



# Staphylococcus saprophyticus Causing Infections in Humans Is Associated with High Resistance to Heavy Metals

© Opeyemi U. Lawal,<sup>a,b</sup> Maria J. Fraqueza,<sup>c</sup> Peder Worning,<sup>d</sup> Ons Bouchami,<sup>a,b</sup> © Mette D. Bartels,<sup>d</sup> Luisa Goncalves,<sup>e</sup> Paulo Paixão,<sup>f</sup> Elsa Goncalves,<sup>g</sup> Cristina Toscano,<sup>g</sup> Joanna Empel,<sup>h</sup> Malgorzata Urbaś,<sup>h</sup> Maria A. Domínguez,<sup>i</sup> Henrik Westh,<sup>d,j</sup> Hermínia de Lencastre,<sup>b,k</sup> © Maria Miragaia<sup>a</sup>

a Laboratory of Bacterial Evolution and Molecular Epidemiology, Instituto de Tecnologia Química e Biológica, Universidade Nova de Lisboa (ITQB-NOVA), Oeiras, Portugal b Laboratory of Molecular Genetics, ITQB-NOVA, Oeiras, Portugal

Centre for Interdisciplinary Research in Animal Health (CIISA), Faculdade de Medicina Veterinária, Universidade de Lisboa, Lisbon, Portugal

<sup>d</sup>Department of Clinical Microbiology, Hvidovre University Hospital, Hvidovre, Denmark

eSAMS Hospital, Lisbon, Portugal

fHospital da Luz, Lisbon, Portugal

<sup>9</sup>Hospital Egas Moniz, Lisbon, Portugal

<sup>h</sup>Department of Epidemiology and Clinical Microbiology, Narodowy Instytut Leków, Warsaw, Poland

'Hospital Universitari de Bellvitge, Barcelona, Spain

Institute of Clinical Medicine, Faculty of Health Sciences, University of Copenhagen, Copenhagen, Denmark

kThe Laboratory of Microbiology and Infectious Diseases, The Rockefeller University, New York, New York, USA

ABSTRACT Staphylococcus saprophyticus is a common pathogen of the urinary tract, a heavy metal-rich environment, but information regarding its heavy metal resistance is unknown. We investigated 422 S. saprophyticus isolates from human infection and colonization/contamination, animals, and environmental sources for resistance to copper, zinc, arsenic, and cadmium using the agar dilution method. To identify the genes associated with metal resistance and assess possible links to pathogenicity, we accessed the wholegenome sequence of all isolates and used in silico and pangenome-wide association approaches. The MIC values for copper and zinc were uniformly high (1,600 mg/liter). Genes encoding copper efflux pumps (copA, copB, copZ, mco, and csoR) and zinc transporters (zinT, czrAB, znuBC, and zur) were abundant in the population (20 to 100%). Arsenic and cadmium showed various susceptibility levels. Genes encoding the ars operon (arsRDABC), an ABC transporter and a two-component permease, were linked to resistance to arsenic (MICs  $\geq$  1,600 mg/liter; 14% [58/422]; P < 0.05). At least three cad genes (cadA or cadC and cadD-cadX or czrC) and genes encoding multidrug efflux pumps and hyperosmoregulation in acidified conditions were associated with resistance to cadmium (MICs  $\geq$  200 mg/liter; 20% [85/422]; P < 0.05). These resistance genes were frequently carried by mobile genetic elements. Resistance to arsenic and cadmium were linked to human infection and a clonal lineage originating in animals (P < 0.05). Altogether, S. saprophyticus was highly resistant to heavy metals and accumulated multiple metal resistance determinants. The highest arsenic and cadmium resistance levels were associated with infection, suggesting resistance to these metals is relevant for S. saprophyticus pathogenicity.

**KEYWORDS** *Staphylococcus saprophyticus*, urinary tract infection, environment, heavy metals, whole-genome sequencing, pan-GWAS, metal resistance determinants, copper, zinc, arsenic, cadmium, metal resistance

ntimicrobial resistance is of global concern, with the constant use of heavy metals recognized as a player contributing to this public health challenge of multiresistant bacteria (1, 2). Heavy metals are naturally found in soil but are also common environmental pollutants derived from human activities like industry, sewage, war (defoliants), and

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Address correspondence to Maria Miragaia, miragaia@itqb.unl.pt.

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agriculture (3). The majority of metals are toxic to bacteria at low concentrations (4-7), and for this reason, they have been massively used in animal production as prophylactics or in agriculture as pesticides, herbicides, and insecticides (8). Moreover, some of them are claimed to promote growth of production animals (4, 5), which has further increased their use in the veterinary setting. Copper and zinc are examples of metals that have been continuously used as feed supplements in the animal production chain to promote growth and as prophylactics (5, 9). Cadmium and arsenic have been mainly used in agriculture, leading to environmental contamination (10).

Heavy metals are also used by the human immune system as a means of defense against bacteria. In particular, copper and zinc play an essential role in optimal immune defense mechanism against pathogen colonization and infection. The mobilization of these metals (copper and zinc) to intracellular locations is described to control inflammation, and their accumulation in the phagosomes, in combination with reactive oxygen species, promotes innate immune function by enhancing the killing of pathogens engulfed by macrophages (9, 11, 12).

Either as a consequence of human activities or by facing human immunity, human and animal microbiota, as well as environmental bacteria, are constantly exposed to selective pressure of subinhibitory concentrations of these metals (2, 9). To survive metal toxicity and overcome human immune barriers, bacteria developed different mechanisms such as enzyme detoxification, biotransformation, compartmentalization to membranes, and extrusion using efflux pumps (8). These efflux pump systems may also result in a higher potential to select for multiple resistance to two or more metals (13). Resistance to cadmium and arsenic are mediated by cad-system genes, namely, cadA, cadD, cadX, cadC and czrC, and arsRDABC operon, respectively, that are either chromosomal (14) or often plasmid-borne (9, 15, 16). In particular, uropathogens such as Escherichia coli are able to overcome the human immune barrier with the extrusion of the toxic metal using copper efflux pump systems (17) and specific zinc exporters (18).

The exposure of bacteria to heavy metals has been hypothesized to coselect for antibiotic and biocide resistance (13) because resistance determinants for these antimicrobials usually co-occur in the same mobile genetic elements, namely, plasmids (1, 10, 13). In staphylococci, metal resistance determinants are often associated with staphylococcal cassette chromosome mec (SCCmec) types such as type VIII (4A), IX (1C2), X (7C1), and XI (8E) (19, 20). Determinants encoding copper, arsenic, and cadmium resistance have also been detected in composite SCC elements in methicillin-resistant Staphylococcus aureus (MRSA; especially livestock, MRSA ST398) and also in mecA-positive coagulase-negative staphylococci (CoNS), namely, Staphylococcus epidermidis, Staphylococcus haemolyticus, and Staphylococcus capitis, among others (5, 19).

Evidence has been gathered supporting the role of metal resistance in both environmental bacterial persistence and evasion from the human immune system. What remains to be determined is whether environmental exposure of bacteria to metals and the consequent increase in resistance can also contribute to an increase in bacterial pathogenesis. To address this hypothesis, we selected as a model Staphylococcus saprophyticus, a bacterium that has a widespread distribution in the environment (21-23), is a commensal of humans and production animals (24), is a frequent contaminant of food (25), and is, additionally, a common human uropathogen associated with 10 to 20% of all urinary tract infections (UTIs) in sexually active women worldwide (23).

