META-IPEP: A GALAXY-BASED METAIMMUNOPEPTIDOMICS BIOINFORMATICS PIPELINE RIGOROUSLY CHARACTERIZES MICROBIAL PEPTIDE ANTIGENS BOUND TO THE HUMAN LEUKOCYTE ANTIGEN (HLA) COMPLEX



Katherine Do¹, Subina Mehta¹, Reid Wagner², Fengchao Yu³, Alexey Nesvizhskii^{3,4}, Timothy J. Griffin^{1,5}, Pratik D. Jagtap^{1,5}

¹Biochemistry, Mol. Biology and Biophysics, University of Minnesota, Minnesota, Minnesota, Minnesota, Minnesota, Minnesota, Minnesota, University of Minnesota, Min of Michigan, Ann Arbor, MI; ⁴Department of Computational Medicine and Bioinformatics, University of Michigan, Ann Arbor, MI; ⁵Masonic Cancer Center, University of Minnesota, Minneapolis, MN

INTRODUCTION

- Emerging studies have described the presentation of intratumoral microbial peptides by the human leukocyte antigen (HLA) complex.
- Mass spectrometry (MS)-based metaproteomics can be used to characterize these "metaimmunopeptides," bettering our understanding of tumor development and progression.
- However, the complex tumor microbiome presents numerous bioinformatic challenges.
- The Meta-iPep pipeline was developed on the Galaxy platform² to enable bioinformatic analysis of microbial peptides from immunopeptidomic tandem MS (MS/MS) data, allowing researchers to investigate microorganisms that may contribute to cancer.

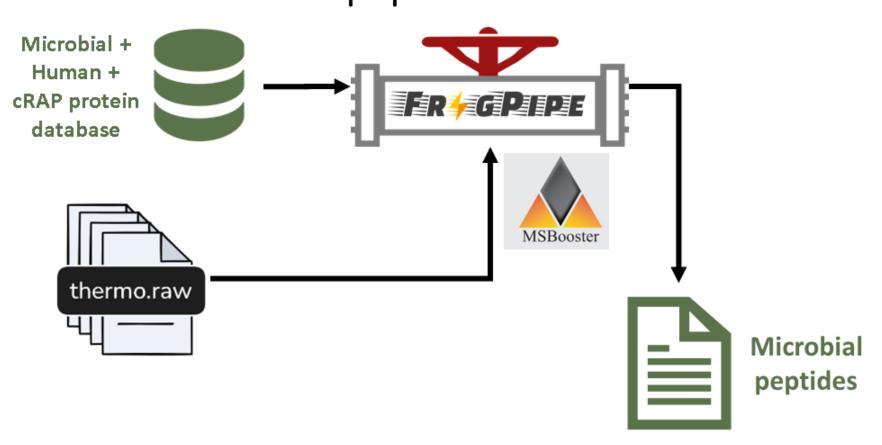
EXAMPLE DATASETS

- Datasets from melanoma samples¹ were used for demonstration (samples 86B2, 92B3, 27). Raw MS/MS data were obtained via datadependent acquisition (DDA) mode (Q Exactive Plus).
- Protein sequence databases: Microbial database of 40 bacterial species (697K seqs); Microbial + Human + cRAP database (780K seqs); Human + cRAP database (83.2K seqs)

METHODS: META-IPEP PIPELINE

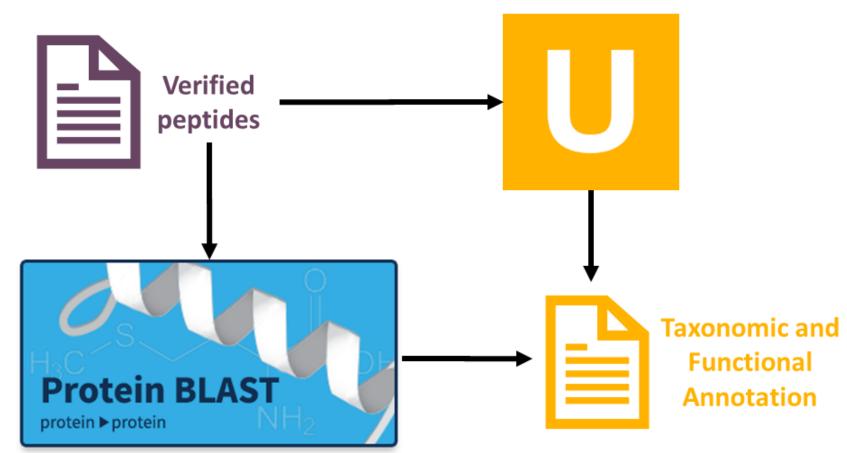
Module 1: Peptide Identification

FragPipe matched MS/MS data against a customized protein sequence database and identified microbial peptides.



