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Life-long dynamics of the swine gut microbiome and their implications in probiotics development and food safety

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ABSTRACT

The swine gut microbiome has received remarkable attention in recent years given that pigs serve not only as important sources for animal-derived food but also as excellent biomedical models for human health. However, despite recent advances in the understanding of the swine gut microbiome, many important biological and ecological questions are still largely unanswered. In a recent study, we characterized the life-long dynamics of the swine gut microbiome from birth to market. We showed distinct shifts in gut microbiome structure along different growth stages mainly driven by diet. Here, we summarize these discoveries and provide additional data related to the core swine gut microbiome, probiotics development in the swine industry, and foodborne pathogens in the pork supply chain. ARTICLE HISTORY Received 2 April 2020 Revised 12 May 2020 Accepted 18 May 2020

KEYWORDS Swine gut microbiome; probiotics; core microbiome; food safety

Introduction

The human microbiome has been extensively studied in the last decade and substantial progress has been made in that field regarding their membership, structure, dynamics, and correlations with different diseases.¹⁻⁵ Pigs serve as important protein sources for human beings. With the increase in global population and preference for animal protein sources, it is critical to maintain sustainable and efficient swine production. Given the importance of pigs as both livestock species and as medical models for human diseases, the swine gut microbiome has been characterized by many groups throughout the world. It has been reported that the swine gut microbiome correlated with feed efficiency, fat deposition, and growth performance.⁶⁻¹⁰ Despite this progress toward understanding the swine gut microbiome, many important ecological questions are yet to be answered.

The swine industry faces enormous challenges. The emergence and spread of antimicrobial resistance (AMR) from the swine industry due to antibiotic application for disease treatment, prevention, and growth promotion have drawn pressing public health concerns,¹¹ necessitating the use of alternatives to

antibiotics, such as probiotics, in the swine industry. Furthermore, live pigs on farm serve as one of the major sources of foodborne pathogens in the pork supply chain and the environment. Given the critical roles that the gut microbiome plays in swine health and production, it is crucial to better understand the mechanisms underlying the assembly and succession of the microbial communities in pigs to identify beneficial bacteria that might serve as probiotics. It is also important to track the dynamics of the pathogens to establish an effective management strategy to reduce, if not prevent product contamination. Recently, we investigated the life-long dynamics of the swine gut microbiome in a longitudinal study at pre-harvest and addressed many important ecological questions.¹² Here, we build on the discoveries from that study, particularly on the core microbiome and stagespecific bacteria and discuss their implications in the context of probiotics development and detection of foodborne pathogens.

Life-long dynamics of the swine gut microbiome

In a test animal trial, we followed 18 pigs from birth to market and found that their gut microbiome

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structures significantly shifted during different growth stages: lactation, nursery, growing, and finishing. Dramatic changes in gut microbiome structure occurred during weaning, when the pigs were separated from the sows and provided solid food rather than sow milk. Gradual but significant changes in swine gut microbiome structures were also observed during the different growth stages when the pigs were on a solid diet. Different signature bacterial taxa for these growth stages that drive the shifts in swine gut microbiome structure are listed in Figure 1.

Prevotella is the most abundant genus in the swine gut microbiome. Eleven of the top 30 features belong to this genus. Although three of these *Prevotella* features belong to the "core" gut microbiome (Table 1), especially Feature 9, which showed the highest abundance at lactation, most of these *Prevotella*-associated features are stage-specific (Figures 1 and 2). One of them (F29) started appearing at the grower stage whereas eight of these *Prevotella* features emerged only after weaning when the pigs were introduced to solid food (Figure 2). *Prevotella* is one of the most abundant genera in humans and its role in human health has been controversial.¹³ *Prevotella* species

are associated with dietary carbohydrates in humans,¹⁴ and produce acetate, an energy source for some butyrate producers such as *Ruminococcus*, *Clostridium*, and *Blautia*. In fact, members of these genera such as *Blautia* also emerged together with *Prevotella* at the beginning of nursery stage (Figure 2), supporting the co-occurence and possible cross-feeding between these bacteria in pigs.