We have previously defined the population structure of S. saprophyticus and identified two clonal lineages, lineages G and S, that were disseminated worldwide and had distinctive genetic features. We also provided evidence for a possible animal origin for lineage G and human origin for lineage S (26). In this study, the analysis of an S. saprophyticus collection of diverse origins by phenotypic and genomic tools allowed us to determine the MIC of S. saprophyticus to four heavy metals, assess the distribution of metal resistance determinants among the S. saprophyticus population, and identify previously unknown associations between specific genetic determinants, metal resistance, and pathogenicity in this bacterial species.

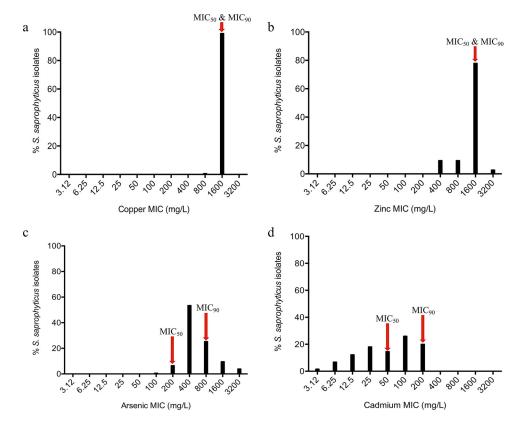


FIG 1 MIC distribution of 422 Staphylococcus saprophyticus isolates recovered from human infection and colonization/contamination and environmental sources using the agar dilution method. Mueller-Hilton agar was supplemented with different concentrations (3.12 to 3,200 mg/liter) of copper (copper sulfate; CuSO₄), zinc (zinc sulfate; ZnSO₄), arsenic (sodium arsenite; AsNaO₂), and cadmium (cadmium chloride; CdCl₂). S. saprophyticus showed high resistance to copper (a) and zinc (b) (1,600 mg/liter). For arsenic (c), unimodal distribution was observed, which suggested epidemiological cutoff value (ECV) of ≥1,600 mg/liter. (d) A bimodal distribution was apparent for cadmium with a suggested ECV of ≥200 mg/liter.

## **RESULTS**

Assessment of heavy metal MIC and resistance determinants in *S. saprophyticus* **population.** The MIC for copper for the great majority of strains (99%, 418/422) was 1,600 mg/liter. The only exceptions were four strains that had MICs of 400 mg/liter (n = 1) or 800 mg/liter (n = 3). We found copA, copB, and/or copZ genes that encode resistance to copper (17) in all isolates. Other copper resistance determinants found include csoR (21%, 88/422), a copper-sensing transcriptional repressor, and mco (20%, 83/422), a multicopper oxidase.

For zinc, the MICs ranged from 200 to 3,200 mg/liter, but 78% of strains (329/422) had MICs of 1,600 mg/liter (Fig. 1a and b). Zinc resistance determinants, including the *czrA-czrB* operon that encodes zinc transporter (27) and other genes such as *zinT*, *znuB-znuC*, and *zur* that have been described to be essential for zinc homeostasis in bacteria (28), were present in all isolates.

Of note, copper and zinc had the same  $MIC_{50}$  and  $MIC_{90}$  (1,600 mg/liter) (Table S1 in the supplemental material). To understand if differences in MIC could be related to alterations in the sequences of genes or proteins, nucleotide and amino acid sequences of strains with low and high MICs were aligned. We did not find any truncation, insertion, or deletion or any mutation that could explain the low MICs. Differences in MICs in *S. saprophyticus* for these metals should most probably be related to the level of expression of any of the resistance genes or to posttranslational modifications. Additionally, it is possible that differences in MICs might be due to the differential distribution of yet-unknown resistance genes.

Regarding arsenic, we found that the MICs ranged from 100 to 3,200 mg/liter, with more than half (53%, 226/422) of the isolates having MICs of 400 mg/liter ( $MIC_{50}$ ), while

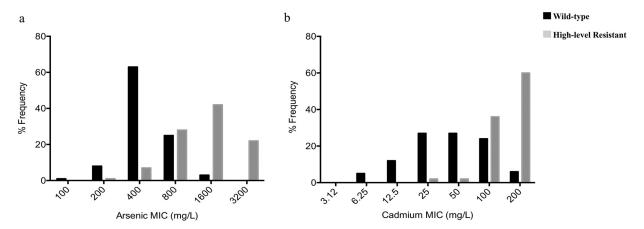


FIG 2 (a) Distribution of arsenic MICs in 422 S. saprophyticus of diverse origins as determined by agar dilution. Wild type, proportion of isolates carrying arsRBC only; high-level resistant, proportion of S. saprophyticus strains carrying a complete ars operon (arsRDABC) for arsenic. (b) Distribution of cadmium MICs in 422 S. saprophyticus isolates of diverse origins, as determined by agar dilution. Wild type, proportion of isolates with less than three cad genes; high-level resistant, proportion of S. saprophyticus strains carrying at least three cad genes, including cadA and/or cadC.

the MIC<sub>90</sub> was 1,600 mg/liter (Fig. 1a and b). Arsenic resistance determinants, namely, arsR, arsB, and arsC (100%, 422/422), as well as arsM (9%, 40/422), were found in the isolates studied. Additionally, 17% (72/422) of the isolates carried a complete ars operon (arsRDABC), the great majority (92%; 66/72) of which had a high MIC value of  $\geq$ 1,600 mg/liter (46/72). Hence, an epidemiological cutoff value (ECV) of  $\geq$ 1,600 mg/liter was suggested for arsenic (Table S1; Fig. 2a).

For cadmium, the MICs varied between 3.12 and 200 mg/liter, with MIC<sub>50</sub> and MIC<sub>90</sub> of 50 and 200 mg/liter, respectively (Fig. 1c and d). Genes that encode resistance to cadmium were present in the following frequencies: cadD (58%, 243/422), cadX (56%, 237/422), cadA (24%, 100/422), cadC (23%, 96/422), and czrC (6%, 26/422). Of note, only 64% (272/422) of all isolates carried at least one known cadmium resistance gene (Table S1).

Although unimodal distributions of MICs were detected for copper, zinc, and arsenic, a bimodal distribution was observed for cadmium. Hence, the isolates were categorized into cadmium susceptible (MIC  $\leq$  50 mg/liter; 54%, 227/422), intermediate (MIC = 100 mg/ liter; 26%, 110/422), and resistant (MIC  $\geq$  200 mg/liter; 20%, 85/422) groups. Notably, the great majority of the isolates in the resistant group (MIC ≥ 200 mg/liter; 88%, 75/85) carried at least three cad genes that included a combination of cadA or cadC and cadD and others (Table S1; Fig. 2b). Thus, an ECV of ≥200 mg/liter was suggested for cadmium.

Interestingly, the mco gene linked to copper resistance and oxidative stress response (29) was strongly associated with isolates with MICs of ≥800 mg/liter and  $\geq$ 100 mg/liter for arsenic and cadmium, respectively (P < 0.05). This might be due to the fact that mco, cad, and/or ars genes were found to be colocated in the same plasmids (Table 1). However, we cannot disregard the hypothesis that mco in S. saprophyticus might provide cross-resistance to Cd, As, and Cu, as it was observed for some efflux pumps (30, 31). We did not test S. saprophyticus isolates for susceptibility to mercury, but we did find its resistance determinant (*merB*) in <10% (n = 35/422) in the collection.

