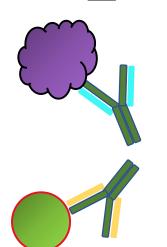




tools.iedb.org



# **B Cell Epitope Prediction**

#### Presented by

Mahita Jarjapu, PhD, Bioinformatics Postdoctoral Fellow



# Outline of this presentation:

- B cell receptor (BCR) antigen interactions: a brief introduction
- 2. B cell epitope prediction methods in the IEDB
  - A. Linear sequence-based prediction methods
  - B. Methods for predicting discontinuous epitopes

# Outline of this presentation:

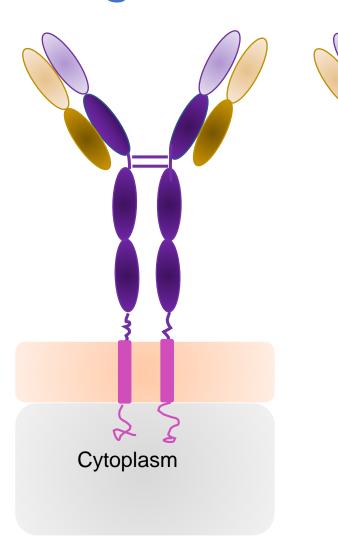
- 1. B cell receptor (BCR) antigen interactions: a brief introduction
- 2. B cell epitope prediction methods in the IEDB
  - A. Linear sequence-based prediction methods
  - B. Methods for predicting discontinuous epitopes

BCR – present on surface of B cells

Attached to B cells via transmembrane domain

Antibodies – secreted forms of BCRs

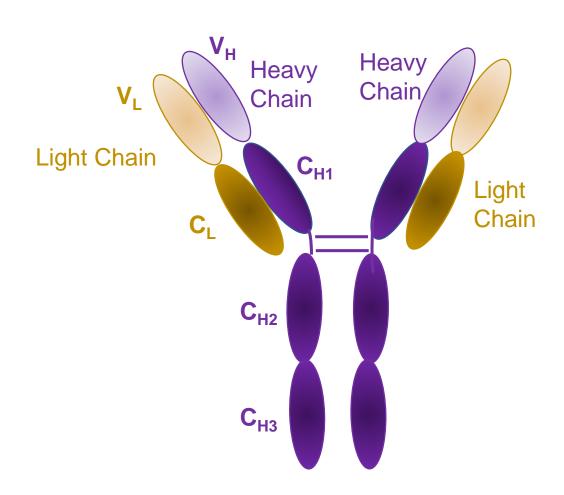
B-Cell plasma membrane





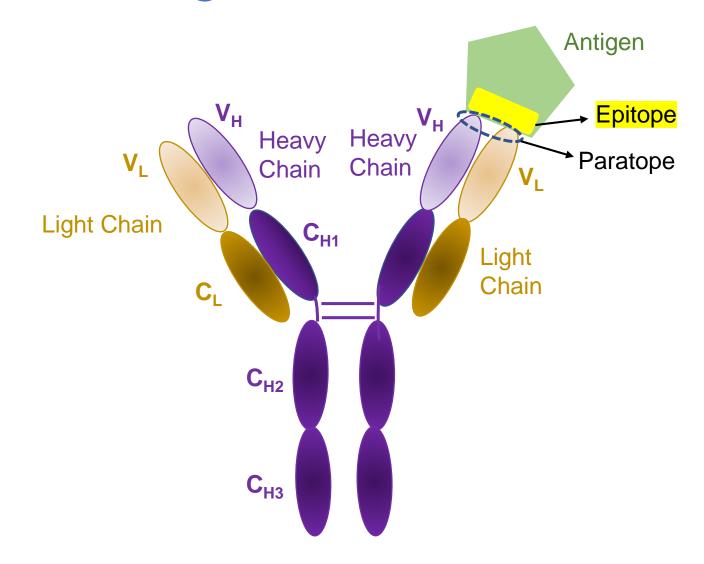
#### **Structure of BCR/antibody:**

- 1. Y-shaped molecule, consists of 2 heavy chains and light chains
- 2. Each heavy chain is paired to a light chain
- 3. Heavy chain contains 1 variable domain (V<sub>H</sub>) and multiple constant domains (C<sub>H</sub>)
- 4. Light chain contains 1 variable domain (V<sub>L</sub>) and one constant domain (C<sub>L</sub>)



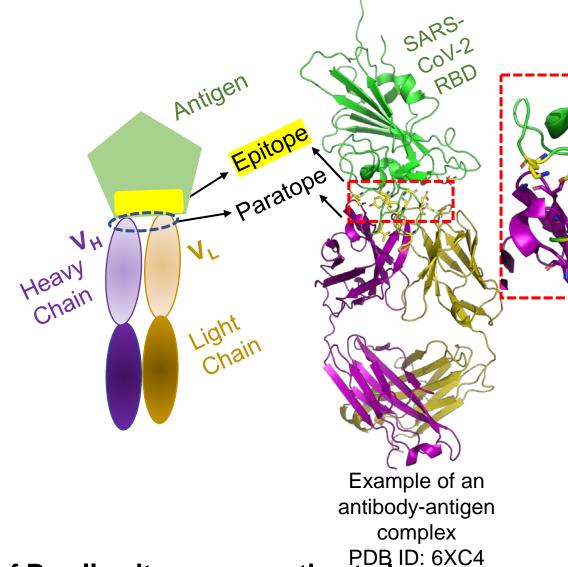
#### **BCR Interactions with Antigen:**

- Variable domains of heavy and light chains interact with antigen
- BCR epitope: Site on the antigen to which the BCR binds
- 3. BCR paratope: Site on the antibody that interacts with antigen



