1 *Enterococcus faecium* genome dynamics during long-term asymptomatic

2 patient gut colonization

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16 Abstract

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18 Background

E. faecium is a gut commensal of humans and animals. In addition, it has recently emerged as an important nosocomial pathogen through the acquisition of genetic elements that confer resistance to antibiotics and virulence. We performed a wholegenome sequencing based study on 96 multidrug-resistant *E. faecium* strains that asymptomatically colonized five patients with the aim to describe the genome dynamics of this species.

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26 Results

27 The patients were hospitalized on multiple occasions and isolates were collected over 28 periods ranging from 15 months to 6.5 years. Ninety-five of the sequenced isolates 29 belonged to *E. faecium* clade A1, which was previously determined to be responsible 30 for the vast majority of clinical infections. The clade A1 strains clustered into six clonal 31 groups of highly similar isolates, three of which entirely consisted of isolates from a 32 single patient. We also found evidence of concurrent colonization of patients by 33 multiple distinct lineages and transfer of strains between patients during 34 hospitalisation. We estimated the evolutionary rate of two clonal groups that colonized 35 12.6 25.2 single patient at and single nucleotide polymorphisms а 36 (SNPs)/genome/year. A detailed analysis of the accessory genome of one of the clonal 37 groups revealed considerable variation due to gene gain and loss events, including the 38 chromosomal acquisition of a 37 kbp prophage and the loss of an element containing carbohydrate metabolism-related genes. We determined the presence and location of 39 40 twelve different Insertion Sequence (IS) elements, with ISEfa5 showing a unique 41 pattern of location in 24 of the 25 isolates, suggesting widespread ISEfa5 excision and 42 insertion into the genome during gut colonization.

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44 Conclusions

- 45 Our findings show that the *E. faecium* genome is highly dynamic during asymptomatic
- 46 colonization of the patient gut. We observe considerable genomic flexibility due to
- 47 frequent horizontal gene transfer and recombination, which can contribute to the
- 48 generation of genetic diversity within the species and, ultimately, can contribute to its
- 49 success as a nosocomial pathogen.

50 Background

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In recent decades, *Enterococcus faecium* has emerged as an important multidrugresistant nosocomial pathogen. It is a major cause of hospital-acquired infections such as bacteraemia, urinary tract infection and endocarditis [1–4]. Furthermore, enterococcal infections contribute to patient mortality, increased length of hospital stay of patients and higher healthcare costs [5]. Infections caused by *E. faecium* are difficult to treat due to the large repertoire of acquired antibiotic resistance determinants, of which vancomycin resistance is arguably the most problematic [6, 7].

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60 The species E. faecium consists of distinct subpopulations or 'clades' [8–10]. A deep 61 phylogenetic split distinguishes clades A and B from each other [11], with clade B 62 containing most human commensal isolates. Clade A was further sub-divided in clade 63 A1 and A2 [8]. Clade A1 contains the vast majority of strains isolated from clinical 64 settings, and overlaps with the previously identified E. faecium sub-population Clonal 65 Complex 17 [9, 12]. The polyphyletic clade A2 is enriched for strains that were isolated 66 from domestic animals and livestock [8, 10]. While vancomycin resistance can be 67 found among strains from both clade A1 and clade A2, clade A1 strains are almost 68 always resistant to ampicillin, while strains from other clades are mostly ampicillin-69 susceptible [12].

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E. faecium is a genetically dynamic organism with an open pan-genome [8, 13, 14]. Genomic changes in *E. faecium* are mostly driven by recombination and horizontal gene transfer (HGT), rather than by mutation [15]. Due to frequent HGT, *E. faecium* strains that have highly similar core genomes can have substantial differences in their accessory genomes [8, 14, 16]. Insertion Sequence (IS) elements are abundant in *E. faecium* genome [16]. IS elements are short transposable segments of DNA that can

77 have an important role in shaping a bacterial genome. Insertion events can lead to 78 disruption of promoters, coding sequences or operon structures. In addition, they can 79 catalyze genomic rearrangements including deletions, inversions, and duplications in 80 bacterial genomes [17]. Complete genome sequences revealed that dozens of IS 81 elements are scattered around the chromosome and plasmids of clinical E. faecium 82 isolates [18, 19]. A number of IS elements, most notably IS16, are associated with 83 clade A1 strains and have been hypothesized to contribute to the adaptation of E. 84 faecium to the hospital environment [8, 16].

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86 Patients that have been hospitalized for prolonged periods of time are potential 87 reservoirs for drug-resistant *E. faecium* strains. Generally, infection by *E. faecium* is 88 preceded by asymptomatic gut colonization by a resistant clade A1 strain [20, 21]. 89 Patients that have been colonized by *E. faecium* can contaminate both their immediate 90 surroundings and healthcare workers, leading to outbreaks [21, 22]. The ability of E. 91 faecium to survive on inanimate objects creates an environmental reservoir of 92 multidrug-resistant strains in hospital wards and makes outbreaks with E. faecium a 93 challenge to control [23].

