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Housing conditions and microbial environment do not affect the efficacy of vaccines for treatment of opioid use disorders in mice and rats

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ABSTRACT

Vaccines offer a promising prophylactic and therapeutic intervention to counteract opioid use disorders (OUD) and fatal overdoses. Vaccines generate opioid-specific antibodies that bind the target opioid, reducing drug distribution to the brain and preventing drug-induced behavioral and pharmacological effects. Due to their selectivity, anti-opioid vaccines can be administered in combination with FDAapproved medications. Because patients with OUD or other substance use disorders may be affected by other multifactorial co-morbidities, such as infection or depression, it is important to test whether vaccine efficacy is modified by factors that may impact individual innate or adaptive immunity. To that end, this study tested whether housing conditions would affect the efficacy of two lead vaccine formulations targeting oxycodone and fentanyl in male mice and rats, and further analyzed whether differences in the gastrointestinal (GI) microbiome would be correlated with either vaccine efficacy or housing conditions. Results showed that housing mice and rats in either conventional (non-controlled) or specific pathogenfree (SPF, sterile barrier maintained) environment did not affect vaccine-induced antibody responses against oxycodone and fentanyl, nor their efficacy against oxycodone- and fentanyl-induced antinociception, respiratory depression, and bradycardia. Differences in the GI microbiome detected via 16S rRNA gene sequencing were related to the housing environment. This study supports use of anti-opioid vaccines in clinical populations that may display deficits in microbiome function.

Introduction

The epidemic of opioid-related fatal overdoses constitutes a significant public health burden. An estimated 2 million people in the US suffer from opioid use disorders $(OUD)^1$ and two out of three drug overdoses in [2](#page-8-1)018 involved opioids.² Synthetic opioids such as fentanyl and its analogs are increasingly prevalent in the community and have proven especially deadly. Synthetic opioids were responsible for 67% of opioid-related deaths in $2018²$ $2018²$ During the COVID-19 pandemic, the incidence of opioid-related fatal overdoses further increased, highlighting the complex interplay of OUD and other public health threats.³ Current treatments for OUD include medication-assisted therapy (MAT) with drugs such as methadone, buprenorphine, and naltrexone, as well as overdose reversal using naloxone. However, these medications either display potential abuse liability or can complicate necessary pain management. Vaccines have been explored as a viable addition to the OUD-treatment repertoire and have displayed efficacy against several opioids in mice, rats, dogs, and nonhuman primates.[4–12](#page-8-3) Upon active immunization, vaccines elicit drugspecific polyclonal antibodies that bind the target drug preventing the distribution of free (unbound) drug across the blood–brain barrier, and reduce drug-induced pharmacological and behavioral effects.⁸ Vaccine efficacy varies across formulations containing

different components, such as haptens, carrier proteins, and adjuvants. $9,12-22$ Individual variability in vaccine efficacy has been shown to relate to the preexisting antigen-specific B and T cell repertoire, processes involved in CD4⁺ T cell-dependent B cell activation, and selected cytokine pathways.^{13[,15](#page-8-8),[23,](#page-8-9)24} Additionally, pre-clinical studies in mice have shown that sex and strain differences may have an impact on the efficacy of vaccines against heroin, 25 oxycodone,¹⁵ and cocaine.^{[26](#page-8-12)} Outside of the laboratory, there are many factors that may impact translation such as age, sex, genetics, and environmental influences. While some of these factors have been explored in the context of OUD vaccines, many others have not.

One such factor is the link between environmental conditions that may impact the gastrointestinal (GI) microbiome and the body's immune response to vaccines. Our knowledge of the relationship between the environment, GI microbiome, and our health continues to grow as more studies investigate this connection. In the context of vaccines, the composition of the GI microbiota has been shown to affect innate and adaptive immune responses to vaccines, and vaccine efficacy in the clearance of pathogens in both pre-clinical and clinical studies.^{27–30} Given that opioid use is linked to an altered GI microbiome, $31-35$ the potential for gut dysbiosis in the target population to receive OUD

