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Antibiotic treatment can exacerbate biofilm-associated infection by promoting quorum cheater development

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Quorum cheating, a socio-microbiological process that is based on mutations in cell density-sensing (quorum-sensing) systems, has emerged as an important contributor to biofilm-associated infection in the leading human pathogen *Staphylococcus aureus*. This is because inactivation of the staphylococcal Agr quorum-sensing system leads to pronounced biofilm formation, increasing resistance to antibiotics and immune defense mechanisms. Since biofilm infections in the clinic usually progress under antibiotic treatment, we here investigated whether such treatment promotes biofilm infection via the promotion of quorum cheating. Quorum cheater development was stimulated by several antibiotics used in the treatment of staphylococcal biofilm infections more strongly in biofilm than in the planktonic mode of growth. Sub-inhibitory concentrations of levofloxacin and vancomycin were investigated for their impact on biofilm-associated (subcutaneous catheter-associated and prosthetic joint-associated infection), where in contrast to a non-biofilm-associated subcutaneous skin infection model, a significant increase of the bacterial load and development of *agr* mutants was observed. Our results directly demonstrate the development of Agr dysfunctionality in animal biofilm-associated infection models and reveal that inappropriate antibiotic treatment can be counterproductive for such infections as it promotes quorum cheating and the associated development of biofilms.

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INTRODUCTION

Healthcare-associated (nosocomial) infections (HAIs) affect an average of 7.6% of hospitalized patients in high-income countries¹. In the United States, the mortality due to HAIs has been estimated at ~99,000 annual deaths² and remains substantial despite some recent decline³. In low-income countries, HAI incidence and mortality are even higher^{1,4}. Many HAIs stem from infections of indwelling medical devices, such as surgical implants, prosthetic devices, and urinary tract, intravenous, or central lineassociated catheters⁵. The frequently fatal outcome of deviceassociated infections is mostly due to bloodstream infections that originate from the infected devices^{6,7}. For example, central lineassociated bloodstream infections (CLABSIs), one of the most deadly types of HAIs, have a mortality rate of 12–25%⁸. Deviceassociated infections are notoriously difficult to treat due to the formation of biofilms. Biofilms are bacterial agglomerations that can cover the device's interior and exterior surface and exhibit pronounced resistance to antibiotics^{9–12}. For that reason, deviceassociated infections have remained particularly difficult to treat even by modern drug development strategies¹³.

One of the most frequent causes of device-associated infections is *Staphylococcus aureus*¹⁴. In comparison to other bacteria often found in these infections, such as the closely related coagulase-negative staphylococci, device-associated infections with *S. aureus* typically show more severe clinical progression and outcome due to the more pronounced virulence of *S. aureus*^{14–16}. *S. aureus* is infamous for its exceptional recalcitrance towards antibiotic treatment¹⁷, which is in part due to specific antibiotic resistance genes, such as *mecA* in methicillin-resistant *S. aureus* (MRSA)^{17,18}. However, even antibiotics that normally efficiently kill MRSA, such

as vancomycin, have strongly reduced activity against MRSA in biofilms^{19,20}, and biofilms formed by methicillin-sensitive *S. aureus* (MSSA) also show pronounced resistance to antibiotic treatment^{21,22}. Therefore, understanding the mechanisms of antibiotic resistance in biofilm infection is essential to improve therapeutic strategies for this major nosocomial pathogen.

Over the last decades, there has been intensive research into the molecular underpinnings of biofilm formation. In S. aureus and other biofilm-forming pathogens, this has led to the identification of a wide variety of molecules that in a structural, metabolic, or regulatory capacity, participate in biofilm formation^{23,24}. For example, guorum-sensing (QS) systems, which adapt bacterial physiology to the changing conditions brought upon by increasing cell density, have a key role in biofilm development in many bacteria^{25,26}. In S. aureus, there is one QS system, which is called Agr for accessory gene regulator^{27,28}. Agr controls several factors that contribute to biofilm development, among them proteases and nucleases that degrade the biofilm matrix and phenol-soluble modulins (PSMs), which are amphipathic peptides that structure biofilms by preventing non-covalent interactions between matrix macromolecules^{23,29,30}. The absence of PSMs leads to decreased formation of biofilm channels and overall thicker and more compact biofilms, to a similarly pronounced degree as seen in agr mutants, indicating a key role of PSMs in biofilm development³¹. We also confirmed the role of Agr and PSMs in S. aureus and S. epidermidis in models of biofilm-associated infections^{25,31-34}. However, these represent rather rare examples in which biofilm infection models were used to confirm the validity of in vitro findings²⁵. Generally, the dynamics of biofilm infection remain incompletely understood.