Overall, S. saprophyticus had higher MIC values for copper and zinc, while there was an increased diversity in the MICs for arsenic and cadmium in this bacterial population.

Different susceptibility levels to arsenic and cadmium in S. saprophyticus. Based on the diversity in MICs observed for arsenic and cadmium, we further categorized the isolates' MICs into three levels of susceptibility to these heavy metals. MICs of isolates without known or combination of known acquired resistance determinants were classified as susceptible, those with acquired resistance determinants known to confer high-level resistance, and those with MICs value greater than or equal to the ECV were grouped as resistant. Intermediate was defined as the MIC value that separates the other two susceptibility

TABLE 1 Putative plasmids associated with metal resistance determinants in Staphylococcus saprophyticus in this study

		Frequency (% [no. of isolates	Plasmid						
		carrying the	size	Gene content (total no. of other coding sequences	Closest homology	Size	Coverage	Identity	Reference no.
Rep gene	Plasmid	plasmid])	(dq)	present in each of the plasmids)	(BLASTn)	(dq)	(%)	(%)	or source
rep20_14 (pSSAP2)	KS40p1"	57 (235)	36,709	rep, repA, arsC (30)	S. saprophyticus subsp.saprophyticus MS1146 plasmid pSSAP2	36,907	100	100	26, 41
rep 19c_3 (pETB)	KS345p_9	26 (109)	30,309	rep, repA, qacC, cadD, cadX, bin, tnpC, IS6-like (22)	S. saprophyticus strain UTI-050 plasmid pUTI-050-1	41,251	55	86	This study
repUS10_1 (pSSP1)	KS275p_14	17 (71)	34,497	rep, repA, tnpC, cadA, cadD, cadX, IS6-like (31)	S. saprophyticus strain UTI-050 plasmid pUTI-050-1	41,251	55	66	This study
rep21_26 (pSK108)	KS244p_29	15 (64)	28,635	rep, repA, blaZ, bin, copA, csoR, czrB, IS6-like, qacC (22)	S. warneri strain 22.1 plasmid pSW22.1	25,886	06	89.66	NA <sup>b</sup>
rep19c_2_rep (pvSw4)	KS316p_8	8 (35)	35,941	rep, repA, cadA, arsR, arsM, bin (31)	S. equorum strain C2014 plasmid pC2014-1	80,302	38	96.76	This study
rep 19c_5 (SAP108A)	KS40p3"	6 (25)	29,692	rep, repA, czcD, csoR, copA, cadC, cadD, cadX, bin, mph(C),	S. saprophyticus strain FDAARGOS_168 plasmid unnamed2	29,612	100	100	26
				msr(A), IS6 (13)					
rep 13_2 (pSSP1)	KS170p_18	3 (13)	3,989	rep, cadC, cadX, cadD (0)	S. aureus subsp.aureus ST398 plasmid pUR3912	6,176	76	94.28	This study
Rep	KS40p2 <sup>a</sup>	2 (7)	33,002	rep, repA, merA, merB, merT, IS200, tnpB, IS6, bin, cadC,	S. cohnii strain FDAARGOS_334 plasmid unnamed2	32,058	62	89.66	26
				cadD, IS6-like (23)					
repUS70_1 (SAP047A)	KS103p_20	1 (6)	16,772	rep, repA, cadD, cadX, cadA, arsC, arsB, arsA, arsD, arsR (10)	S. saprophyticus subsp.saprophyticus MS1146 plasmid pSSAP1	66,104	85	86	This study
rep 19c_4 (pSSP2)	KS217p_11	1 (4)	34,121	rep, repA, mco, copA, merB, cadD, cadA, cadX, arsC, arsB,	S. equorum strain KM1031 plasmid unnamed1	45,912	26	86	This study
				arsR, arsA, arsD, arsR (19)					
rep 13_8 (pUR3912)	KS319p_14	<1 (3)	3,747	rep, repA, cadD, cadX (1)	S. aureus subsp. aureus ST398 plasmid pUR3912	6,176	73	96.13	This study
rep5b_1 (pUR2355)	KS203p_15	<1 (2)	32,211	rep, repA, copA, czrB, copY, IS6-like (34)	S. warneri SG1 plasmid clone pvSw4	19,866	44	86.66	This study
rep 16_7 (pBORa53)	KS155p_8	<1 (1)	27,852	rep, repA, cadD, cadX, bin (24)	S. aureus plasmid pMS97 merB gene	33,347	33	98.48	This study
repUS23_1 (SAP099B)	KS262p_11	<1 (1)	28,564	rep, repA, merA, merR, merT, czrB, csoR, copA, copZ, qacA,	S. epidermidis strain 107.2 plasmid pAQZ1	29,431	89	99.94	This study
				qacR, mph(C), msr(A), bin, IS4 (17)					
rep19b_1 (SAP105A)	KS45p_30 <1(1)	<1 (1)	26,220	rep, repA, cadD, cadX, bin (20)	S. hominis strain FDAARGOS_762 plasmid unnamed1	25,845	42	99.75	This study
rep 19c_1 (pLEW6932)	KS161p_10 <1(1)	<1(1)	55,367	rep, repA, mco, copA, bin, merB, ricR, cadX, cadD, 1S6-like (49) S. saprophyticus strain UTI-035 plasmid pUTI-035-2	S. saprophyticus strain UTI-035 plasmid pUTI-035-2	35,615	27	92.25	This study

<sup>a</sup>Sequenced with Nanopore. <sup>b</sup>NA, not applicable.

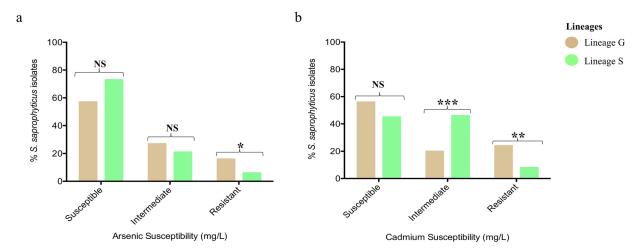
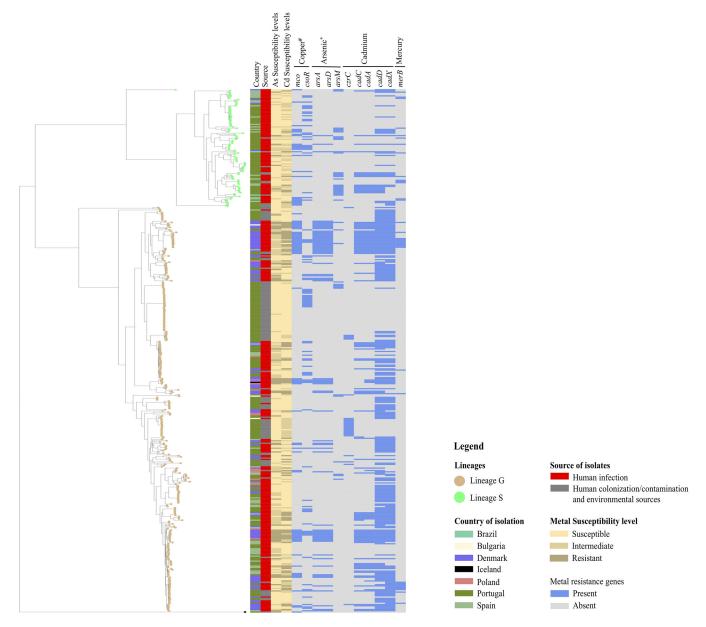