The swine core microbiome

The core microbiome has been well- researched in different species and ecological niches.^{1,15–18} Identifying a core microbiome is vital to understand its function in the gut to enable manipulation of microbial communities that are beneficial for human health. In general, a core microbiome refers to the common group of bacteria present in all or most (e.g. >90%) of the communities of a special habitat.^{16,19} However, it has been challenging to define a core microbiome given the many factors that affect the human gut microbiome such as diet, genetics, age, and antibiotics.^{2,5,19–23}

There have also been efforts in defining a core swine microbiome.^{24,25} In a recent study, Holman



Figure 1. Bi-plot showing the life-long dynamics of the swine gut microbiome and the stage associated Prevotella.

Table 1. The swine core gut microbiome.

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F23 522ba9d695541c9ea478db7cafeb4355 Bacteroidetes Bacteroidales S24-7	
F28 fa9cbb7e45355cb861070b68d9a5653b Firmicutes Clostridiales Ruminococcaceae Oscillospira	
F46 b88939309e235a04fdcff68d166139ab Bacteroidetes Bacteroidales [Paraprevotellaceae] [Prevotella]	
F48 27a8a06bc2b03e2ee032a7aeef16dbe3 Bacteroidetes Bacteroidales Prevotellaceae Prevotella	stercorea
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F52 f324a15262fda881e9e0f6b59a20b21d Bacteroidetes Bacteroidales [Paraprevotellaceae] CF231	
F33 f2c72e7978ae955c780882f71f689e9b Firmicutes Clostridiales Christensenellaceae	
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F93 1f75f87fb55993516a97af66507a0f08 Bacteroidetes Bacteroidales [Paraprevotellaceae] [Prevotella]	
F112 04e3a222e2655f35b175436f9cb29844 Bacteroidetes Bacteroidales	
F116 c0e706eff2fbc0db84755141796f11af Bacteroidetes Bacteroidales	
F120 fd4bd6f441389fd712ee14af66eaf217 Bacteroidetes Bacteroidales Prevotellaceae Prevotella	
F121 52f6ab8a13bead00126a83f61d959ab6 Firmicutes Lactobacillales Lactobacillaceae Lactobacillus	delbrueckii
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F198 b05ae994010ddd94626d03a8c4ceafe1 Firmicutes Erysipelotrichales Erysipelotrichaceae [Eubacterium]	biforme
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F275 5947530ad170bbc67f9af778d42f8dc7 Bacteroidetes Bacteroidales Porphyromonadaceae Parabacteroides	
F302 f361d0070bf833c26d64b95fe512847a Bacteroidetes Bacteroidales Prevotellaceae	
F310 413d7371b0955033e463b538bfab0cfc Firmicutes Clostridiales Ruminococcaceae	
F312 829d3bd6a7df703802fbb4a076f614b5 Firmicutes Clostridiales Ruminococcaceae	
F319 fc3d8267a88365a43202affb1b1c0d1f Firmicutes Clostridiales Ruminococcaceae Oscillospira	
F357 71903137448067873e3ffbf70dea44eb Firmicutes Clostridiales	
F394 1c4985419653025d3a4a1be178t4676 c Firmicutes Erysipelotrichales Erysipelotrichaceae p-75-a5	
F410 603998/e101/12b3302t6e8e5beee/ea Firmicutes Clostridiales	
r413 U2C93184000D094305D522152050D3C FIRMICUTES CLOSTRIDIALES LACHNOSPIRACEAE	
1771 CUISUUUUUUUUUUUUUUUUUUUUUUUUUUUUUUUUUUU	
F518 547cr82727e9e688a34afaefredd5c11 Proteobacteria Rurkholderiales Alcaligenaceae Sutterella	
F521 ba2b96b172b40e9f509571929d9a082b Actinobacteria Coriobacteriales Coriobacteriaceae	
F524 65732a9995f5007582ebb500e7df4ea5 Firmicutes Clostridiales Ruminococcaceae Oscillospira	
F561 d76796a7df0d1f21a46610474a17f2e4 Firmicutes Clostridiales Ruminococcaceae Ruminococcus	



Figure 2. Boxplots showing the dynamics of the top 11 bacterial features associated with *Prevotella* and one feature associated with *Blautia* during different growth stages of pigs.

and colleagues performed a meta-analysis of 20 data sets and found several shared genera such as Clostridium, Prevotella, Alloprevotella, and Ruminococcus. However, the most striking conclusion from the analysis is that, other than gastrointestinal (GI) tract location, the "Study" factor was also significant in shaping the swine gut microbiota. It is not surprising that different niches along the GI tract harbor distinct gut microbiomes given the unique ecological environments and physiological conditions in each niche. The significant effect of "Study" on the swine gut microbiome underscores the importance of standardizing experimental techniques, e.g. sample collection and storage,^{26,27} DNA extraction,²⁸⁻³⁰ hypervariable regions of the 16 S

rRNA gene,³¹ and bioinformatics pipelines,³² to allow cross-study comparisons aiming to identify a core swine gut microbiome.