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vaccines is high. While pre-clinical studies involving vaccines against OUD or other substance use disorders involve immunization of laboratory animals in either conventional or specific pathogen-free (SPF) housing conditions, previous literature indicates that the abnormally hygienic environment of laboratory mice may impact their immune system. This was demonstrated by studies of "dirty mice" or "pet store mice," which were bred outside of the more controlled microbial environment (e.g., SPF) of most research animals, which resulted in more robust immune responses to infection.³⁶ Therefore, it is essential to test whether different housing conditions would affect vaccine efficacy against OUD, and whether housing conditions would differentially affect the GI microbiome in vaccinated and control subjects. Such information will help to interpret pre-clinical data across laboratories using mice and rats housed under different conditions, and to ensure validity of findings across academic labs and contract research organizations (CROs) conducting GLP studies to support IND filing. Additionally, understanding the contribution that housing or the microbiome may have on therapeutic outcomes will inform clinical management of OUD patients, who may have altered flora based upon the effects of opioids on the GI tract.

In this study, we tested the hypothesis that the microbial environment associated with different housing conditions would alter responses to OUD vaccines. Mice and rats were housed in either SPF conditions (wherein a sterile barrier is kept throughout the study) or non-sterile housing, where no such barrier is maintained (termed "conventional housing" in many academic and commercial *vivaria*, and for the remainder of this manuscript). We then assessed the effect of these housing conditions on the efficacy of vaccines against oxycodone and fentanyl through examination of parameters such as the generation of drug-specific antibodies, inhibition of opioidinduced behaviors, and blockage of drug distribution to the brain in mice and rats. Finally, we tested mice housed under different conditions for changes in the microbiome that may be related to either differential housing or administration of vaccines.

Materials and methods

Drugs and reagents

Oxycodone and fentanyl were obtained from the University of Minnesota Pharmacy. Drug doses and concentrations are expressed as weight of the free base. Subunit keyhole limpet hemocyanin (sKLH) was obtained as GMP-grade source (Biosyn, Carlsbad, CA).

Animals

Male BALB/c mice (Jackson Laboratories, Bar Harbor, ME) and male Sprague–Dawley rats (Envigo, Madison, WI) were housed in a 14/10 hour light/dark cycle and fed *ad libitum*. Mice were 6 weeks old on arrival, while rats were 2 months old on arrival. Specified pathogen-free (SPF) animals were handled in a laminar flow hood under sterile conditions for the duration of the experiment. Specific Pathogen-Free facilities are regularly tested by RAR to ensure maintenance of SPF status. Conventionally housed animals were kept in a separate facility where no sterile barrier was maintained. Mice and rats were tested in the same room for vaccine efficacy against druginduced behavioral effects. All testing occurred in the light cycle.

Vaccine formulation

The anti-oxycodone conjugate vaccine consists of an oxycodone-based hapten (OXY) conjugated to the subunit keyhole limpet hemocyanin carrier protein (sKLH) through a tetraglycine linker. The OXY-sKLH has been extensively described in mice and rats, and it has shown efficacy against oxycodone-induced behavioral, pharmacological, and toxic effects.^{6,[17,](#page-8-15)[37](#page-9-2),38} The anti-fentanyl conjugate vaccine consists of a fentanyl-based hapten (F) conjugated to the sKLH through a tetraglycine linker, which has been previously tested in both mice and rats.^{20[,21](#page-8-17)}

Immunization

Mice were immunized intramuscularly $(i.m.)$ with 60 μ g of F-sKLH or unconjugated sKLH carrier protein as a control. Conjugates were adsorbed on 300 µg of aluminum adjuvant (Alhydrogel85, Brenntag) and delivered in a final volume of 30 µl in each hind leg for a total of 60 µl. Mice were immunized on days 0, 14, and 28. Rats were immunized i.m. with 60 µg of either OXY-sKLH or sKLH. Conjugates were adsorbed on 90 µg of aluminum to a final volume of 150 µl and delivered into one hind leg. Rats were immunized on days 0, 21, and 42.

