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## Whole genome-based population biology and epidemiological surveillance of *Listeria monocytogenes*

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34

#### 35 Abstract

Listeria monocytogenes (Lm) is a major human foodborne pathogen. Numerous Lm 36 37 outbreaks have been reported worldwide, associated with high case fatality rate, reinforcing the need for strongly coordinated surveillance and outbreak control. We 38 developed a universally applicable genome-wide strain genotyping approach and 39 40 investigated the population diversity of Lm using 1,696 isolates from diverse 41 sources and geographical locations. We define, with unprecedented precision, the 42 population structure of *Lm*, demonstrate the occurrence of international circulation 43 of strains, and reveal the extent of heterogeneity in virulence and stress resistance genomic features among clinical and food isolates. Using historical isolates, we show 44 that the evolutionary rate of Lm from lineage I and lineage II is low (~2.5x10<sup>-7</sup> 45 46 substitutions per site per year, as inferred from the core genome) and that major sublineages (corresponding to so-called 'epidemic clones') are estimated to be at 47 least 50 to 150 years old. This work demonstrates the urgent need of monitoring Lm 48 49 strains at the global level and provides the unified approach needed for global 50 harmonization of *Lm* genome-based typing and population biology.

#### 52 Introduction

Pathogens know no border and can cause multi-country outbreaks and 53 pandemics,<sup>1,2</sup> emphasizing the importance of international coordination for 54 infectious diseases surveillance.<sup>3</sup> Microbiological surveillance programs rely on the 55 continuous monitoring of circulating genotypes in space and time, enabling the 56 rapid detection of common-source clusters and the implementation of control 57 measures.<sup>4</sup> Despite outstanding exceptions,<sup>5-7</sup> most pathogens are so far 58 monitored only at the national level. The lack of international coordination implies 59 that outbreaks affecting multiple countries are either not detected or not 60 controlled optimally.<sup>3,4</sup> International and cross-sector surveillance of pathogens 61 requires strain subtyping methods that combine high resolution, reproducibility 62 and exchangeability, so that epidemiologically relevant groups of matching isolates 63 can be rapidly recognized across space and time.<sup>4</sup> Besides, harmonized and 64 universally shared strain nomenclatures, which must be rooted in the 65 microorganism population biology, are a prerequisite for rapid detection and 66 67 efficient communication on emerging strain types.

68 The foodborne pathogen *Listeria monocytogenes* (*Lm*) causes listeriosis, a human systemic infection characterized by septicemia, central nervous system and 69 70 maternal-fetal invasion, with high hospitalization and fatality rates.<sup>8</sup> Less severe manifestations include gastroenteritis<sup>9</sup> and may often remain undiagnosed. In the 71 72 PulseNet program,<sup>6</sup> the microbiological typing golden standard, pulsed-field gel electrophoresis (PFGE), has been standardized internationally, but naming of 73 74 profiles is not coordinated between the different international PulseNet networks. Furthermore, PFGE does not reflect evolutionary relationships and certain profiles 75

76 are highly prevalent leading to insufficient discriminative power. In contrast, multilocus sequence typing (MLST) based on seven genes provides highly 77 standardized genotypes and nomenclature,<sup>10-12</sup> but lacks the discriminatory power 78 required for epidemiological surveillance of most bacterial pathogens. Advances in 79 high-throughput sequencing technologies have established whole genome 80 sequencing (WGS) as a powerful epidemiological typing tool<sup>1,13,14</sup> that has been 81 applied to investigate outbreaks and *Lm* contamination of food production 82 plants.<sup>15-20</sup> However, these studies were restricted to local or national levels and a 83 relatively small number of isolates. 84

Wide-range transmission of *Lm* strains can occur through international food trade<sup>21</sup> and the major MLST-defined clonal complexes (CCs) of *Lm* are distributed globally.<sup>11</sup> However, the rate of evolution of *Lm* genomes and the speed at which strains can spread over large distances are currently unknown. Further, a global view of the relationships between genotype and virulence potential of *Lm* strains remains to be established.

To enable population biology studies of global *Lm* collections and for prospective 91 international epidemiological surveillance, a harmonized protocol to translate 92 genomic sequence into its corresponding nomenclatural genotype needs to be 93 established. Although single-nucleotide polymorphism (SNP)-based approaches 94 can provide maximal discrimination,<sup>20</sup> they are difficult to standardize and can be 95 difficult to interpret.<sup>18,22</sup> In contrast, genome-wide MLST approaches rely on well-96 defined standard sets of hundreds of genes that can be validated *a priori* for strain 97 genotyping.14,19,23,24 98

Here we developed a core genome MLST (cgMLST) method for *Lm* and applied it to 99 a large number of strains from a wide spectrum of geographic, temporal and 100 epidemiological origins. This enabled us to decipher the population structure and 101 102 evolutionary rate of Lm, to demonstrate international transmission of major sublineages, and to develop a unified genome-based nomenclature of *Lm* strains 103 104 accessible through an open bioinformatics platform, allowing international 105 collaboration on research and public health surveillance based on high-throughput 106 genome sequencing.

