pig-enriched salmonellae. This indicated that the predominance of modern pig 285 industries in Europe and the Americas made them the centers of development and global 286 dissemination of salmonellae, highlighting the role of agricultural practice as a driver of the 287 geographic dispersal of associated bacterial pathogens.

A limitation of this work is that the majority of involved genomes were from public databases and had sampling bias towards developed countries. The genetic diversities of pig-enriched salmonellae in the majority of developing countries, especially those in South America and Africa have not been sampled. Downsampling was adopted to reduce the influence of such bias, but, as evidenced in Choleraesuis, itself could introduce a bias towards countries of low genetic 293 diversities. Furthermore, there is not enough data for investigation of local transmissions driven by 294 country-wide agricultural transportation or the movements of wild boars, as previously reported <sup>35</sup>.

295 In summary, our findings demonstrate the influence of modern agriculture on the population 296 dynamics of S. enterica. The intensive farming has driven the host jumps of many S. enterica 297 populations into pigs and population expansion of the pig-associated populations, the widespread 298 availability of antibiotics after the 1940s increased the prevalence of antimicrobial resistance 299 (AMR), and the expansion of globalized trade and transportation resulted in rapid and frequent 300 global dissemination of these pig-enriched S. enterica (Fig. 5). Despite decades of significant 301 progress on Salmonella control in pigs, the evidence provided here warrants further investigation 302 and potential intervention into the global spread of S. enterica from centralized origins at the 303 pinnacle of pork production.

304

#### 305 Methods

#### 306 Strains and whole-genome sequencing procedures

307 The metadata associated with all 362,931 S. enterica strains accessible in EnteroBase (July 2022) 308 was downloaded and manually classified into seven categories: Pig, Bovine, Poultry, Human, other 309 Animals, and Food/Environment. The serovar associated with each ceBG (HC900 cluster) was 310 downloaded from https://enterobase.readthedocs.io/en/latest/HierCC lookup.html. A subset of 61 311 ceBGs with  $\geq$ 20 pig strains (277,588 strains in total) was used to display as a hierarchical bubble 312 plot (Fig. 1D), showing phylogenetic grouping at subspecies (HC2850), super-lineage (HC2000), and 313 ceBG (HC900) levels, along with pie charts representing source category. A total of 9,259 genomes 314 from 9 ceBGs each containing >40% of pig-associated strains were selected for downstream 315 analysis. Additionally, a set of 16,829 genomes from 8 pig-containing ceBGs that each contain 316 lower levels (2-40%) of pig-associated strains were also selected in comparison with the 9 pig-317 enriched ceBGs. Additionally, 15 Choleraesuis strains were collected by China CDC from northern 318 and eastern regions across China between 2002 and 2022. The DNA of each strain was extracted 319 using the HiPure Bacterial DNA kit (D3146). Paired-end libraries with insert sizes of ~300 bp were 320 prepared following Illumina's standard genomic DNA library preparation procedure (VAHTS

Universal DNA Library Prep kit for Illumina V3) and sequenced on an Illumina NovaSeq 6000
 using the S4 reagent kits (v1.5) according to the manufacturer's instructions.

To demonstrate the association between pig and its enriched *S. enterica* strains, we sequenced the genome of 78 strains of the prominent pig-enriched serovar, Choleraesuis. These include 63 strains from Germany or Austria as part of the University of Warwick/University College Cork 10K genomes project<sup>36</sup> and 15 from China. They were integrated with public genomes of 679 strains isolated between 1935 and 2022 and one genotype reconstructed from a ~1600-year-old human remains<sup>37</sup>, resulting in a global collection of 757 genomes (Additional Supplementary Files Table 2) encompassing 41 countries.

330

#### 331 Bioinformatic analysis

332 The sequencing reads of each strain were quality trimmed using EtoKi prepare<sup>12</sup>, and the high-

333 quality sequences were further assembled into contigs using SPAdes V3.13<sup>38</sup> which was

implemented in the 'EtoKi assemble' pipeline. The genes in each assembled genome were predicted

and annotated using PROKKA 1.14.6<sup>39</sup> and had detailed functional predictions using eggnog-

mapper  $v2^{40}$ . The antibiotic resistance genes were predicted using AMR finder v3.11.14<sup>41</sup>, and the

337 disrupted genes in the pig-enriched populations were predicted using PEPPAN<sup>42</sup>. The multi-

338 sequence alignment for each pig-enriched ceBG was generated using the EtoKi align module and

used to build a maximum-likelihood (ML) phylogeny using IQTree v1.6.12<sup>43</sup> implemented in EtoKi

340 phylo after the removal of recombinant regions using RecHMM<sup>11</sup>.