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Fig. 1 Development of Agr (QS)-dysfunctional mutants under antibiotic treatment in vitro. a Experimental setup. For planktonic growth, cultures of *S. aureus* LAC were inoculated daily into new TSB media at 1/200 volume for 9 days. Levofloxacin (Lev), vancomycin (Van), or clindamycin (Cli) were supplied at $\frac{1}{4} \times$ MIC. For biofilm growth, cultures of *S. aureus* LAC were inoculated at 1/200 volume from pre-cultures into microtiter plate wells containing 200 µl of TSBg each and grown for 48 h to form a biofilm. Then, the supernatant was gently removed, and 200 µl TSBg containing Lev, Van, or Cli was dispensed into the wells at 5× MIC In the following 9 days, every 3 days, the old supernatant was gently removed and replaced with fresh TSBg (200 µl) with the respective antibiotics. **b**, **c** Results for planktonic (**b**) and biofilm (**c**) growth. Agr dysfunctionality was assessed by hemolysis on sheep agar plates. n = 3/group and time point. Error bars show the mean ± SD. Statistical analysis is done by two-way ANOVAs with Dunnett's post-tests versus control values.

We previously reported that Agr-dysfunctional S. aureus mutants develop in vitro to a considerable extent³². The development of QS-dysfunctional mutants such as S. aureus Agrdysfunctional mutants are commonly called "quorum cheating" and was first observed for the QS systems of Pseudomonas aeruainosa³⁵. Ouorum cheating describes the sociomicrobiological phenomenon that some bacteria in a population shut off the costly, QS-controlled secretion of degradative enzymes that are needed for nutrient acquisition, relying on other members of the population until a balanced equilibrium of cheaters and non-cheaters develops³⁶

While established predominantly using in vitro research, there is evidence that similar principles of quorum cheating and quorum cheating control also apply to in vivo infection^{37,38}. Importantly, we and others have reported that Agr-

dysfunctional mutants can be frequently found in *S. aureus* infection isolates and particularly in those isolated from biofilmassociated infections or blood infections, which often stem from biofilms on infected indwelling devices^{39–43}. Recent animal research in our laboratory has indicated that the development of *agr* mutants in biofilm-associated infections does not entirely follow predictions from socio-microbiological models³² inasmuch as it is strongly dependent on the specific in vivo setting, with the increased biofilm formation of *agr* mutants mediating increased resistance to innate immunity mechanisms. In accordance with this apparent key importance of Agr dysfunctionality for immune evasion in a biofilm setting, we also recently found, using analysis of sequential isolates, that Agr-dysfunctional mutants develop during human clinical PJI⁴⁰, an observation made afterward in similar form in cystic



fibrosis⁴⁴. Notably, in our previous study, clinical biofilms were virtually 100% composed of *agr* mutants ("quorum cheaters") rather than of an equilibrium of Agr-functional and -dysfunctional bacteria as the socio-microbiological model would have predicted³². The fact that in this recent clinical study, patients

were commonly under antibiotic therapy prompted us to investigate in the present study, using animal models of biofilm infection, whether antibiotic therapy plays a role in the development of antibiotic-resistant biofilms via a possible stimulation of quorum-cheating effects. np

Fig. 2 Development of Agr dysfunctionality and impact of antibiotic treatment during device- and non-device-associated infection. **a** Experimental setup. Female, 6–8 weeks old C57BL/6 were used. For antibiotic treatment, mice received antibiotics starting on day 6 after infection (catheter and skin abscess models) every 24 h for 3 days until the end of the experiment. Controls received no antibiotic. Mice received intraperitoneal injections of 0.25 ml containing 0.3 mg ml⁻¹ Van (3.75 mg kg⁻¹) or oral doses of 0.4 ml containing 0.04 mg ml⁻¹ Lev (0.8 mg kg⁻¹). All mice in one infection type were infected with the same CFU (skin abscess, $\sim 1 \times 10^7$ CFU; catheter infection, $1 \times 10^3 - 10^4$ CFU with actual adherent bacterial numbers tested.) **b**, **c** Results obtained with infection by *S. aureus* LAC wild-type with and without antibiotics. **d**, **e** Results obtained with infection by *S. aureus* LAC wild-type versus isogenic Δagr mutant. **f**, **g** Results obtained with infection by *S. aureus* LAC Δagr with and without antibiotics. n = 6 (**b**, **d**, **f**); n = 8 (**c**, **e**, **g**). **h** Representative infected or control (no infection) catheter pieces stained with PI or WGA-Alexa FluorTM 350. Statistical analysis is 1-way ANOVA (**b**, **f**) or Kruskal–Wallis (**c**, **g**), with Dunnett's post-tests versus data obtained with wild-type control, Mann–Whitney test (**d**), and unpaired, two-tailed *t*-test (**e**). Parametric versus non-parametric tests were chosen based on normal distribution (Shapiro–Wilk) tests for the data in the respective comparisons. Error bars show the geometric mean and geometric SD.