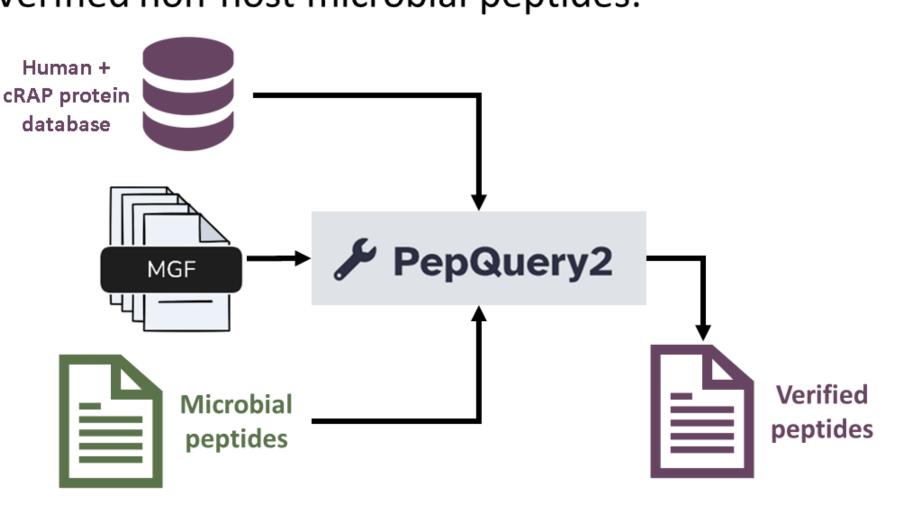
Module 3: Peptide Annotation

Microbial peptides verified by PepQuery2 were analyzed by Unipept and BLAST-P for taxonomic and functional annotation.



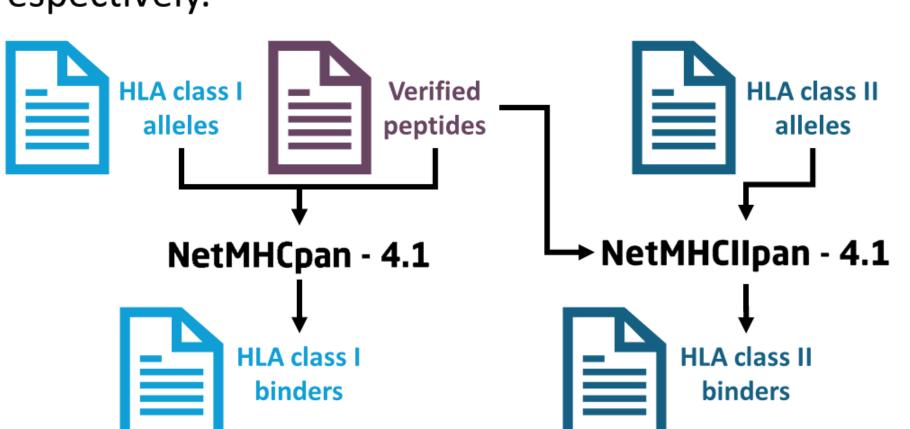
Module 2: Peptide Verification

Microbial peptides identified using FragPipe were then validated using PepQuery2, resulting in verified non-host microbial peptides.



Module 4: HLA Binding Prediction

The verified peptides were used as input for NetMHCpan and NetMHCIIpan to predict peptide binding to HLA class I and class II molecules, respectively.



Select Predicted

HLA Alleles

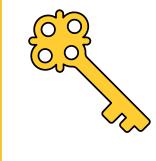
Predicted

Binding Core

Key Takeaways



"Meta-immunopeptides" are intratumoral microbial peptides that are presented by the HLA and can be characterized via MS-based metaproteomics.



The **Meta-iPep pipeline** was developed to address the many bioinformatic challenges posed by the complexity of the tumor microbiome.



Meta-iPep is a modular bioinformatics pipeline for rigorous analysis of MS-based metaimmunopeptidomics data that empowers community adoption via the Galaxy ecosystem.



This pipeline can be expanded to analyze samples from different cancer types to better our understanding of **tumor** development and progression.

RESULTS

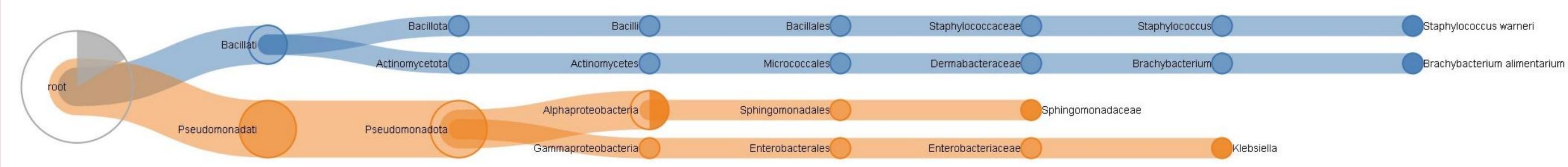


FIGURE 1. Example of Microbial Taxonomy (Sample 86B2).

Example Sample 86B2

Taxonomy (FIG. 1)

- Three genera identified: *Klebsiella, Staphylococcus,* and Brachybacterium.
- Two bacterial species identified: **Staphylococcus warneri** and Brachybacterium alimentarium.