FIG 3 Lineage-based distribution of heavy metal susceptibility levels of 422 Staphylococcus saprophyticus isolates recovered from human infection and colonization/contamination and environmental sources. Resistance to arsenic (sodium arsenite) (a) and cadmium (cadmium chloride) (b) were associated with isolates belonging to lineage G (P < 0.0330 and P < 0.0047, respectively), whereas intermediate phenotype to cadmium was associated with isolates belonging to lineage S (P < 0.0014). Susceptible,  $\leq$  50 mg/liter; intermediate, 100 mg/liter; resistant,  $\geq$  200 mg/liter.

groups. Therefore, isolates with MIC values of ≤400 mg/liter, 800 mg/liter, and ≥1,600 mg/ liter were classified as susceptible, intermediate, and resistant to arsenic, respectively. Likewise, for cadmium, isolates with MIC values of  $\leq$ 50 mg/liter, 100 mg/liter, and  $\geq$ 200 mg/ liter were categorized as being susceptible, intermediate susceptible, and resistant to this metal (Fig. 2a and b; Table S1; Fig. S1). According to this classification, 14% (58/422) showed a resistant phenotype to arsenic, while 25% (800 mg/liter; 107/422) of the isolates in the collection showed an intermediate phenotype. In the case of cadmium, 20% (85/422) showed a resistant phenotype, whereas 26% (110/422) and 54% (227/422) showed intermediate and susceptible phenotypes, respectively (Table S1).

S. saprophyticus belonging to clonal lineage G showed a higher resistant phenotype to cadmium and arsenic. Given that the S. saprophyticus population is mainly composed of two distinct lineages of different origins (26), we looked for a possible link between the level of arsenic and cadmium resistance and S. saprophyticus genetic background. We found that resistant phenotypes to both metals were associated with isolates belonging to lineage G (arsenic: 16%; 52/327, lineage S: 6%; 6/95, P < 0.0330; cadmium: 24%; 77/327, lineage S: 8%; 8/95, P < 0.0047, respectively). Conversely, an intermediate phenotype (MIC, 100 mg/liter) to cadmium was associated with isolates belonging to lineage S (46% [44/95]; 20% [66/327] associated with lineage G; P < 0.0014) (Table S1; Fig. 3a and b; Fig. 4). The association of lineage G and cadmium resistance was independent of the geographic location. Although isolates from Denmark had a high resistance rate to these two metals (Cd, 48/85; As, 25/58), when only isolates from Portugal and Spain were considered, still over 70% (Cd, 23/30; As, 21/28) of the cadmium/arsenic resistant isolates belonged to lineage G.

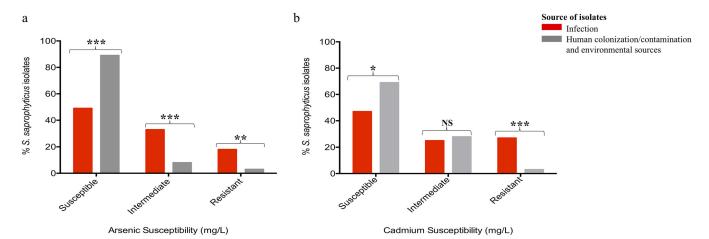
S. saprophyticus isolates of human origin are resistant to high concentrations of arsenic and cadmium. Bacterial lifestyle has been reported to play a significant role in niche adaptation (32, 33). To understand if isolates from different sources differ in their susceptibility to heavy metals, we categorized the isolates into either infection or colonization/contamination/environmental sources. Isolates from human colonization were included in the group of environmental isolates because the great majority of them (32/33) were from the hands of slaughterhouse workers, and in this case, it is not possible to distinguish a situation of colonization from that of contamination with slaughterhouse flora. Indeed, we found different resistant phenotypes to heavy metals to be significantly associated with the source of the isolates. For example, resistance to arsenic (infection, 18% [54/297]; colonization/contamination/environmental sources, 3% [4/125]; P < 0.0011) and cadmium (infection, 27% [81/297]; colonization/contamination/environmental sources, 3% [4/125]; P < 0.0001) were associated with human urinary tract infection



**FIG 4** Distribution of arsenic and cadmium susceptibility levels and associated resistance determinants in 422 *Staphylococcus saprophyticus* isolates as determined by *in silico* analysis. Phylogenetic tree was constructed based on core-genome single-nucleotide polymorphisms without recombination. Phylogenetic tree was visualized using a Microreact web tool. Susceptibility levels to arsenic were classified as follows: susceptible, ≤400 mg/liter; intermediate, 800 mg/liter; resistant, ≥1,600 mg/liter. Susceptibility levels to cadmium were classified as follows: susceptible, ≤50 mg/liter; intermediate, 100 mg/liter; resistant, ≥200 mg/liter. \*, all isolates in the collection carried *arsRBC*; #, all isolates in the collection carried *copABZ*. Data in interactive format are accessible at https://microreact.org/project/uDDq7sLSj3n1Fax6iw8NrY.

isolates (Fig. 4; Fig. 5a and b). A similar observation was noted for an intermediate phenotype to arsenic that was strongly associated with human infection isolates (infection, 33% [97/297]; colonization/contamination/environmental sources, 8% [10/125]; P < 0.0001). Conversely, isolates that were susceptible to arsenic and cadmium were associated with colonization/contamination/environmental sources (P < 0.0007 and P < 0.0411, respectively) (Fig. 4; Fig. 5a and b).

Of note, a similar observation was found when we grouped isolates into human origin (human infection and colonization/contamination) and other environmental sources. Also, when isolates from human infection and colonization/contamination were compared, we noted that resistance to arsenic (MIC, 3,200 mg/liter) and cadmium (MIC, 200 mg/liter) was exclusively from human infection isolates (P < 0.05). This result further



**FIG 5** Heavy metal susceptibility levels in 422 *Staphylococcus saprophyticus* isolates based on origin. (a) Resistant and intermediate phenotypes to arsenic (sodium arsenite) were associated with human infection isolates (P < 0.0011 and P < 0.0001, respectively). Susceptible,  $\leq 400$  mg/liter; intermediate, 800 mg/ liter; resistant,  $\geq 1,600$  mg/liter. (b). Human infection isolates were strongly associated with high-level tolerance to cadmium (cadmium chloride) (P < 0.0001). Overall, susceptible phenotypes to arsenic and cadmium were associated with isolates from colonization/contamination/environmental sources (P < 0.0007 and P < 0.0411, respectively). Susceptible,  $\leq 50$  mg/liter; intermediate, 100 mg/liter; resistant,  $\geq 200$  mg/liter.

suggests that resistance to these metals (arsenic and cadmium) was not only linked with isolates from human origin but associated specifically with those causing infections. The two isolates recovered from small monkeys had similar phenotypes for copper and zinc (1,600 mg/liter each) and an intermediate phenotype to arsenic (200 mg/liter) but had different susceptibility levels for cadmium (100 mg/liter and 200 mg/liter, respectively). The only isolate from live pig also had an MIC of 1,600 mg/liter for copper, but low MICs for zinc and arsenic (400 mg/liter) relative to other isolates in the collection, and an intermediate phenotype (100 mg/liter) for cadmium (Table S1). Overall, *S. saprophyticus* strains causing infection in human are highly resistant to heavy metals.