In our recent report, we identified a "core" microbiome of 69 bacterial features that were present in all the growth stages and shared by three groups of pigs in the test and validation trial (Table 1). Consistent with the findings of Holman et al,²⁵ most of these features are associated with the order Clostridiales (n = 28), Bacteroidiales (n = 22), and Lactobacillales (n = 6). At the family level, the top three families are Prevotellaceae (n = 11), Ruminococcaceae (n = 16), and Lactobacillaceae (n = 5). A total of 10 features were not classified to the family level. Although some of the top

features such as *Megasphaera* (F1) and *Prevotella* (F3) were present during all the growth stages, others such as F4 (unclassified Clostridiaceae) and F10 (Bacteroidetes YRC22), rarely noticeable at lactation and nursery stages, emerged rapidly and became the dominant taxa at the growing and finishing stages. The sequence and taxonomy of these features are listed in Table 1.

Our study has several contributions to the effort of identifying a core microbiome. We used ASVs (amplicon sequence variants) or ESVs (exact sequence variants) to define bacterial features that differed with a single nucleotide. This approach enables cross-study comparisons to determine whether the same bacterial features are shared among different studies.³³ For core microbiome studies, our data show that it is important to take into account the stage-specific bacterial taxa. For example, the finishing-stage bacteria (e.g. F4) might be missed in the "core" gut microbiome if only nursery-stage samples were used for comparison.

Swine probiotics development: does one size fit all?

Due to pressures from a public health standpoint, many countries have banned the use of antibiotics for growth promotion in animals. Alternatives to antibiotics are critical to improve animal health and growth performance in the swine industry. Probiotics serve as an important alternative to subtherapeutic antibiotics.³⁴ As a first step in developing probiotics, we performed a regression-based random forest analysis to identify potentially beneficial bacteria that correlate with growth performance at each growth stage and at the end of the test trials. Apparently, different sets of bacteria associated with growth performance were observed from each stage. In a validation trial, we inoculated 12 postweaning pigs with fecal samples from a healthy pig at growing stage. Fecal microbiota transplantation (FMT) improved the growth performance of the recipient pigs. Although not statistically significant likely due to the small sample size (n = 12), FMT did increase the body weight of recipient pigs by 4.9 kg on average compared to their litter mates at the end of the validation trial. The fecal sample from the donor is representative of the mature pigs from growing stages regarding the microbiome composition and structure.¹² FMT didn't change the overall gut microbiome structure of the recipients, however, it did enrich several groups of bacterial taxa. Random forest identified these stage-associated bacteria that were enriched in the FMT group and correlated with growth performance in the validation trial. A comparison of the test and validation trial identified shared bacterial features that might serve as potentially beneficial bacteria promoting animal growth performance (Table 2).

Figure 3 shows the relative abundance of these bacteria in the pigs of the control and the FMT group in the validation trial. Bacterial features associated with Bulleidia (F336) and Lacobacillus mucosae (F454) were more abundant in the FMT group with greater growth performance at the nursery stage, whereas features affiliated with Acidaminococcus (F100) and Prevotella (F73) were over represented in the FMT group at the late nursery and growing stages. Members of Turicibacter (F26), more abundant in the FMT group, didn't emerge until the finishing stage. Of note, features associated with growth performance, calculated based on the final body weight, were mainly late colonizers of the swine gut. For example, F4 and F18, which were more abundant in the FMT group, started appearing in the gut at the growing stages. Our data show different sets of potentially beneficial bacteria associated with superior phenotypes with a stage-specific pattern. We propose that a mix of probiotics tailored to growth stages of pigs, rather than to a single bacterial strain, should be developed

Table 2. Stage-specific potentially beneficial bacteria shared by the two animal trials.