RESULTS

Quorum cheater development in biofilm and planktonic settings in vitro

We first analyzed the development of Agr-dysfunctional mutants under treatment with subinhibitory concentrations of antibiotics in vitro, using the common approach to determine hemolytic capacity as a proxy for Agr dysfunctionality^{32,39,41,45} (Fig. 1a). We used ¹/₄× MIC concentrations for the planktonic and 5× (planktonic) MICs for the biofilm mode of growth⁴⁰. These concentrations were chosen as they produced similarly modest arowth inhibition under the conditions of the experimental setup (Supplementary Fig. 1). Vancomycin (Van), levofloxacin (Lev), and clindamycin (Cli) were chosen as antibiotics for this experiment because these were most frequently used for PJI in our clinic and because we also had used them in our previous study on antibiotic tolerance mediated by Agr-dysfunctional biofilms⁴⁰. We used the MRSA strain LAC (USA300) for our experiments, which is nowadays a widely used standard strain in S. aureus pathogenesis research. USA300 isolates are the most common cause of community-associated MRSA and a leading cause of hospitalassociated MRSA infections in the United States⁴⁶.

In this experiment, we passaged cultures by daily inoculation of fresh growth media with 1/200 volume of the cultures in the planktonic mode setup. For the biofilm setup, as biofilms cannot be quantitatively transferred, we exchanged the supernatant on top of the biofilms grown in microtiter plate wells every three days with fresh growth medium. We found that the applied sub-inhibitory concentrations of antibiotics revealed significant effects on the development of quorum cheaters (Fig. 1b, c). Furthermore —although the planktonic and biofilm experimental setups are certainly difficult to directly compare—these antibiotic-dependent effects appeared earlier (already at 3 versus only at 6 days) and were more pronounced (a consistent increase of ~50% over the 3–9 days' time range) in the biofilm than a planktonic mode of growth.

Impact of low-dose antibiotic concentrations on the development of biofilm- and non-biofilm-associated infection

Then, we proceeded to our main goal of analyzing quorum cheating under antibiotic treatment during experimental infection. To that end, we again used strain LAC (USA300) and mouse infection models of biofilm-associated and non-biofilm-associated subcutaneous skin infection (Fig. 2a). Except for device insertion, these two models are very similar and thus offer the possibility to compare for the effect of device (biofilm) involvement. Antibiotic treatment was initiated at day 6 post-infection (in both skin abscess and catheter infection models) and repeated another two times every 24 h, for a total of 3 days, after which CFU was counted. For the investigation of the impact of antibiotics, we focused on Van and Lev and used a low-dose regimen corresponding to ~1/8 of the mouse body weight-corrected dose suggested for the clinical treatment of bone and joint infections⁴⁷. This was intended to mimic the situation frequently encountered

during the treatment of device-associated infections, where the applied dosage is subinhibitory due to increased tolerance to antibiotics of the device-associated biofilms, resulting in the persistence of the infection. The low-dose regimen was also necessary because of the comparison to non-catheter-associated skin infection, where higher doses would have rapidly killed all bacteria.

As intended, treatment with Van or Lev only slightly and did not significantly reduce CFU in the skin abscess model (Fig. 2b). Contrastingly, in the biofilm-associated subcutaneous catheter model, CFU was increased by the addition of antibiotics, which was significant for Lev (Fig. 2c). Hypothesizing that the underlying reasons were associated with quorum cheating and its effect on biofilm-mediated resistance, we first determined the behavior of a constructed isogenic QS (Δagr) mutant versus wild-type LAC. In accordance with what we showed previously³², the Δagr mutant had strongly and significantly decreased infectivity in the skin abscess model (Fig. 2d), as expected from the control by Agr of several virulence factors that are known to be crucial in that setting, such as PSMs or α -toxin^{48,49}. In contrast, the Δagr strain showed significantly higher infectivity than the wild-type strain in the biofilm-associated catheter infection model (Fig. 2e). In the skin abscess model, both Van and Lev treatment led to significantly reduced CFU (Fig. 2f), indicating that in vivo resistance to the used antibiotic concentrations is strongly diminished in the Δagr strain, a likely consequence of the strongly diminished bacterial survival capacities that are associated with Agr dysfunctionality in that setting^{32,49}. Notably, the significant increase in CFU in the biofilm-associated catheter infection model that we observed with antibiotic treatment and infection by wildtype S. aureus was not observed with the isogenic Δagr strain (Fig. 2g), suggesting that Agr quorum sensing is causally related to this phenomenon. We also stained catheters with PI or WGA-Alexa FluorTM 350, which stain biofilm extracellular DNA or polysaccharide, respectively, confirming that antibiotics increased biofilm formation in the LAC but not Δagr -infected animals (Fig. 2h).