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95 Recent studies have used whole-genome sequencing (WGS) to trace transmission 96 events of *E. faecium* between patients in hospital wards and between hospitals [10, 97 24, 25]. Recently, the relatedness of *E. faecium* strains from bloodstream infections, 98 the gut and the immediate environment of four patients that were hospitalized for up to 99 two months was studied using WGS [21]. Here, we present an analysis of the genome 100 dynamics of vancomycin- and ampicillin-resistant E. faecium during asymptomatic gut 101 colonization of five patients for periods ranging from 15 months to 6.5 years. We 102 describe the evolutionary trajectories, including the roles of gene gain and loss events, 103 and IS-element excision and insertion that shape the genome of *E. faecium*.

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105 Results

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107 Isolate collection and patient hospital stay

This study used vancomycin- and ampicillin-resistant *E. faecium* (VRE and ARE, 108 109 respectively) isolates that were collected and stored in the period 2001 - 2008 as part 110 of routine diagnostics and infection prevention interventions at the University Medical 111 Center Utrecht, the Netherlands (figure 1). Analysis of the collected isolates with 112 anonymized patient data, showed that for five patients multidrug-resistant E. faecium 113 isolates were collected over a period of >1 year. We sequenced the genomes of 96 114 isolates, all of which were determined to be ampicillin-resistant using a previously 115 described method [26]. Using Abricate [27], we found that 38 and 21 isolates carried 116 the vanA or vanB operon. Further information on the antibiotic resistance profiles of 117 the strains sequenced in this study is provided in Supplementary Table 1. The time 118 span between the first and the last isolate collected from a single patient ranges from 119 15 months (patient B) to 6.5 years (patient C).

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121 Genetic diversity of *E. faecium* patient isolates

122 To be able to place the collected isolates in the larger E. faecium population, we 123 created a SNP-based, recombination-filtered phylogenetic tree using the 96 genomes 124 sequenced in this study and 70 previously described *E. faecium* genome sequences that represent the global *E. faecium* population [8]. This phylogenetic tree is based on 125 126 1448 core genes and a total of 77,909 SNPs. Out of the 96 patient isolates, 95 clustered into clade A1, a clade of hospital-associated E. faecium strains 127 (Supplementary figure 1). The remaining isolate clustered with strains that were 128 129 previously assigned to clade A2.

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131 The relatively large diversity of the 70 publicly available *E. faecium* genome 132 sequences, limited the resolution of the phylogenetic relationships between the patient 133 isolates. We therefore created a second tree, with only the 95 clade A1 patient isolates 134 in this study, supplemented with 19 genome sequences of clade A1 strains that were 135 previously sequenced [8]. This tree was based on 1805 core genes, with 5092 SNPs 136 and allowed us to accurately interpret the similarities between the hospital isolates 137 (figure 2). The phylogenetic tree of the clade A1 strains revealed 6 groups of closely 138 related isolates. Three of these groups (1, 2 and 3) contained only isolates from a 139 single patient (A, B and D, respectively). While additional isolates of patients B and D 140 were present in other groups, patient A isolates clustered exclusively in group 1. In 141 group 4, isolates clustered closely together despite being from three different patients 142 (B, C and E). By analysis of dates and locations of hospitalization of these patients, 143 we found that patients B, C and E were simultaneously present in a hospital ward 144 (figure 1b), suggesting that we captured a small outbreak with this set of isolates. 145 Groups 5 and 6 are two small, highly similar clusters of isolates. The isolates in group 146 5 originate from 3 patients (C, D, E) which were isolated between October 2003 and 147 February 2004. In group 6, isolates from patients C and E that were isolated between 148 September 2007 and January 2008 cluster together. Both of these groups may thus 149 also reflect transmission of strains between different patients.

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We also found that patients can be colonized by different populations of *E. faecium* at the same time, as shown by the genetic diversity found in strains that were isolated on the same date, e.g. those on 4 February 2004 (D_040204_23, D_040204_24 and D_040204_25).

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We determined whether a temporal signal is present in the *E. faecium* genome sequences in each individual group. The temporal signal was defined using Path-O-Gen [28], which plots the time at which each isolate was identified versus the distance to the root of the tree. A temporal signal ($R^2>0.3$), was only found in groups 1 and 4. Analysis by BEAST resulted in estimated mutation rates for groups 1 and 4 of 4.2 x 10⁻

⁶ (with 95% highest posterior density (HPD) of [2.2 x 10⁻⁶, 6.3 x 10⁻⁶]) and 8.4 x 10⁻⁶ 161 162 (with 95% HPD of [4.7 x 10⁻⁶, 1.2 x 10⁻⁵]) substitutions per nucleotide per year, being 163 equivalent to 12.6 (6.6 - 19.8) SNPs/genome/year and 25.2 (14.1 - 36.0) SNPs/genome/year, respectively. The lack of temporal signal in groups 2, 3, 5, and 6 164 165 is likely caused by the relatively low number of strains in these groups. Because all 166 group 1 isolates originate from the same patient, they provide a unique opportunity to 167 study the genome dynamics of *E. faecium* during long-term asymptomatic patient gut 168 colonization. Hence, we focused further analyses on the strains from this group.

