# MixMHC2pred

MixMHC2pred is a pan-allele predictor of MHC class II ligands and epitopes. It is described in: Racle, J., et al., Machine learning predictions of MHC-II specificities reveal alternative binding mode of class II epitopes. *bioRxiv* (2022) (available here).

and

Racle, J., et al. Robust prediction of HLA class II epitopes by deep motif deconvolution of immunopeptidomes. *Nat. Biotechnol.* 37, 1283–1286 (2019) (available here).

MixMHC2pred is also available as a web application: http://mixmhc2pred.gfellerlab.org.

## Installation

- 1. Download MixMHC2pred-2.0.zip file and move it to a directory of your choice, where you have writing permissions.
- 2. Unzip MixMHC2pred-2.0.zip in this directory.
- 3. To test your installation, make sure you are in *MixMHC2pred-2.0* directory and run the following command, depending on your operating system:
  - Mac OS: ./MixMHC2pred -i test/testData.txt -o test/out.txt -a DRB1\_15\_01
     DRB5\_01\_01 DPA1\_02\_01\_\_DPB1\_01\_01 DQA1\_01\_02\_\_DQB1\_05\_01
     DQA1\_01\_02\_\_DQB1\_06\_02
  - Unix: ./MixMHC2pred\_unix -i test/testData.txt -o test/out.txt -a
     DRB1\_15\_01 DRB5\_01\_01 DPA1\_02\_01\_\_DPB1\_01\_01 DQA1\_01\_02\_\_DQB1\_05\_01
     DQA1\_01\_02\_\_DQB1\_06\_02
  - Windows: MixMHC2pred.exe -i test/testData.txt -o test/out.txt -a
     DRB1\_15\_01 DRB5\_01\_01 DPA1\_02\_01\_DPB1\_01\_01 DQA1\_01\_02\_DQB1\_05\_01
     DQA1\_01\_02\_DQB1\_06\_02

Your file *test/out.txt* should be the same as *test/out\_compare.txt*. Running the software takes few seconds or more when testing lots of peptides and alleles.

The *testData.txt* file corresponds to a subset of the HLA-II peptidomics data obtained from the cell line *DOHH2* in Dheilly et al., *Cancer Cell* (2020), containing some peptides bound to the HLA in the reverse direction.

4. (Optional) To run MixMHC2pred from anywhere on your computer, make an alias of MixMHC2pred executable (see above for which one depending on operating system) or add it in your path.

If using a non-standard OS, it is possible to compile MixMHC2pred using the Makefile found in the bin folder.

## Running

#### Command

MixMHC2pred -i input\_file -o output\_file -a allele1 allele2 [additional options]

- Depending on your operating system, use MixMHC2pred, MixMHC2pred\_unix or MixMHC2pred.exe as indicated in the installation instructions.
- Do not use spaces in your file or directory names.
- Do not use other special characters (e.g., \*, ?, %, &,...) in file or directory names.

## Required arguments

- Input file (command -i <file> or --input <file>):

  File listing all the peptides. It should contain two columns: the 1st column being the sequence of the peptide and 2nd column beeing its context sequence (12 amino acids long: 3 residues upstream of the peptide, 3 N-terminal residues of the peptide and 3 residues downstream of the peptide). When the peptide lies near the begin or end of a protein, the corresponding context AAs should be written as "-", i.e. for the protein ACDEFG... if the peptide is CDEFG... the first 6

  AA encoding its context should be written as --ACDE (and these 6 AAs should be directly followed by the 6 AAs describing the context near the C-terminal of the peptide). Also, if some AAs from the context of a peptide are not known, the unknown AAs should be written with the letter X. See test/testData.txt for an example of input file. When using the no\_context option (see below), then this input file should only contain the list of the peptides, without any 2nd column of the context (an example input file without in such a case is available at test/testData\_noContext.txt).
- Output file (command -o <file> or --output <file>):
   The name of the output file (including the directory). Peptides are kept in the same order than in the input file.
- Alleles (command: -a <alleles> or --alleles <alleles>):
   List of HLA-II alleles to test. Use the nomenclature DRB1\_03\_01 for HLA-DRB1\*03:01 and DPA1\_01\_03\_DPB1\_04\_01 for HLA-DPA1\*01:03-DPB1\*04:01. The full list of alleles available and corresponding nomenclature is given in the file Alleles\_list.txt.