Lactation	Nursery	Growing	Finishing	Overall
F77	F222	F100	F26	F55
F363	F604	F73	F19	F4
F182	F7	F40	F27	F27
F876	F233		F333	F75
F162	F339		F100	F19
F1	F336		F61	F26
F166	F301		F394	F234
F502	F454		F134	F18
F21				F336
F53				F165
F247				F127
				F103
				F377
				F196
				F433
				F231
				F376
				F100
				F17
				F330
				F307



Figure 3. Stage-associated potentially beneficial bacteria in the control and fecal microbiota transplantation (FMT) pigs. FMT remarkably improved swine growth performance. Bacterial features identified by random forest that positively correlate with growth performance were more abundant in the FMT group.

to optimize their beneficial effects on swine health and production.

Foodborne pathogens: the best window for intervention

Pork, the most consumed meat worldwide, is a major source of foodborne pathogens, which are a major cause of human morbidity and mortality every year.³⁵ Most of the studies in the food safety area focus on the

post-harvest section of the swine industry with very limited information about the live animals on farm during the pre-harvest season. In fact, live pigs are not only the source of foodborne pathogens, which are passed along to the post-harvest supply chain, they also shed these pathogens on the farms, thus exposing farm workers as well.³⁶ Therefore, understanding the dynamics of these pathogens on farm provides information on the best window and strategy to manage these pathogens.



Figure 4. The dynamics of foodborne pathogens (members of Campylobacter and E. coli) in pigs during the pre-harvest section of the pork supply chain.

Campylobacter is one of the major foodborne pathogens in the swine industry.³⁵ Our longitudinal study shows the relative abundance and dynamics of 13 bacterial features associated with Campylobacter and one bacterial feature associated with E. coli (Figure 4). E. coli was abundant during the lactation stage and faded out after weaning. Different features of Campylobacter showed different dynamic patterns. Future study is needed to track the dynamics of these pathogens in the whole pork supply chain to determine which features are transmitted from farm to fork so that a treatment window based on this essential information could be determined.

Conclusions

In conclusion, this longitudinal characterization of the swine gut microbiome provides the foundation for translational research aiming to improve animal health and production. This study not only contributes to our understanding of many key biological and ecological concepts, but also identified potentially beneficial bacteria and pathogens. Characterization of the growth-stage-associated swine gut microbiome emphasizes the importance of optimization of probiotics based on different stages. It also provides insights on the best window to manage foodborne pathogens during the pre-harvest season of the swine industry. We also advocate for standard protocols in swine gut microbiome studies (e.g. sample collection, DNA extraction) to improve reproducibility and cross-study comparability for translational research investigations.

Materials and methods

All the animals and sequencing data were from our previous study¹². No additional pigs or sequences were included. Sequence process and analysis were performed as described previously¹². The biplot in Figure 1 was generated by the corr.axes function (setting: method = spearman; numases = 2) in mothur software package (v.1.40.5).³⁷ Boxplots (Figures 2 and 3) and stacked barchart (Figure 4) were generated by the ggplot2 package of R.

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References

- Wang X, Tsai T, Deng F, Wei X, Chai J, Knapp J, Apple J, Maxwell CV, Lee JA, Li Y, et al. Longitudinal investigation of the swine gut microbiome from birth to market reveals stage and growth performance associated bacteria. Microbiome. 2019;7 (1):109. doi:10.1186/s40168-019-0721-7.
- Turnbaugh PJ, Hamady M, Yatsunenko T, Cantarel BL, Duncan A, Ley RE, Sogin ML, Jones WJ, Roe BA, Affourtit JP, et al. A core gut microbiome in obese and lean twins. Nature. 2009;457(7228):480–484. doi:10.1038/ nature07540.
- Zhao J, Schloss PD, Kalikin LM, Carmody LA, Foster BK, Petrosino JF, Cavalcoli JD, VanDevanter DR, Murray S, Li JZ, et al. Decade-long bacterial community dynamics in cystic fibrosis airways. Proc Natl Acad Sci U S A. 2012;109 (15):5809–5814. doi:10.1073/pnas.1120577109.
- Yatsunenko T, Rey FE, Manary MJ, Trehan I, Dominguez-Bello MG, Contreras M, Magris M, Hidalgo G, Baldassano RN, Anokhin AP, et al. Human gut microbiome viewed across age and geography. Nature. 2012;486(7402):222–227. doi:10.1038/nature11053.
- Clemente JC, Ursell LK, Parfrey LW, Knight R. The impact of the gut microbiota on human health: an integrative view. Cell. 2012;148(6):1258–1270. doi:10.1016/j. cell.2012.01.035.
- Kong F, Deng F, Li Y, Zhao J. Identification of gut microbiome signatures associated with longevity provides a promising modulation target for healthy aging. Gut Microbes. 2018;10 (1):1–6. doi:10.1080/19490976.2018.1455790.
- Tsai T, Sales MA, Kim H, et al. Isolated rearing at lactation increases gut microbial diversity and post-weaning performance in pigs. Front Microbiol. 2018;9:2889. Published 2018 Nov 29. doi:10.3389/ fmicb.2018.02889.
- Wei X, Tsai T, Knapp J, et al. ZnO modulates swine gut microbiota and improves growth performance of nursery pigs when combined with peptide cocktail. Microorganisms. 2020;8(2):146. Published 2020 Jan 21. doi:10.3390/microorganisms8020146.
- Xiao YP, Kong FL, Xiang Y, et al. Comparative biogeography of the gut microbiome between Jinhua and Landrace pigs. Sci Rep. 2018;8:5985. doi:10.1038/ s41598-018-24289-z.
- Yang H, Xiang Y, Robinson K, et al. Gut microbiota is a major contributor to adiposity in pigs. Front Microbiol. 2018;9:3045. Published 2018 Dec 10. doi:10.3389/fmicb.2018.03045.