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170 The accessory genome of group 1 strains

A total of 74 orthologous genes (OGs) were found to be differentially present in the genomes of the group 1 isolates (figure 3a). Hierarchical clustering showed that most of the OGs were part of larger groups of OGs that showed the same presence-absence pattern across the genome sequences, suggesting that they are genetically linked. Further analysis revealed that the clustered OGs were co-located on contigs.

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The two largest variably present clusters are phage-related OGs (cluster 1), and OGs related to carbohydrate metabolism (cluster 2). Cluster 1 contains 24 OGs, of which 10 are annotated as being hypothetical proteins. The annotations of the remaining genes suggested a phage origin of this element as they included tail and terminase protein-encoding genes (figure 3a). Cluster 2 comprised several genes that are related to carbohydrate transport. Neither of the clusters contained genes related to antimicrobial resistance.

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When aligning these gene clusters to the original collection of 166 genomes (96 genomes sequenced in this study and 70 genomes representing global *E. faecium* diversity) using BLAST, we find that they are mostly found in the newly sequenced isolates (Supplementary figure 1), with cluster 1 being found in 42 genomes, of which

38 were sequenced as part of this study. Cluster 2 was present in 28 genomes, ofwhich 26 were sequenced here.

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192 To further investigate the genetic linkage of these variably present clusters in the 193 accessory genome of group 1 strains, we fully sequenced the genome of isolate 194 A 020709 82, combining Illumina reads with long reads generated via Oxford 195 Nanopore's MinION platform to complete the genome assembly. The A 020709 82 196 strain has most of the genes of the accessory genome that are variably present among 197 group 1 strains, including the two largest groups of OGs. The A 020709 82 strain has 198 a chromosome of 2,740,566 nucleotides and 4 plasmids, ranging in size from 222 kbp 199 to 4 kbp (figure 3b). By mapping all the differentially present OGs onto the 200 A 020709 82 reference genome sequence, we found that the clustered OGs were 201 located in close proximity to one another in the chromosome. A third, smaller variably 202 present cluster consisting of 4 OGs, was found to be representing a 4.1 kbp plasmid 203 that is lost in its entirety in 4 of the isolates, in a presence/absence pattern unrelated 204 to that of the two larger clusters. To assess whether the differences in accessory 205 genome sequences influence the fitness of the 25 group 1 isolates, we determined 206 their *in vitro* maximum growth rates but found no statistically significant differences 207 between the strains with different accessory genomes (Supplementary Figure 2).

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209 Dynamics of IS elements in a clonal *E. faecium* population

We identified 12 different IS elements in the genome of A_020709_82. To identify the diversity and location of IS elements in the other strains from group 1, we used ISmapper [29] with the A_020709_82 genome as a reference and the sequencing reads of the other genomes in group 1 (figure 4). The positions of two IS elements (IS16 and IS6770) are fixed in all 25 isolates. The IS-element IS*Efa5* exhibited a particularly large diversity, having between 17 and 27 copies per genome. Twenty-four out of the 25 isolates in group 1 have a unique pattern, suggesting frequent excision

- and integration events of this IS element. The remaining 9 IS elements showed an
- 218 intermediate amount of diversity.

220 Discussion

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222 In this study, we use a collection of *E. faecium* carriage strains that were isolated from 223 patients that were repeatedly admitted to a hospital over a time period ranging from 15 224 months to 6.5 years. Out of 96 isolates, 95 clustered to the hospital-associated A1 225 clade, which is expected given their source as ampicillin-resistant clade A1 strains 226 cause the majority of hospital-acquired infections, and are rarely carried by humans in 227 community settings [8, 30]. The patients likely acquired these isolates during their 228 hospital stay and were carriers for extended periods of time. Previous work has shown 229 that ampicillin-resistant *E. faecium* clones can persist in the gut microbiota for several 230 months after discharge from hospital [31], during which time further spread can occur.