341

#### 342 **Temporal signal and randomization test**

343 The presence of a temporal signal in *Salmonella* serovar Choleraesuis (ceBG1272) was tested using

344 three approaches. The regression of root-to-tip distances and dates of isolation was estimated using

345 TempEst v1.5.3<sup>44</sup> with a correlation of determination ( $R^2$ ) of 0.67 and P-value of 4.15 ×10<sup>-6</sup>. We

346 then randomly permutated the isolation dates of the strains ten times and estimated their  $R^2$  values.

347 The same datasets were also used for BactDating  $v1.1^{45}$  inferences as described above, and their

348 substitution rates were compared with the rate from the actual data (Extended Data Fig. 2),

349 demonstrating the presence of a significant temporal signal. We also performed the same tests

350 without the ancient genotype, demonstrating the presence of temporal signals. Furthermore, the

351 tests were also performed for the other eight pig-enriched populations, proving their availability for

352 temporal analyses (Extended Data Fig. 3).

353

#### 354 **Population dynamics of serovar Choleraesuis**

The ML tree of serovar Choleraesuis was calibrated by dated tips using BEAST<sup>44</sup> with a GTR 355 356 substitution model and fixed topology. Eight BEAST runs were prepared by combinations of two 357 clock models of "strict clock rate" and "optimised relaxed clock", and four population models of 358 "constant coalescence", "Bayesian skyline", "Birth-death skyline" and "extended Bayesian 359 skyline". All models were run in "Nested Sampling" mode with 8 parallel chains each with "chainLength=20000", "particleCount=1", and "subChainLength=5000". The results were 360 361 summarized using NSLogAnalyser and the model with "optimised relaxed clock" and "Bayesian 362 skyline" had the greatest marginal likelihood with a maximum ESS of 632.3. The posterior trees 363 from the best model were then summarized using treeannotator into a maximum clade credibility

364 tree (MCC tree) and visualized in iTol<sup>46</sup>.

Two downsampling tests were performed by selecting at most ten or five random genomes from each country. We employed TreeTime to reconstruct the ancestral states of the internal nodes based on a subtree containing only those selected tips. Each test was run parallel 100 times, and the results were summarized in Extended Data Fig. 4.

369

#### 370 **Population dynamics of pig-enriched and pig-containing ceBGs**

371 Furthermore, the population dynamics of each pig-enriched population were estimated using

372 BactDating<sup>47</sup>, which performed Bayesian inference of ancestral dates based on the ML tree. Parallel

373 chains of 5e6 samples each were run for each of the substitution models of "strictgamma",

374 "mixedgamma", and "carc". The first 50% of the chain (3e6 samples) for each model was discarded

375 as burn-ins and the convergence of the run was determined by ensuring effective sampling sizes

376 (ESSs) of >100 for all parameters. The results from all samples were compared based on their

377 Bayes Factors using the model compare function in BactDating, and only the best model for each

pig-enriched population was reported. Notably, the dating results for ceBG1272 (Choleraesuis) by

379 BactDating were very similar to that by BEAST, suggesting high reproducibility of the analyses.

380 We then estimated the host transfers and geographic transmissions of each population along the

dated trees using the ML algorithm implemented in TreeTime<sup>48</sup>. Similarly, the dates and host

382 transfers of the ancestral nodes in the ML trees of the pig-containing ceBGs were also estimated as

383 described above.

384

#### 385 **Transmission events and the correlation between trade data**

386 We define a transmission or host transfer event when the ancestral node and the descending node

387 of a branch are assigned different country/host information. Considering all possible states as *S*.

388 A host transfer or international transmission was counted along the ML tree if the reconstructed

389 states in the ancestral and the descending nodes of a branch were different, and the numbers of

host transfers and international transmissions were summarized as  $N_{i->j}$ , where  $i \in S$  and  $j \in S$  are

391 the states of the ancestral and descending nodes, respectively. Then there is:

$$T_{i \to j} = N_{i \to j} / \sum_{k \in S} N_{k \to j}$$

Where  $T_{i->j}$  is the normalized frequency of *Sj* originating from *Si*, and  $k \in S$  is an iterator for calculating the total number of transmissions into *Sj*. Furthermore, the normalized frequency between two continents *m* and *n* are:

396 
$$\hat{T}_{m \to n} = \sum_{a \in m} \sum_{b \in n} T_{a \to b}$$

Where *a* and *b* are countries in the continents *m* and *n*, respectively.