Antibody analysis

Serum antibody analysis was performed via indirect ELISA on blood sampled from facial veins in mice (days 14 and 34) and from tail veins in rats (day 49). Ninety-six-well plates were coated with 5 ng/well of F-BSA conjugate or OXY-OVA conjugate (for mice and rats, respectively) or unconjugated BSA or OVA as a control. Conjugates were diluted in 50 mM Na_2CO_3 , pH 9.6 (Sigma) and blocked with 1% porcine gelatin. Serum was incubated on the plate and then washed and incubated with an HRP-conjugated goat anti-mouse IgG (1:30,000, Jackson ImmunoResearch Laboratories), Ig G_1 (1:35,000, Alpha Diagnostic International), Ig G_{2a} (1:7500, Alpha Diagnostic International), or goat anti-rat IgG (1:50,000, Jackson ImmunoResearch Laboratories) to assess haptenspecific serum IgG antibody levels using statistical analysis previously described.^{23[,37](#page-9-2)}

Effect of vaccine on opioid-induced antinociception

To determine the efficacy of the vaccine to block opioidinduced analgesia, a hot plate test was performed to establish whether vaccination protects against centrally-mediated effects of opioids. Rodents were acclimated to the testing environment for 1 h prior to measuring baseline. Maximum latency to respond was either 30 s (rats) or 60 s (mice) to avoid tissue damage due to thermal injury. Rodents were placed on a hot plate (Columbus Instruments, OH) set to 54°C and removed after displaying a lift or flick of the hind paw or jumping. In

mice, baselines were measured on day 35 (7 days after last immunization), followed by administration of 0.05 mg/kg fentanyl, subcutaneously (s.c.). The hot plate response was measured again 30 min after injection. In rats, baselines were measured on day 56 (14 days after last immunization), and rats were given 2.25 mg/kg of oxycodone, delivered s.c. at time 0 and again at 17 min (cumulative dose of 4.5 mg/kg oxycodone). The hot plate response was measured at 15 and 30 min. Data are displayed as percent MPE calculated as: (postdrug latency − baseline latency)/(maximal cutoff − baseline latency) \times 100.

Effect of vaccine on opioid-induced respiratory depression and bradycardia

Oxygen saturation, heart rate (beats per minute, BPM), and breath rate (breaths per minute, BRPM) were measured by pulse oximetry before and after drug administration in rats. Oximetry was measured using a MouseOx Plus (Starr Life Sciences, Oakmont, PA). Rats were acclimated to the testing environment for 1 h prior to measuring baseline. After collection of baseline responses, rats were given two s.c. doses of 2.25 mg/kg oxycodone, delivered at time 0 and 17 min. Oximetry measurements were collected at baseline and postchallenge at 15 and 30 min.

Analysis of oxycodone and fentanyl concentrations in serum and brain

After the final oximetry and hot plate measurements, animals were anesthetized, decapitated, and trunk blood and brain were collected for analysis. For fentanyl samples, samples were processed using liquid chromatography coupled to mass spectrometry (LC-MS) as previously described.²⁰ Oxycodone samples were processed using gas chromatography coupled to mass spectrometry (GC-MS) as previously described.^{[6](#page-8-14)}

Analysis of GI microbiome in vaccinated mice

Murine fecal samples were collected pre-challenge on day 35 and flash frozen in liquid nitrogen. The fecal content was processed using DNeasy PowerSoil® kits (Qiagen, Germantown, Maryland) modified to include a bead-beating step where fecal pellets were lysed using glass beads by a MagnaLyser tissue disruptor.³¹ Sequencing and bioinformatics were performed by the University of Minnesota Genomic Center, MN, United States. At the University of Minnesota, after DNA isolation, 16S ribosomal DNA hypervariable regions V5 and V6 were amplified via PCR using primers with the V5F RGGATTAGATACCC and V6R CGACRRCCATGCANCACCT gene-specific sequences, Illumina adaptors, and molecular barcodes as described to produce 427 base pair (bp) amplicons. Samples were sequenced on an Illumina MiSeq (Illumina, San Diego, California) using MiSeq 600 cycle v3 kit.³⁹