108 Results

### 109 Universal Lm cgMLST

A core genome MLST (cgMLST) scheme of 1,748 loci was defined based on a high 110 111 level of conservation of this set of genes among 957 genomes of diverse origins (Supplementary Information 2.1). Using an independent set of 650 112 prospectively collected isolates to estimated typeability<sup>4</sup>, each of these genes could 113 be detected in 644 genomes (99.1%) on average, resulting in half of the genomes 114 115 having 8 or fewer uncalled alleles (average±standard deviation of uncalled alleles 15±20; **Supplementary Information 2.1**). These results demonstrate the 116 117 universal applicability of this cgMLST scheme for *Lm* strain genotyping.

Reproducibility of allele calls based on genomic sequences obtained from 118 119 independent cultures and sequencing protocols of the reference EGD-e strain was absolute (error rate <0.029%, i.e. <1 error in 3,496 allelic comparisons). cgMLST 120 121 genotyping was also reproducible irrespective of assembly pipeline for coverage depths  $\geq$ 40 (with per-site Phred quality score  $\geq$ 20, i.e. corresponding to  $\geq$ 99% base 122 accuracy) and *de novo* assembly allele calls were identical to assembly-free 123 methods (Supplementary Information 2.4). Altogether, the cgMLST scheme 124 developed herein constitutes an extremely robust genotyping method, even when 125 applied on a very wide variety of *Lm* strains sequenced from diverse sources and 126 geographical locations. 127

128

## 129 Definition of cgMLST types

To provide a definition of cgMLST types (CTs) that would be maximally useful forsurveillance purposes, we compared the genetic heterogeneity between

epidemiologically related isolates on the one hand, and between isolates with no 132 133 documented epidemiological link on the other hand. Pairwise allelic mismatches revealed two distinct distributions (Fig. 1A). First, most isolates sampled during 134 investigations of single outbreaks had seven or fewer allelic mismatches (Fig. 1A). 135 Among these, pairs of isolates from vertical maternal-neonatal transmission cases 136 had no allelic differences (not shown). Second, taking into account the entire 137 dataset (**Fig. 1A**), a sharp discontinuity was observed, with few pairs of isolates 138 139 having between 7 and 10 allelic mismatches, showing that isolates with no documented epidemiological link differed most generally by more than 10 140 141 mismatches. Clustering efficiency was optimal when using a cut-off value of 7.3 142 allelic mismatches (i.e. 0.414% of mismatched loci; Supplementary Information 143 **2.7**). Therefore, we propose to define CTs as groups of cgMLST profiles that differ by up to 7 allelic mismatches out of 1,748 loci (i.e., in case of uncalled alleles, 144 0.400% of mismatched loci among those that are called in both profiles), from at 145 least one other member of the group. 146

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## 148 Comparison of cgMLST and PFGE genotyping

PFGE is the current reference method for *Lm* epidemiological surveillance and outbreak investigation.<sup>6</sup> Among the 100 *Lm* isolates used for cgMLST and PFGE comparison, only 36 distinct *AscI-ApaI* combined PFGE profiles (Simpson's diversity index = 0.944, 95% confidence interval CI = [0.926, 0.963]) were identified, whereas cgMLST distinguished 68 CTs (Simpson's index = 0.987; 95% CI = [0.981, 0.994]). This indicates that cgMLST greatly improves discrimination among *Lm* isolates as compared with PFGE (*p*<0.001; **Supplementary**  156 **Information 2.5**). Consistent with this, PFGE did not subtype any CT, whereas 157 multiple PFGE types could be subdivided using cgMLST (adjusted Wallace index of concordance = 0.215; 95% CI = [0.156, 0.304]). Retrospective analysis indicated no 158 epidemiological link among isolates that were grouped by PFGE but not by cgMLST 159 (NRC and InVS, France). These results are consistent with previous work that 160 reported improved discrimination of genome sequence typing over PFGE,<sup>18,19</sup> and 161 our collective unpublished experience covering more than one year with WGS for 162 real-time surveillance of listeriosis in Denmark, France, the United Kingdom and 163 the United States. Implementation of cgMLST in *Lm* surveillance therefore shows 164 165 great promise to improve the definition of clusters of cases, thus facilitating 166 investigations of contamination sources.

167

#### 168 *Phylogenetic structure and nomenclature of Lm sublineages*

169 A unified nomenclature of *Lm* subtypes is critically needed for real-time exchange 170 of information on the emergence and geographic dispersal of strains. To provide an optimized subtype definition, we analyzed the phylogenetic structure of *Lm*. 171 The four major phylogenetic lineages of *Lm* were clearly separated (Fig. 2A). 172 cgMLST-based clustering of isolates into lineages and their sublineages was highly 173 concordant with the sequence-based phylogenetic tree (Fig. 2B). Whereas the 174 strains of lineages III and IV (which are rarely isolated in the context of 175 surveillance) were scattered into multiple rare sublineages, lineages I and II were 176 strongly structured into major sublineages, each comprising multiple closely-177 related isolates (Fig. 3A). Two atypically divergent sublineages within lineage II 178

were identified (sublineages SL842 and SL843, Fig. 2A), showing that lineage II is
more diverse than previously reported.

