Lambda Interferon Restructures the Nasal Microbiome and Increases Susceptibility to *Staphylococcus aureus* Superinfection

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ABSTRACT Much of the morbidity and mortality associated with influenza virus respiratory infection is due to bacterial coinfection with pathogens that colonize the upper respiratory tract such as methicillin-resistant *Staphylococcus aureus* (MRSA) and *Streptococcus pneumoniae*. A major component of the immune response to influenza virus is the production of type I and III interferons. Here we show that the immune response to infection with influenza virus causes an increase and restructuring of the upper respiratory microbiota in wild-type (WT) mice but not in *Il28r−/−* mutant mice lacking the receptor for type III interferon. Mice lacking the IL-28 receptor fail to induce STAT1 phosphorylation and expression of its regulator, SOCS1. *Il28r−/−* mutant mice have increased expression of interleukin-22 (IL-22), as well as Ngal and RegIIIγ, in the nasal cavity, the source of organisms that would be aspirated to cause pneumonia. Proteomic analysis reveals changes in several cytoskeletal proteins that contribute to barrier function in the nasal epithelium that may contribute to the effects of IL-28 signaling on the microbiota. The importance of the effects of IL-28 signaling in the pathogenesis of MRSA pneumonia after influenza virus infection was confirmed by showing that WT mice nasally colonized before or after influenza virus infection had significantly higher levels of infection in the upper airways, as well as significantly greater susceptibility to MRSA pneumonia than *Il28r−/−* mutant mice did. Our results suggest that activation of the type III interferon in response to influenza virus infection has a major effect in expanding the upper airway microbiome and increasing susceptibility to lower respiratory tract infection.

IMPORTANCE *S. aureus* and influenza virus are important respiratory pathogens, and coinfection with these organisms is associated with significant morbidity and mortality. The ability of influenza virus to increase susceptibility to *S. aureus* infection is less well understood. We show here that influenza virus leads to a change in the upper airway microbiome in a type III interferon-dependent manner. Mice lacking the type III interferon receptor have altered STAT1 and IL-22 signaling. In coinfection studies, mice without the type III interferon receptor had significantly less nasal *S. aureus* colonization and subsequent pneumonia than infected WT mice did. This work demonstrates that type III interferons induced by influenza virus contribute to nasal colonization and pneumonia due to *S. aureus* superinfection.

Bacterial superinfection is a major cause of the morbidity and mortality associated with influenza (1). *Streptococcus pneumoniae*, *Haemophilus influenzae*, and *Staphylococcus aureus* have been the most prevalent respiratory pathogens; however, highly virulent methicillin-resistant *S. aureus* (MRSA) strains common in the United States are now increasingly frequent (2, 3). These organisms are often part of the commensal flora colonizing the nasal cavity, which provides a source for subsequent aspiration into the lung. While the normal host readily clears the small numbers of routinely aspirated flora, in the setting of influenza virus infection, there is significantly increased susceptibility to severe bacterial pneumonia (4–6). Substantial epidemiological data have documented that nasal colonization with *S. aureus* is a major predisposing factor for subsequent infection (7–10). These data have spurred screening for nasal carriage of MRSA and universal de-colonization of intensive care unit patients (11) to prevent infection, since the carriage of these organisms is so common (12). Several investigators have demonstrated that the bacterial inoculum required to cause *S. pneumoniae* (4) or *S. aureus* pneumonia (13, 14) in a murine model is significantly decreased in the setting of antecedent influenza virus infection, and the multiple immune mechanisms responsible have been recently reviewed (15). The density of pathogen colonization in the upper respiratory tract is likely a contributing factor in susceptibility to subsequent pneu-
monia. Influenza vaccination with live attenuated virus increases the amounts of both pneumococci and staphylococci in the upper airway (16), suggesting that the immune response activated by influenza virus affects the factors that normally regulate the upper airway microbiome.

A major component of the initial immune response to influenza virus infection is activation of type I and III interferons (IFNs), resulting in the induction of over 300 genes that comprise the interferome (17–19). Type I IFN signaling is mediated through IFNAR, a receptor that responds to 13 IFN-α subtypes, IFN-β, IFN-ε, and IFN-ω through JAK-STAT signaling and activation of an autocrine loop (20). The type III IFNs, IFN-λ, or IL-28A/B and IL-29 are sensed through a compound receptor composed of the IL-28 receptor (IL-28R) and IL-10RB (21), which is not ubiquitous like IFNAR and is expressed predominantly on mucosal surfaces (22) and on neutrophils (23). Type I and III IFN signaling contributes to the pathology elicited by S. aureus pulmonary infection (24, 25) and influenza virus-induced type I IFN contributes to greater S. aureus-induced lung pathology and poorer prognosis (6). Thus, once these pathogens reach the lower airways, they are likely to cause more severe disease in the setting of influenza. However, it is not clear whether influenza and IFNs enable pathogens such as MRSA to colonize and proliferate in the nasal cavity, which is a major source of subsequent pulmonary infection.