16S rRNA sequencing data analysis

Primer sequences were removed from raw sequencing reads and low-quality bases (Phred score <20) were trimmed from 3ʹ end

using Cutadapt.⁴⁰ Microbial taxonomy assignment abundance quantification was analyzed with Greengenes database (ver.08/ 13) using dada2 pipeline. 41 Microbial diversity was quantified by Shannon's index (α-diversity), and Bray–Curtis dissimilarity (βdiversity) using R package "vegan.["42](#page-9-7) The dissimilarity between pairs of treatment groups was assessed using permutation multivariate analysis of ANOVA (PERMANOVA), and the significance of pair-wise comparison was adjusted for multiple comparison using Bonferroni correction. Individual differential taxa were identified using DESeq2 with significance determined based on a false discovery rate (FDR) of $0.05⁴³$ Relative abundance of functional content of microbial communities was obtained using PICRUSt.^{[44](#page-9-9)}

Results

Housing conditions do not affect vaccine efficacy against fentanyl in mice

To determine the effects of housing conditions on vaccine efficacy, mice housed in either conventional or SPF conditions were immunized on days 0, 14, and 28 with either F-sKLH or unconjugated sKLH (control). After a primary immunization, F-sKLH elicited significantly lower antibody titers in SPF mice compared to conventionally housed mice ([Figure 1\(a](#page-3-0))). However, on day 34 no significant differences in antibody response were detected between conventionally and SPF housed mice [\(Figure 1\(b\)](#page-3-0)). To further assess whether housing conditions would affect the quality of the humoral response, IgG₁ and IgG_{2a} subclasses were measured on day 34. Vaccinated groups in both SPF and conventional housing showed equivalent levels and distribution of IgG₁ ([Figure 1](#page-3-0) [\(c\)](#page-3-0)) and Ig G_{2a} titers ([Figure 1\(d](#page-3-0))).

After immunization, the ability of F-sKLH to reduce drug distribution to the brain was assessed by a hot plate test of centrally mediated analgesia. Animals were challenged with 0.05 mg/kg s.c. fentanyl and the hot plate response was measured 30 min post-challenge and compared to baseline as a percent of maximum possible effect (MPE). Both conventionally and SPF housed vaccinated mice showed a significant reduction in fentanyl-induced analgesia (*p* < 0.05) at 30 min post-challenge, with no significant difference seen between housing conditions in vaccinated groups [\(Figure 1\(e\)](#page-3-0)). Fentanyl distribution to the brain was also directly analyzed via LC-MS *post-mortem* [\(Figure 1\(f](#page-3-0))). Across both conditions, the F-sKLH vaccine was able to effectively block fentanyl distribution to the brain as compared to control animals. All together, these data indicate that housing conditions do not have a significant effect on fentanyl vaccine efficacy in mice.

Housing conditions do not affect vaccine efficacy against oxycodone in rats

An anti-oxycodone conjugate vaccine was used to assess vaccine efficacy in rats housed in either conventional or SPF housing conditions ([Figure 2\)](#page-4-0). Rats were immunized on days 0, 21, and 42 with either an oxycodone conjugate (OXY-sKLH) vaccine or the unconjugated carrier protein as a control. Blood was collected on day 49 to assess oxycodone-specific antibodies

Figure 1. *In vivo* comparison of the effect of conventional and SPF housing conditions on vaccine responses against fentanyl in mice . The F-sKLH vaccine and the unconjugate sKLH control were tested in male BALB/c mice (n = 12/group) in either conventional or SPF housing. Conjugates were adsorbed on alum adjuvant and injected in mice i.m. on days 0, 14, and 28. Blood was collected via facial vein at days 14 and 34 to test for fentanyl-specific serum antibody titers via ELISA. IgG titers are shown for (a) 14 days post-immunization and (b) 34 post-immunization. Serum from 34 days post-immunization was tested for (c) IgG₁ subclass titers and (d) IgG_{2a} subclass titers. On day 35, all mice were challenged s.c. with 0.05 mg/kg fentanyl. (e) Effect of F-sKLH in blocking fentanyl-induced antinociception in the hot plate test at 30-min post-challenge. After being tested on the hot plate, mice were euthanized and brains were collected. (f) Brain fentanyl concentrations in mice measured via LC-MS. Statistical analysis performed via Welch's t-test between control and immunized mice in different housing conditions, after establishing no statistical difference between control groups under each housing condition via t-test. * $p \le 0.05$, ** $p \le 0.01$, *** $p \le 0.001$, **** $p \le 0.0001$.

in serum via ELISA [\(Figure 2\(a\)](#page-4-0)). While the vaccine produced high anti-oxycodone serum IgG titers, there was no significant differences between housing conditions.