The observed trimodal distribution of allelic mismatches among all pairs of 181 isolates (Fig. 1A) was consistent with phylogenetic structure: isolates belonging to 182 distinct major phylogenetic lineages differed by 1,500 loci or more out of 1,748 183 loci, isolates from different sublineages within a given lineage typically showed 184 between 1,000 and 1,400 allelic differences, and most isolates within the same 185 186 sublineage were up to 150 allelic mismatches distant. Moreover, clustering efficiency was optimal between 140 and 150 allelic mismatches (Supplementary 187 188 Information 2.7). Therefore, a threshold of 150 allelic mismatches (8.58%) dissimilarity) was chosen to define sublineages. This cut-off value led to the 189 190 identification of 163 sublineages. Remarkably, the flat rarefaction curve obtained 191 for sublineages within lineages I and II suggests that this study has captured most 192 of the phylogenetic sublineages of these two epidemiologically major lineages (Fig. 1B). In contrast, the almost linear rarefaction curve of CT richness indicates that 193 the 1,013 CTs sampled represent only a small fraction of those expected to be 194 uncovered upon further sampling (Fig. 1B), underlining the fine subtyping power 195 of cgMLST and its ability to subdivide *Lm* biodiversity into a multitude of 196 epidemiologically relevant genotypic groups. 197

We next analyzed the correspondence of sublineages with classical 7-genes MLST nomenclature.<sup>10–12</sup> Whereas 156 sequence types (STs) have been previously defined in the Institut Pasteur MLST database (now in BIGSdb-*Lm*, <u>http://bigsdb.pasteur.fr/listeria</u>), 63 new ones were identified, revealing a significant amount of novel diversity of *Lm* strains. MLST-defined CCs were

203 mapped onto the cgMLST-based phylogenetic structure (Supplementary 204 **Information 2.7**), largely revealing a one-to-one correspondence with cgMLST sublineages. Therefore, the MLST nomenclature was mapped onto sublineages 205 where possible (Supplementary Table 4). As expected, frequent sublineages 206 corresponded to previously recognized major MLST clones.<sup>10–12,25,30</sup> As a result, the 207 sublineage cgMLST-based nomenclature can be easily matched with the widely 208 used MLST nomenclature, which remains a valuable tool for first line identification 209 210 of sublineages.<sup>31</sup>

211

## 212 Evidence for international spread of Lm strains

To investigate international transmission of Lm strains, we first mapped the 213 214 geographic origin of isolates onto the phylogeny (Fig. 3A). All sublineages 215 represented by more than 50 isolates were recovered from at least four distinct 216 countries (Fig. 3B). Using a stochastic mapping approach to reconstruct ancestral states, we estimated the average number of cross-country transmission events as 217 ranging from 13 to 48 in the 10 most frequent sublineages (Fig. 3C and 3D). These 218 results show that subsequent to the evolutionary origin of major sublineages, 219 geographical shifts have occurred repeatedly. When normalizing the number of 220 geographical transitions by taking into account the number of isolates and 221 evolutionary time (jointly approximated by total tree length), large differences in 222 cross-country transition rates were apparent (Fig. 3D). Interestingly, the most 223 224 food-associated sublineages SL9 and SL121<sup>25</sup> had among the highest geographical transition rates. 225

To investigate international transmission at a more recent epidemiological timescale, we searched for internationally distributed CTs. Interestingly 9 CTs, comprising a total of 34 isolates, included isolates from at least two countries (**Fig. 4**, **Supplementary Table 6**). These results demonstrate the international distribution of genotypic groups of *Lm* isolates that exhibit levels of genetic divergence typical of those observed within documented outbreaks and transmission events.

233

### 234 Temporal accumulation of variation within Lm lineages and outbreaks

235 Phylogenetic analysis of the most prevalent sublineage (SL1) (Supplementary 236 
 Table 5) showed that the root-to-tip distances were significantly associated
 237 (*p*<0.0001, F-test) with the isolation year of isolates (**Fig. 5B**). The inferred slope of 238 the linear regression indicated an accumulation of 0.23 allelic mismatches per 239 cgMLST profile (i.e., 1.58 Mb) per year. BEAST analysis of the concatenated multiple sequence alignments confirmed the existence of a temporal signal 240 (Supplementary Information 2.8) and estimated an evolutionary rate of 2.6x10<sup>-7</sup> 241 subst/site/year (0.41 subst/1.58Mb/year), i. e. 1 substitution on the core genome 242 every 2.5 years (95% HPD=[1.9-3.4]). We also estimated independently the rate of 243 SL9, as a representative of major lineage II. Remarkably, the SL9 rate was 2.4x10<sup>-7</sup> 244 subst/site/year (0.38 subst/1.58Mb/year), indicating a highly similar rate in SL1 245 and SL9. These results demonstrate measurable evolution of *Lm* genomes over a 246 247 few decades and provide an estimate of the short-term rate of accumulation of genetic variation in representative sublineages of the two major lineages of Lm. 248 Based on the hypothesis that the substitution rate is conserved in *Lm*, we 249