We postulated that bacterial superinfection after influenza virus infection requires two factors: first, the accumulation of an adequate inoculum of potential pathogens in the upper respiratory tract, and second, impaired innate immune defenses within the lung itself, attributed to the type I/III IFNs and other factors (5, 24, 26). The combination of both events results in pneumonia instead of bacterial clearance. In the studies presented here, we demonstrate that type III IFN-STAT1 signaling elicited by influenza alters the composition of the nasal microbiome and proteome, increases susceptibility to nasal colonization, and impairs the clearance of S. aureus from the lower airways.

RESULTS

Influenza virus infection results in expansion and restructuring of the nasal microbiome. We investigated the influence of mouse-adapted influenza virus strain PR8 on the upper respiratory microbiome of wild-type (WT) C57BL/6J mice (Fig. 1). There was a significant increase in the total numbers of bacteria recovered from the upper airway following 3 days of infection (P = 0.002) (Fig. 1A). Although the overall diversity of the microbial community was unchanged, as measured by culture-dependent and -independent techniques (Fig. 1B and C), we observed specific changes in the relative abundance of certain bacterial species (Table 1; Fig. 1D), including murine commensal staphylococci. In addition, culture-independent microbial community profiles clustered on the basis of the presence of influenza virus, suggesting reproducible shifts in the structure of the commensal microbiome in response to infection (Fig. 1E and F).

IL-28R signaling has a major effect on the density of the upper airway flora. We next addressed the role of type III IFN signaling in the control of the nasal microbiome. IL28 gene expression in the upper airway was documented to be significantly upregulated in response to PR8 (Fig. 2A). There was no increase in the abundance or change in diversity of the nasal flora observed in the Il28r−/− mutant mice after influenza virus infection (Fig. 2B and C), in contrast to the significant increase in upper airway flora in WT mice after influenza virus infection. Culture-independent experiments further confirmed a lack of change in diversity after influenza virus infection (Fig. 2D) and also showed no major changes in the structure or composition of the microbiome (Fig. 2E).

To confirm that type III IFN signaling was responsible for alterations in flora, recombinant IL-28B (IL-28A and -B are 96% identical [27]) was instilled into the airways of WT mice, which resulted in significant increases in the number of bacteria recovered from the upper airway (P = 0.0011) (Fig. 2F), to levels comparable to those observed with influenza virus infection. There were no significant changes in the overall diversity of the microbiota, but as with influenza virus infection, some species increased disproportionately (Fig. 2G; Table 1; see Tables S1 to S4 in the supplemental material). These results suggested that IL-28R–IFN-λ signaling is specifically involved in the restructuring of the microbial ecology of the upper airway and the increase in specific local flora in response to influenza virus infection. The differences in flora observed were not due to the severity of influenza virus infection in the different mouse strains. Weight loss over the course of infection (Fig. 2I) and levels of viral RNA found in the lungs of WT and Il28r−/− mutant mice were similar (Fig. 2I).

IL-28R signals through STAT1. The type III IFNs are involved in multiple downstream signaling cascades that could affect the abundance of nasal flora through the action of antimicrobial peptides, cytokines that alter barrier function and immune cells recruited across the mucosal surface. The effects of type III IFNs are mediated by JAK/STAT signaling, initiated by phosphorylation of STAT1 (28, 29). The relative induction of STAT1 and STAT3 phosphorylation in WT and Il28r−/− mutant mice, exposed to influenza virus or phosphate-buffered saline (PBS), were compared, and Ifnar−/− mutant mice were included as a control for the type I IFNs (Fig. 3A). STAT1 and STAT3 phosphorylation was induced by influenza virus infection in WT and Ifnar−/− mutant mice at days 3 and 7 postinfection (Fig. 3A). However, minimal amounts of STAT1 or phosphorylated STAT1 were detected in Il28r−/− mutant mice. Even at 7 days postinfection, substantially less phosphorylated STAT1 was detected in Il28r−/− mutant mice than in WT or Ifnar−/− mutant controls. To determine if these differences in STAT1 activation were associated with changes in the upper airway microbiome after influenza virus infection, we quantified commensal flora in STAT1 null mice before and following influenza virus infection. As was observed in the Il28r−/− mutant mice, in the absence of STAT1, there was no increase in the abundance or diversity of nasal flora after influenza virus infection (Fig. 3B). To confirm that the effect of type III IFN on flora was through STAT1, we applied purified IL-28B to the airways of WT and Stat1−/− mutant mice. While addition of IL-28B to WT mice led to expansion of the resident flora and increases in specific species, Stat1−/− mutant mice had no change in the numbers of bacteria present (Fig. 3C; see Tables S5 to S8 in the supplemental material). Thus, IFN-λ-dependent regulation of the nasal microbiome is mediated by STAT1-dependent signals.