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232 The mutation rate we find in both the clonal group 1 and non-clonal group 4 (12.6 and 233 25.2 substitutions/genome/year, respectively) are in line with previously described 234 values for similar *E. faecium* populations [13, 32]. Others have described rates of up 235 to one order of magnitude higher [8, 21, 25]. This difference is postulated to be caused 236 by increased genetic drift within patients along with a limited time for purifying selection 237 to act on a population, leading to the incomplete removal of strains with mildly 238 deleterious mutations [21, 33]. Our group 1 estimation in particular can be assumed to 239 be a better approximation of the background mutation rate of *E. faecium* given their 240 clonality, the absence of enterococcal disease in the source patient, and the longer 241 time over which they were collected. However, it is also possible that the large 242 differences in the mutation rate of different E. faecium clones reported in literature are 243 a true biological signal. As in the Gram-negative gut commensal E. coli, E. faecium 244 clones with a higher mutation rate may be able to more rapidly adapt to novel 245 environments while negatively impacting their transmissibility and ability to recolonize 246 similar hosts [34].

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248 The pangenome of *E. faecium* has previously been determined to be essentially open, meaning that it can easily acquire novel genes by horizontal gene transfer [8, 14]. This 249 250 ability to acquire DNA was recently vividly illustrated by the description of a bovine E. 251 faecium strain that had acquired a gene cluster encoding a botulinum-like neurotoxin 252 [35]. In group 1 strains we observed a number of gene gain and loss events. The 253 earliest isolates in group 1 carry a gene cluster that is predicted to be involved in 254 carbohydrate metabolism, while later strains lose this element and acquire a phage. 255 Five isolates carry both the phage element and the carbohydrate metabolism gene 256 cluster, which shows that carriage of both elements is not mutually exclusive. While we 257 did not observe differences in the in vitro growth rates of strains with different 258 combinations of the carbohydrate metabolism and phage element, their presence 259 might affects the strains' fitness in colonizing gut of this patient. It is possible that the 260 changes in the accessory genome allow the clone to optimally adapt to colonize in the 261 context of the patient's gut microbiota.

262

263 As described in previous studies, there is an abundance of IS elements in the E. 264 faecium genome [16]. We find that some IS elements, such as IS256, IS6770 and the 265 clade A1-associated IS16[8], show little to no variation in insertion location and number in the genomes of patient A isolates. IS16 was previously proposed to confer a degree 266 267 of genomic flexibility to the hospital-adapted sub-population of *E. faecium* that could 268 contribute to its success as a nosocomial pathogen[16]. However, the fixed position of 269 IS16 in the group A isolates appears to contradict a major role for this IS element in 270 shaping the *E. faecium* genome. It may be more likely that IS16 has entered the *E.* 271 faecium population when the hospital-adapted sub-population (clade A1) first emerged 272 and has since been spreading vertically in this population. Conversely, we find a large 273 number of ISEfa5 copies in the genome of group 1 strains and evidence for frequent 274 excision and insertion events. ISEfa5 was first described as part of Tn1546-like 275 elements, which are responsible for VanA-type vancomycin resistance, in South

American *E. faecium* isolates [36, 37], but it was later found in European [38] and Australian strains [39] as well. In the whole genome sequence of strain Aus0085 25 copies of IS*Efa5* were found [39]. Its high copy number in *E. faecium* strains and the evidence provided in this study for frequent integration and excision events, suggests that IS*Efa5* may be contributing significantly to the genomic flexibility of the species.

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282 Our observation that patients can be colonized by multiple strains simultaneously is in 283 line with previous studies [21, 33, 40]. Concurrent colonization by multiple clones can 284 have an important impact on infection prevention efforts if only single colonies are 285 selected for further typing. Potentially pathogenic or multidrug-resistant strains can 286 then be inadvertently missed, leading to the erroneous reconstruction of transmission 287 networks. When isolates are missed, transmission networks may also be 288 reconstructed erroneously [21], making outbreak control more challenging. This is 289 illustrated by the small outbreak we detected in our dataset, where patients B, C and 290 E appear to be colonized by isolates with high inter-patient similarity, as well as more 291 different ones. Sampling and typing of multiple colonies when performing screening for 292 colonization by multi-drug resistant E. faecium is thus required to capture the full within-293 patient diversity of this organism. In addition, the use of metagenomic shotgun 294 sequencing, combined with tools to reconstruct microbial genomes and resolve strains 295 [41] may become a useful alternative to culture-based approaches to determine the 296 presence of different *E. faecium* clones in the gut microbiome.