250 estimated that the root of the other major sublineages was 50 to 150 years old 251 (Supplementary Information 2.8). Note that these estimates must be taken with care: the rate may vary in some sublineages, and it is likely that our sampling has 252 missed some divergent branches, implying that our estimates are minimal ages. 253 Nevertheless, our current age estimates suggest an expansion of major sublineages 254 in modern times. Whether the dissemination of *Lm* was driven by an increase in 255 the intensity of exchange of people, animals and food in recent times is an 256 257 intriguing possibility.

258 *Lm* can survive for long periods of time in various sources, where genetic diversification from a single population founder can occur.<sup>15,20,32</sup> Consistently, we 259 260 observed that allelic divergence within outbreak sets and international clusters was positively associated with the time span between the first and last isolate 261 collected (*p*<0.05, F-test; **Fig. 5C**), with an accumulation of 0.28 allelic mismatch 262 per year, highly consistent with the phylogenetic tree-based evolutionary rate 263 estimate. These results illustrate the importance and possibility of taking the 264 265 temporal dimension into account when interpreting genomic data in the context of persistent contaminations.<sup>20</sup> 266

The phylogeny of SL1 (**Fig. 5A**) showed that outbreaks strains were dispersed in multiple branches, suggesting that all SL1 isolates have the potential to cause outbreaks. Moreover, it demonstrated that the multiple outbreaks caused by this sublineage, previously called 'epidemic clone ECI',<sup>30</sup> are actually independent epidemiological events. The most recent common ancestor of SL1 was estimated to have existed around 1876 (95% HPD=[1861-1891]), reinforcing the idea that extant SL1 isolates do not derive from a single recent epidemic. 274

## 275 Biological features of Lm sublineages and CTs

Important genomic differences among sublineages are shown in Fig. 6. PCRserogroup distribution across the phylogenetic tree was consistent with previous
knowledge, with major PCR-serogroups being strong markers of the main divisions
of *Lm* diversity.<sup>10,33,34</sup> In contrast, PCR-serogroup variant IVb-v1<sup>35</sup> was found in
various branches. Likewise, and as expected, serogroup L<sup>35</sup> was present in lineages
III and IV, but also in lineage I. These results underline that caution is needed when
interpreting molecular serotyping data for *Lm* epidemiological purposes.

283 The screening for virulence and stress resistance genes showed important 284 differences among *Lm* lineages and sublineages (Fig. 6). As expected, the major 285 pathogenicity island LIPI-1 was highly conserved. A complete LIPI-3<sup>36</sup> was almost exclusively detected within lineage I. The recently described LIPI-4<sup>25</sup> was nearly 286 universally present in SL4 and closely related sublineages (Fig. 6), and was also 287 found in few other isolates, including in lineages III and IV. inlA alleles encoding 288 truncated InlA variants, which are associated with hypovirulence,<sup>37</sup> were observed 289 in most isolates of lineage II sublineages SL9, SL31, SL121, SL199 and SL321 (Fig. 290 6 and Supplementary Information 2.9) and were significantly associated with 291 food and food-production isolates (p<0.0001). The presence of a non-disrupted 292 form of the *comK* gene, involved in intracellular survival switch and biofilm 293 formation<sup>38,39</sup>, was dispersed across multiple sublineages and far more frequent in 294 295 lineage I than in lineage II (79% vs 38%, respectively, p < 0.0001, Fisher's exact test). Finally, genes that confer resistance to benzalkonium chloride, a major 296 disinfectant applied on food-industry surfaces,<sup>40</sup> were significantly associated 297

(*p*<0.0001, Fisher's exact test) with lineage II and particularly frequent in SL121,</li>
consistent with persistence of this clonal complex in food processing plants.<sup>41</sup>
Taken together, these results demonstrate the strong heterogeneity among *Lm*sublineages with regards to genomic features involved in either pathogenesis or
food contamination.