Effects of STAT1-SOCS1 interactions in the upper airway. STAT1 signaling could affect the abundance of the upper airway flora through several mechanisms. STAT1 induces and is regulated by SOCS1, which interacts directly with JAK kinase (30, 31). SOCS1 regulates the expression of antimicrobial peptides that would control the abundance of commensal flora (32). We pre-
dicted that, in the absence of STAT1 signaling, there would be decreased SOCS1 expression, as was observed in the lung lysates of Il28r/H11002/ H11002/ H11002 mutant mice compared with those of WT or Ifnar/H11002/ H11002/ H11002 mutant mice, both of which express STAT1 (Fig. 3D). In the nasal cavities of WT mice, there was significant upregulation of Socs1 expression in response to influenza virus infection, but no increase was observed in the Il28r/H11002/ H11002/ H11002 mutant mice that lacked P-STAT1 (P < 0.01) (Fig. 3E).

SOCS1 involvement in the suppression of NF-κB- and STAT1-dependent genes could impact the abundance of antimicrobial peptides in the upper airway. We compared the expression of selected antimicrobial peptides and cytokines in the nasal cavities of WT and Il28r/H11002/ H11002/ H11002 mutant mice (Fig. 3F). While Il22 expression was undetectable in WT mice, it was prominently expressed in Il28r/H11002/ H11002/ H11002 mutant mice. There was upregulation of the IL-22-dependent antimicrobial peptide RegIIIγ in Il28r/H11002/ H11002/ H11002 mutant mice but no significant differences in S100A8 (33, 34). NGAL (lipocalin), an NF-κB-dependent gene product, was also significantly upregulated in the absence of IFN-λ signaling.

Proteomic analysis of upper airway lavage fluids reflects consequences of IL-28 signaling for epithelial barrier function. A global analysis of the effects of type III IFN signaling on the proteome of the upper airway was performed. Nasal lavage fluids were harvested from WT and Il28r/H11002/ H11002/ H11002 mutant mice with and without influenza virus infection (Fig. 4). At the baseline, we found significant amounts of the antimicrobial peptide NGAL in Il28r/H11002/ H11002/ H11002 mutant mice, which was likely to have an effect on the overall composition of the nasal microbiota (Fig. 4A). Classification of the families of proteins differentially expressed in WT and Il28r/H11002/ H11002/ H11002 mutant mice indicated major differences in proteins that control barrier function. Consistent with the observed upregulation of Il22 in Il28r/H11002/ H11002/ H11002 mutant mice and proposed effects of IL-22 on mucosal barrier function, we detected differential expression of proteins that were enriched for actin depolymerization and the

FIG 1 Changes in the upper respiratory microbiome in response to influenza virus infection. WT mice were infected with PR8 or treated with PBS for 3 days. (a) Total bacterial load (CFU) recovered from the upper airway, n = 11. (b, c) Shannon-Weiner diversity of bacteria cultured (b) or identified with culture-independent techniques (c) from the upper airway, n = 11 (b) or 8 (c). (d) Culture-independent analysis of community composition in the upper airways of WT mice infected with PR8 or treated with PBS as a control. Relative abundance plots show differences between PR8-infected and PBS-treated mice. The bar plot shows differences in rarefied reads for the top 10 OTUs (ranked by relative abundance), as indicated by color coding. The top 10 OTUs constitute >99% of the rarefied reads. n = 8. (e) Maximum-parsimony tree based on OTU presence in or absence from the upper airways of mice infected with PR8 or treated with PBS. Branch length is proportional to the number of gain/loss changes in OTUs (scale bar represents 40 changes). Branches representing influenza virus-infected samples are red, and PBS-inoculated control samples are green. (f) Ordination plot of culture-independent analysis demonstrating segregation of PR8-infected mice (red) and PBS-treated controls (green); shaded areas are the minimum convex polygons enclosing the data points in each group. P = 0.004. Data are representative of at least two independent experiments. Graphs display mean values and standard errors. **, P < 0.01; *, P < 0.05.
cytoskeleton, including radixin and moesin, in Il28r−/− mutant mice (Fig. 4B). Fewer differences were seen in the nasal proteome of Il28r−/− mutant mice after influenza virus infection, consistent with the major role of IL-28R in mediation of the local responses to influenza virus infection (Fig. 4C). One protein differentially upregulated in Il28r−/− mutant mice in response to influenza virus infection was AGR2, which interacts with Muc-2 and has an anti-inflammatory role in the gut (35). Another protein with a similar expression profile, PP1A, is a phosphatase that plays a role in HIV-1 transcription (36). Many more differentially expressed proteins were observed in WT mice following influenza virus infection. These findings suggest a change in the proteome reflecting consequences of IL-28 signaling in response to viral influenza virus infection.

Type III IFN signaling promotes MRSA nasal colonization and pulmonary infection. To determine if the density of the human commensal/pathogen MRSA USA300 is similarly affected by IFN-α signaling, we examined the consequences of influenza virus infection on the nasal carriage of MRSA (Fig. 5A). Following influenza virus infection, mice were intranasally inoculated with MRSA in a small volume such that bacteria were not aspirated into the lungs, animals infected with influenza virus were found to contain significantly more S. aureus in their nasal tissue, i.e., 67-fold (at 3 days) and 41-fold (at 7 days) more than PBS-inoculated controls (Fig. 5A). Influenza virus infection also led to significant recovery of S. aureus from the lower airways compared to PBS-inoculated mice that did not aspirate S. aureus into their lungs (Fig. 5A). Similar results were obtained with mice precolonized with S. aureus prior to influenza virus, which had a 197-fold greater nasal bacterial burden (P < 0.01) and a 21-fold (P < 0.01) greater amount of bacteria recovered from the lungs than control mice (Fig. 5B).