- He B, Bai Y, Jiang L, et al. Effects of oat bran on nutrient digestibility, intestinal microbiota, and inflammatory responses in the hindgut of growing pigs. Int J Mol Sci. 2018;19(8):2407. Published 2018 Aug 15. doi:10.3390/ijms19082407.
- Looft T, Johnson TA, Allen HK, Bayles DO, Alt DP, Stedtfeld RD, Sul WJ, Stedtfeld TM, Chai B, Cole JR, et al. In-feed antibiotic effects on the swine intestinal microbiome. Proc Natl Acad Sci U S A. 2012;109 (5):1691–1696. doi:10.1073/pnas.1120238109.
- De Filippis F, Pasolli E, Tett A, Tarallo S, Naccarati A, De Angelis M, Neviani E, Cocolin L, Gobbetti M, Segata N, et al. Distinct genetic and functional traits of human intestinal prevotella copri strains are associated with different habitual diets. Cell Host Microbe. 2019;25 (3):444–53 e3. doi:10.1016/j.chom.2019.01.004.
- Wu GD, Chen J, Hoffmann C, Bittinger K, Chen YY, Keilbaugh SA, Bewtra M, Knights D, Walters WA, Knight R, et al. Linking long-term dietary patterns with gut microbial enterotypes. Science. 2011;334 (6052):105–108. doi:10.1126/science.1208344.
- Tschop MH, Hugenholtz P, Karp CL. Getting to the core of the gut microbiome. Nat Biotechnol. 2009;27 (4):344–346. doi:10.1038/nbt0409-344.
- Shade A, Handelsman J. Beyond the Venn diagram: the hunt for a core microbiome. Environ Microbiol. 2012;14:4–12. doi:10.1111/j.1462-2920.2011.02585.x.
- 17. Zaura E, Keijser BJ, Huse SM, Crielaard W. Defining the healthy "core microbiome" of oral microbial communities. BMC Microbiol. 2009;9:259.
- Lundberg DS, Lebeis SL, Paredes SH, Yourstone S, Gehring J, Malfatti S, Tremblay J, Engelbrektson A, Kunin V, Rio TGD, et al. Defining the core Arabidopsis thaliana root microbiome. Nature. 2012;488(7409):86–90. doi:10.1038/nature11237.
- Hamady M, Knight R. Microbial community profiling for human microbiome projects: tools, techniques, and challenges. Genome Res. 2009;19(7):1141–1152. doi:10.1101/gr.085464.108.
- Arumugam M, Raes J, Pelletier E, Le Paslier D, Yamada T, Mende DR, Fernandes GR, Tap J, Bruls T, Batto J-M, et al. Enterotypes of the human gut microbiome. Nature. 2011;473(7346):174–180. doi:10.1038/nature09944.
- Goodrich JK, Waters JL, Poole AC, Sutter JL, Koren O, Blekhman R, Beaumont M, Van Treuren W, Knight R, Bell J, et al. Human genetics shape the gut microbiome. Cell. 2014;159(4):789–799. doi:10.1016/j.cell.2014.09.053.
- Deng F, Li Y, Zhao J. The gut microbiome of healthy long-living people. Aging (Albany NY). 2019;11 (2):289–290. doi:10.18632/aging.101771.
- Zhao J, Murray S, Lipuma JJ. Modeling the impact of antibiotic exposure on human microbiota. Sci Rep. 2014;4(1):4345. doi:10.1038/srep04345.
- 24. Lowe, B.A., Marsh, T.L., Isaacs-Cosgrove, N. et al. Defining the "core microbiome" of the microbial communities in the tonsils of healthy pigs. BMC Microbiol. 2012;12:20. doi:10.1186/1471-2180-12-20.