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298 Conclusions

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300	Our findings show that the <i>E. faecium</i> genome is highly dynamic during asymptomatic
301	colonization of the patient gut. We demonstrate E. faecium's remarkable genomic
302	flexibility, which is characterized by frequent gene gain and gene loss due to horizontal
303	gene transfer and recombination and the movement of IS elements. The ability of <i>E</i> .
304	faecium to rapidly diversify may contribute to its success as a nosocomial pathogen as
305	it allows clones that circulate in a hospital to rapidly optimize their ability to effectively
306	colonize individual patients that may differ in their underlying illnesses, antibiotic
307	therapy and composition of the gut microbiota. Improving our understanding of the
308	mechanisms that underpin this trait is crucial for combating the issues related to the
309	emergence of multidrug-resistant <i>E. faecium</i> as an important nosocomial pathogen.
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311 Methods

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313 Strain collection

Ninety-six E. faecium strains were isolated from five patients during routine diagnostic 314 315 screenings at the University Medical Center Utrecht, a tertiary care facility in Utrecht, 316 the Netherlands, as part of routine screening for colonization by multidrug-resistant E. 317 faecium [26, 42]. Patients were screened for carriage of multidrug-resistant E. faecium 318 by culturing rectal swabs in Enterococcosel broth (Becton Dickinson) supplemented 319 with aztreonam (75 mg/liter) at 37°C. If the cultures exhibited black colorization within 320 48 h, the broth was streaked on an Enterococcosel Agar plate (Becton Dickinson), 321 supplemented with aztreonam and vancomycin (25 mg/liter) or with aztreonam and 322 ampicillin (16 mg/liter) and incubated at 37°C for 48 h. Black colonies formed by Gram-323 positive cocci were subjected to multiplex PCR to detect vancomycin resistance genes 324 and the esp gene, as well as additional antibiotic susceptibility testing. If a vancomycin-325 and/or an ampicillin-resistant isolate was found during a screening, this isolate was 326 subsequently stored at -80°C. These patients were selected due to their relatively high 327 number of available screening isolates (between 17 and 25 per patient). One patient 328 (patient C) was admitted to the hospital for recurring abscesses on the upper leg, the other four patients were admitted for (hemo)dialysis procedures. None of the patients 329 330 were diagnosed with enterococcal infections.

331

332 Growth curves and maximum growth rate

A BioScreen C instrument (Oy Growth Curves AB) was used to measure bacterial growth. One colony was picked per strain and grown overnight in Brain Heart Infusion (BHI) broth at 37°C with shaking at 200 rpm, then diluted to an initial optoical density at 600 nm (OD_{600}) of 0.1 in BHI. The cultures were incubated in triplicate in the Bioscreen C system at 37°C with continuous shaking, and absorbance at 600 nm (A_{600}) was recorded every 15 min for 9 hours. The growth rates (μ) were calculated using

339 $\mu = \frac{\ln(A_2) - \ln(A_1)}{(t_2 - t_1)}$, where t_x signifies a time point and A_x the associated A₆₀₀ at this time 340 point. The maximum growth rate (μ_{max}) was determined for each individual experiment 341 by taking the highest μ over the course of the growth.

342

343 **DNA isolation, genome sequencing and assembly**

344 Genomic DNA of all strains was isolated from overnight cultures in Brain Heart Infusion 345 broth, incubated at 37°C with shaking at 200 rpm, using the Wizard Genomic DNA 346 purification kit (Promega). Library preparation for sequencing was done using the 347 Nextera XT kit and 150 nucleotide paired-end sequencing was performed by 348 Edinburgh Genomics on an Illumina HiSeg 2500. An additional 70 publicly available E. faecium genomes, described in [8], were also included in our analyses and were used 349 350 to represent the global diversity of the species *E. faecium*. The Nesoni (version 0.122) 351 tool [43] was used to remove adapter sequences and homopolymers, and to trim low-352 quality bases in sequence reads that had a quality score below 10. If more than half of 353 a read was composed of low-quality bases, the read was discarded. The SPAdes 354 assembler (version 3.1.0) [44] with --careful option and with k-mer sizes of 21, 31 and 355 41 was used for genome assembly. From the resulting contigs, those with less than 356 10-fold nucleotide coverage, as well as those smaller than 500 bases were discarded.

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Assembly quality was checked using QUAST [45] and contigs not originating from bacteria (presumably due to low-level contamination of datasets with eukaryotic reads) were identified by aligning to NCBI GenBank database using BLASR+ (version 2.2.29) [46] and were removed.

362

The genome of strain A_020709_82 (GenBank accession number CP018128) was sequenced to serve as a reference for the analysis of the accessory genomes and distribution of IS elements in the genomes of the strains in group 1. DNA was prepared

366 as described above, and then prepared for sequencing according to the Genomic DNA 367 sequencing for the MinION device protocol (Oxford Nanopore Technologies, March 2016). From the obtained Pre-Sequencing Mix, approximately 60ng was loaded on a 368 369 R7.3 flowcell and sequenced using an Oxford Nanopore MinION MkI instrument, which 370 was run for a total of 48 hours with a Pre-Sequencing Mix top up (~60ng) at the 24-371 hour mark. A total of 18,629 high-guality two-directional (2D) reads were produced for 372 a total of ~127 million bases. Poretools [47] was used to extract a fasta-format file 373 containing the reads. A hybrid assembly using these reads combined with 2 x 150 bp 374 HiSeg 2500 Illumina reads was then generated using SPAdes 3.7.0 [44] with the --375 nanopore option.