On day 56 (14 days after final immunization), rats were challenged with 2.25 mg/kg dose of s.c. oxycodone at time 0 and a second dose 17 min later. Vaccine efficacy was assessed by hot plate antinociception [\(Figure 2\(b](#page-4-0)) and (c)) measured prior to drug delivery and at 15- and 30-min post-challenge. After each dose, rats in both housing conditions showed trends toward significantly lowered MPE%, but these trends were only statistically significant for conventional housing after the first dose, and for SPF after the second dose.

As another measure of vaccine efficacy, a pulse oximeter was used to assess oxycodone-induced respiratory depression and

SPF Housing O Conventional

Figure 2. *In vivo* comparison of conventional and SPF housing conditions on vaccine responses against oxycodone in rats. The OXY-sKLH vaccine was tested in male Sprague–Dawley rats (n = 12/group) in either conventional or SPF housing. Conjugates were adsorbed on alum adjuvant and injected i.m. on days 0, 21 and 42. Blood was collected via tail vein on day 49 to measure (a) oxycodone-specific IgG tiers via ELISA. On day 56, all rats were challenged with two s.c. doses of 2.25 mg/kg oxycodone at 0 min and 17 min (to provide a cumulative dose of 4.5 mg/kg). Hotplate responses were measured at baseline, 15 mins and 30 mins, and maximum possible effect (MPE%) was calculated for (b) 2.25 mg/kg and (c) 4.5 mg/kg cumulative dose. Efficacy of OXY-sKLH was further assessed by measuring (d) oxygen saturation, (e) heart rate and (f) breath rate at baseline, 15 min, and 30 min post-drug challenge. After 30 min, rats were euthanized for blood and brain collection to measure oxycodone distribution to the (g) serum and (h) brain, via GC-MS. Statistical analysis was performed via Welch's t-test between control and immunized rats in different housing conditions. Symbols: * represents significance between conventionally housed animals or as indicated by lines between groups, # represents significance between SPF-housed animals. $*$ or # $p \le 0.05$, $**$ $p \le 0.01$, $***$ $p \le 0.001$, $***$ $p \le 0.0001$.

bradycardia, which are both commonly associated with opioid use.⁴⁵ At a dose of 2.25 mg/kg oxycodone, only SPF-housed control animals showed a significant decrease in oxygen saturation compared to control (Figure $2(d)$). However, at a cumulative dose of 4.5 mg/kg oxycodone, both conventional and SPF housed animals showed significant differences in oxygen saturation compared to their respective controls. This suggests that the oxycodone conjugate vaccine was able to effectively protect animals against this opioid-induced respiratory depression under both housing conditions.

The heart rate of control animals decreased in both SPF and conventionally housed rats after oxycodone administration [\(Figure 2\(e\)](#page-4-0)). At a dose of 2.25 mg/kg oxycodone, this drop was statistically significant only between vaccine and control groups housed under SPF conditions. At a cumulative dose of 4.5 mg/kg oxycodone, conventionally housed animals showed a significant change in heart rate between vaccine and control groups, which was not seen in the SPF animals. Breath rates of animals in all housing conditions and vaccine groups trended downwards as the dose of oxycodone increased, but none were

statistically significant [\(Figure 2\(f](#page-4-0))). After 30 min post-drug challenge, blood and brain were collected and tested to determine the distribution of oxycodone in each compartment. In both SPF and conventionally housed animals, vaccination with OXY-sKLH led to a significant increase in serum oxycodone concentrations and a decrease in brain oxycodone concentrations (Figure $2(g)$) and (h).

Magnitude of change in metrics of vaccine efficacy do not differ between SPF and conventionally housed animals

While there was no significant difference between vaccine response in SPF and conventionally housed rodents, the percent change in response from control was calculated in each group to ensure the magnitude of response was similar between groups. Mean of the control was calculated and compared between SPF and conventional housing. Next, the percent change in efficacy between the immunized animals and the mean of the control was determined and compared between housing conditions ([Table 1\)](#page-5-0). There was no change in

Table 1. Statistical analysis of metrics of vaccine efficacy between housing conditions in control groups and change from percent change from mean control value in immunized groups.

