

High-Resolution Typing of Staphylococcus epidermidis Based on Core Genome Multilocus Sequence Typing To Investigate the Hospital Spread of Multidrug-Resistant Clones

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- 1 High resolution typing of Staphylococcus epidermidis based on cgMLST to investigate
- 2 the hospital spread of multidrug resistant clones

- 4 Running title: A cgMLST scheme for Staphylococcus epidermidis typing
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Abstract (max 250 words)

- 34 Staphylococcus epidermidis is a pathogen emerging worldwide as a leading cause of health-
- 35 care associated infections. A standardized high-resolution typing method to document
- transmission and dissemination of multidrug-resistant S. epidermidis strains is needed. Our 36
- 37 aim was to provide a core genome multilocus sequence typing (cgMLST) typing scheme for
- S. epidermidis to improve the international surveillance of S. epidermidis. 38
- 39 We defined a cgMLST scheme based on 699 core genes and used it to investigate the
- 40 population structure of the species, and the genetic relatedness of isolates recovered from
- infants hospitalized in several wards of a French hospital. Our results show the long-lasting 41
- 42 endemic persistence of S. epidermidis clones within and across wards of hospitals and
- 43 demonstrate the ability of our cgMLST approach to identify and track these clones.

We made the scheme publicly available through the Institut Pasteur BIGSdb server (http://bigsdb.pasteur.fr/epidermidis/). This tool should enable international harmonization of the epidemiological surveillance of multidrug-resistant *S. epidermidis* clones. By comparing gene distribution among infection and commensal isolates, we also confirmed the association of the *mecA* locus with infection isolates and of the *fdh* gene with commensal isolates.

Introduction

Staphylococcus epidermidis, a member of coagulase-negative staphylococci, is an abundant and ubiquitous resident of the human skin and mucosal microbiota (1). The most frequently isolated microorganisms in intensive care units (ICU)-acquired bloodstream infections are coagulase-negative staphylococci, among which S. epidermidis is prominent (2). S. epidermidis infections are almost exclusively associated with health care and occur primarily in patients with implanted medical devices, such as intravascular devices or orthopaedic and cardiac implants. In addition, neonates and immunocompromised patients represent a population at particular risk for nosocomial infections (3). The ability of S. epidermidis to form biofilms contributes to the chronicity and difficulties to treat these infections (3, 4).

The proportion of MRSE (methicillin resistant *S. epidermidis*) among clinical isolates is greater than 70% (5), leading to the probabilistic prescription of vancomycin in patients with suspected *S. epidermidis* infections. Resistance to linezolid is rare but emerging (5, 6). The emergence and global spread of multidrug-resistant *S. epidermidis* clones causing invasive diseases has been largely documented (7, 8). In addition, the transmission of *S. epidermidis* strains among patients and between patients and medical staff, mostly in neonatal intensive care units, is possible (3, 9-11). However, the significance of *S. epidermidis* transmission is likely to be underestimated, and the identification of subtypes that could represent higher risks for transmission or pathogenesis, remains difficult using available subtyping methods.

The classification of *S. epidermidis* isolates has so far largely relied on Multilocus Sequence Typing (MLST) based on the sequencing of 7 conserved loci (12). This typing method allows the assignment of a Sequence Type (ST) to each unique allelic profile. STs can be grouped into clonal complexes (CCs) with eBURST algorithm (13). While an extensive strain-level diversity has been observed between healthy individuals (1), only a few health-care associated clones are found in hospital environments worldwide (4, 14). Indeed, more than 50% of the clinical strains and less than 10% of the community strains belong to a clonal complex encompassing ST2 and ST5 (4, 5, 14). The global dissemination of these two genotypes suggests an adaptation to the hospital environment. ST2 strains are almost all resistant to methicillin (15, 16). Similar to the closely related *S. aureus* species, the *mecA* gene confers resistance to methicillin and is found within the SCCmec (staphylococcal cassette chromosome *mec*) genomic island (17, 18).