304 Discussion

305 Listeriosis surveillance is currently organized almost exclusively at national levels, thereby limiting our capacity to trace sources of infections involving international 306 transmission through food trade or human travel. An efficient global laboratory 307 surveillance system would consist of three parts: standardized methods and 308 databases, open sharing of data between public health laboratories, and rapid 309 communication about outbreaks. Here, we have addressed these issues by 310 311 developing a genome-wide genotyping system validated on a large international collection of *Lm* strains. Furthermore, we have set up an openly accessible 312 313 database and analysis tool (BIGSdb-*Lm* at <u>http://bigsdb.pasteur.fr/listeria</u>), which 314 provides a unified nomenclature that will ease global communication on *Lm* 315 genotypes. Real-time incorporation of genotypic variation of future *Lm* isolates 316 uncovered through prospective genomic surveillance will enable global coordination of epidemiological surveillance. 317

318

Although alternative sets of cgMLST loci (Supplementary Information 2.3) have 319 been recently proposed for *Lm* typing,<sup>19,24</sup> the scheme developed here in the 320 context of a global collaboration contains more genes, was validated using isolates 321 from diverse origins, and was extremely reproducible when comparing the results 322 from independent allele calling approaches. We also show that cgMLST has a far 323 greater discriminative power than PFGE when applied to the prospective 324 325 surveillance of isolates. It is worth noting that although we already identified 1,013 CTs, they represent only a small fraction of existing CTs that will be revealed by 326 future genomic surveillance (Fig. 1B), indicating that referenced CTs should 327

rapidly surpass the number of PFGE types distinguished during 20 years of 328 329 PulseNet surveillance (4,119 unique ApaI/AscI combinations among 21,158 isolates with PFGE as of December 21, 2015). The largely improved refinement of 330 *Lm* genotyping using cgMLST is expected to (*i*) reduce in size clusters accurately 331 detected by PFGE, (ii) erase clusters falsely inferred from PFGE, and (iii) allow 332 detecting earlier, clusters that would likely remain ignored when belonging to 333 hyper-prevalent PFGE profiles. Together, these highly significant improvements of 334 335 *Lm* typing will strongly reduce and even eliminate unnecessary epidemiological investigations, which is a major drawback of the lack of discrimination of the 336 337 current standard PFGE, and will help to identify the food source of clusters of 338 human cases by refining the definition of cases in case-control studies.

339

340 The analysis of a large and geographically diverse collection of *Lm* genomes also 341 allowed us to determine the population structure of this species with 342 unprecedented precision. The sharp discontinuities observed within the phylogenetic diversity of *Lm* allowed to identify and define sublineages 343 unambiguously, which will constitute the basis of a universal genome-based 344 nomenclature. This nomenclature has the advantage of being congruent with the 345 previously widely adopted 7-genes MLST nomenclature and the corresponding 346 major clinically- and food-associated CCs.<sup>10,25</sup> In addition, by including a large 347 number of sets of epidemiologically related isolates, we could also define cgMLST 348 349 types relevant for epidemiological purposes using a statistically optimized cut-off. As cgMLST dissimilarity is highly congruent with phylogenetic relationships, *Lm* 350 strains can be assigned with high confidence to sublineages and types based on 351

their cgMLST profile. Because this does not require a multiple sequence alignment step, this approach is considerably faster than sequence-based identification, and easier to interpret by microbiologists, epidemiologists and public health professionals. Thus, CT classification is poised to become a universal tool for cluster detection and international communication during regional or global *Lm* outbreaks.

358

359 By applying genomic sequencing to a large collection of *Lm* isolates from diverse geographic origins, we were able to clearly demonstrate repeated international 360 361 transmission of multiple sublineages of *Lm*. Further, we identified international groups of genetically highly related isolates, suggestive of recent cross-country and 362 363 intercontinental transmissions. These results provide a unique population-level based snapshot of *Lm* international transmission and suggest that cross-country 364 365 outbreaks that were recognized up to now<sup>17,42</sup> are only the tip of the iceberg of *Lm* long distance dissemination.<sup>43</sup> Given the retrospective nature of our analyses, we 366 were not able to identify the epidemiological links among isolates of these 367 international clusters, but these observations suggest that their detection in real 368 time would allow tracing back to common sources, and firmly establish the 369 importance of monitoring in real time the diffusion of Lm genotypes at the 370 international level. The cgMLST collaborative approach here developed makes this 371 goal achievable and paves the way for future research aimed at better 372 understanding the routes and contributing factors of *Lm* dissemination. 373

374

375 We calibrated the short-term evolutionary rate of Lm genomes, and could 376 therefore provide a quantitative estimate of the widely recognized view that *Lm* genomes are highly stable.<sup>12,44,45</sup> Because cgMLST types diversify slowly (roughly 377 0.2 alleles per year), greater discrimination may be needed to decipher short-term 378 patterns of transmission.<sup>17,18</sup> Therefore, to fully harness the power of genomic 379 sequencing for *Lm* epidemiology, multi-approach strategies can be applied, 380 including the use of pan-genomic MLST and reference-based SNP-calling. However, 381 382 in contrast to MLST, genome-wide SNP-based approaches do not rely on predefined genomic loci and require *ad-hoc* reference sequences, thus being more 383 384 complex to standardize. In this context, the genotyping method and publicly shared nomenclature developed herein will represent a pivot element of collaborative 385 approaches to control the burden of *Lm* infections at the global scale. 386