Figure 3. The impact of housing environment and vaccination on mouse GI microbiome. After immunization, mouse fecal samples were collected for analysis of microbiome via 16s rRNA sequencing. (a) Box plots show that conventionally housed mice exhibited a significant increase in α-diversity (calculated by Shannon's index) compared to SPF mice. (b) Non-metric multidimensional scaling (NMDS) plot was used to visualize the unweighted UniFrac distances of each group (calculated by Bray-Curtis distance). (c) Changes in abundance of bacteria by environment or vaccination at family and genus levels were displayed in the heatmaps. Bacteria were selected from the comparison of SPF and conventionally housed sKLH controls with FDR<0.1. (d) In control mice housed in either SPF or conventional conditions, bacterial gene functions were predicted from 16S rRNA gene-based microbial compositions using the PICRUSt.

magnitude of the response in any of the metrics tested, with the exception of the rat serum oxycodone concentrations. Of note, the mean control values were significantly different between both rat serum and brain oxycodone concentrations when comparing housing conditions.

Effect of housing conditions and vaccination on microbiome in mice

To evaluate whether housing conditions or vaccination group are responsible for microbiota changes, gut microbial composition was evaluated by 16S rRNA gene sequencing of fecal pellets from each group. The alpha diversity was quantified by the Shannon diversity index, which accounts for both operational taxonomic unit (OTU) richness and evenness. The Shannon diversity was significantly decreased in SPF groups compared with conventionally raised groups, regardless of vaccination status ([Figure 3\(a](#page-5-1))).

Nonmetric multidimensional scaling (NMDS) analysis of the Bray–Curtis distance plot was also performed among the fecal samples from different groups. There was a clear separation between conventional and SPF sKLH-immunized controls (PERMANOVA test, FDR $q = 0.007$; [Figure 3\(b](#page-5-1))) and conventional and SPF F-sKLH (PERMANOVA test, FDR $q = 0.007$; [Figure 3\(b](#page-5-1)), Table S1). This suggests the changes in microbiota are influenced more by environmental conditions than vaccination status.

SPF mice receiving sKLH displayed a decreased relative abundance of *Proteobacteria* at the phylum level, *Rikenellaceae, Gemellaceae*, and *Clostridiaceae* at the family level and *Candidatus Arthromitus, Gemella*, and *Nelumbo* at the genus level compared to conventionally-housed sKLH controls. The relative abundance of *Dehalobacteriacea* and *Ruminococcaceae* at the family level and *Marvinbryantia* and *Oscillospira* at the genus levels were increased [\(Figure 3\(c\)](#page-5-1), Table S2).

Additionally, the overlap between F-sKLH and control groups in the SPF condition (PERMANOVA test, FDR $q = 0.114$) represents resilience to modulation by vaccination [\(Figure 3\(b](#page-5-1))). Interestingly, there was significant and distinct clustering of the F-sKLH group compared to control animals in conventional housing (PERMANOVA test, FDR $q = 0.046$) [\(Figure 3\(c\)](#page-5-1)). There was a reduction of *Rikenellaceae* at the family level and *Anaerostipes* and *Candidatus Arthromitus* at the genus level, and expansion of *Marvinbryantia* at the genus level in conventionally housed F-sKLH treatment group $(Figure 3(c))$ $(Figure 3(c))$.

The functional profiles of the microbial communities were analyzed in each group using PICRUSt. Of 42 KEGG pathways tested, 8 non-human-gene pathways differed in abundance between SPF and conventional raised controls (FDR q < 0.05). These include pathways related to cell growth and death, transcription, cancer, infectious diseases, carbohydrate metabolism, energy metabolism, metabolism of cofactors and vitamins, and metabolism of terpenoids and polyketides. There were no significant changes in functional composition related to vaccination in either conventional or SPF groups [\(Figure 3\(d\)](#page-5-1), Table S3). However, when comparing SPF and conventional sKLH controls, KEGG pathways related with cell growth and death, cancer, energy metabolism, metabolism of cofactors and vitamins, and metabolism of terpenoids and polyketides were found

to be down-regulated while KEGG pathways related with carbohydrate metabolism, transcription, and infectious disease were up-regulated in SPF controls. This suggests that environmental factors have a more important impact on microbial changes compared to vaccination.