The high-resolution whole-genome sequencing (WGS) approach has been used to study S.

epidermidis linezolid-resistant isolates epidemiology (6, 19). A major insight from WGS-based epidemiological studies is the description of long-lasting endemic persistence of *S. epidermidis* clones across wards of hospitals (20, 21).

The population structure of *S. epidermidis* is divided into three main phylogenetic lineages (17, 22), which encompass six previously defined clonal groups (23, 24). These subsets of *S. epidermidis* show distinct associations with clinical infections and carriage. Besides, they have distinctive genetic and phenotypic features including association with biofilm synthesis genes, SSCmec and antimicrobial resistance. However, both asymptomatic carriage and invasive isolates are found in all major phylogenetic groups (22), and the epidemiological relationships of carriage and invasive isolates need to be deciphered at microevolutionary timescales.

Genotyping of bacterial isolates is best performed with WGS for molecular epidemiological studies (25-28). Core-genome MLST (cgMLST) provides the high resolution of genome-wide methods while maintaining the benefits of standardization, reproducibility and portability of classical 7-gene MLST (28, 29). While infections with multidrug resistant *S. epidermidis* strains are an increasingly important issue in hospitals worldwide, an effective tool for international strain comparison is still lacking.

The main aims of this study were i) To define a cgMLST scheme for *S. epidermidis* genotyping; ii) To provide a publicly accessible international database for *S. epidermidis* genomic typing; and (iii) To investigate the genetic relatedness of isolates recovered from infants hospitalized in several wards of a French hospital, including a Neonatal Intensive Care Unit (NICU). We also explored the population structure of *S. epidermidis* and the association of previously reported marker genes and lineages.

Methods

Routine procedures for bacterial isolation from clinical samples

- The 25 isolates sequenced here were recovered from one healthy adult and from cultures
- performed routinely on clinical samples in the clinical microbiology laboratory at Necker-
- 114 Enfants Malades Hospital (Paris, France). The strains were grown on Columbia agar
- supplemented with 5% horse blood and incubated 24-48 h at 37°C (INCUCELL incubator,
- 116 MMM group, Germany). Coagulase-negative staphylococci isolates were identified at the
- species level by MALDI-TOF MS (Bruker Daltonics, Bremen, Germany).

Core genome MLST (cgMLST) scheme definition

For the determination of the cgMLST scheme, 5 closed S. epidermidis genomes and 299 draft 120 121 genome assemblies available at NCBI GenBank (on the 22th of December 2015) were 122 downloaded. We also downloaded 83 draft genome assemblies deposited by Meric et al. (17) 123 in the Dryad repository. All used assemblies are publicly available from the Institut Pasteur 124 instance of the BIGSdb database at https://bigsdb.pasteur.fr/epidermidis/. 125 Low quality assemblies were excluded based on the following criteria: assembled genome 126 size >150% of the reference genome; organism identified as non S. epidermidis as 127 determined using Kraken v0.10.5 (30) and Average Nucleotide Identity < 95% compared to 128 ATCC 12228 strain reference (GCF_000007645) (31). This resulted in the selection of 371 129 genomes for core genes definition. Supplementary table S1 provides a detailed description 130 of the strain collection used for the establishment of the cgMLST scheme (e.g., date of 131 isolation, geographic origin and source). 132 From this set we inferred the species core genome using the CoreGeneBuilder pipeline default 133 settings (26) and S. epidermidis ATCC 12228 strain (GCF 000007645) as a reference. The 134 pipeline's first step relies on the eCAMBer software (32), which consists of a de novo annotation of the genomes (except the reference) using Prodigal (33) and the harmonization 135 136 of the positions of the stop and start codons. In the next step, the core genome is inferred with 137 a bidirectional best hits (BBH) approach as previously described by Touchon et al. (34). We 138 used CoreGeneBuilder default settings. A gene was considered as part of the core genome if it 139 was found in at least 95% of the genomes under study. This resulted in an initial core genome 140 containing 1623 genes. We then filtered out some genes based on the following criteria. (i) 141 First, we removed 14 potential paralogous loci. The rationale behind this is that the presence 142 of paralogs inside a typing scheme can lead to ambiguities, as a candidate gene might be 143 attributable to two different core gene loci. To detect those potential paralogs, we compared 144 each allele of each locus against all the alleles of all the other loci using the software BLAT 145 (35). If a single hit was found between two different loci (more than 70% protein identity 146 between two alleles), we removed both loci. (ii) Second, we removed 840 loci whose length 147 varies among alleles, which is useful in reducing ambiguities during the genotyping process. 148 (iii) We also removed 10 loci for which alleles contained ambiguous characters. (iv) Last, we 149 removed 582 loci with variation within the start and stop codons; the rationale is that allele 150 calling relies on BLASTn, which may not produce full-length alignments when the start or stop codons differ, resulting in incomplete alleles. Note that these sets of filtered loci can 151 152 overlap. After applying these four steps, 699 core genes were retained and constitute our 153 cgMLST scheme.