376

377 Genome annotation and clustering of orthologous proteins

378 We annotated the genome assemblies of all 166 isolates included in this study by using 379 the Prokka [48] annotation tool (version 1.10) with its default parameters. To create 380 clusters of orthologous proteins, the amino acid sequences of all genes in the 166 381 genomes were aligned against themselves using BLAST+ (version 2.2.29) [46]. 382 Orthologous genes were identified with orthAgogue (version 1.0.3) [49] using the bit 383 score information from the BLAST alignments, where aligned sequence length 384 between two genes should at least be half of the size of the longer gene. Orthologous 385 genes were grouped into OGs using the MCL algorithm (version 12-135) with the 386 inflation parameter of 1.5 [50].

387

388 Phylogenetic analyses

We generated core genomes by concatenating the sequences of OGs that were present once in all genomes. To prevent bias in our data created by recombination, we filtered the core genomes to identify putative recombination regions using the Gubbins recombination filtering tool (version 1.3.4) [51]. We then used the SNPs in the core genome located outside of the identified recombination regions to create two 394 phylogenetic trees: one for all 166 strains (96 patient isolates and 70 publicly available 395 genomes), and one for the 114 clade A1 strains (95 patient isolates and 19 clade A1 396 isolates as defined in [8]), using FastTree2 (version 2.1.7; double precision mode 397 enabled) [52]. We used a GTR substitution model for nucleotide sequences with a 398 Gamma site evolutionary rate correction and 1000 bootstrap samples to estimate the 399 support for bifurcation points.

400

We observed 6 different groups of strains among newly sequenced 96 strains based on their similarity in the tree of 114 clinical isolates. Each of these 6 groups was then analyzed separately. For each group of strains, OG clustering as well as recombination filtering was applied as described above. However, instead of using SNPs, a concatenated core genome containing all the core genes that are outside of recombination regions were used to obtain more accurate branch lengths and better estimates of time divergence in phylodynamic analysis [53].

408

409 Estimation of mutation rates

To further analyze the evolutionary dynamics of each group of strains, we first checked for the presence of sufficient temporal signal ($R^2>0.30$) using Path-O-Gen (version 1.4pre) [28]. We then used the BEAST molecular evolutionary analysis tool (version 1.8.2) [54] only for those groups that had a sufficient level of temporal signal.

414

We used jModelTest2 [55] to identify the substitution model and site heterogeneity model, and to estimate the proportion of invariant sites, the transition/transversion ratio and the shape parameter of the Γ distribution. Five different clock models (strict, exponential, log-normal, fixed and random) and three different demographic models (constant, log-normal and Bayesian-skyline plot) were used in the BEAST analysis. These different models were analyzed with 100 million Markov chain Monte Carlo

421 (MCMC) simulations with 10 million burn-ins, where sampling was done after every 422 10,000 simulations. The best model among these 15 models (5 clock models x 3 423 demographic models) was selected using path sampling (PS) and stepping-stone 424 sampling (SS) model selection algorithms with one million simulations and 100 path 425 steps, where logs after every 1000 simulations were screened as described previously 426 [56]. Maximum clade credibility (MCC) tree was generated using TreeAnnotator using 427 the median heights of trees [54]. The estimated prior values by jModelTest2 for 428 substitution and heterogeneity models were HKY and I+G for both groups. The rest of 429 the estimated coefficients were the same with the exception of the 430 transition/transversion ratio being 6.79 and 3.88 for group 1 and 4, respectively. The 431 best BEAST model for group 1 isolates was a lognormal relaxed clock (lognormal) with 432 a constant coalescence model (lognormal-constant) based on SS model selection, and 433 a lognormal relaxed clock with a Bayesian skyline (BS) coalescence model (lognormal-434 BS) based on the PS model selection. Although the SS model selection method is 435 generally more accurate than the PS model selection method [57], we chose the 436 lognormal-BS as the BS coalescence model had higher effective sample size values 437 than the constant model; and the difference between lognormal-constant and 438 lognormal-BS models was negligible. For group 4 strains, the best BEAST model was 439 the lognormal relaxed clock with an exponential coalescence model according to both 440 the SS and PS model selection methods.

441

442 Analysis of accessory genome

Besides core-genome based analysis, we studied the differential presence of accessory genes within the six groups. When an OG was either present in less or absent in more than 90% of the strains in the group, it was included in the accessory genome. In addition to the annotation information, we also considered on which contigs differentially present genes were located in order to identify potential genetic links. Thus, we aligned the corresponding contigs of each differentially present gene against 449 the GenBank database using BLAST+ (version 2.2.29+) [46] to identify putative mobile 450 elements on which the variably present genes were located. We aligned differentially 451 present genes of group 1 to the A 020709 82 reference genome and visualized 452 location of these genes on the reference using Circos (version 0.69) [58]. The two largest clusters were aligned to all 166 genomes using BLAST+ (version 2.2.29+) [46] 453 454 to determine the presence/absence of these regions in E. faecium. Abricate [27] was 455 used to determine the presence of antimicrobial resistance determinants in the 456 assembled genomes.