When we repeated the experiment by comparing WT and Il28r−/− mutant mice, influenza virus-infected Il28r−/− mutant mice had 40-fold fewer (P < 0.01) S. aureus bacteria in their nasal tissue than did infected WT mice (Fig. 5C). Likewise, in their lung tissue, Il28r−/− mutant mice had 99.7% fewer bacteria than similarly infected WT mice (Fig. 5C). Analysis of cytokine production in bronchoalveolar lavage fluid (BALF) from Il28r−/− mutant mice showed significant increases in IL-6 and leukemia inhibitory factor (Fig. 5D) that may have aided in bacterial clearance from the airway.

To determine if the effects of type III IFN signaling on infection are specific for the pathogens typically associated with human infection after influenza virus infection, we repeated the influenza studies by using the opportunistic pathogen Pseudomonas aeruginosa. No increase in subsequent pulmonary infection was observed (Fig. 5E), suggesting that the consequences of IL-28R signaling on the antimicrobial milieu of the upper airway are somewhat pathogen specific (Fig. 5E). To further confirm that IL-28 signaling is a major factor in the pathogenesis of pulmonary MRSA infection after influenza virus infection, PBS-treated or influenza virus-infected mice were inoculated with a standard intranasal inoculum of S. aureus USA300. As expected, there was significantly increased susceptibility of WT mice to MRSA pneumonia, with a bacterial burden in the lungs 8.3-fold greater than that of Il28r−/− mutant mice (Fig. 5F).

### TABLE 1 Microbiota changes based on culture with influenza and rIL-28

| Species                      | No. of mice with bacteria | Mean no. of CFU/50 μl of BALF |
|------------------------------|---------------------------|-------------------------------|
|                              | Influenza− | Influenza+ | PBS | rIL28 | P value | Influenza− | Influenza+ | PBS | rIL28 | P value |
| Gram positive                |             |            |     |       |         |              |            |     |       |         |
| Staphylococcus lentus        | 9           | 10         | 1.0000 | 268 | 483 | 0.1639 |
| Staphylococcus xylosus       | 9           | 9          | 1.0000 | 19  | 192 | 0.2556 |
| Staphylococcus nepalensis    | 8           | 7          | 1.0000 | 24  | 123 | 0.4698 |
| Enterococcus faecalis        | 3           | 4          | 1.0000 | 21  | 21.25 | 0.3545 |
| Bacillus thuringiensis       | 4           | 1          | 0.3108 | 8   | 1   | 0.2556 |
| Enterococcus gallinarum      | 2           | 1          | 1.0000 | 3   | 4   | >0.9999 |
| Staphylococcus cohnii        | 2           | 1          | 1.0000 | 11  | 106 | >0.9999 |
| Aerococcus urinaeaequi       | 0           | 2          | 0.4762 | 0   | 13  | 0.4762 |
| Jeotgalicoccus halotolerans  | 0           | 2          | 0.4762 | 0   | 58  | 0.4762 |
| Gram negative                |             |            |     |       |         |              |            |     |       |         |
| Klebsiella oxytoca           | 3           | 5          | 0.6594 | 2   | 43  | 0.1883 |
| Enterobacter hormaechei      | 4           | 2          | 0.6351 | 32  | 1,224 | 0.6351 |
| Enterobacter absuriae        | 1           | 4          | 0.3108 | 7   | 464 | 0.1454 |
| Gram positive                |             |            |     |       |         |              |            |     |       |         |
| Staphylococcus xylosus       | 10          | 10         | 1.0000 | 59  | 284 | 0.1639 |
| Staphylococcus lentus        | 7           | 9          | 0.5820 | 3   | 230 | 0.0034 |
| Staphylococcus nepalensis    | 3           | 9          | 0.0198 | 4   | 200 | 0.0014 |
| Staphylococcus cohnii        | 5           | 6          | 1.0000 | 59  | 283 | 0.1948 |
| Enterococcus faecalis        | 5           | 5          | 1.0000 | 24  | 244 | 0.5076 |
| Aerococcus urinaeaequi       | 0           | 5          | 0.0325c | 0   | 289 | 0.0325c |
| Gram negative                |             |            |     |       |         |              |            |     |       |         |
| Enterobacter hormaechei      | 4           | 4          | 1.0000 | 57  | 190 | 0.8114 |
| Enterobacter absuriae        | 1           | 0          | 1.0000 | 194 | 0   | >0.9999 |