cgMLST allele definitions and tagging of publicly available genomes using BIGSdb

The BIGSdb server is designed to host separately a database of allele sequence definitions and a database of genomic assemblies with attached source information (36). Newly imported assemblies were scanned using BIGSdb to designate alleles of each locus. A locus was tagged when its sequence had > 90% nucleotide sequence identity over at least 90% of the alignment length with a reference allele. In case of exact match with an allele found in the database, the locus was designated by the allele number. In case of partial match, if the locus corresponded to a protein-coding sequence (beginning with a start codon and ending with a stop codon), the allele was added to the allele database. Then, a subsequent scan allowed tagging isolates with novel alleles. A locus was considered missing when there was no match with alleles in the database.

- To evaluate the conservation of the chosen genes in an independent sample of the *S. epidermidis* population, we analyzed 289 additional genome assemblies from NCBI GenBank and from Harris *et al.* (4) that were not yet available at the time of scheme definition. The validation set is described in **Supplementary table S1.**
- 170 All assemblies, allele sequences designations and profiles are available at 171 http://bigsdb.pasteur.fr/epidermidis/.

Assessment of the population structure of S. epidermidis

The population structure of *S. epidermidis* was assessed based on 703 available genomes. To obtain the alignment required for the phylogenetic analysis, we extracted, for each genome assembly, the allelic sequences of the 699 loci. For each locus the alleles sequences were translated to proteins, aligned using MAFFT (37) and the G-INS-i algorithm, and backtranslated to nucleotide sequences, thus resulting in codon alignments. We finally concatenated the 699 alignments into one supermatrix, containing 703 sequences (isolates) and 539 151 sites (the nucleotide positions of missing alleles were replaced by gaps in the concatenate of alignments of individual loci). A phylogenetic tree was obtained with the maximum likelihood (ML) criterion after purging recombination using Gubbins v2.2.0 (38) with default parameters resulting in an alignment of 31,385 sites. RAxML v8.2.8 (39) was used for the phylogenetic inference under the GTRCAT model (final tree optimized under the GTRGAMMA model). The tree was drawn using iTOL (40).

The same methodology was applied to compare clusters obtained based on cgMLST allelic profiles with those observed by phylogenetic analysis of the concatenated allele sequences of the 699 core loci.