457

458 Gain and loss of insertion sequences

459 We used ISMapper [29] to find gain and loss of insertion sequence elements (IS 460 elements) among group 1 strains, which solely includes isolates from the same patient 461 (patient A). Sequences of IS elements were found by uploading the complete genome 462 sequence of the A 020709 82 reference strain at the ISfinder [59] website. Sequences 463 of the identified IS elements were used in ISmapper together with the sequence reads 464 from patient isolates. The genome of the patient A strain A 020709 82 was used as a reference to which reads were aligned, positions of IS elements were ordered 465 466 regarding their positions in the reference genome.

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468

470 List of abbrevations

- 471
- 472 SNPs: single nucleotide polymorphisms
- 473 IS: insertion sequence
- 474 HGT: horizontal gene transfer
- 475 WGS: whole genome sequencing
- 476 ARE: ampicillin-resistant *E. faecium*
- 477 VRE: vancomycin-resistant *E. faecium*
- 478 HPD: highest posterior density
- 479 OGs: orthologous genes
- 480 BHI: Brain Heart Infusion
- 481 OD₆₀₀: optical density at 600 nm (OD₆₀₀)
- 482 A_{600} : absorbance at 600 nm (A_{600})
- 483 μ : growth rate
- 484 μ_{max} : maximum growth rate
- 485 MCMC: Markov chain Monte Carlo (MCMC)
- 486 PS: path sampling
- 487 SS: stepping-stone sampling
- 488 MCC: maximum clade credibility
- 489 BS: Bayesian skyline
- 490 ENA: European Nucleotide Archive
- 491 ICU: Intensive Care Unit

493 **Declarations**

494

- 495 Ethics approval and consent to participate
- 496 Strains were isolated as part of routine diagnostic procedures during a VRE outbreak.
- 497 This aspect of the study did not require consent or ethical approval by an institutional
- 498 review board.

499

- 500 Consent for publication
- 501 Not applicable

502

503 Availability of data and material

504 Short read data for the 96 genomes sequenced in this study are available at the

505 European Nucleotide Archive (ENA), accession number PRJNA344739. The long-read

sequence dataset used for the assembly of the genome of strain A_020709_82 is

- 507 available at ENA, accession number CP018128.
- 508
- 509 Competing interests
- 510 The authors declare that they have no competing interests

511

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517

518 Authors' contributions

- 519 W.v.S. designed the study. A.T. provided the strains. J.R.B., J.B., M.R.C.R. performed
- 520 data analyses. J.R.B., J.B., R.J.L.W., and W.v.S. wrote the manuscript. All authors read
- 521 and approved the final manuscript.
- 522
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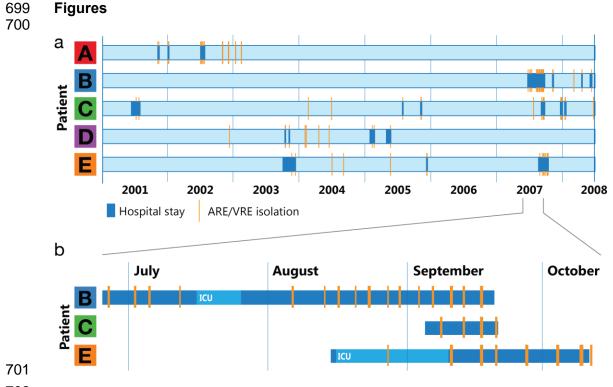
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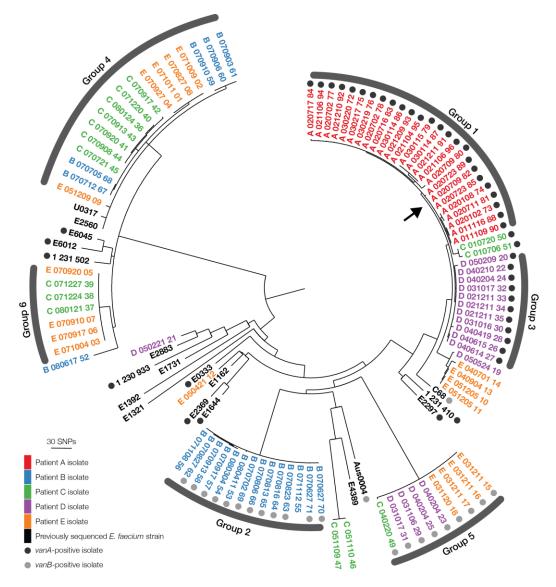
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Figure 1: (a) Timeline of hospital stay for 5 patients (A-E) and the time points at which multi-drug-resistant *E. faecium* strains were isolated during routine screening between 2001 and 2008. (b) Detail for patients B, C, and E, showing the overlap in their hospital stay in 2007 and the associated ARE/VRE isolations. Dark blue: patient hospital stay; orange: ARE/VRE-positive screening; ICU: patient in an intensive care unit. If an isolation time point does not overlap with hospital stay, the screening was performed at home as part of outbreak control studies.