* Culture-dependent identification of bacteria recovered from the upper airways of WT mice infected with PR8 or treated with PBS for 3 days or with BSA or rIL28B after 18 h is shown. Data are representative of at least three independent experiments. For presence data, the Fisher exact test was used. For mean CFU counts, the Mann-Whitney nonparametric test was used. For the median values and interquartile ranges, see Tables S1 to S4 in the supplemental material.

b Total n = 20.

c Significantly different.
DISCUSSION

Influenza virus infection predisposes the host to severe bacterial pneumonia, which is associated with substantial morbidity and mortality (1, 3, 37, 38). Numerous mechanisms of immune impairment after influenza virus infection have been described that contribute to increased severity of infection, as well as increased susceptibility to smaller inocula of either *S. pneumoniae* (39, 40) or *S. aureus* (13) after influenza virus infection. Our findings suggest that IFN-λ production induced by influenza virus infection is a major factor contributing to subsequent bacterial pneumonia. Induction of IL-28R/STAT1/SOCS1 signaling alters the antimicrobial milieu of the upper airway, affecting the expression of antimicrobial peptides and cytoskeletal components that regulate the mucosal barrier function. IFN-λ signaling in response to influenza virus infection results in proliferation of the upper airway microbiota, increasing the likelihood that colonizing pathogens such as MRSA will be aspirated and cause pneumonia.

Both type I and III IFNs are induced in response to influenza virus infection, although the type III response, mediated by mucosal IL-28R, has been thought to predominate (41). STAT1 and STAT3 phosphorylation comprise the major signaling cascade activated by influenza virus infection contributing to induction of the expression of over 300 genes that comprise the interferome, responses that are critical for antiviral activity (17–19). We found that the induction of STAT1 phosphorylation by influenza virus was dependent upon IL-28R, consistent with the dominant role of the type III IFNs in this infection. Our results suggest that, in the lung during influenza virus infection, the type III IFN pathway predominantly regulates STAT1 activation. Therefore, while type I IFN is capable of activating this pathway, perhaps type III IFNs...
are needed in this model to drive production of the protein. In the absence of STAT1 signaling and the associated effects on SOCS1, Il28r/H11002 mutant mice had significant protection from both endogenous and exogenously acquired organisms, and specifically from MRSA pneumonia, whether acquired before or after influenza virus infection.

A likely mechanism of the resistance of Il28r/H11002 mutant mice to bacterial superinfection is the ability to suppress the nasal microbiota through increased production of antimicrobial peptides. IL-22 and IL-22-dependent antimicrobial peptides are important in the control of the gut microbiota and mucosal barrier integrity (42). IL-22 functions to ameliorate pulmonary pathology in influenza virus infection and decrease the severity of pneumonia due to S. pneumoniae superinfection (43). Il28r/H11002 mutant mice had markedly increased constitutive IL-22 expression, which likely contributed to their resistance to superinfection. Increased IL-22 expression may be a compensatory response, as IFN-γ and IL-22 have been shown to have synergistic effects in activating the phosphorylation of STAT1 (44). Our findings are consistent with this observation, as in the absence of IL-28R, IL-22 was not sufficient to activate STAT1. IL-22 itself does not have direct antiviral or antibacterial effects; thus, much of its beneficial effects are thought to be due to maintenance of epithelial barrier function (45). We observed some expected and possible consequences of IL-22 signaling on antimicrobial peptide expression and epithelial barrier function in the upper airway. There was a substantial increase in the expression of RegIII/H9253, but not S100A8, both IL-22 dependent (33, 34), in Il28r/H11002 mutant mice, consistent with their ability to control microbial proliferation in the nasal cavity. Additional antimicrobial peptides and cytokines with antimicrobial activity were also found in the nasal secretions of Il28r/H11002 mutant mice.

Ngal was highly induced in the absence of IFN-γ signaling, detected by both quantitative reverse transcription (qRT)-PCR and proteomic analysis. The suppressive effects of IL-28 signaling on the expression of these and likely additional antimicrobial peptides help to account for the differences in the microbiotas isolated from WT and influenza virus-infected mice, differences not observed in Il28r/H11002 mutant mice.
The upregulation of several classes of proteins that function in maintaining the dynamic responses and integrity of the mucosal barrier were the major changes found in the upper airways of Il28r−/− mutant mice. In the absence of IL-28R, the nasal mucosal secretions contained significantly increased amounts of the actin cytoskeleton and proteins involved in actin depolymerization. Also significantly increased were the ERM proteins radixin and moesin that mediate the interactions between the plasma membrane, where pathogens are sensed, and the cytoskeleton (46). These findings suggest involvement of IL-28R in the suppression of cytoskeletal dynamics that enable immune cell transmigration, even in the maintenance of the normal microbiota. Whether these changes in cytoskeletal proteins are directly due to IL-28R, IL-22, or some other effectors remains to be established.