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Patients and isolates

- To evaluate the ability of cgMLST to identify potential transmission events within hospital
- settings, we selected 25 isolates including 24 clinical isolates from patients hospitalized in
- several wards between November 2014 and August 2016.
- The 25 isolates were recovered from 21 hospitalized individuals (16 hospitalized neonates and
- 5 hospitalized children) and one non-hospitalized healthy adult. All neonates have stayed in a
- NICU, 3 children have stayed in a gastroenterology ward and 2 children have stayed in an
- orthopedic ward. One isolate was sequenced per patient except for 3 patients who had 2
- isolates sequenced (patients 3, 7 and 21). Information on patients and sources of isolates is
- summarized in **Table 1**.
- 200 The study of S. epidermidis clinical isolates collected from the Necker-Enfants Malades
- Hospital was approved by the ethics review board of our institution and registered with
- 202 clinicaltrials.gov Identifier#NCT03374371. All experiments were performed in accordance
- with the guidelines and regulations described by the Declaration of Helsinki and the low
- 204 Huriet-Serusclat on human research ethics and informed consent was obtained for all
- participating subjects.

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Whole-genome sequencing and assembly

- 208 DNA extractions were performed on pure culture using DNeasy Blood and Tissue Kit
- 209 (Qiagen) following manufacturer's instructions with addition of lysostaphin (Sigma) to the
- 210 Gram-positive lysis buffer (final concentration 20 µg/mL).
- Whole-genome shotgun libraries sequenced on an Illumina MiSeq sequencing platform (2 x
- 212 150 bp paired-end reads) were prepared with the Nextera XT Kit (Illumina). Whole-genome
- shotgun libraries sequenced on an Illumina HiSeq-2500 sequencing platform (2 x 130 bp
- paired-end reads) were prepared with the Ovation Ultralow V2 kit (NuGEN).
- Reads were trimmed using Trimmomatic v0.36 (41) and assembled using SPAdes v3.9.0 (42).
- 216 De novo assemblies quality was assessed with QUAST (43). In silico MLST was performed
- on the de novo assemblies with MLST v2.6 (https://github.com/tseemann/mlst). De novo
- assemblies were imported and scanned in BIGSdb.

Cluster analysis of clinical isolates using BIGSdb

221 To validate the ability of cgMLST to cluster related isolates, we first used sequence data from 222 a recently published study of linezolid resistant isolates (6). Raw Illumina reads (accession 223 number SRP039360) were downloaded from NCBI Sequence Read Archive (SRA) and 224 processed as newly sequenced genomes. Assemblies were imported and scanned in BIGSdb 225 except isolate UCLA-Sa-LR-01, which was discarded due to poor quality of its de novo 226 assembly. We also tested our cgMLST scheme using the 25 newly sequenced clinical isolates 227 (Table 1). The PHYLOViZ tool (integrated as a plugin of BIGSdb) was used to generate 228 minimum spanning trees based on the cgMLST allelic profiles (44). Here, clusters were 229 defined as groups of genotypes showing ≤ 21 cgMLST allele mismatches with at least one 230 other member of the group.

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- 232 Data availability
- 233 This Whole Genome Shotgun project has been deposited in GenBank under the Bioproject ID
- 234 PRJNA608162.
- All assemblies, sequences and their allelic designations and cgMLST profiles are available
- 236 from the Institut Pasteur BIGSdb database access web page at
- 237 https://bigsdb.pasteur.fr/epidermidis/.

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Results

- Definition and evaluation of a cgMLST scheme for S. epidermidis using public genomes
- Using 371 publically available genomes, we developed a cgMLST scheme consisting of 699
- core-genes, which includes 30% of the 2,348 CDS of S. epidermidis ATCC 12228 reference
- 243 genome. As shown in **Supplementary figure S1**, the distribution along the *S. epidermidis*
- genome of the 699 cgMLST genes was even.
- To evaluate the conservation of gene loci of the newly defined cgMLST scheme, a
- validation set of 289 additional publically available genome assemblies was analyzed (NCBI
- 247 genomes, last accessed on Sept. 27th, 2017). These additional genomes were made public after
- the definition of our cgMLST scheme and thus represent a non-overlapping strain collection.
- These genomes had 97.5% tagged loci on average, showing that the cgMLST scheme loci are
- 250 highly conserved, and can therefore be expected to be mostly present in future sequenced
- 251 genomes. Supplementary figure S2 shows the distribution of the number of missing loci
- among the 699 genes of the scheme.