Microbial peptides of interest

• Out of 92 microbial peptides identified (TABLE 1), four microbial peptides were of interest, based on the quality of their mass spectra: KAGMLSITY, DTEIPRKELY, FAEGAGRLAG, AADKAAADKAAADK (TABLE 2, FIG. 2).

TABLE 1. Results summary for three melanoma samples. SBs: strong binders; WBs: weak binders.

| Tool | Data | Sample 86B2 | Sample 92B3 | Sample 27 |
|-----------------|--------------------|-------------|-------------|-----------|
| FragPipe | Total peptides | 11,262 | 7,424 | 5,998 |
| | Microbial peptides | 92 | 88 | 63 |
| PepQuery2 | Validated PSMs | 17 | 15 | 12 |
| | Microbial peptides | 12 | 11 | 6 |
| NetMHCpan 4.1 | HLA class I SBs | 21 | 11 | 16 |
| | HLA class I WBs | 40 | 27 | 30 |
| NetMHCiipan 4.1 | HLA class II SBs | 5 | 3 | 2 |
| | HLA class II WBs | 6 | 4 | 2 |

Taxonomic and

Functional Annotation

Microbial Peptide

(MS scan)

TABLE 2. Excerpt of HLA binding predictions for sample 86B2.

Length

| | $\mathbf{B} \stackrel{NH2-D}{\downarrow_1} T \stackrel{y^6}{\downarrow_2} E \stackrel{y^7}{\downarrow_3} I \stackrel{y^6}{\downarrow_4} P R \stackrel{y^4}{\downarrow_6} K E \stackrel{y^2}{\downarrow_8} L Y-COOH$ | | | | | | |
|---|---|--|--|--|--|--|--|
| 75- rK b ₁ Prec ²⁺ b ₇ | 100- 75- 50- 100- 100- 100- 100- 100- 100- 100 | | | | | | |
| NH2-F A L A G-COOH | D NH2-A A D N A A D K A A A D K-COOH | | | | | | |
| 100- IF Y ₈ Y ₇ Y ₇ | 100- 75- | | | | | | |
| 25 | 50- 11X b ² ₃ b ⁴ ₃ b ² ₅ y ² ₁ b ⁷ ₂ b ⁷ ₃ b ⁷ | | | | | | |
| FIGURE 2. Mass spectra for four microbial peptides of interest: A) KAGMLSITY, B) DTEIPRKELY, C) FAEGAGRLAG, and D) AADKAAADKAAADK. | | | | | | | |

| | KAGMLSITY (Seq47093_QE3_raw:31656:2) | 9 | Staphylococcus warneri Transmembrane transporter activity | KAGMLSITY | HLA-B*35:01, HLA-C*02:02 |
|-------|---|----|---|------------|-----------------------------------|
| → m/z | DTEIPRKELY (Seq47093_QE3_raw:25390:2) | 10 | Brachybacterium alimentarium DNA Partitioning ATPase | DTEIPRKELY | HLA-A*01:01, HLA-B*44:02 |
| | FAEGAGRLAG (Seq47093_QE3_raw:20028:2) | 10 | Family Sphingomonadaceae Phage tail assembly chaperone protein (TAC6) | FAEGAGRL | HLA-C*03:03, HLA-C*08:02 |
| → m/z | AADKAAADKAAADK (Seq47095_QE3_raw:4568:2) | 14 | root dextransucrase | AAADKAAAD | HLA- DQA1*01:02/ DQB1*03:02 |

CONCLUSIONS

- Meta-iPep is a modular, Galaxy-based pipeline for the identification, rigorous verification, and characterization of HLA-I- and HLA-II-binding microbial peptides from immunopeptidomics data.
- In this study, we used the Meta-iPep pipeline to examine bacterial peptides in the HLA immunopeptidome of melanoma samples.
- These workflows will be made publicly accessible on the European Galaxy server, and accompanying tutorial materials will be disseminated on the Galaxy Training Network (GTN).

FUTURE DIRECTIONS

- We envision that the Meta-iPep pipeline can be used for different samples besides melanoma to investigate microorganisms that may contribute to specific cancers.
- Considering peptide inversion is one future area of exploration that may yield greater understanding of factors that influence peptide—MHC binding, thereby improving MHC prediction models.

REFERENCES

- 1. Kalaora S, Nagler A, Nejman D, Alon M, Barbolin C, Barnea E, et al. Identification of bacteriaderived HLA-bound peptides in melanoma. Nature. 2021;592(7852):138-43.
- 2. Galaxy Community. The Galaxy platform for accessible, reproducible, and collaborative data analyses: 2024 update. Nucleic Acids Res. 2024;52(W1):W83-W94. doi: 10.1093/nar/gkae410.

ACKNOWLEDGMENTS

This work is supported by NIH grants UG3CA244687 and 1U01CA288888, as well as grant P30CA077598 to the Masonic Cancer Center at the University of Minnesota. **COI DISCLOSURE:** A.I.N. and F.Y. receive royalties from the University of Michigan for the sale of MSFragger, IonQuant, and diaTracer software licenses to commercial entities. All license transactions are managed by the University of Michigan Innovation Partnerships office, and all proceeds are subject to university technology transfer policy. Other authors declare no other competing interests.