388 Methods

#### 389 Bacterial isolates

A total of 1,696 *Lm* genomes were included in the main dataset (1,055 human 390 isolates, 475 isolates from food and food-processing environments, and 166 391 isolates from other or unknown sources; **Supplementary Table** 392 1: **Supplementary Figure 1**), comprising isolates collected between 1960 and 2015, 393 mostly from North America and Europe. This set included the 104 genomes 394 395 representative of the clonal diversity of *Lm* used for core genome definition,<sup>25</sup> genomic sequences from isolates collected in the context of Lm surveillance 396 397 programs in Canada (n=36 isolates), Denmark (n=224), France (n=112), the United Kingdom (n=448) and the United States (n=758), and 14 genomes from a German-398 399 Austrian outbreak.<sup>17</sup> This collection included (*i*) prospectively collected isolates as 400 well as (ii) isolates collected in the frame of outbreak investigations or mother-401 child transmission cases (Supplementary Table 1; Supplementary Figure 1). In 402 addition, 34 historical isolates (Supplementary Table 5), were included for 403 analysis of *Lm* evolutionary rates. DNA extraction, library preparation and Illumina sequencing using MiSeq, NextSeq or HiSeq instruments were performed locally in 404 each reference center. Sequence assembly was performed using BioNumerics v.7.5 405 (Applied Maths NV, Sint-Martens-Latem, Belgium) or CLC Assembly Cell 4.3.0 406 (Qiagen, Aarhus, Denmark). Provenance data and genomic assembly details of the 407 1,696 isolates are listed in **Supplementary Table 1**. 408

### 410 Validation of a universal cgMLST scheme for Lm genotyping

411 A previously defined *Lm* core genome with 1,791 loci<sup>25</sup> was further refined by removing genes present in less than 95% of 957 high-quality genome sequences 412 (Supplementary Figure 1), genes with close paralogs and genes belonging to the 413 seven MLST scheme (**Supplementary Information 2.1**). This filtering procedure 414 led to a final subset of 1,748 core genes, here referred as the Lm cgMLST scheme 415 (Supplementary Tables 2 and 3). The levels of diversity, selection and 416 417 recombination were quantified for each cgMLST locus (Supplementary 418 **Information 2.2**). The robustness of cgMLST genotyping was tested using both 419 assembly-free and *de novo* assembly-based methods, to control that allelic profiles 420 generated by the two approaches are consistent and to exclude potential assembly 421 artefacts. The performance of different assemblers was also tested at different 422 sequencing coverage depths (**Supplementary Information 2.4**).

423

## 424 Comparison of cgMLST and PFGE genotyping

To compare cgMLST with PFGE for *Lm* strain typing, we analyzed in parallel 100 425 426 isolates (57 human isolates, 33 food isolates and 10 isolates from food production environments) prospectively collected between January and April 2015 in the 427 frame of the French listeriosis surveillance system by the National Reference 428 Center for Listeria (Institut Pasteur, France). PFGE restriction profiles were 429 430 obtained using the enzymes AscI and ApaI according to PulseNet standardized procedures (http://www.cdc.gov/pulsenet/PDF/listeria-pfge-protocol-508c.pdf) 431 and were analyzed using BioNumerics. PFGE and cgMLST typing results were 432

compared using Simpson's index of diversity and the adjusted Wallace index of
concordance (see Supplementary Information 2.5 for details).

435

## 436 *Phylogenetic and clustering analyses*

The phylogenetic relationships of the 1,696 isolates were inferred based either on 437 the allelic profiles or on the recombination-purged multiple sequence alignments 438 of the 1,748 loci (see **Supplementary Information 2.6** for details). Single-linkage 439 440 clustering analysis was performed from the *p*-distances among allelic profiles (cgMLST allelic distances, *i.e.* proportion of mismatched loci among those that are 441 442 called in both strains). Clustering efficiency (*i.e.* optimizing both compactness 443 within clusters and separateness among clusters) was assessed with Dunn's index 444 (**Supplementary Information 2.7**) using different allelic mismatch thresholds.

445

## 446 Phylogeography and temporal analysis

Geographical transitions within major sublineages were inferred from FastME v.2.07 trees using discrete trait transition modelling based on 100 simulations with the make.simmap tool in the phytools R package.<sup>26,27</sup> Once the ancestral states were estimated, the total number of character changes was computed from the resulting set of trees, using the count.simmap function within the same R package.<sup>27</sup>

To estimate the evolutionary rate of sequences and cgMLST profiles, 22 historical isolates belonging to MLST clonal complex CC1 and 12 isolates from clonal complex CC9, collected between 1921 and 1974, were analyzed jointly with the isolates from sublineages SL1 and SL9 (see below) from the main dataset