The short-duration experiment (6 plus 3 days) was chosen to be able to compare directly to non-biofilm-associated skin infection, in which pathogenesis-related phenotypes occur early. However, because effects in the catheter infection model were not very pronounced at 9 (6 plus 3) days post-infection, only reaching significance for Lev in the important comparison shown in Fig. 2c, we performed an additional catheter infection experiment in which we prolonged the infection and took samples at 6 plus 1, 3, or 9 days to obtain time-dependent data (Fig. 3a). The phenomenon of increased infectivity under antibiotic treatment developed over time, reaching significance at 3 and 9 days for Lev and at 9 days for Van, but was completely absent in mice that were infected with Δagr instead of wild-type *S. aureus* (Fig. 3b, c).

Furthermore, we used an additional biofilm-associated infection model, a model of PJI, to corroborate our results obtained in the catheter infection model (Fig. 4a). In this model, we also observed significantly increased CFU in Δagr as compared to LAC-infected animals and increased CFU in LAC but not Δagr -infected animals



Fig. 3 Analysis of the development of Agr (QS)-dysfunctional mutants in the catheter infection model over time. a Experimental setup. Mice were implanted with catheters with $1 \times 10^3 - 10^4$ adherent bacterial CFU and received intraperitoneal injections of 0.25 ml containing 0.3 mg ml⁻¹ Van (3.75 mg kg⁻¹) or oral doses of 0.4 ml containing 0.04 mg ml⁻¹ Lev (0.8 mg kg⁻¹) daily for 9 days after infection. Controls received no antibiotic. Different groups of mice (n = 6/group) were euthanized on days 1, 3, or 9 after initiation of antibiotic treatment. **b**, **c** CFU on the catheters in the different groups after euthanizing. Statistical analysis is by Mann–Whitney tests. Error bars show the geometric mean and geometric SD. **d**, **e** Agr (QS) dysfunctionality was assessed by hemolysis on sheep agar plates. Statistical analysis is by Fisher's exact test at every time point based on the underlying raw data (hemolysis phenotype) of analyzed clones.

under antibiotic treatment (reaching statistical significance with Lev) (Fig. 4b–d).

Development of quorum cheaters during biofilm- and nonbiofilm-associated infection with low-dose antibiotic concentrations

If our hypothesis is correct that QS dysfunctionality underlies the observed increased infectivity under antibiotic treatment in the biofilm-associated models, we expect to detect the development of quorum cheaters during infection with wild-type *S. aureus*. To confirm this hypothesis, we determined the hemolytic capacity of isolates as a readout for Agr functionality at the end of the infection. While Agr-dysfunctional mutants were not detected in

non-catheter (non-biofilm)-associated skin infection under any condition, they developed in a catheter (biofilm)-associated infection at significantly higher rates (Table 1). Importantly, the rate of Agr-dysfunctional mutant development in catheterassociated infection was further increased significantly under treatment with Lev or Van. Similar observations were made in the PJI model, where no Agr-dysfunctional mutants were observed without, but at significant rates with Lev or Van treatment (Table 1). All non-hemolytic clones interpreted as *agr* mutants were confirmed by DNA sequencing to harbor non-synonymous mutations in the Agr system (Tables 2 and 3). As reported previously for *agr* mutations that occur in vitro or in vivo^{32,40,41}, mutations mapped to the *agrA* or *agrC* genes. Interestingly, we frequently detected the same mutation in two or more isolates



а



Fig. 4 Prosthetic joint infection (PJI) model. a Experimental setup. Female, 6–8 weeks old C57BL/6 were used. For antibiotic treatment, mice received antibiotics starting on day 14 after infection every 24 h for 7 days until the end of the experiment. Controls received no antibiotic. Mice received intraperitoneal injections of 0.25 ml containing 0.3 mg ml⁻¹ Van (3.75 mg kg⁻¹) or oral doses of 0.4 ml containing 0.04 mg ml⁻¹ Lev (0.8 mg kg⁻¹). All mice were infected with the same CFU (~1 × 10⁷ CFU in 50 µl, intra-articular injection). **b** Results obtained with infection by *S. aureus* LAC wild-type with and without antibiotics. **c** Results obtained with infection by *S. aureus* LAC wild-type versus isogenic Δagr with and without antibiotics. *n* = 8. Statistical analysis is 1-way ANOVA with Dunnett's post-tests versus data obtained with wild-type control (**b**, **d**) and by unpaired, two-tailed *t*-test (**c**). Error bars show the geometric mean and geometric SD.