398

399 The international trade data of all categories were obtained from Harvard Dataverse

400 (https://dataverse.harvard.edu). Trade values were expressed in constant U.S. dollars after

401 adjustment for inflation and summed up. The normalized fluxes of trade between continents were

402 also calculated using a procedure similar to the above. As a result, frequencies of pathogen

403 transmissions and trading among five continents of Asia, Africa, Europe, Oceania, and the

404 Americas were obtained and pairwise Pearson's correlation coefficients (R) between the cross-

405 continental flows of the goods and between the flows of the goods and the pathogens were

406 calculated. All goods and salmonellae were then projected into a 2-D space based on their 1-R

407 values using UMAP (Uniform Manifold Approximation and Projection), which is a non-linear

408 dimension reduction technique that has been extensively used in biological analysis, such as in

409 single-cell studies<sup>49</sup>.

410

#### 411 Data availability

412 The raw sequencing reads for the 15 Chinese strains have been deposited in the Genome Sequence 413 Archive in the National Genomics Data Center, China National Center for Bioinformation / Beijing 414 Institute of Genomics, Chinese Academy of Sciences (GSA: CRA012579) and are publicly 415 accessible at https://ngdc.cncb.ac.cn/gsa. The assembled genome sequences have been deposited in 416 the Genome Warehouse (GWH) in the National Genomics Data Center with BioProject accession 417 PRJCA019682. The raw reads for 67 European Choleraesuis strains were deposited in Short Reads 418 Archive (SRA) at EBI under BioProject accession: PRJEB20997, as part of the University of 419 Warwick/University College Cork (UOWUCC) 10K genomes project. A detailed list of the sample 420 accession codes for all Choleraesuis strains is available in Additional Supplementary Files Table 2. 421 Assembled genomes for all pig-enriched populations were available as a workspace in EnteroBase 422 at https://enterobase.warwick.ac.uk/a/100355. The resulting figures and underlying data of 61 423 ceBGs with  $\geq 20$  pig strains are all available at https://observablehq.com/d/232a986be1a99113.

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#### 431 **Competing interests**

432 The authors declare no conflicts of interest.

#### 433 Authors' contributions

- 434 HL, YR, XL, ZZ designed the study. UM, XL applied the experiments, DFeng, QJ, JR, and LB
- 435 prepared the figures and tables. LZ, SL, YR, ZL analysed the statistical data. HL, YW, DFeng, ZZ
- 436 wrote the initial version of the manuscript. HL, DFeng, SO, DFalush, XD, BK, ZZ revised the
- 437 manuscript.
- 438

439

#### 440 Figure Legends

441 Fig. 1 | Summary of the pig-enriched ceBGs in the *Salmonella* database in EnteroBase. (A)

442 Histogram of the numbers of *Salmonella* strains for each non-human source in EnteroBase. (B)

443 Histogram of the numbers of pig-associated *Salmonella* strains per year during 1885-2022. (C) Bubble

444 plot of the 61 pig-associated ceBGs each with  $\geq$ 20 strains. Each ceBG is sized proportional to the

445 number of strains in it, and placed according to the numbers and percentages of its pig-associated

446 strains. (D) Hierarchical bubble plot of the 61 pig-associated ceBGs as in panel C. The sizes of the

447 circles are proportional to the number of strains, the three levels in the plot represent (from outer to

448 inner) clusters at the levels of subspecies (HC2850), super-lineage (HC2000), and ceBG (HC900),

449 as described previously<sup>9</sup>. Pie charts represent the proportions of strains from different sources. The 9

450 pig-enriched ceBGs each with >40% pig strains were labelled in parts C and D.