(Supplementary Information 2.8, Supplementary Tables 1 and 5). 457 Phylogenetic analyses were performed using FastME on p-distances estimated 458 from either concatenated multiple sequence alignments or cgMLST profiles. Linear 459 regression of the root-to-tip distances against the year of isolation was carried out 460 using Path-O-Gen v1.4 (http://tree.bio.ed.ac.uk/software/pathogen/). The rate of 461 evolution of SL1 and SL9 genomes were independently estimated from the 462 concatenated multiple sequence alignments of the 1,748 loci using BEAST v.2.3.1<sup>28</sup>. 463 464 For this analysis, Gubbins<sup>29</sup> was used to detect recombination within the alignments. Isolates with recombinant regions were discarded from the alignments 465 466 (Supplementary Information 2.8). Subsequently, the mean of the rates of SL1 and SL9 (2.5x10<sup>-7</sup> substitutions per site per year) was used to estimate the age of 467 all major sublineages using BEAST v.2.3.1<sup>28</sup>. Details of the temporal analysis 468 methods are given in **Supplementary Information 2.8**. Genetic divergence as a 469 470 function of the time span between the first and last isolate of outbreak sets and international clusters was evaluated using regression analysis. 471

472

## 473 Determination of PCR serogroups, virulence and resistance genes profiles

To investigate the biological differences among sublineages, the PCR-serogroup and the presence of 76 loci involved in virulence or resistance were deduced *in silico* from genomic sequences using the BIGSdb platform<sup>23</sup> for each of the 1,696 genomes (see **Supplementary Information 2.9** for details).

478

479 Online implementation of an open bioinformatics platform for Lm strain
480 nomenclature and genome analysis

481 To make the cgMLST-based nomenclature sharable and expandable, the Lm 482 cgMLST scheme was implemented in an integrative database and analysis platform (BIGSdb-Lm) powered by the BIGSdb v.1.10<sup>23</sup> bioinformatics tool. To unify Lm 483 genotyping resources, the classical 7-gene MLST scheme was transferred into the 484 BIGSdb-*Lm* platform. Openly accessible predefined schemes for molecular 485 serogrouping and for virulence and resistance gene analyses were also 486 incorporated in the BIGSdb-Lm platform. BIGSdb-Lm is publicly accessible at 487 488 http://bigsdb.pasteur.fr/listeria.

489

## 490 Accession numbers

FASTQ data files were deposited in NCBI-SRA and EBI-ENA public archives under
the project's accession numbers PRJEB12738 (Institut Pasteur), PRJEB14476
(Statens Serum Institut), PRJNA248549 (Public Health England) and PRJNA212117
(Centers for Disease Control and Prevention). The accession numbers of all isolates
are indicated in Supplementary Table 1.

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#### 635 Author contributions

636 This study was designed by SB, ML, PGS and BP. Selection of isolates was carried out by 637 EMN, CN, VCF, AL, AR, KG, TD and LSK. DNA preparation and sequencing was performed 638 by HBD, VCF, AL, CT, HC, SS, ZK, JTB, AR, CN, KG, MW and VE. PFGE analysis was performed 639 by HBD, VCF, AL and AM. Sequence analysis was carried out by AM, HP, TC, LK, HC, JTB. 640 Definition of core genome was done by MMM, EPCR, MTouchon. Validation and 641 reproducibility of cgMLST loci was performed by AM, HP and EL. Phylogenetic and 642 clustering analyses were carried out by AM and AC. Online database implementation was 643 done by LJ, AM and SB. Epidemiological data analysis was performed by MTourdjman, AL, 644 AM, TD, KG, EMN and CT. AM and SB wrote the manuscript, with contributions and 645 comments from all authors.

646

#### 647 Additional information

648 Correspondence and requests for materials should be addressed to ML and SB.

649

#### 650 **Declaration of interests**

HP and BP are co-developers of the BioNumerics software mentioned in the manuscript.

The remaining authors declare no competing interests.

## 654 Legends to figures

655 Figure 1. Nomenclature of Lm cgMLST profiles. A) Distribution of the number of 656 cgMLST allelic differences between pairs of isolates among the 1,696 genomes (blue) and 657 within 49 sets of epidemiologically related isolates (426 isolates in total; red). Dashed bars 658 represent cut-off values for cgMLST types (CT, 7 allelic mismatches) and sublineages (SL, 150 allelic mismatches). Inset: global dataset; Main figure: up to 200 allelic mismatches. B) 659 660 Rarefaction curves of the number of sublineages and cgMLST types identified, broken 661 down per main phylogenetic lineage (I-IV). Curves were estimated using 100 random 662 samples per point. Inset: zoom on the 0-50 X-axis values. Lineages III and IV were pooled 663 but must be sampled more extensively to determine the shape of the curve.