from one mouse, indicating the proliferation of agr-mutated clones. Finally, while the percentage of QS mutants after 6 plus 3 days of intervention was still low, it is important to stress that in our time-extended antibiotic intervention model, the percentage of QS mutants that were detected after 6 plus 9 days was substantial (Lev > 10%; Van > 2% of the entire population) (Fig. 3d, e). The mouse biofilm-associated infection models can barely be further extended because the infections heal. Nevertheless, these data indicate that QS mutants can develop and substantially proliferate during antibiotic treatment of biofilm-associated infection. Because the biofilm phenotypes we observed with low-dose antibiotics can theoretically also be due to reduced Agr expression under those conditions, we analyzed whether low-dose antibiotic treatment leads to changes in agr expression. While it is difficult to estimate the actual in vivo concentrations at the biofilm infection site, we used the $5\times$ MIC concentrations we had employed in the in vitro experiment shown in Fig. 1c for that purpose. We believe that the moderate growth inhibition observed with those concentrations in vitro indicates that they are at least as high as those encountered in vivo because we did not observe growth inhibition in vivo with the used antibiotic concentrations at the initial 1-day time points. There was no inhibition of agr expression, as measured by gRT-PCR of the agrA gene, by 5× MIC of Lev, Van, or Cli (Supplementary Fig. 2). For all three antibiotics, agr expression, in fact, rather increased.

Altogether, our findings show that antibiotic treatment can exacerbate device-associated *S. aureus* infection and mechanistically link this phenomenon to the increased frequency of development and proliferation of biofilms composed of Agrdysfunctional mutants that exhibit increased antibiotic resistance.

DISCUSSION

The exceptional capacity of S. aureus and other pathogens to colonize indwelling medical devices to cause persistent, antibioticresistant biofilm infections has mainly been attributed to the presence of specific genes, such as those coding for biofilm matrix polysaccharides or proteins^{25,50,51}. While such biofilm-associated factors are certain prerequisites for the initiation and persistence of biofilm infection, and the infection environment can also lead to changes in their expression⁵², recent work performed in our laboratories and elsewhere indicates that device-associated infection is a dynamic process with genetic adaptations that play an important role in the progress of such infections. Specifically, mutations in the Agr QS system have now been recognized as defining genetic adaptations developing during and exacerbating S. aureus device-associated infection by their increased propensity to form biofilms^{31,32,34,40,53,54}, explaining the frequent isolation of such mutants from these infections^{34,39,41}.

Because clinical device-associated infections commonly progress under antibiotic treatment, in this study, we aimed to directly investigate whether antibiotic treatment can impact device-associated infections by potentially stimulating quorum cheating, i.e., stimulating the rise of *agr* mutants. In vitro, antibiotics led to earlier and more pronounced development of quorum cheaters in biofilm than in the planktonic mode of growth. More importantly, we show that a low-dose antibiotic

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able 1. Agr mutation rates during infection under 3-day low-dose antibiotic treatment.							
Mutation rate (agr mutant clones/total)	Skin abscess	Catheter infection	PJI				
Without antibiotic	0 (0/920)	5.88×10 ⁻³ (5/850)	0 (0/914)				
Levofloxacin	0 (0/908)	1.75×10^{-2} (15/855; $p = 0.040^{a}$)	5.5×10^{-3} (5/903; $p = 0.030^{a}$)				
Vancomycin	0 (0/916)	1.74×10 ⁻² (16/918; <i>p</i> = 0.028 ^a)	5.6×10^{-3} (5/895; $p = 0.030^{a}$)				
^a Statistical analysis is by two-tailed Fisher's exact test versus data obtained without antibiotics in the same infection type.							

regimen exacerbated biofilm-associated infection and was associated with a concomitant rise and proliferation of *agr* mutants.

Our findings are consistent with a model (shown in Fig. 5) in which the persistence of spontaneously arising Agr-dysfunctional QS mutants during biofilm-associated infection is promoted by antibiotic treatment. As our previous investigations have shown^{32,40}, biofilms composed of *agr* mutants have increased resistance to antibiotics and leukocyte attacks; thus, the development of Agr-dysfunctional biofilms during clinical biofilm-associated infection is likely to be explained by the selective pressure exerted by a combination of these two mechanisms.

These findings have important clinical implications. The most striking message from our study is that antibiotic treatment at concentrations that do not eradicate the infection—which is the very problem encountered in the case of device-associated infections—can trigger the rise of Agr-dysfunctional quorum cheater mutants and thereby further exacerbate the infection.