   If you want to make predictions with multiple alleles, list the different alleles separated by a space (e.g. a DRB1\_11\_01 DRB3\_02\_02).

### Optional arguments

#### • --no context:

In principle, MixMHC2pred includes the peptide context for its predictions (i.e. corresponding to a sequence of 12 AAs in total, including AAs just before and just after the peptide as explained above). It is nevertheless possible to decide to not consider any context information at all, when using this option. It is generally advised to include the context, in order to search for best candidate epitopes. But if analyzing a posteriori pre-cleaved peptide sequences (e.g. in experiments testing specific peptides directly, that therefore did not need to be cleaved by the cell), it may be a good to not consider the context encoding (often multiple overlapping epitopes are observed, so the peptide tested may not correspond to the best peptide based on context but it could still be recognized by the same T cells when given directly). When using this ——no\_context option, then the input file should only contain the

list of peptides, without their context. An example input file is available at *test/testData\_noContext.txt*; results of running MixMHC2pred without the context on this file, based on the same alleles as the first example above is given in *test/out\_noContext\_compare.txt*.

#### Results returned and additional information

- MixMHC2pred is meant for scoring different peptides and prioritising the most likely HLA-II ligands and epitopes. As it is trained on naturally presented peptides, it does not output a predicted affinity value, simply a score.
- Input should consist in a list of peptides, not proteins. Currently, MixMHC2pred is not cutting longer peptides/proteins into shorter fragments but use the peptides given in input as is.
- The score is computed for each allele provided in input. Results are returned for each allele in separate columns and additional columns give the results from the best allele for each peptide (columns BestAllele and ...\_best in the output file, determined by the allele that had the best score, i.e. the most likely allele by which the peptide would be presented).
- The two first columns of the output file give the *Peptide* and *Context* sequence of the peptide, which were given in the input file. When the option —no\_context is used, the column *Context* is kept but it is empty.
- The scores returned (columns %Rank) correspond to a percentile rank (best score is about 0, worst score is 100). This tells among random peptides, the percent of peptides expected to be better presented by this allele than the given peptide.
- The *CoreP1*... columns tell what is the most likely binding core position for the given peptide towards the allele (this tells the position of the first amino acid from the binding core (which has a size of 9 aa in the predictions), starting at a value of 1 (i.e. if binding core corresponds to the 9 first amino acids from the peptide, this *CoreP1* = 1)).
- For convenience, the binding core sequence is also indicated for the best allele per peptide (column *Core\_best*, for the other alleles this can be obtained from the *CoreP1* as indicated above).
- The *subSpec\_...* columns tell in which sub-specificity the given peptide is likely bound toward the given allele. The value 1 corresponds to the main sub-specificity (the only one for most alleles). But for example for *DRB1\*08:01* allele a 2nd sub-specificity exists and is indicated by the value 2. For alleles accomodating reverse binding, a value of -1 indicates that the given peptide is bound in the reverse orientation.
- Peptides shorter than 12 amino acids, longer than 21 amino acids or containing non-standard amino acids are kept but with a score of "NA".
- The list of alleles available is provided in *Alleles\_list.txt* showing the IPD-IMGT/HLA nomenclature and the corresponding nomenclature to use when running MixMHC2pred.

### Latest version

Latest version of MixMHC2pred is available at https://github.com/GfellerLab/MixMHC2pred.

Check the file NEWS to see the main changes of the given version.

## Web application

MixMHC2pred is also available as a web application at http://mixmhc2pred.gfellerlab.org.

## License

MixMHC2pred can be used freely by academic groups for non-commercial purposes (see license). The product is provided free of charge, and, therefore, on an "as is" basis, without warranty of any kind.

**FOR-PROFIT USERS**: If you plan to use MixMHC2pred (version 2.0) or any data provided with the script in any for-profit application, you are required to obtain a separate license. To do so, please contact nbulgin@lcr.org at the Ludwig Institute for Cancer Research Ltd.

## Contact information

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For license-related questions, please contact Nadette Bulgin (nbulgin@lcr.org).

## How to cite

To cite MixMHC2pred, please refer to:

Racle, J., et al., Machine learning predictions of MHC-II specificities reveal alternative binding mode of class II epitopes. *bioRxiv* (2022) (available here).

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