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713 Figure 2: Phylogenetic tree of clade A1 isolates. This maximum-likelihood tree 714 includes 95 of the 96 genome sequences generated in this study and 19 publicly available E. faecium genome sequences. The core genome alignment consisted of 715 716 2,295,725 nucleotides. The position of strain A 020709 82 is marked with an arrow. The genome of this isolate was sequenced and assembled to completion using a 717 718 combination of short- and long-read sequencing for use as a reference genome in 719 further analyses. Genome sequences are coded as follows: the letter represents the 720 patient, the six number code represents the data of isolation in year-month-day 721 format, the final number is the unique identifier for each genome sequence. Colours 722 indicate the patient this isolate was taken from. Black and gray marks indicate the 723 presence of the vanA or vanB vancomycin resistance operon in the genome, 724 respectively.

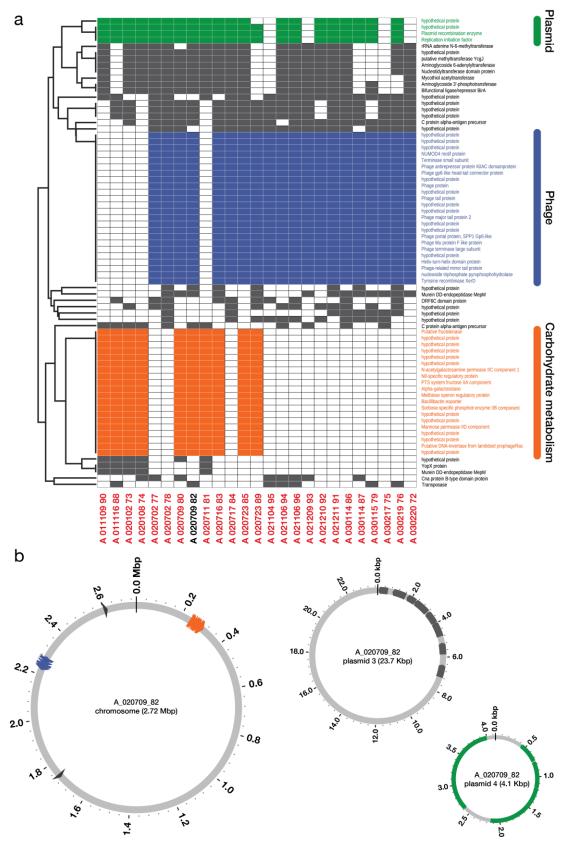


Figure 3: The accessory genome of group 1 isolates. (a) Plot showing the

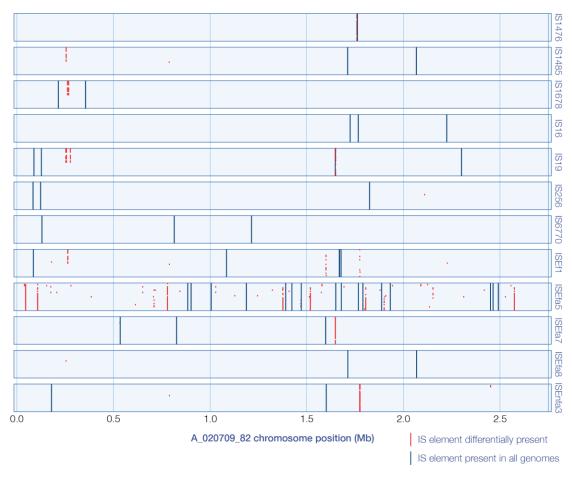
differentially present genes in the different isolates, ordered chronologically. Colours

indicate gene clusters that are variably present or absent and are annotated on the

pasis of their predicted function or origin. (b) The differentially present genes mapped

onto the A_020709_82 genome, with colours corresponding to gene clusters in panel

a. Chromosome and plasmid sizes not shown to scale.



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Figure 4: Variable presence of IS elements in a clonal population of E. faecium 736 737 during asymptomatic gut colonization. Overview of the different IS elements found in the genomes of the 25 clonal patient A isolates, plotted on the chromosomal 738 sequence of isolate A 020709 82. A total of 12 different IS elements are found in this 739 740 group. Blue marks indicate the presence of that IS-element in all isolates. Red marks 741 indicate that the IS element is present in the indicated isolate, but not in all isolates. 742 Each row of an individual IS element represents a single isolate, with the oldest 743 isolate on top and the newest at the bottom.