The accumulating literature provides a clearer understanding of the pathogenesis of bacterial superinfection after influenza virus infection and suggests several targets to prevent this potentially lethal infection. Our data indicate that induction of IFN-λ signaling in response to influenza virus infection and the activation of both STAT1 and its regulator SOCS1, while critical in regulating the inflammatory response associated with antiviral activities, are major factors in enhancing the proliferation of the

![Graph showing upper airway proteomic changes in WT and Il28r−/− mutant mice.](image-url)

**FIG 4** Upper airway proteomic changes in WT and Il28r−/− mutant mice. Two micrograms of protein from nasal lavage fluid was proteolytically cleaved by trypsin and analyzed by LC-MS/MS. (a) The upper airway proteomes of WT and Il28r−/− mutant mice in the resting state were analyzed by an MS-based approach. Relative protein abundance among biological samples is expressed by spectral counts on a log scale. The color scale bar indicates the range of protein expression levels. Each column represents an individual mouse. Significantly different proteins ($P < 0.05$) are presented and clustered by protein expression profiles among biological samples. (b) Functional annotation of proteins differentially expressed in WT and Il28r−/− mutant mice. Shown are functional categories enriched and statistically significant within the data set. Data were analyzed with David. (c) WT and Il28r−/− mutant mice were infected with PR8 or treated with PBS as a control, and upper airway nasal lavage fluid was analyzed by an MS-based approach. Each column represents an individual mouse. Representative data are shown.
nasal microbiome, which often includes potential pathogens. Nasal IL-22 expression is limited under resting conditions and not induced by influenza virus infection. Its protective effects in inducing the expression of antimicrobial peptides and in activating dynamic responses of the mucosal barrier to facilitate signaling and immune cell recruitment could be exploited therapeutically. Strategies already in place, such as universal MRSA decolonization (11), could be more widely implemented in the setting of early influenza virus infection and, combined with the development of local immunomodulators of STAT1 or therapeutic delivery of IL-22, may be useful in preventing bacterial superinfection in influenza.

**MATERIALS AND METHODS**

**Ethics statement.** Animal work in this study was carried out in strict accordance with the recommendations in the Guide for the Care and Use of Laboratory Animals of the National Institutes of Health, the Animal Welfare Act, and U.S. federal law. The protocol was approved by the Institutional Animal Care and Use Committee of Columbia University (protocol AAAF4851).
Viral and bacterial growth. Mouse-adapted influenza virus A/Puerto Rico/8/34 (PR8; H1N1) was grown on Madin-Darby canine kidney cells and stored as previously described (13). S. aureus (LAC USA300) and P. aeruginosa (PAK) were grown to stationary phase overnight at 37°C in Luria-Bertani broth, diluted 1:100 in the morning, and grown to an optical density at 600 nm of 1.0 (USA300) or 0.50 (PAK) for infection (25).

Animal models. Seven-week-old C57BL/6 WT mice were bred in house as previously described (24). Il28r−/− mutant mice were provided by Bristol Myers Squibb and bred in house, and Ifnar−/− mutant mice have been described previously (25, 47). Both Ifnar−/− and Il28r−/− mutant mice are bred on the C57BL/6 background. Stat1−/− mutant mice were generously provided by Christian Schindler, Columbia University (C57BL/6 background), and from Taconic (129S6/SvEv background). Mice were anesthetized with ketamine and xylazine and intranasally inoculated with influenza virus (50 PFU/mouse) or PBS with 0.1% bovine serum albumin (BSA) as a control. To determine the effect of IFN-α on the nasal flora, mice were intranasally treated with 1 μg of recombinant mIL-28B (PBL Assay Science; <1 EU/μg) in 50 μl with PBS-BSA as a control, resulting in delivery to both the upper and lower respiratory tracts. Nasal flora, upper airway RNA, and lung tissue were harvested 3 days following infection. Nasal lavage was performed by inserting a sterile angiocatheter intratracheally, flushing with sterile UV-treated PBS, and collecting lavage fluid from the nose. Selected animals were reinjected 7 days following initial infection with exponentially growing S. aureus USA300 (4 × 10^6 CFU/mouse). These mice were sacrificed 24 h following bacterial infection, and the numbers of bacteria present in their lungs were determined as previously described (24). Colonization studies were performed by intranasal inoculation of 10^6 CFU of S. aureus in a small volume (10 μl into the nares without anesthesia) to limit infection to the naso-pharynx. Colonization studies were performed for 3 or 7 days postinfection after a 1-week influenza virus infection. S. aureus was applied to the noses of precolonized mice 7 days prior to influenza virus infection. Bacteria were isolated from homogenized nasal septum tissue. Infection of mice while they were under anesthesia was conducted with 1 × 10^6 CFU of exponentially growing P. aeruginosa PAK in 50 μl.