S. saprophyticus isolates from different countries differed in their susceptibility to arsenic and cadmium. To understand if the level of resistance to metals clustered geographically, we assessed the distribution of heavy metal MICs in three countries for which  $\geq$ 55 S. saprophyticus isolates were obtained, (Denmark (n = 94), Portugal (n = 250), and Spain (n = 55). We noted that the resistant phenotype to arsenic was linked to isolates recovered from a northern European country (Denmark; P < 0.05), while susceptible isolates were associated with southern European countries (Portugal and Spain; P < 0.05). Similarly, we did find that more than 50% (51%; 48/94) of isolates recovered from Denmark showed a resistant phenotype to cadmium (200 mg/liter; P < 0.05) (Fig. 4; Fig. 6a and b) and also belonged to lineage G, a lineage reported to be globally disseminated and also prevalent in northern European countries (26).

Identification of new genes putatively linked to arsenic and cadmium resistance in *S. saprophyticus*. Bacterial susceptibility to different concentrations of heavy metals could be associated with different mechanisms. To identify other candidate determinants that could be associated with resistance to arsenic and cadmium to complement the *in silico* analysis described above, we employed a pangenome-wide association study (pan-GWAS) approach. The association between different metal susceptibility levels described above was tested against 9,182 genes that constituted the accessory genome defined as pan less core (n = 1,885/11,067) using Bonferroni and pairwise comparison P values of <0.05 and odds ratio (OR) of <1 (see Materials and Methods). We excluded the MICs of copper and zinc from this analysis since resistance to these metals was intrinsic in the collection analyzed. In addition to the *ars* operon (arsRDABC) that was strongly linked to resistance to arsenic ( $\geq 1,600 \, \text{mg/liter}$ ) in *S. saprophyticus*, we found genes that encode a putative ABC-F family ATP-binding cassette ( $group_3565$ ) and five hypothetical proteins also associated with high MICs. Notably, another gene that was enriched in isolates showing a resistant phenotype to arsenic

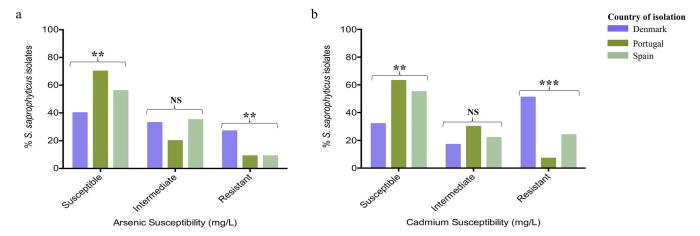


FIG 6 Heavy metal susceptibility level in Staphylococcus saprophyticus recovered from three European countries. (a) Resistance to arsenic (sodium arsenite) was significantly associated with isolates recovered from a northern European country (Denmark), while isolates showing susceptible phenotypes were associated with southern European countries (Portugal and Spain) (P < 0.05). Susceptible,  $\leq 400 \text{ mg/liter}$ ; intermediate, 800 mg/liter; resistant,  $\geq 1,600 \text{ mg/}$ liter. (b) Isolates from Denmark were significantly associated with resistance to cadmium (P < 0.05). Susceptible,  $\leq 50 \text{ mg/liter}$ ; intermediate, 100 mg/liter; resistant, ≥200 mg/liter.

was group\_1381 that encoded two-component membrane permeases that have been described in Streptococcus mutans to be involved in the survival of this bacterium in general stress conditions, particularly in acidified environments (34) (Table 2; Fig. S2;

In addition to the cad genes that were identified by in silico analysis to be associated with a resistant phenotype to cadmium, we found genes (group\_6201 and group\_7208 and group\_7210) encoding multidrug efflux pumps, three transposases, and four genes with uncharacterized functions that were strongly associated with resistance to this metal. Also included was a gene (opuAC) that encodes glycine betainebinding protein that has been described previously in E. coli to be involved in adaptation and resistance in high-osmolarity environments (35) (Table 3; Fig. S3; Table S2). Likewise, a gene (group\_7205) that encodes a transporter belonging to a broad LysE transporter superfamily that is related to CadD family (36) and was previously described to be involved in the amino acids and heavy metal efflux in Corynebacterium glutamicum (36, 37) was included (Table 3; Fig. S3; Table S2).

Besides the metal resistance genes, the putative new resistance determinants identified by GWAS were not part of the representative or putative plasmids identified in this study, with the exception of group\_1381, suggesting that their association with high-level resistance should be functional and not due to colocation in the same mobile genetic element.

The fact that we found the genes identified by the in silico analysis to be associated with resistant phenotype using the pan-GWAS approach further supports the ECVs defined for arsenic and cadmium (Fig. S2 and S3; Table S2). We noted that the great

**TABLE 2** Genes positively associated with resistance (MIC  $\geq$  1,600 mg/liter) to arsenic in Staphylococcus saprophyticus in this study<sup>a</sup>

Gene annotation	Functional annotation	Frequency (%)	Other (%)b	Reference no. or source
arsRDABC	Arsenical resistance operon	79	7	8
group_2340	Hypothetical protein	79	7	NA <sup>c</sup>
group_6095	Hypothetical protein	79	7	NA
group_1381	Putative two-component membrane permease complex subunit SMU_747c	78	7	33
group_3121	Hypothetical protein	50	15	NA
group_3565	Putative ABC transporter ATP-binding protein	34	3	NA
group_6309	Hypothetical protein	22	0	NA
group_6308	Hypothetical protein	22	0	NA

<sup>&</sup>lt;sup>a</sup>Bonferroni P < 0.05 and OR > 1: n = 58.

<sup>&</sup>lt;sup>b</sup>% isolates in the population that carried the genetic determinant but susceptible to the heavy metals.

<sup>&</sup>lt;sup>c</sup>NA, not applicable.

**TABLE 3** Genes positively associated with resistance to cadmium (MIC  $\geq$  200 mg/liter) in *Staphylococcus saprophyticus* in this study<sup>a</sup>

Gene annotation	Nonunique gene name	Functional annotation	Frequency (%)	Others (%) <sup>b</sup>	Reference no. or source
cadX_1		Putative cadmium efflux system accessory protein	72	7	5
group_3121		Hypothetical protein	49	13	$NA^c$
group_2412		Hypothetical protein/transposase	45	11	NA
group_2065		Hypothetical protein/resolvase	45	4	NA
group_3485	cadD	Cadmium resistance permease (CadD)	44	4	5
group_1830	cadA_2	Cadmium-transporting ATPase (CadA)	44	4	5
cadD_1		Cadmium resistance permease (CadD)	44	4	5
tnpC_1		Transposase for transposon Tn554	35	2	NA
group_6073		MerR family transcriptional regulator	35	2	NA
group_6075		Hypothetical protein	34	2	NA
group_7205		Hypothetical protein/lysE family transporter	18	1	35, 36
opuAC		Glycine betaine-binding protein OpuAC	18	1	34
group_7208		RND superfamily resistance-nodulation-cell division, proton (H <sup>+</sup> ) antiporter	18	1	NA
group_7209		Hypothetical protein	18	1	NA
group_7210		Hypothetical protein/ABC transporter permease	18	1	NA
group_2701		Hypothetical protein	16	1	NA
group_6201		Hypothetical protein/DHA2 family multidrug efflux MFS transporter permease subunit	15	1	NA

<sup>&</sup>lt;sup>a</sup>Bonferroni P < 0.05 and OR > 1: n = 85.

majority of the new genes identified were present together with other known resistance determinants to arsenic and cadmium in isolates that showed resistant phenotypes to these metals (Fig. S2 and S3).