Our study has limitations. We only used selected antibiotics for our study. However, we believe that our results can be generalized because (i) the antibiotics we chose cover those frequently used in the clinic, (ii) represent entirely different modes of action (DNA synthesis, cell wall synthesis), and (iii) antibiotic tolerance by biofilm formation is generally recognized to be non-specific. Furthermore, due to limits of how long mouse biofilm-associated experimental infection can be maintained, we were not able to prolong infection until the complete overtake of quorum cheaters that we saw in chronic clinical biofilm infection⁴⁰ could be observed. However, given the considerable expansion of guorum cheaters that we observed in the mouse model during 2 weeks of infection, we believe it is reasonable to assume further spread to the point observed in long-term human infection. In addition, the strong increase under antibiotic treatment, which represents the main message of this study, was clearly visible during the monitored timeframe. Finally, we acknowledge that there may be additional mechanisms unrelated to biofilm formation that facilitate survival of Agr-dysfunctional mutants in persistent infection, such as intracellular survival in host cells, which has been linked to PSMs⁵⁵. While intracellular persistence was not addressed in our study, it has been linked to factors other than Agr, such as small colony variants or the regulator Rsp^{56,57} mutations associated with which were not identified in our previous human study that monitored mutations arising during biofilm infection⁴⁰.

METHODS

Bacterial strains and growth conditions

S. aureus LAC (pulsed-field type USA300) was obtained from NARSA (Network on Antimicrobial Resistance in S. aureus). The isogenic agr mutant of S. aureus USA300 LAC has been described previously⁴⁸. The entire agr system is deleted in this mutant, which has been produced via phage transduction from strain RN6911⁵⁸. All strains were stored in tryptic soy broth (TSB and BD) supplemented with 30% glycerol at -80 °C. For pre-cultures, which were used to inoculate main cultures in the various experiments as indicated, bacteria were grown on solid agar plates containing TSB for ~24 h, from which single clones were

tional All bacterial cultures were grown at 37 °C. Analysis of QS dysfunctionality and agr sequencing Similarly to several previous studies^{32,39,41,45}, we used hemolytic

activity upon plating on sheep blood agar as a readout for Agr functionality. Most mutants that lose hemolytic capacity reportedly show spontaneous mutations in the Agr system^{32,39,41,45}. In key in vivo experiments, we sequenced the *agrA* and *agrC* genes of the non-hemolytic clones with primers agrACforward (5'-GCTATACAGTGCATTTGCTAG-3') and agrACreverse (5'-TCGCAGCT TATAGTACTTGTG-3').

used for inoculation. Planktonic cultures were grown under

shaking conditions (200 rpm) in TSB, and biofilm cultures in

microtiter plates in TSBg (TSB plus 0.5% glucose) without shaking.

In-vitro development of Agr-dysfunctional mutants

For the planktonic mode of growth, cultures were grown in TSB for 24 h in 15 ml round-bottom tubes, and fresh cultures were inoculated every day for 9 days using 1/200 volume of the previous culture in only TSB (control) or TSB with levofloxacin (Lev), vancomycin (Van), or clindamycin (Cli) at 1/4 MIC. The MICs determined for strain LAC against antibiotics used in this study were: 1 µg/ml (Van), 4 µg/ml (Lev), and 0.3 µg/ml (Cli). On days 3, 6, and 9, dilutions were plated on sheep blood agar, and hemolysis was evaluated after overnight incubation at 37 °C. For the biofilm mode of growth, cultures of S. aureus LAC were inoculated at 1/200 volume from pre-cultures into microtiter plate wells containing 200 µl of TSBg and grown for 48 h to form a biofilm. Then, the supernatant was gently removed, and 200 µl TSBg containing Lev, Van, or Cli was dispensed into the wells at 5× MIC. In the following 9 days, every 3 days, the old supernatant was gently removed and replaced with fresh TSBg (200 µl) with the respective antibiotics.

Antimicrobial resistance profiles

The antimicrobial susceptibilities of isolates were determined by the disc diffusion method on Mueller–Hinton agar according to Clinical and Laboratory Standards Institute (CLSI) guidelines. *S. aureus* ATCC29213 was used as a quality control.

Quantitative real-time reverse transcription polymerase chain reaction (qRT-PCR)

The total RNA of *S. aureus* was extracted using an RNA extraction reagent (Takara RR047A), then complementary DNA was synthesized from the total RNA by using the RT reagent Kit (Takara, RR037A). Amplification of the resulting complementary DNA sample was performed with the TB Green[®] Fast qPCR Mix (Takara, RR430A). The 7500 Sequence Detector (Applied Biosystems) was used to perform reactions in MicroAmp Optical 96-well reaction plates. Oligonucleotides used were as follows (5'–3'): gyrB-F, CAAATGATCACAGCATTTGGTACAG, gyrB-R, CGGCATCAGTCATAAT GACGAT, agrA-F, GCACATACACGCTTACAATTATTA, agr-R, ACACTG AATTACTGCCACGTTTTAA. 8