Culture-dependent analysis of flora. For each sample, 2 ml of mouse nasal lavage fluid was centrifuged at 1,400 rpm for 5 min. A 1.7-ml volume of the supernatant was removed, and the pellet was resuspended in the remaining 300 μl. Fifty microliters of each sample was plated on CHROMagar Orientation and CHROMagar S. aureus plates and incubated overnight at 37°C. For colony PCR from CHROMagar plates, the 16S RNA gene sequence was amplified with primers Bact-8F (5′-AGAGTTTGTATCCCTGGCTCAG-3′) and Bact-1391R (5′-GACGCCGCGTGTTGTCGTCAG-3′). At least two colonies per unique color/morphology per plate were picked. The PCR used Taq 5× master mix (New England Biolabs) and 0.5 μM of forward and reverse primers. The cycling conditions were 95°C for 1 min; 30 cycles of 95°C for 30 s, 60°C for 1 min, and 68°C for 5 min; and holding at 4°C. The amplified 16S rRNA gene sequences were sequenced by GeneWiz, Inc., with the Bact-8F primer. The resulting sequences were identified by 16S rRNA gene sequence (Bacteria and Archaea) nucleotide BLAST (basic local alignment search tool) searching at http://blast.ncbi.nlm.nih.gov/Blast.cgi. The resulting alignments were viewed, and the highest-scoring alignment with an E (error) value of 0.0 was taken as the species identification. For each sample, the identifying information recorded for each 16S rRNA gene PCR template colony was used to identify the assumed species of all colonies of that unique color on both CHROMagar plates. Using the calculated number of CFU per species for each nasal lavage fluid sample, the mean total CFU count, taxonomic richness, Shannon-Weiner diversity index, and species evenness were calculated for each experimental condition, as were the mean CFU count for each species and the species prevalence.

Culture-independent analysis. Nasal lavage fluid microbial DNA was isolated with the Powersoil DNA Isolation kit (Mo Bio Laboratories, Inc., Carlsbad, CA) according to the manufacturer’s instructions with modifi-

Presence/absence analysis. For the PA dendrogram analysis, a presence/absence matrix was constructed where any number of rarefied reads for a particular OTU was designated present. Each sample was treated as a taxon, and each OTU was treated as a binary character. The dendrogram was then constructed on the basis of a maximum-parsimony algorithm as implemented in the program PAUP (54). All characters and character state transformations were given equal weight. We used Mesquite (55) to define specific OTUs that were exclusively present in or absent from the cluster of samples defined by influenza virus. All but one virus-positive sample clustered on the basis of the parsimony analysis. To further explore characteristic attributes of the virus-positive samples, we performed the same analysis by forcing all virus-positive samples into the same group.

ELISA and immunoblotting. BALB/c mice were used for cytokine and chemokine content by enzyme-linked immunosorbent assay (ELISA) (R&D Biosystems, PBL Assay Science, or eBioscience) and multiplex analysis (Eve Technologies). Lung homogenates were lysed in radioimmuno-precipitation assay buffer (20 mM Tris-HCl, 150 mM NaCl, 1 mM EDTA, 1 mM EGTA, 1% Triton X-100) with Halt protease and phosphatase inhibitor (Pierce). Protein separation, transfer, and immunoblotting were performed as described previously (26). Anti-phospho-STAT1 (Abcam), -STAT1, -phospho-STAT3, -STAT3, -SOCS1 (Cell Signaling), and -β-actin (Sigma) antibodies were used to measure expression.

qRT-PCR. RNA was recovered with the PureLink RNA minikit (Life Technologies). Briefly, the upper airways were washed with RNA lysis buffer by inserting a catheter into the trachea and pushing the lysis buffer through the nares. RNA was purified according to the manufacturer’s instructions. cDNA was synthesized with the High Capacity cDNA RT kit (Applied Biosystems). qRT-PCR was performed with Power SYBR green PCR master mix in a StepOne Plus thermal cycler (Applied Biosystems). β-Actin was used to normalize samples. Primers for actin, Ifnβ, and Ifnλ have been described previously (24). The following primers were used: HA, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense); mReg3β, 5′-ACTCCTCTGAATATCATTCC (antisense) and 5′-CCATTTGACGACATACGAGG (sense); mReg3α, 5′-TGCAAGTGGCCACCACGGAG (sense) and 5′-GCCATTTGACGACATACGAGG (antisense); Ifna1, 5′-TGGCAATGGGACCACAGG (sense) and 5′-ATGCAGACAATATGTATAGG (antisense); Ifna2, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense); Ifna4, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense); Ifnλ, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense); SOCS1, 5′-CTCGGGGCTTCTATGGGAGG (antisense); STAT1, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense); IL-12, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense); IFN-γ, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense); IFN-β, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense); IFN-α, 5′-ATGCAGACAATATGTATAGG (sense) and 5′-GATATCGAATTTGCT (antisense).

Shotgun proteomic analysis. (i) Materials. High-performance liquid chromatography (HPLC) grade LC buffers, diithiothreitol, acetonitrile (ACN), ammonium bicarbonate, trifluoroacetic acid, and iodoacetamide were purchased from Thermo, Fisher Scientific (Waltham, MA). Trypsin Gold, Mass Spectrometry Grade, was purchased from Promega (Madison,
(ii) Sample preparation. Proteins were precipitated from 500 μl of mouse nasal lavage fluids with methanol-chloroform and resuspended in 20 μl of 4 M urea in 50 mM ammonium bicarbonate. The protein concentration in the mouse lavage fluid was determined by the EZQ Protein Quantification Assay (Life Technology Corp.). Two micrograms of protein from mouse lavage fluid was digested with 150 ng of trypsin (1:40) along with 2 mM CaCl₂ and incubated at 37°C for 16 h. Samples were centrifuged for 30 min at 14,000 rpm, and the cleared supernatants were transferred to fresh tubes to be acidified with 90% formic acid (FA) (2% final) to stop proteolysis. The soluble peptide mixtures were collected for liquid chromatography-tandem mass spectrometry (LC-MS/MS) analysis.