Fig. 2 | Population dynamics, ARGs, and global transmissions of ceBG1272 (Choleraesuis). (A) The
 maximum-likelihood phylogeny (left), metadata (middle), and predicted ARGs for all strains in
 ceBG1272. The predicted lineages, clades, and clusters are labeled near the associated branches. The

associations between the numbers of predicted ARGs and the sampling years, source categories, and
 countries are also visualized. (B) The associations between the numbers of predicted ARGs and the

456 sampling years in Para C lineages, and (C) the association between the number of ARGs per strain and

457 host sources. (D) Visualization of the correlations between the numbers of predicted ARGs and countries

458 in Choleraesuis. (E, F, and G) Bayesian inferences of the population dynamics of ceBG1272 over the past

459 ~2500 years. (E) Global transmission of ceBG1272. Pie charts show the proportional composition of

460 clades in each major country, and the arrows show the transmissions reconstructed based on the tree in

461 part F, with the transmission dates shown nearby. The world map was modified from the map hosted in

462 the d3.js (https://d3js.org/). The piecharts and arrows were color-coded by the associated clades.

463 Inset: the Simpson diversity of clades in each geographic region in the world. (F) The maximum clade-

464 credibility (MCC) tree of ceBG1272 by BEAST2. The branches were color-coded by the most probable

465 ancestral geographic origins (as in the Key). Piecharts of all possible geographic origins were shown over

466 certain nodes where the most probable origins had <90% posterior supports. The dates of origin for some

467 branches were shown together with the 95% confidence intervals in brackets. (G) The fluctuation of

468 effective population sizes with time by the 'skygrowth' package in R. Arrows points to the time of three

469 major developments in the modern pig industry.

470 Fig. 3 | Host transfers for the pig-enriched ceBGs. (A) Curves show the dynamic changes of the
471 proportional host sources with time for each ceBG. The ancestral host associations were predicted by

- 472 TreeTime. The predicted median effective population sizes were also shown as black curves for
- 473 ceBG1272 (Choleraesuis) and ceBG3 (Derby). The period for host transfers into pigs (red) or population
- 474 expansions (yellow) is shown above each plot. Detailed prediction of population dynamics for all nine
- 475 ceBGs can also be found in Extended Data Fig. 5. (B) Proportional source of host transfers summarized
- 476 for all nine ceBGs in the past 50 years. Detailed host transfer data for each ceBG can be found in
- 477 Extended Data Fig. 6. (C) Proportional source of host transfers in the past 50 years summarized for eight
- 478 pig-containing ceBGs that have 5-35% pig strains, including ceBGs of 5, 8, 22, 125, 276, 709, and 1898
- 479 (see Fig. 1C). (B, C) The arrows show the direction of transfers and are color-coded by average
- 480 frequencies. The most contributing sources (B: pigs, and C: human) are highlighted with a '\*'. (D)
- 481 Median numbers of disrupted CDSs (coding sequences) per genome with 95% confidence intervals in all
- 482 pig-enriched and pig-containing ceBGs.

#### 483 Fig. 4 | Association between the transmission of the pig-enriched ceBGs and the global trade of pig-

484 related products. (A, B) Visualization of the international trade of all pork-related products (top) and the 485 transmissions of pig-enriched ceBGs (bottom). The pie charts show the relative proportions of source

- 486 continents for the products or pathogens to the target continents. The world map was modified from the
- 487 map hosted in the d3.js (https://d3js.org/). (C) UMAP plot of Pearson's correlations among the trade and
- 488 the transmission of pig-enriched salmonellae. Each colored dot in the plot shows an animal-related
- 489 product as in the Harvard database and the grey dots are other, non-animal products. The triangle shows
- 490 inter-continental transmission data summarized from all pig-enriched salmonellae. The insert highlights
- 491 the dashed box in the plot, with arrows specifying the correlation coefficient (R) between the
- 492 transmissions of pathogens and the trade of pig-related products. (D-G) Linear regressions of different
- 493 categories of pig-related products (X-axis) and the inter-continental transmissions of pig-enriched ceBGs
- 494 (Y-axis). The correlation coefficient values for the linear regressions are also shown.

#### 495 Fig. 5 | The influences of modern agriculture on population dynamics of *Salmonella enterica*

- 496 **serovars.** This image provides a visual summary of the paper. Agricultural production has become
- 497 increasingly modernized over the past half-century. On the one hand, the pattern of large-scale intensive
- 498 pig farming has led to the emergence and population expansion of pig-enriched *Salmonella*; on the other
- 499 hand, globalized trade exchanges concerning pigs have similarly increased the probability of global
- 500 transmission of pig-enriched Salmonella enterica serovars. In addition, with the use of antibiotics in the
- 501 process, more and more pig-enriched *Salmonella* has obtained new antibiotic resistance genes, including
- 502 many of the previously reported human-specific antibiotic resistance genes. The impact of the
- 503 development model of modern agriculture on pig-enriched *Salmonella* is comprehensive and far-reaching.