664

665 Figure 2. Phylogenetic structure of the global Lm dataset. A) Phylogeny of the four 666 phylogenetic lineages (I, red; II, orange; III, green; IV, blue). Representative isolates of the 667 four lineages were used to determine the location of the root, using L. innocua and L. 668 *marthii* as outgroups. The tree was obtained using FastME on the p-distance of the 1,748 669 concatenated alignments. B) Comparison of the phylogeny obtained from 1,748 670 recombination-purged sequence alignments (left) and from cgMLST allelic profile 671 distances (right). To reduce redundancy, only one strain per outbreak set was used. Scale 672 bars indicate the % of nucleotide substitutions (A right and B left) and the % of allelic 673 mismatches (B right). For practical reasons, bootstrap values (based on 500 replicates) 674 are shown only for long internal branches.

675

676 Figure 3. International distribution of Lm sublineages. A) Clustering of 1,696 Lm 677 isolates based on single-linkage analysis of the cgMLST profiles. Lineage branch colours 678 are as in Fig. 2. Light and dark grey alternation (inner circle) delimitates sublineages with 679 more than 10 isolates (main sublineages are labelled). Source country is represented in 680 the external ring using the colour key from panel C. B) Number of countries from which a sublineage was isolated, as a function of number of isolates per sublineage. Disk size is a 681 682 function of number of isolates per sublineage. C) Inferred geographical origin of ancestral 683 nodes of the phylogeny of sublineage 1. Pie charts represent the likelihood proportion of 684 geographical origins. The tree was constructed using minimum evolution based on 685 cgMLST profiles. Bootstrap values above 50% (based on 500 replicates) are shown for the 686 major nodes. D) Absolute number of geographical transitions (left) and number of 687 geographical transitions normalized by total branch length (right) within the 10 most 688 frequent sublineages, as inferred by stochastic ancestral state reconstructions (numbers in parentheses indicate the precise values inferred for each sublineage). 689

690

**Figure 4. International groups of isolates classified into the same cgMLST type.** The 9 groups of isolates are indicated by a specific colour. The genotype is indicated as a string consisting of a succession of lineage (e.g., L1), sublineage (e.g., SL1), sequence type (e.g., ST1) and cgMLST type (e.g., CT288). Countries of isolation, isolation year range and total number of isolates are given after the genotype string. The circles on the map indicate the country where a particular CT was isolated and their size is related to the number of isolates from that country. The details of each CT are given in Supplementary Information. Abbreviations: L, lineage; ST, sequence type; SL, sublineage; CT, cgMLST type; US, United
States of America; CA, Canada; DK, Denmark; UK, United Kingdom; FR, France.

700

701 Figure 5. Temporal analysis of cgMLST profiles evolution. A) Best-fitting rooted 702 phylogeny of SL1 isolates (n=195), including the historical isolates. The tree was obtained 703 using FastME on cgMLST profiles. Coloured blocks represent the isolation time range 704 (1921-1950, pink; 1951-1980, purple; 1981-2010, blue; 2011-2015, green). Outbreak 705 reference strains are indicated by red dots. Outbreak identifier, country, year and cgMLST 706 type are provided on the right. The scale bar indicates the number of allelic substitutions per locus. Statistical significance was assessed using F-test. B) Linear regression of 707 708 isolation year with root-to-tip cgMLST distance. C) Accumulation of cgMLST variation over 709 time, determined based on the international CTs (n=9) and outbreak sets (n=49). 710 Statistical significance was assessed using F-test.

711

712 Figure 6. Virulence and resistance profiles across the phylogeny of the 1,696 Lm 713 isolates. A) Cluster analysis based on cgMLST profiles. The dotted vertical bar indicates 714 the cgMLST mismatch cut-off for sublineages (SL). The 10 most frequent sublineages are 715 highlighted. B) Pattern of gene presence (color line) or absence (white). The first and last 716 columns corresponds to the serogroup and sample source, respectively, represented by color codes (upper left key). The presence/absence gene matrix represents, from left to 717 718 right, genes involved in teichoic acid biosynthesis (*gltAB, tagB, gtcA*), genes located in the 719 pathogenicity islands LIPI-1 (prfA, plcA, hly, mpl, actA, plcB), LIPI-3 (llsAGHXBYDP) and 720 LIPI-4 (LM9005581\_70009 to LM9005581\_70014), genes coding for internalins 721 (*inlABCEFGHJK*), and other genes involved in adherence (*ami*, *dltA*, *fbpA*, *lap*, *lapB*), 722 invasion (aut, aut\_IVb, cwhA, lpeA, vip), intracellular survival (hpt, lplA1, oppA, prsA2, purQ, 723 svpA), regulation of transcription and translation (agrAC, cheAY, fur, lisKR, rsbV, sigB, stp, 724 virRS), surface protein anchoring (lgt, lspA, srtAB), peptidoglycan modification (oatA, 725 pdgA), immune modulation (IntA), bile-resistance (bsh, mdrM, mdrT, brtA), resistance to 726 detergents (*qac*, *bcrABC*, *ermE*) and biofilm formation and virulence (*comK*).

Figure 1

Α



В

# Figure 2

Α



В



0.01

Figure 3

Α





## Figure 4



## Figure 5



<u>⊢0.01</u>