Metal resistance determinants in S. saprophyticus are either chromosomal and/ or plasmid-borne. To determine the location of metal resistance genes in S. saprophyticus, first, we accessed the Nanopore closed genomes of KS40, representative of lineage G, and KS160, representative of lineage S (26). The chromosomes have an average size of 2.6 Mb and 2,481 coding sequences (CDS). Noteworthy, the two strains were methicillin resistant and carried mecA. While one (KS160) of the SCCmec types was nontypeable by SCCmecFinder (38), the other (KS40) carried SCCmec type III, a type commonly found in S. saprophyticus (39). These two strains were also different in terms of metal susceptibility phenotypes. KS160 showed an intermediate phenotype to both arsenic and cadmium, while KS40 showed susceptible and resistant phenotypes to these metals, respectively (Table S1).

The visualization of the two closed genomes using Artemis v17.0.1 (40) showed that both strains had resistance determinants for copper (copB) and cadmium (cadD, cadC, and/or cadA) located within the SCCmec region. Other resistance determinants to copper (copA, copZ), zinc (zinT, znuB-znuC, and zur), arsenic (arsB, arsR, and/or arsC), and cadmium (cadC, cadD, and/or cadA) were found in the same chromosomal location in the two strains. There were, however, some differences in the location of extra copies of arsenic resistance determinants (arsB, arsC, and/or arsR) in the chromosomes of the two representative strains (Fig. 7a and b). Additionally, KS160 strain carried extra copies of cadmium resistance determinants (cadA, cadC, and cadD) in its chromosome (Fig. 7b).

The KS160 strain carried no plasmids and more chromosomally encoded heavy metal resistance determinants, but KS40 strain carried three metal-containing plasmids (KS40p1, KS40p2, and KS40p3) (Fig. 7c to e) with sizes ranging from 29,628 bp to 36,856 bp with 27 to 36 CDS. The best hits in a BLAST search against the NCBI (BLASTn) database for each plasmid identified KS40p1 as pSSAP2 (100% nucleotide identity) (GenBank accession number HE616681.1) (41) and KS40p3 as FDAARGOS\_168 plasmid unnamed2 (GenBank accession number CP014115.1)—two plasmids previously found in S. saprophyticus. The KS40p1 was present in 57% (235/422) of the isolates in the collection. It contained the gene encoding plasmid replication protein 20 (rep20), genes encoding arsenic reductase (arsC), and surface protein F (sssF), among other metabolic genes (Table 1; Fig. 7c). On the other hand, KS40p3 was found in 6% (n = 25/422) of the

<sup>&</sup>lt;sup>b</sup>% isolates in the population that carried the genetic determinant but susceptible to the heavy metals.

<sup>&</sup>lt;sup>c</sup>NA, not applicable.

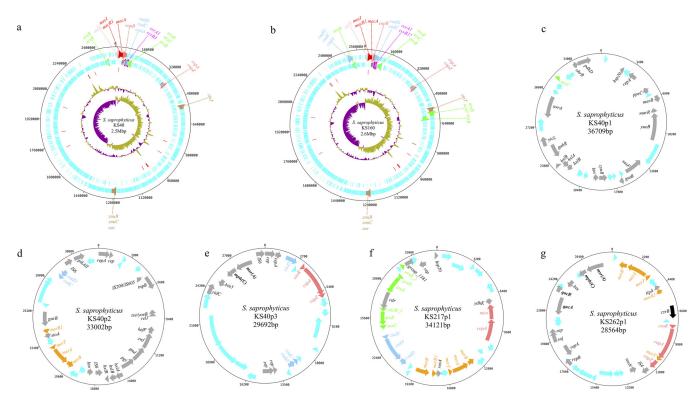


FIG 7 Staphylococcus saprophyticus genomes showing the chromosome and plasmid-borne genetic determinants that encode resistance to heavy metals. (a to b) S. saprophyticus KS40 (a) and KS160 (b) chromosomes showing the chromosome-borne metal resistance determinants of representative strains of lineages G and S, respectively. The tracks from the outside represent (i) chromosome tick marks, (ii) forward CDS, (iii) reverse CDS, (iv) tRNA (red), (v) percent GC plot, and (vi) GC skew (GC)/(G+C). orfX-mecA complex and cassette recombinase genes within the SCCmec are depicted with pink-, red-, and magenta-colored arrows, respectively. Other genes encoding resistance to copper (copA, copB, copZ), zinc (zinT, znuB, znuC, zur), arsenic (arsB, arsC, arsR), and cadmium (cadA, cadC, cadD) are highlighted with different-colored arrows. Arrows with the same color encode resistance to the same heavy metal. (c to g) Representative S. saprophyticus plasmids that carried a single (c) or multiple (d and f) heavy metal resistance determinants in addition to determinants that encode resistance to antibiotics and/or biocides (e and g). Colored arrows represent forward and reverse CDS. Cyan arrow, hypothetical proteins; light red arrows, copper resistance determinants; green arrows, arsenic resistance determinants; light sky-blue arrow, cadmium resistance genes; orange arrows, mercury resistance genes; black arrow, cobalt, zinc, and cadmium resistance gene; dark gray arrow, other CDS. Gene names in bold form represent biocides and antibiotics resistance genes.

collection and carried rep19c genes, genes encoding transposases for insertion sequences, and several resistance determinants to copper (copA, copZ, csoR), cadmium and zinc (cadC, cadD, and czcD), and macrolides [mph(C), msr(A)], among other metabolic genes as well (Table 1; Fig. 7e). The third KS40 plasmid (KS40p2) was present in only seven isolates and had a low homology (coverage, 62%) to those in the NCBI database and hence could be a novel S. saprophyticus plasmid. This novel plasmid contained multiple resistance determinants to heavy metals (cadmium; cadC and cadD; mercury, merR, merA, and merB), IS6-like elements, rep genes, and other metabolic genes (Table 1; Fig. 7d).

Other putative plasmids carrying metal resistance determinants in the entire S. saprophyticus collection were identified using PlasmidFinder (see Materials and Methods). We identified 13 rep gene families (Table S3). Next, we selected one representative isolate from each rep family and blasted the contigs containing these rep genes using BLASTn nonredundant/nucleotide (nr/nt) against the NCBI database and the Nanopore sequences obtained for the KS40 and KS160 strains. We found 13 putative plasmids that were associated with at least one metal resistance determinant in addition to the three plasmids described above (Table 1). One of these putative plasmids, KS244p,  $rep21_26$  (pSK108), 28.6 Kbp, present in 15% (n = 64/422) of the isolates in this collection, was similar (>90% nucleotide identity and coverage) to that in Staphylococcus warneri (pSW22.1) (NBCI nucleotide accession no. NZ\_CP032158.1) and carried copper (copA, csoR) and zinc (czrB) resistance determinants in addition to biocide (qacC) and penicillin (blaZ) resistance genes. The remaining putative plasmids (n = 12) appear to be new, as they had low homology compared to those in NCBI database and present in <10% of the isolates in the collection. Five of these putative plasmids carried only *cad*-system genes (*cadA*, *cadD*, *cadX*, and/or *cadC*), and two carried both *ars* operon and *cad*-system genes, while others carried genes that encoded resistance to macrolides [*mph(C)*, *msr(A)*], biocides (*qacA*, *qacR*), and multiple heavy metals, including copper (*copA*, *csoR*, *mco*), arsenic (*arsRDABC*), cadmium (*cad*-system), and mercury (*merB*) (Table 1; Fig. 7f and g). However, we did not find a direct correlation between the carriage of *rep* genes or the putative plasmids identified and the metal resistance genes in our study. Additionally, we could not ascertain by the methodology used if the plasmids in the collection analyzed were located in the chromosome or autonomously replicating in the cytoplasm.