Discussion and conclusion

The effect of the microbiome on health and disease has been increasingly investigated in recent years. Changes in the microbiome have been associated with cardiovascular disease, autoimmune conditions, cancer, obesity, diabetes, and potentially even mental health disorders.^{[46,](#page-9-11)47} Studies have suggested that the microbiome plays a role in the immune response to vaccination, $27-29$ making it critical that vaccine efficacy is tested in conditions that closely mimic the human microbiome. Since opioid use is also correlated to gut dysbiosis, it is even more imperative that vaccines for OUD are tested in a variety of contexts[31](#page-9-0)[,32,](#page-9-13)[34,](#page-9-14)[35](#page-9-15) to ensure vaccines will translate into a clinical setting. In this study, we sought to determine if changes in animal housing conditions affected the efficacy of vaccines against fentanyl and oxycodone in mice and rats. We found that while there were some minor differences in microbiota diversity between the two housing conditions, there were no major differences in the efficacy of either vaccine.

Differences in housing conditions and subsequent effects on behavior and disease have been noted in the literature in both mice and rats. Published studies show that housing conditions can affect the development of experimental autoimmune ence-phalitis in mice,^{[48](#page-9-16)} and rats housed in conventional vs. SPF conditions showed varying responses to surgical trauma and anesthesia[.49](#page-9-17) Studies exploring the differences between wild and laboratory mice also show that immune composition varies greatly between environmental conditions. Wild mice have more robust numbers and heterogeneity of circulating IgG, as well as significantly greater numbers of T cells, with less NK cells and dendritic cells.⁵⁰ In this study, we found that there was a significant increase in alpha diversity in the GI microbiota when comparing mice in conventional vs. SPF conditions, regardless of vaccination status. Since alterations in GI microbiota have been closely tied to many pathologies and alterations in metabolism, this study supports the need for careful consideration of mouse models when testing new therapies, and the requirement for comparisons between housing conditions to ensure microbiota differences do not affect treatment outcomes.

When analyzing the microbiome via sequencing, a distinct change in bacterial species was observed between conventionally housed control and immunized mice. Interestingly, these changes in microflora mirrored the changes observed in SPF mice when compared to conventionally housed mice. While no change in diversity between control and immunized mice was found in the SPF group, this finding may be due to a lack of microbial diversity due to the stringent microbial environment in these housing conditions. This finding suggests that the vaccine composition may have influenced the GI microbiome. While the fentanyl-based F hapten has been shown to be inactive at the mu-opioid receptor, 21 formal GLP toxicology studies of conjugate vaccines containing fentanyl-based

haptens are warranted. Histopathology and blood chemistry analysis in mice injected with $OXY\text{-}sK LH,^{24}$ as well as GLP toxicology studies of OXY-sKLH in rats (Pravetoni, personal communication), did not show any sign of toxicity. There have been reports that opioids modulate toll-like receptor (TLR) $4⁵¹$ $4⁵¹$ $4⁵¹$ a TLR involved in regulation of the GI microbiome, and that OXY-KLH responses were altered in TLR4KO mice.¹⁷ Followup studies will be needed to explore any potential interaction between anti-opioid vaccination, immunity, and microbiome.

Despite these minor differences in GI microbiota, we found no major significant differences in the efficacy of vaccines targeting fentanyl or oxycodone when examining opioidspecific antibody titers, pharmacokinetic parameters, and physiological and behavior responses. This outcome was unexpected, as there have been several studies noting the effects of the microbiome on immune response after vaccination.²⁷⁻³⁰ These results help validate previous data of preclinical studies of anti-opioid vaccines conducted in both SPF and conventional housing conditions. This also suggests that efficacy of anti-opioid vaccines are not significantly affected by environmental factors associated with housing conditions in laboratory animals, making interpretation of data from different laboratories more consistent. Additionally, these data suggest that OUD patients with opioid-induced dysbiosis may equally benefit from anti-opioid vaccination.