Treatment	Sample no	Mouse no	Mutated gene	Mutated location in gene	Amino acid exchange
	Sumple no.	mouse no.	mutated gene		
3d none	1	1	agrA	C520A	His174Asn
	2	1	agrA	C520A	His174Asn
	3	1	agrC	C1160T	Ser387Phe
	4	2	agrA	G683A	Cys228Tyr
	5	4	agrA	C355T	Arg119Stop
3d Lev 1 2 3 4 5 6 7 8 9	1	1	agrA	C520A	His174Asn
	2	1	agrA	C520A	His174Asn
	3	1	agrA	C520A	His174Asn
	4	1	agrA	G683A	Cys228Tyr
	5	1	agrA	G683A	Cys228Tyr
	6	2	agrA	G683A	Cys228Tyr
	7	2	agrA	G683A	Cys228Tyr
	8	2	agrA	G541A	Glu181Lys
	9	2	agrA	G541A	Glu181Lys
	10	3	agrC	C634T	Arg212Cys
	11	3	agrA	G443A	Gly148Asp
12 13 14	12	3	agrA	G443A	Gly148Asp
	13	3	agrA	G653A	Arg218Gln
	14	3	agrA	G653A	Arg218Gln
	15	4	agrC	C insertion before T634	Frameshift
3d Van	1	1	agrA	C505T	His169Tyr
	2	1	agrA	C505T	His169Tyr
	2	1	agrC	T1070G	lle357Asn
	3	1	agrA	G227A	Arg76His
	4	2	agrC	C1085T	Ser362Leu
	4	2	agrC	T557A	Phe186Tyr
	5	2	agrC	C1160T	Ser387Phe
	6	2	agrC	C1160T	Ser387Phe
	7	2	agrC	C1160T	Ser387Phe
	8	2	agrC	C1160T	Ser387Phe
	9	3	agrA	C520A	His174Asn
	10	3	agrA	C520A	His174Asn
	11	3	agrA	C520A	His174Asn
	12	3	agrA	C520A	His174Asn
	13	4	agrC	A796 deletion	Frameshift
	14	4	agrC	A796 deletion	Frameshift
	15	4	agrC	G1018A	Ala340Thr
	-				

Animal experiments

Female C57BL/6 mice were purchased from JSJ Corp. (originally introduced from Jackson Laboratory) and used for all mouse experiments. All mice were between 6 and 8 weeks of age at the time of use. All animals were euthanized by CO_2 at the end of the studies. In the antibiotic treatment experiments, mice received antibiotics every 24 h starting on day 6 after infection (catheter and skin infection models) or day 14 after infection (PJI) every 24 h until the end of the experiment. Controls received no antibiotic. Van and Lev were dissolved in water to a concentration of 0.3 mg ml⁻¹ or 0.04 mg ml⁻¹, respectively, and solutions were filter-sterilized. Mice received intraperitoneal injections of 0.25 ml containing 0.3 mg ml⁻¹ Van (3.75 mg kg⁻¹) or oral doses of 0.4 ml containing 0.04 mg ml⁻¹ Lev (0.8 mg kg⁻¹). Investigators were blinded to group allocation when determining CFU.

Skin abscess model. About 1×10^7 CFU of bacteria in 50 µl of PBS were injected subcutaneously into the left and/or right flank of shaved mice. To determine the bacterial load, abscesses on day 9 were surgically removed, cut into small pieces and split into four separate tubes containing 500 mg of borosilicate glass beads and 500 µl of sterile PBS. The skin pieces were homogenized in a FastPrep 96 (MP Bio) homogenizer, 5×1 min at 1800 rpm. The homogenates were then plated, incubated at 37 °C for 24 h, and enumerated.

Catheter infection model. The catheter infection model was performed essentially as described previously³². Briefly, 1-cm catheter pieces (Surflo[®] Teflon i.v. catheters, $14 \times 2''$) were coated with equal numbers of bacteria. Adherence was tested in control experiments and was in the same range ($\sim 1 \times 10^3$ – 10^4). Catheters were then inserted under the dorsal skin of mice. Catheters were removed carefully from the skin on days 7, 9, and 15 after infection, and CFU on the catheters and the directly adjacent

Table 3. Non-synonymous mutations in non-hemolytic clones that developed in the mouse PJI model.								
Treatment	Sample no.	Mouse no.	Mutated gene	Mutated location in gene	Amino acid exchange			
3d none	No non-hemolytic clones observed							
3d Lev	1	2	agrC	C541T	Gln181Stop			
	2	2	agrA	G683A	Cys228Tyr			
	3	2	agrC	C640T	Gln214Stop			
	4	2	agrC	A1252G	Asn418Asp			
	5	3	agrC	G1024A	Glu342Lys			
3d Van	1	1	agrA	C136T	Gln46Stop			
	2	2	agrC	G940A	Glu314Lys			
	3	2	agrC	G940A	Glu314Lys			
	4	2	agrC	G940A	Glu314Lys			
	5	3	agrC	A898G	Lys300Glu			