#### **DISCUSSION**

*S. saprophyticus* is a common cause of uncomplicated community-acquired UTIs worldwide. An association between metal resistance and antimicrobial resistance has been previously established (1), and metal resistance has been described to be a means of evading human immune response (12), potentially contributing to pathogenicity. To better evaluate the clinical significance of resistance to metals, we determined the susceptibility to metals of a diverse collection of *S. saprophyticus*, comprising isolates from human infection and colonization/contamination and food and environmental contamination. Moreover, we explored the heavy metal resistome and identified genes that were never before linked to resistance using a pan-GWAS approach.

Our study showed that S. saprophyticus was highly resistant to copper and zinc and carried, in parallel, resistance determinants for these metals. Copper is acknowledged as a host effector mobilized to urine during UTI to impair bacterial colonization (42, 43). All isolates in this study carried copA and copB that were previously described to mediate efflux and maintain intracellular concentrations of copper necessary for growth in staphylococci (28). These same genes in E. coli were additionally described to be involved in detoxification, colonization, and adhesion of bacteria to the epithelial cells (18). Zinc, on the other hand, is an essential element that plays an important catalytic and structural role in a number of proteins (44). In humans, in particular, the trafficking of zinc to intracellular locations may enhance the bactericidal capability of macrophages and neutrophils (9, 11, 12). All isolates in this study carried genes (zinT, czrA, czrB, znuB, znuC, and zur) which are all part of already described zinc extrusion mechanisms in S. aureus (27). The fact that carriage of these copper and zinc detoxification systems was associated with a high MIC in our study suggests that these systems are probably responsible for the high resistance of S. saprophyticus to copper and zinc. On the other hand, they could additionally contribute to mediating resistance to phagocytosis in infection (11, 43). However, the establishment of a definitive link between these genetic determinants and antibiotic resistance or pathogenicity in S. saprophyticus requires further genetic studies.

In contrast to copper and zinc, for which all *S. saprophyticus* isolates had high MICs, susceptibility to arsenic and cadmium had diverse levels in the population. In particular, 14% of the isolates in this study showed resistance to arsenic ( $\geq$ 1,600 mg/liter), which was correlated with the corresponding carriage of a complete *ars* operon (*arsRDABC*). This system had been described in *S. aureus* and *E. coli*, among others, to mediate resistance to arsenic (8). Like for arsenic, for cadmium, there was a strong association between resistance present in 20% of the population and the presence of a specific *cad* gene system (*cadA* or *cadC* and *cadD-cadX*) that encodes resistance to cadmium in *S. aureus* (27, 45, 46). For these reasons, we proposed that the ECV of  $\geq$ 1,600 mg/liter for arsenic and  $\geq$ 200 mg/liter for cadmium should be considered in *S. saprophyticus*. Another phenomenon that we observed was that the accumulation of previously described arsenic and cadmium resistance genes were associated with a

steady increase in MIC for these two metals, which could be an alternative strategy to achieve high-level resistance.

Using pan-GWAS, we additionally identified other putative determinants that were strongly linked to resistance to arsenic and cadmium. This included a putative ABC-F family ATP-binding cassette and a gene encoding a two-component membrane permease associated with high-level resistance to arsenic and a multidrug efflux pump and an ABC transporter linked to high-level resistance to cadmium. These determinants were previously described to contribute to survival in acidified environments (34) and stress conditions in other bacterial species (34, 36, 37) and can also be important for arsenic and cadmium resistance in S. saprophyticus, contributing to its persistence in low-pH environments such as urine. Most of these new genes were carried together with other known resistance determinants, suggesting that the accumulation of different resistance mechanisms could probably be responsible for the high-level resistance to these metals (arsenic and cadmium) in this bacterium. Indeed, a similar phenomenon has been previously described for high-level resistance to linezolid in S. epidermidis (47). Further studies on the functional characterization of these candidate protein-coding genes and the hypothetical proteins identified are required to give insight into their roles in heavy metal resistance in S. saprophyticus. Surprisingly, for the few cadmium-intermediate-resistant isolates that do not carry any known resistance genes, no genes were found to be associated with this phenotype. The phenotypes observed in these isolates could probably be due to cross-resistance from resistance mechanisms from other heavy metals or unknown mechanisms yet unexplored.

Resistance to arsenic and cadmium was statistically associated with isolates belonging to clonal lineage G, a lineage previously reported to have originated in food production animals (26). Likewise, livestock-associated MRSA (LA-MRSA) isolates belonging to clonal complex 398 (CC398) have been previously reported to be associated with resistance to cadmium (48). Arsenic and cadmium are ubiquitous in nature, and the continuous use of these metals in human industrial activities could have contributed to their abundance (8). This could have been the driving force for the emergence of arsenic and cadmium resistance of bacteria in the farm environment (8). In addition, resistance to arsenic and cadmium was additionally strongly linked to isolates from northern Europe (Denmark). The causal link between arsenic resistance and Denmark is not easy to explain and could derive from either the high prevalence of lineage G in this country (26) or selection by exposure to arsenic. Prevalence of lineage G, a lineage associated with the pig meat processing chain, can be a result of the fact that Denmark is one of the major producers of pigs and pig meat (49). On the other hand, studies assessing the concentration of metals in food products showed that contamination of these products (fish, meat, and milk) with arsenic is apparently higher in Denmark than in other countries such as Portugal (50). Since S. saprophyticus can be a colonizer or contaminant of these food products (7), resistance to arsenic could have resulted from prolonged exposition to arsenic and cadmium in these food products. Nevertheless, we could not establish if there were differences in the use of heavy metals between the southern and northern European countries sampled in this study that could explain these results, as there are scarce reports addressing this.

Interestingly, resistance to arsenic and cadmium was associated with human infection, an observation that was still maintained when only isolates outside Portugal (infection and environment) were considered. This finding could be the consequence of continuous interaction of human microbiota with these heavy metals in the environment where they are found as common pollutants (51) or from their use as topical antiseptics, disinfectants, and preservatives in consumer products (52, 53). On the other hand, the link between arsenic resistance and infection might derive from previous colonization with S. saprophyticus strains belonging to lineage G. This lineage was found in this study to be associated with arsenic and cadmium resistance. Furthermore, lineage G was previously shown to have

originated in the food production chain and to be transmitted to humans, probably as a result of poor hygienic procedures during raw meat handling or contact with the food processing chain setting (26). Since urine is the main route of excretion of most metals (54-56), resistance of uropathogenic S. saprophyticus to these metals could also contribute to its survival in the bladder. On the other hand, genetic determinants associated with resistance to these metals can provide a better adaptation of S. saprophyticus to the acidic environment of the urine as mentioned above, functioning as virulence determinants under these conditions.