The cgMLST genotyping system is publicly available through the Institut Pasteur BIGSdb server (https://bigsdb.pasteur.fr/epidermidis/).

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Population structure of S. epidermidis genomes

- We next used 703 genomes to assess the phylogenetic structure of S. epidermidis based on
- 258 cgMLST gene sequences (Supplementary Figure 1), which confirmed that the population is
- 259 divided into 3 main clades (A-C) as previously reported (17). Most of the isolates belong to
- clade A, which encompasses clonal groups 5 and 6 associated with the two major nosocomial
- clones, ST2 and ST5 respectively (23, 24).
- The supplementary figure S3 shows the concordance with clades A, B and C as defined
- previously by Méric and colleagues (17), with the clonal groups defined previously (23, 24),
- and with classical 7-gene MLST.
- In addition to the core genes, we scanned the assemblies for the presence of accessory genes
- associated with the SCCmec locus (mecA, ccrA and ccrB) and the ica genes associated with
- 267 biofilm formation capacity through polymeric N-acetyl-glucosamine (PNAG) synthesis. In
- 268 addition, we searched for the putative commensal marker fdh encoding a formate
- dehydrogenase (14).
- 270 The distribution of SCCmec associated genes among infection and commensal isolates
- showed a positive association between infection strains and the SCCmec locus (Fisher <1e-3)
- 272 (**Figure 1**). The search of the co-occurrence of the *icaAD* genes, commonly used as a proxy to
- evaluate the biofilm formation potential of isolates (45), yielded no significant association
- 274 (Figure 1). In contrast, a positive association between commensal isolates compared to
- infection isolates was observed for the putative commensal marker gene *fdh* (Fisher <0.005)
- 276 (**Figure 1**).

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Application of the S. epidermidis cgMLST scheme to hospital linezolid-resistant isolates

- 279 To evaluate the ability of cgMLST to cluster S. epidermidis isolates, we analyzed the
- relationships among isolates from a previous study of linezolid resistant isolates (6).
- 281 All genomes had > 93% of tagged loci (95.5% on average). Cluster analysis based on
- 282 cgMLST allelic profiles showed 4 clusters and 1 outgroup isolate (Figure 2). The same
- 283 clusters were found after phylogenetic analysis of the concatenated sequences of core genes
- 284 (Figure 2). These results were concordant with the ones reported by Tewhey et al. based on
- the alignments of 2,093 core genes (6). However, there was no description of potential

epidemiological links between the isolates of this study, which were compared only because of their common phenotypic linezolid resistance.

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Application to S. epidermidis epidemiology in a French hospital

To assess the ability of cgMLST to cluster S. epidermidis isolates with defined epidemiological sources, we next sequenced 24 clinical isolates recovered from several wards of a pediatric French hospital and an isolate from a healthy adult (total of 25 sequenced isolates). The mean number of contigs was 211 (range, 137 to 410) (Table S2). After cgMLST genotyping of the genomic assemblies, the mean percentage of tagged loci was 97.6% (range, 96.1 to 100%) (Table S2). As expected, most isolates recovered from hospitalized patients (20 out of 24) belonged to ST2 (n = 12) and ST5 (n = 8) (**Table 1**). Nineteen isolates were grouped into 6 clusters (≤ 21 allele differences), whereas there were 6 ungrouped isolates (Figure 3). Five clusters were observed among isolates from the NICU during one year (span time of clusters ranging from 49 to 354 days), whereas another cluster contained isolates from the orthopedic and the gastroenterology wards. The maximum number of differing alleles among isolates of the same cluster was 21, whereas the minimum number of differing alleles between isolates of distinct clusters was 39 (Figure 3). For the 3 pairs of isolates recovered from 3 individual patients, collected between 7 to 38 days apart, we observed a maximum of 7 differences. The timeline shown in **Figure 4** illustrates that isolates belonging to the same cluster were sometimes found in patients hospitalized in distinct wards

(i.e., cluster IV in patients hospitalized in gastroenterology and orthopedic units) and in

patients hospitalized up to 1-year apart (i.e., cluster I for patients 3, 16 and 18).