One point of interest is that in control rats, serum, and brain oxycodone levels were significantly increased in SPF housing conditions compared to conventional conditions [\(Table 1](#page-5-0)). This would suggest that the metabolism of oxycodone is decreased in SPF conditions, which may be linked to differences in the microbiota. Published literature has established a link between diversity of GI microbiota and the dysregulation of metabolism of morphine.³² While few studies have addressed the potential of the microbiome to affect the metabolism of other opioid molecules, such as oxycodone or fentanyl, it is possible that decreased microbial diversity in SPF rats would lead to decreased oxycodone metabolism, resulting in increased oxycodone concentrations in the serum and brain. This would be consistent with the findings that the functional differences in microbiome between SPF and conventional mice [\(Figure 3\(d](#page-5-1))) resulted in differences in metabolism of carbohydrates, vitamins, cofactors, terpenoids, and polyketides. These potential differences in metabolism and microbiome conditions will need to be further evaluated, although they may be of note for future experimental design and when comparing studies of laboratory animals housed under different conditions.

Future follow-up experiments will address some of the limitations of the current study to further explore the interplay between the microbiome and vaccination against OUD. One limitation is that current studies were only performed in male mice and rats. Significant differences in titers between male and female mice after anti-opioid vaccination were previously reported,^{15,25} and there have been noted sex differences in microbiome composition.⁵² Future studies will compare male and female animals to determine whether the GI microbiome affects the efficacy of anti-opioid vaccines in a sex-dependent fashion. Another limitation of this study was that the SPF condition likely does not fully capture the changes in

microbiome that are found in chronic opioid users. For example, previous literature indicates that active opioid users have an increase in abundance in Bifidobacterium and decreases in *Baceterodacea, Clostridiales XI*, and *Ruminococcaceae*, which were not recapitulated in the current study. 34 However, there was a decrease in overall alpha diversity and in *Rikenellaceae*, which are consistent with previous literature using mice chronically treated with morphine.³² While it has been shown that rats chronically treated with opioid agonists and antagonists still mount an anti-opioid antibody response after vaccination,^{20[,21](#page-8-17),38} the relationship between chronic opioid treatment and microbiome composition has not yet been explored in the context of vaccines for OUD. This will be critical in future studies to determine whether opioid users will respond to anti-opioid vaccination.

As testing of OUD vaccines in clinical settings is underway (e.g., OXY-sKLH, NCT 04458545), the impact of vaccination on GI microbiota and *vice versa* will help to inform clinicians on therapeutic management of OUD patients. Pre-clinical studies are often conducted in microbially controlled environments, which may be masking or changing pathologies and/ or outcomes related to disease treatment. In the case of OUD, looking at the impact of the GI microbiome on potential therapeutic efficacy becomes even more crucial when the target population may have a higher incidence of abnormal microbiome function. We found that while SPF and conventionally housed animals displayed differences in GI microbiota composition, these differences did not affect the efficacy of either an anti-oxycodone or anti-fentanyl vaccine. These studies validate previous and future data testing opioid vaccines preclinically in different housing conditions, and support future testing of OUD vaccines as a treatment strategy for individuals that may have deficits or abnormal microbiomes, as well as otherwise healthy individuals.

Abbreviations

Opioid use disorder (OUD), medication-assisted therapy (MAT), gastrointestinal (GI), specific-pathogen free (SPF), contract research organization (CRO), good laboratory practices (GLP), investigational new drug (IND), intramuscular (i.m), subcutaneous (s. c), OXY (oxycodone hapten), F (fentanyl hapten), subunit keyhole limpet hemocyanin (sKLH), bovine serum albumin (BSA), chicken ovalbumin (OVA), maximum possible effect (MPE), beats per minute (BPM), breaths per minute (BRPM), polymerase-chain reaction (PCR), Nonmetric multidimenstional scaling (NMDS)

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Data availability

16s rRNA sequencing data are available under NCBI accession number PRJNA738384.

Disclosure of potential conflicts of interest

Pravetoni is the inventor of "Fentanyl hapten-conjugates and methods for making and using same," Application No. 62/932,757 and "Fentanyl haptens, fentanyl hapten conjugates, and methods for making and using the same," Application No. 62/989,417. All other authors declare no competing interests.

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