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#### 615 Extended Data Figure 1. Circular presentation of the maximum-likelihood phylogeny in Figure 1A.

- 616 Outer rings: The clade, source, and geographic origin of each strain. Colored arcs underneath the tree
- 617 show the cluster assignments as in the Key.

#### 618 Extended Data Figure 2. Evaluation of the presence of temporal signal in *S. enterica* serovar

- 619 Choleraesuis. The analysis was performed on 587 genomes. (A) Linear regression between root-to-tip
- 620 distances of strains and the sampling years with a coefficient of determination ( $R^2$ ) of 0.67. (B)
- 621 Substantially lower R<sup>2</sup> values were obtained for ten date-randomisation datasets. (C) The average (dots)
- 622 and standard deviation (error bars) of the substitution rates for actual data (black) and ten date-
- 623 randomisation datasets (red), estimated by BactDating.

624 Extended Data Figure 3. Assessing the existence of temporal signal randomization test in pig-

625 **enriched ceBGs.** (A) Coefficients of determination  $(\mathbb{R}^2)$  for the ten date-randomisation tests were

626 obtained by linear regression between root-to-tip distances of strains and the sampling years in pig-

627 enriched ceBGs. (B) The average (dots) and standard deviations (error bars) of the substitution rates for

- 628 actual data (black) and ten date-randomisation datasets (red) by BactDating. Pig-enriched ceBGs
- 629 including ceBG3 (n=3136), ceBG10 (n=622), ceBG17 (n=155), ceBG35 (n=516), ceBG37 (n=1012),
- 630 ceBG40 (n=176), ceBG459 (n=1441), ceBG621 (n=787), ceBG1272 (n=586). The ancient sample was
- 631 not included in ceBG1272 in both (A) and (B).

#### 632 Extended Data Figure 4. The geographic states of the ancestral nodes in the Choleraesuis

633 **population after downsamplings.** (A) Downsampling tests of up to ten strains per country/region. (B)

634 Downsampling tests of up to five strains per country/region. Both: the geographic states were predicted

635 using TreeTime. Each test was run in 100 parallels. The pie charts illustrate the proportions of the best-

636 supported geographic states in the 100 parallels for the corresponding ancestral nodes.

637 Extended Data Figure 5. Reconstructed ancestral host associations for all nodes in nine pig-

638 enriched ceBGs. The corresponding ceBGs for each panel are: (A) ceBG3 (Derby), (B) ceBG1272

- 639 (Choleraesuis), (C) ceBG17 (Chailey), (D) ceBG35 (Worthington), (E) ceBG37 (London), (F) ceBG40
- 640 (Cerro), (G) ceBG459 (Johannesburg), (H) ceBG621 (Ohio), (I) ceBG10 (Adelaide). The mean values of
- 641 effective population sizes with time were also shown for (A) and (B), with 95% confidence intervals in
- 642 grey shapes. The orange and grey boxes show the periods of population expansion (A, B) or the periods
- 643 of host transfers into pigs (C-I).
- 644 Extended Data Figure 6. The host transmission frequency of nine pig-enriched ceBGs. The
- 645 corresponding ceBGs for each panel are: (A) ceBG10 (Adelaide), (B) ceBG1272 (Choleraesuis), (C)

- 646 ceBG17 (Chailey), (D) ceBG3 (Derby), (E) ceBG35 (Worthington), (F) ceBG37 (London), (G) ceBG 40
- 647 (Cerro), (H) ceBG 459 (Johannesburg), (I) ceBG 621 (Ohio). Different arrows represent the direction of
- 648 host transmission, with darker colors indicating higher transfer frequency. "\*" marks the most
- 649 contributing host sources for the transmissions.

#### 650 Extended Data Figure 7. A 5 X 5 table showing the summarised international transmission events

of all nine pig-enriched ceBGs in *Salmonella* in the past 50 years. The maximum-likelihood phylogeny

was reconstructed based on SNPs in the core genome of each ceBG and the date of origin was estimated

- using BactDating. TreeTime was applied to reconstruct the country sources for all nodes in the tree. A
- 654 transmission was recorded when the ancestral node and descending node of a branch were different. All 655 transmissions were then summarized and grouped based on their associated continents.