1832 👄 Y. LI ET AL.

- 25. Holman DB, Brunelle BW, Trachsel J, Allen HK.Metaanalysis to define a core microbiota in the swine gut. mSyst. 2017: 2.
- 26. Zhao J, Li J, Schloss PD, Kalikin LM, Raymond TA, Petrosino JF, Young VB, LiPuma JJ. Effect of sample storage conditions on culture-independent bacterial community measures in cystic fibrosis sputum specimens. J Clin Microbiol. 2011;49(10):3717–3718. doi:10.1128/JCM.01189-11.
- 27. Song SJ, Amir A, Metcalf JL, Amato KR, Xu ZZ, Humphrey G, et al. Preservation methods differ in fecal microbiome stability, affecting suitability for field studies. mSyst. 2016: 1.
- Costea PI, Zeller G, Sunagawa S, Pelletier E, Alberti A, Levenez F, Tramontano M, Driessen M, Hercog R, Jung F-E, et al. Towards standards for human fecal sample processing in metagenomic studies. Nat Biotechnol. 2017;35(11):1069–1076. doi:10.1038/nbt.3960.
- Zhao J, Carmody LA, Kalikin LM, Li J, Petrosino JF, Schloss PD, Young VB, LiPuma JJ. Impact of enhanced Staphylococcus DNA extraction on microbial community measures in cystic fibrosis sputum. PLoS One. 2012;7(3):e33127. doi:10.1371/journal.pone.0033127.
- 30. Kennedy NA, Walker AW, Berry SH, Duncan SH, Farquarson FM, Louis P, Thomson JM, Satsangi J, Flint HJ, Parkhill J, et al. The impact of different DNA extraction kits and laboratories upon the assessment of human gut microbiota composition by 16S rRNA gene sequencing. PLoS One. 2014;9(2):e88982. doi:10.1371/ journal.pone.0088982.
- 31. Chen Z, Hui PC, Hui M, Yeoh YK, Wong PY, Chan MCW, et al. Impact of preservation method and

16S rRNA hypervariable region on gut microbiota profiling. mSyst. 2019: 4.

- 32. Sinha R, Abu-Ali G, Vogtmann E, Fodor AA, Ren B, Amir A, Schwager E, Crabtree J, Ma S, Abnet CC, et al. Assessment of variation in microbial community amplicon sequencing by the Microbiome Quality Control (MBQC) project consortium. Nat Biotechnol. 2017;35 (11):1077–1086. doi:10.1038/nbt.3981.
- 33. Thompson LR, Sanders JG, McDonald D, Amir A, Ladau J, Locey KJ, Prill RJ, Tripathi A, Gibbons SM, Ackermann G, et al. A communal catalogue reveals Earth's multiscale microbial diversity. Nature. 2017;551(7681):457–463. doi:10.1038/nature24621.
- Liu WC. Application of complex probiotics in swine nutrition – a review. Ann Anim Sci. 2018;18(2):335-50-2018. doi:10.2478/aoas-2018-0005.
- 35. Baer AA, Miller MJ, Dilger AC. Pathogens of interest to the pork industry: A review of research on interventions to assure food safety. Compr Rev Food Sci Food Saf. 2013;12:183–217.
- 36. Sun J, Liao XP, D'Souza AW, Boolchandani M, Li SH, Cheng K, Luis Martínez J, Li L, Feng Y-J, Fang L-X, et al. Environmental remodeling of human gut microbiota and antibiotic resistome in livestock farms. Nat Commun. 2020;11(1):1427. doi:10.1038/s41467-020-15222-y.
- 37. Schloss PD, Westcott SL, Ryabin T, Hall JR, Hartmann M, Hollister EB, Lesniewski RA, Oakley BB, Parks DH, Robinson CJ, et al. Introducing mothur: open-source, platform-independent, community-supported software for describing and comparing microbial communities. Appl Environ Microb. 2009;75(23):7537–7541. doi:10. 1128/AEM.01541-09.