(iii) LC-MS/MS analysis. The concentrated peptide mixture was reconstituted in a solution of 2% ACN–2% FA for MS analysis. Peptides were loaded with the autosampler directly onto a 2-cm C₁₈ PepMap precolumn and eluted from the 1D PepMap RSLC C₁₈ 2-μm column (50 cm by75 μm) with a Thermo Dionex 3000 and a 98-min gradient ranging from 2% buffer B to 30% buffer B (100% acetonitrile, 0.1% FA). The gradient was switched from 30% to 85% buffer B over 5 min and held constant for 1 min. Finally, the gradient was changed from 85% buffer B to 98% buffer A (100% water, 0.1% FA) over 2 min and then held constant at 98% buffer A for 25 min. The application of a 2.0-kV distal voltage electrosprayed the eluting peptides directly into the mass spectrometer equipped with an Easy-Spray Source (Thermo Finnigan, San Jose, CA). The full mass spectra of the peptides were recorded over an m/z range of 400 to 1,500 at a 120,000 resolution, followed by MS/MS collision-induced dissociation events for a total of a 3-s cycle. Charge state-dependent screening was turned off, and peptides with charge states of 2 to 6 were analyzed. Mass spectrometer scanning functions and HPLC gradients were controlled by the Xcalibur data system (Thermo Finnigan, San Jose, CA). Three technical replicates of each sample were run, and MS/MS data from technical replicates were merged for a subsequent database search.

(iv) Database search and interpretation of MS/MS data. Tandem mass spectra from .raw files were searched against a human protein database with the Proteome discoverer 1.4 (Thermo Finnigan, San Jose, CA). The Proteome Discoverer application extracts relevant MS/MS spectra from the .raw file and determines the precursor charge state and the quality of the fragmentation spectrum. The Proteome Discoverer probability-based scoring system rates the relevance of the best matches found by the SEQUEST algorithm (56). The mouse database was downloaded as FASTA-formatted sequences from the UniProt protein database (released in December 2014) (57). The peptide mass search tolerance was set to 10 ppm. A minimum sequence length of 7 amino acid residues was required. Only fully tryptic peptides were considered. To calculate confidence levels and false-positivity rates (FDR), Proteome Discoverer generates a decoy database containing reverse sequences of the nondecoy protein database and performs the search against this concatenated database (nondecoy plus decoy) (58). The discriminant score was set at a 1% protein database and performs the search against this concatenated data-base (nondecoy plus decoy) (58). The discriminant score was set at a 1% FDR determined on the basis of the number of accepted decoy database peptides to generate protein lists for this study. Spectral counts used to identify each protein were used for expression profiling analysis. Qlucore Omics Explorer (Qlucore AB, Sweden) was used to perform statistical analysis of quantifiable proteins among biological replicates (t test, P < 0.05). Differentially expressed proteins were analyzed with David (59).

Statistics. Significance of data was determined by a nonparametric Mann-Whitney test. Multiple comparisons were performed by analysis of variance (ANOVA) with a Bonferroni comparison posttest. These tests were conducted with GraphPad Prism software, and significance was defined as P < 0.05.

For culture-independent community analyses, principal-coordinate analysis was used to visualize pairwise similarities in composition. Permutational multivariate ANOVA (PERMANOVA, with 999 permutations) was used to test whether influenza virus-infected mice harbored bacterial communities that were significantly different in composition from those found in controls. The ordination and PERMANOVA analyses were conducted in R v. 3.0.0.

SUPPLEMENTAL MATERIAL

Supplemental material for this article may be found at http://mbio.asm.org/lookup/suppl?doi=10.1128/mBio.01939-15/-DSSupplemental.

Table S1, PPT file, 0.3 MB.
Table S2, PPT file, 0.2 MB.
Table S3, PPT file, 0.2 MB.
Table S4, PPT file, 0.2 MB.
Table S5, PPT file, 0.2 MB.
Table S6, PPT file, 0.2 MB.
Table S7, PPT file, 0.2 MB.
Table S8, PPT file, 0.2 MB.

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P.J.P., D.P., T.S.C., and A.S.P. designed the experiments. P.J.P., H.S., T.H., N.F., C.R., and D.O. analyzed nasal flora. D.P., T.S.C., and P.J.P performed in vivo experiments and analyzed host signaling pathways. E.I.C. conducted proteomic analysis. P.J.P., D.P., T.S.C., and A.S.P. wrote the manuscript.

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