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Discussion

S. epidermidis is a leading cause of bacteremia and device-related infections and can cause severe infections in immunocompromised patients and neonates. S. epidermidis infections are mostly caused by strains belonging to multidrug-resistant nosocomial clones ST2 and ST5 (5, 10, 19, 46). Our results corroborate the predominance of ST2 and ST5 among hospitalized patients. Although the 7-gene MLST has played an important role to recognize the worldwide emergence and nosocomial endemic persistence of multidrug-resistant clones, there is a need for higher resolution genotyping, allowing strain comparison within endemic clones. Moreover, standardization is paramount for worldwide tracking of strain dissemination and

recognizing subtypes with medically important properties. We therefore explored a core genome MLST (cgMLST) approach, which provides a high resolution and has the potential for a universal typing method both for epidemiological investigations and for population biology studies. Standardized cgMLST schemes are available for many pathogens including Klebsiella pneumoniae, Campylobacter jejuni, Campylobacter coli, Staphylococcus aureus and Listeria monocytogenes (28, 47-49). However, a cgMLST scheme has been lacking until now for *S. epidermidis*. The potential of the developed S. epidermidis cgMLST scheme to delineate closely related isolates was investigated by comparing genomes obtained from children hospitalized in several wards of the same hospital. Our analysis showed that the cgMLST scheme of 699 genes had an adequate discriminatory power to delineate distinct clusters of very closely related isolates within the same ST. The maximum allelic distance among epidemiologically related isolates (2 isolates recovered from 2 patients hospitalized several months apart in the orthopedic ward) was 21, and we chose this cutoff to define clusters. This relatively high number of differences is likely to reflect the fact that clones are able to persist several years in hospitals where they diversify and are likely transferred to patients on multiple occasions (7, 20, 21). For instance, Dortet et al. investigated a long-lasting outbreak spanning 2 years caused by linezolid-resistant S. epidermidis clones and report 22 ST2 isolates with 13 SNPs along their core genome (19). Our findings also show that several clones can co-exist and persist over months in a NICU. This is concordant with previous observations showing that patients acquire genetically related strains belonging to multidrug-resistant endemic clones that persist in clinical settings (10, 50). In addition, we leveraged the ability of the BIGSdb database tool to analyse the presence of genes of medical interest to compare the distribution of several putative marker genes associated with infection or carriage. We confirmed a positive association between infection strains and the SCCmec locus (22) and a positive association between commensal isolates and the fdh gene (14). The co-occurrence of icaAD genes has been proposed as a marker for biofilm formation ability (45) linked with isolate virulence. However, the presence of the *ica* locus does not always correlate with biofilm production in vitro (45). For instance in a study of 200 S. epidermidis isolates from hospitalized patients in Germany, among 124 icaADpositive isolates, only 49% were able to produce biofilm in vitro, whereas only 50% of in vitro biofilm-producing isolates were ica-positive (51). The weak correlation between ica presence and biofilm formation ability is corroborated by Du et al. who reported biofilm production in less than 60% of their *icaA*-positive isolates (52).

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In another study, when nosocomial isolates associated with infection or contamination were compared only *mecA*, but neither *icaA* nor *fdh*, was differentially found among infection and contamination isolates (24).

In conclusion, we developed a cgMLST scheme for WGS-based typing of *S. epidermidis*, integrated it in a publically available BIGSdb web application platform and illustrated its application to the molecular epidemiology of *S. epidermidis* in a French university hospital. We hope that the novel genotyping tool will contribute to allowing reproducible comparisons among clinical laboratories for the epidemiological surveillance and biological studies of *S. epidermidis* clones causing infections.