Fig. 5 Model of the role of QS (Agr) mutant development during staphylococcal device-associated infection. Naturally, skincolonizing *S. aureus* contaminates the indwelling medical device (shown as a subcutaneous catheter, as an example) during insertion. Initial colonization of the device by contaminating bacteria ensues. Spontaneous mutations in the *agr* locus happen in some bacteria, producing Agr-dysfunctional *S. aureus*. During prolonged infection under selective pressure by antibiotics (vancomycin, levofloxacin), Agr-dysfunctional mutants outgrow wild-type members of the population. As a result, a strong biofilm forms, considerably increasing antibiotic resistance and resistance to leukocyte attacks. This leads to the exacerbation of device infection, which can involve bacteremia and systemic dissemination.

tissue were determined by plating as above after performing a validated sonication protocol to disrupt bacterial agglomerates on the catheters and homogenizing the tissue samples using the FastPrep 96 (MP Bio) homogenizer, 5×1 min. The sonication protocol consisted of sonication of harvested catheters for 5 min in 1 ml PBS in 2 ml tubes in an Ultra Sonic Cleaner, followed by vortexing for 15 min on a Vortex-Genie2. Some catheters obtained on day 9 after infection were also fixed with 2.5% glutaraldehyde in 0.1 M PBS for 30 min and then stained either with 10 μ M propidium iodide (Yeasen, Shanghai) (staining extracellular DNA) for 15 min or 2.5 μ g/ml wheat germ agglutinin (WGA)-Alexa

FluorTM 350 (Invitrogen, W11263) (staining staphylococcal biofilm exopolysaccharide) for 20 min. Stained catheters were then washed with PBS and longitudinally placed in wells of a 96-well sterile, tissue culture-treated microplate with black well walls and an optically clear cyclic olefin bottom and imaged using an Agilent BioTek Lionheart FX Automated Microscope using the confocal channel (555 nm laser for the PI-stained staphylococcal biofilm and 350 nm laser for the WGA-stained staphylococcal biofilm) with the $4\times$ objective.

PJI model. For the PJI model, mice underwent unilateral proximal tibial implant insertion with a 10-mm syringe needle from a 1-ml BD insulin syringe $(29 \text{ G} \times 1/2^{"}, 0.33 \text{ mm} \times 12.7 \text{ mm})$ using a previously described surgical technique⁵⁹. Following pressfit implant insertion and arthrotomy closure, a gas-tight syringe (65 RN, Hamilton) was utilized to administer a 50-µl intra-articular injection of bacteria with ~ 1×10^7 CFU. Beginning CFU dosing was verified through parallel syringe injections placed directly in triplicate onto sheep blood agar plates. On day 21 after infection, mice were euthanized by CO2. Each of the whole unilateral tibial implant with the syringe needle and the directly surrounding tissue was removed and CFU were determined by plating as above, after performing a validated sonication protocol (see above) to disrupt bacterial agglomerates on the total unilateral tibial implant, and homogenizing the tissue samples using the FastPrep 96 (MP Bio) homogenizer, 5×1 min.

Statistics

Statistical analysis was performed using GraphPad Prism version 9.3.1 for Mac OS. Unpaired, two-tailed *t*-tests or Mann–Whitney tests were used for the comparison of two groups depending on the results of Shapiro–Wild tests for normality of distribution, and 1-way or 2-way ANOVAs, or Kruskal–Wallis tests, as applicable and depending on Shapiro-Wilk tests, for the comparison of more than two groups. The specific tests used are indicated in the figure legends. For arithmetic scales, error bars depict the standard deviation (SD) and lines depict the mean. For logarithmic scales, the geometric mean with the geometric SD is depicted. All replicates are independent.

Graphics software and pictures

Illustrations were made using Biorender and Adobe Illustrator under NIAID licenses. Mouse pictures are from Vecteezy.com.

Inclusion and ethics

All animal work complied with all relevant ethical regulations and was approved by the Ethics Committee of Ren Ji Hospital, School

(Approval Number: KY2021-225-B).

Reporting summary

Further information on research design is available in the Nature Research Reporting Summary linked to this article.

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DATA AVAILABILITY

All data generated or analyzed during this study are included in this published article or in the supplementary information files. The *S. aureus* LAC Δagr strain is available from Dr. Min Li or Dr. Michael Otto subject to a simple transfer agreement.

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AUTHOR CONTRIBUTIONS

Conceptualization: M.O. Methodology: L.H., M.O., and M.L. Investigation: L.H., H.L., Y.W., F.J., Q.L., F.Z., and H.W. Visualization: L.H. and M.O. Funding acquisition: L.H., H.S., M.L., and M.O. Supervision: L.H., H.S., and M.L. Writing—original draft: L.H. and M.O. Writing—review & editing: L.H., M.L., and M.O.

COMPETING INTERESTS

The authors declare no competing interests.

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