Some of the resistance determinants for copper, arsenic, and cadmium were found in our collection to be part of the core nonmobile genome, and some have been found in mobile genetic elements like putative plasmids and SCCmec, as previously described in S. aureus (46, 57). In particular, a high prevalence of putative plasmids harboring metal resistance genes was estimated among the S. saprophyticus collections analyzed, reaching 57% for some plasmids. In some of these putative plasmids, there was co-occurrence of multiple metal resistance determinants (ars operon, cad gene system, copA, mco, and merB) in addition to biocides (qacC, qacA) and antibiotic resistance genes [mph(C), msr(A), and blaZ]. This suggests that these determinants could probably be transferred between strains or to other related staphylococcal species, providing resistance not only to multiple heavy metals but also to biocides and antibiotics in a single genetic event. Indeed, the exposure of bacteria to heavy metals has been suggested to coselect for antibiotic and biocide resistance owing to the co-occurrence of their resistance determinants that could be transported in the same plasmid (10, 13).

In this study, we found high levels of resistance to heavy metals in S. saprophyticus, identified putative resistance determinants, found geographic and clonal lineage associations, and established a link between high heavy metal resistance and pathogenicity.

#### MATERIALS AND METHODS

Ethical considerations. The human isolates were recovered as part of the routine clinical diagnostic testing; ethical approval and informed consent were not required. All data were handled anonymously. Isolates from slaughterhouse samples were recovered as part of the routine control practices for evaluation of good hygiene practices and programs to ensure meat safety (CE no. 853/2004).

Bacterial collection. A diverse collection of 422 S. saprophyticus isolates recovered from different sources between 1997 and 2017 in seven countries was assembled. UTI-causing isolates (n = 285) were recovered from Denmark (n = 91), Poland (n = 13), Portugal (n = 128), and Spain (n = 54). Twelve isolates recovered from human blood in Brazil (n = 2), Bulgaria (n = 3), Denmark (n = 4), Iceland (n = 1), Poland (n = 1), and Spain (n = 1), as well as one isolate from human nasal swab in Poland, were included in the collection. Additionally, we included 104 isolates recovered from human hands (n = 32), slaughterhouse equipment (n = 32), pork meat samples (n = 39), and a live pig (n = 1). We also included 18 isolates recovered from household kitchen equipment (n = 13) and staple food products (n = 5). Lastly, two isolates recovered from small monkeys in Brazil were also included (Table S1 in the supplemental material).

Metal susceptibility testing. MICs to four heavy metals were determined for all isolates using agar dilution method with Mueller-Hinton agar (58) containing copper (copper sulfate; Merck, Darmstadt, Germany), zinc (zinc sulfate; Merck, Darmstadt, Germany), arsenic (sodium arsenite; Sigma-Aldrich, St. Louis, MO), and cadmium (cadmium chloride; Sigma-Aldrich, St. Louis, MO) and at concentrations ranging from 3.12 to 3,200 mg/liter (58). Bacteria were grown overnight, and cultures were emulsified in 0.85% NaCl to a turbidity equivalent to a 0.5 McFarland standard suspension, inoculated with 2-µl spots on the top of the agar plates supplemented with metals, and incubated at 37°C for 24 h. Assays were carried out in duplicate. The MIC was determined as the lowest concentration of metal that completely inhibited growth (58).

Determination of ECV. The ECV was defined as the MIC value that separates the isolates into a wildtype population and those with acquired or unknown resistance mechanisms to the heavy metals, as previously suggested by EUCAST (59).

Whole-genome sequencing and assembly. Pair-end sequence reads produced on an Illumina MiSeq with an average coverage of 103x per genome reported in Lawal et al. (26) with the accession number PRJNA604222 were retrieved from Sequence Read Archive. Low Q score ends (Q score < 20) were trimmed of the Illumina reads using Trimmomatic v0.36 (60). Reads were assembled using SPAdes v3.11.1 (61). The quality of the assemblies was evaluated using QUAST v5.1 (62). Contig sizes of less than 200 bp were discarded.

Detection of metal resistance genes and putative plasmids. The draft genomes were screened for known metal resistance determinants using ABRicate v0.5 pipeline (https://github.com/tseemann/ abricate). Genes that were reported to be putatively associated with resistance to metals in staphylococci were searched for in literature, and respective nucleotide sequences were extracted from NCBI to create a custom database that was embedded in ABRicate (Appendix I in the supplemental material). Genes with minimum coverage length of ≥70% and identity of ≥90% were considered present. Moreover, to determine whether metal resistance genes were carried within plasmids, genomes were first screened for genes encoding plasmid replication proteins (rep) using the PlasmidFinder database (https://cge.cbs.dtu.dk/services/PlasmidFinder/). Furthermore, containing the rep genes were blasted against the NCBI database and against closed genomes of representative strains that had previously been sequenced with Nanopore (26) (accession number PRJNA604222). The chromosomes and plasmids were visualized using Artemis v17.0.1 (40) and DNAPlotter v1 (63).

Phylogenetic construction. Sequence reads were mapped to the S. saprophyticus strain (ATCC 15305) and generated core genome alignment using Snippy v4.3.6 (https://github.com/tseemann/ snippy). Unknown characters from the sequence alignment were removed, and the cleaned alignment was used as input for the recombination detection pipeline Gubbins v2.3.4 (64) with default parameters to remove the polymorphic sites. The recombination-free alignment was used to construct a maximumlikelihood tree using RAxML v8.2.18 (65). The generalized time-reversible nucleotide substitution with gamma correction for rate heterogeneity was performed with 100 bootstrap replicates random resampling for node support. Phylogenetic tree was visualized using Microreact web tool (66).

Genome annotation and pan-GWAS analysis. To further identify putative genetic determinants associated with different metal resistance levels (high, medium, and low), we annotated the draft genomes using the gene function prediction pipeline, Prokka v1.13 (67). Homologues were clustered at 85% amino acid identity to generate the pangenome using Roary (68). We accessed the accessory genome, which was defined as the pan less the core. To determine genetic determinants for heavy metal resistance, the three different phenotypes (susceptible, intermediate, and resistant) were used as predefined traits for pan-GWAS using Scoary (69). Only genes with a Bonferroni and best pairwise comparison P values of <0.05 and odds ratio (OR) >1, with no duplicated function in the pangenome, were considered.

Statistical analysis. The mean and standard error values of replicates of each strain were calculated. The statistical significance was assessed using unpaired Student's t test or chi-square test. Statistical analyses were performed with GraphPad Prism v6.0 (GraphPad Software, Inc., San Diego, CA).

#### **SUPPLEMENTAL MATERIAL**

Supplemental material is available online only.

SUPPLEMENTAL FILE 1, PDF file, 2.2 MB. **SUPPLEMENTAL FILE 2**, XLSX file, 0.04 MB. **SUPPLEMENTAL FILE 3**, XLSX file, 0.1 MB. SUPPLEMENTAL FILE 4, XLSX file, 0.04 MB.

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O.U.L. and O.B. performed the isolation. O.U.L. performed the phenotypic experiments and bioinformatics analysis. O.U.L., H.W., P.W., and M.D.B. performed the sequencing of the isolates. O.U.L. and M.M. carried out the data analysis and interpretation and wrote the first draft of the manuscript. O.U.L. and M.M. revised the manuscript. M.J.F., L.G., P.P., E.G., C.T., J.E., M.U., H.d.L., H.W., and M.D.B. provided the isolates. M.J.F., L.G., P.P., E.G., C.T., J.E., M.U., H.d.L., H.W., P.W., and M.D.B. were involved in manuscript revision. All authors read and approved the final manuscript.

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We declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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