Author statements

- 368 Conflicts of interest
- The authors declare that there are no conflicts of interest
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- 371 (CRC17040); the sponsor was Assistance Publique des Hôpitaux de Paris (APHP)
- 372 (Département de la Recherche Clinique et du Dévelopement).
- 373 Ethical approval: The study of S. epidermidis clinical isolates collected from the Necker-
- Enfants Malades Hospital has been approved by the ethics review board of our institution and
- 375 registered with clinicaltrials.gov Identifier#NCT03374371. All experiments were performed
- in accordance with the guidelines and regulations described by the Declaration of Helsinki
- and the low Huriet-Serusclat on human research ethics and informed consent was obtained for
- all participating subjects.

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598	Figure legends
599	Figure 1. Distribution of gene presence and absence for mecA, ccrAB, ica and fdh loci
600	among 252 infection isolates and 194 commensal isolates from the BIGSdb database.
601	mecA encodes penicillin-binding protein 2 (PBP2); ccrA and ccrB encode cassette
602	chromosome recombinase A and B respectively; icaA and icaD genes are involved in
603	polysaccharide intercellular adhesin (PIA) production; fdh encodes a formate dehydrogenase.
604	There was a positive association between infection isolates and mecA, ccrA and ccrB loci
605	compared to commensal isolates (** Fisher<0.001) and there was a positive association
606	between commensal isolates and fdh locus compared to infection isolates (* Fisher <0.005).
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610	Figure 2. Comparison of cluster analysis based on cgMLST allelic profiles with
611	phylogenetic analysis based on core genes alignments for 20 linezolid-resistant isolates.
612	The minimum-spanning tree based on cgMLST allelic profiles is shown on the left side. The
613	tree was generated from allelic profiles of 699 core genes and visualised with PHYLOViZ.
614	Each node represents an isolate and is coloured according to the 7-loci ST. In silico MLST
615	performed on the de novo assemblies revealed that isolates UCLA-Sa-LR-14 (497) and
616	UCLA-Sa-LR-21 (503) had been erroneously assigned to ST24 and ST186-like respectively
617	in the original publication (6). We found that in fact both strains belonged to ST186. Black
618	numbers next to the nodes indicate the BIGSdb identifiers of each isolate. Red numbers on the
619	connecting lines indicate the number of core gene allele differences between adjacent nodes.
620	Link lengths are loosely related to the number of allelic differences.
621	The tree based on 699 core gene sequences alignments is shown on the right side. The tip
622	labels indicate the BIGSdb identifiers of each isolate.
623	Clusters reported by Tewhey et al. based on the alignments of 2,093 core genes (6) are
624	indicated by circles and letters (A, B, C and D).
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628	Figure 3. Comparison of clustering analyses based on cgMLST allelic profiles and on
629	core gene sequences alignment, for 25 S. epidermidis isolates sequenced in this study.
630	The minimum-spanning tree based on cgMLST allelic profiles is shown on the left side. The

tree was generated from allelic profiles of 699 core genes. Each node represents an allelic

profile and corresponds to a single isolate except the node corresponding to cluster VI where 2 isolates have the same profile. Nodes are coloured according to the ward where patients were hospitalised. Black numbers next to the nodes indicate the BIGSdb identifiers of each isolate. Red numbers on the connecting lines indicate the number of core gene alleles differences between adjacent nodes. Link lengths are not proportional to the number of allelic differences. Clusters of closely related genotypes (≤ 21 allele differences) are surrounded by circles and are numbered (I to VI). The tree based on 699 core genes alignment is shown on the right side. The tip labels indicate the BIGSdb identifiers and names of each isolate. Clusters are indicated by circles and are numbered (I to VI) as in the minimum-spanning tree. Figure 4. Timeline of the 21 hospitalized patients from which 24 S. epidermidis isolates were sequenced. The patient numbers indicated in the coloured boxes and the patient isolate numbers indicated between brackets correspond to those in Table 1. The clusters to which isolates belong correspond to those in Figure 3. The isolate sequence type (ST) is indicated on the right side of the graph.

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