#### 656 Extended Data Figure 8. Pearson's correlations analysis of sub-classification for pig-related

- 657 **products.** The Sub classifications involved include (A) Pork offal, frozen (021011); (B) Pork, frozen
- 658 (020649); (C) Pork, frozen cut (020329); (D) Pork, preserved (020322); (E) Pork offal, fresh (020630);
- 659 (F) Pig fat (020910); (G) Pork, fresh cuted (020912); (H) Pork, fresh (020319); (I) Pig carcasses
- 660 (020310); (J) Pig, live breeding (010391); (K) Pig, live, less 50kg (010392); (L) Pig, live, over 50kg
- 661 (020311). The codes in parentheses represent the Harmonized System Codes of the products. Analyzing
- the correlation between the intercontinental dissemination of each pig-related commodity and the
- 663 intercontinental transmission of pig-enriched ceBGs. R: Pearson's correlation coefficient.
- 664

#### 665 Supplementary Information and Additional Supplementary Files

666

#### 667 Supplementary Table S1. Pig-enriched HC5s that were isolated from multiple countries.

The item in the table including the HC5 cluster from Enterobase, corresponded with pig-enriched ceBGs,continent, transnational, and host sources information.

670

#### 671 Supplementary Table S2. Simpson's diversity of clades at the national level.

- When calculating the Simpson's diversity of clades, only countries with more than 10 strains were selected.
- 674

#### 675 Supplementary Table S3. Distribution of the colistin-resistant genes in serovars Choleraesuis.

- 676 Information on colistin-resistant genes extracted from the statistical information on the number of ARGs
- 677 of strains of serovar Choleraesuis is summarised in this table. The collection years, host sources, and
- 678 geographic information for strains with colistin resistance are labeled in the table.

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680	Supplementary Table S4. The frequencies of transmissions in each pair of regions across all
681	100 random downsamplings.
682	The table on the left shows the results of 5 samples drawn from each region, while the table on
683	the right shows the results of 10 samples drawn from each region. The transmission frequency
684	corresponds to the total number of transmission events that occur in 100 repeats.
685	
686	Additional Supplementary Files Table 1 Metadata of eight pig-enriched ceBGs except 1272
687	(Choleraesuis).
688	The metadata included eight pig-enriched ceBGs (which had $\geq 40\%$ of the strains from pigs) except
689	ceBG1272 (Choleraesuis), including ceBG3 (Derby), ceBG10 (Adelaide), ceBG459 (Johannesburg),
690	ceBG37 (London), ceBG621 (Ohio), ceBG40 (Cerro), ceBG35 (Worthington), and ceBG17 (Chailey).
691	The table provides information about the ceBG names, geographic information, collection year, source
692	details, and the number of ARGs per strain of these pig-enriched ceBGs.
693	
694	Additional Supplementary Files Table 2 Metadata of Salmonella strains in the serovars
695	Choleraesuis and Paratyphi C. There is a total of 911 Salmonella strains from the Para C lineage,
696	including 757 S. Choleraesuis serovars and 154 Paratyphi C serovars. The specific serotyping, geographic
697	information, collection year, and host source details of these strains are listed in this table, as well as the
698	statistical information about the number of ARGs per strain.





A Predicted host association with time 1600 1650 1700 1750 1800 1850 1900 1950 2000 1550 Pig Human Food/Environment Other Animals Poultry Bovine ceBG1272(Choleraesuis) ceBG3(Derby) ceBG35(Worthington) ceBG459(Johannesburg) ceBG621(Ohio) ceBG37(London) ceBG10(Adelaide) ceBG17(Chailey) ceBG40(Cerro)

















A Random sampling of 10 isolates from each country/region



**B** Random sampling of 5 isolates from each country/region









Source

		Africe	, Asia	Euros	e Aner	ocean	10
Target	Africa	2.077	0.000	15.922	2.000	0.000	
	Asia	0.000	12.301	18.062	10.634	0.000	
	Europe	0.006	4.643	50.505	18.841	0.000	
	Americas	0.325	1.825	13.220	40.602	0.025	
	Oceania	0.000	0.663	3.672	3.665	1.000	