# **Linear and Discontinuous Epitopes**

- **1. Linear Epitope**: Epitope formed by a continuous stretch/sequence of amino acid residues
- 2. Discontinuous or Conformational Epitope: Epitope formed by residues that are close together on the 3D structure but are non-sequential

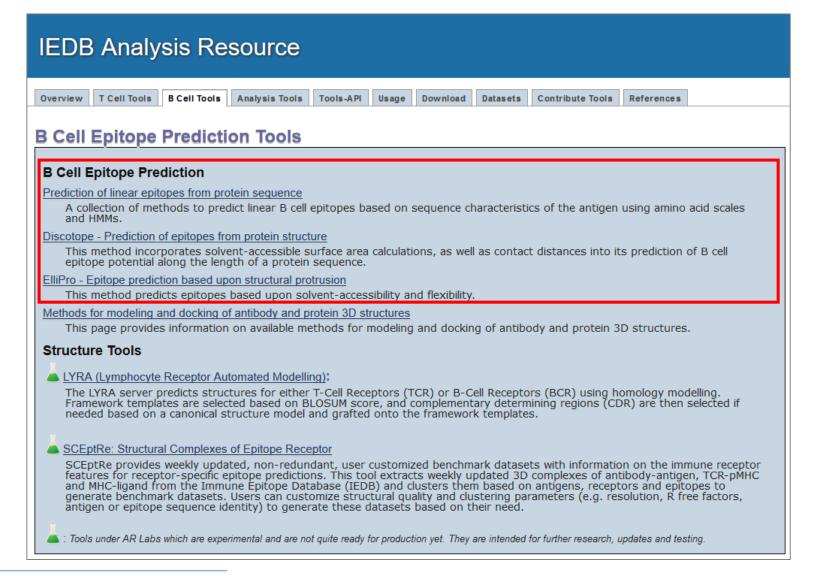


Example of a discontinuous epitope

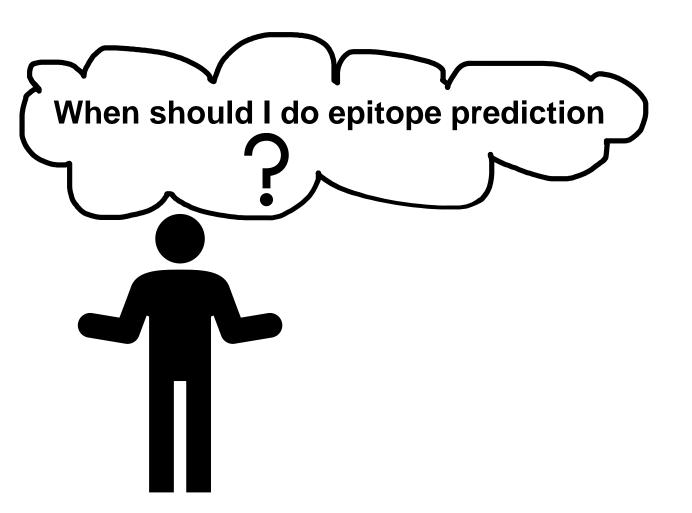
More then 90% of B cell epitopes are estimated to be discontinuous

# Outline of this presentation:

- B cell receptor (BCR) antigen interactions: a brief introduction
- 2. B cell epitope prediction methods in the IEDB
  - A. Linear sequence-based prediction methods
  - B. Methods for predicting discontinuous epitopes

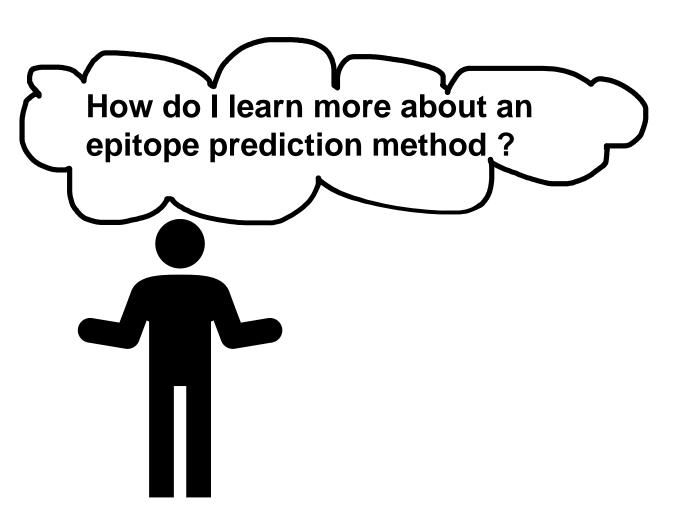


- 1. Go to <a href="http://tools.iedb.org/main/bcell/">http://tools.iedb.org/main/bcell/</a>
- 2. Page provides an overview of B cell epitope prediction methods

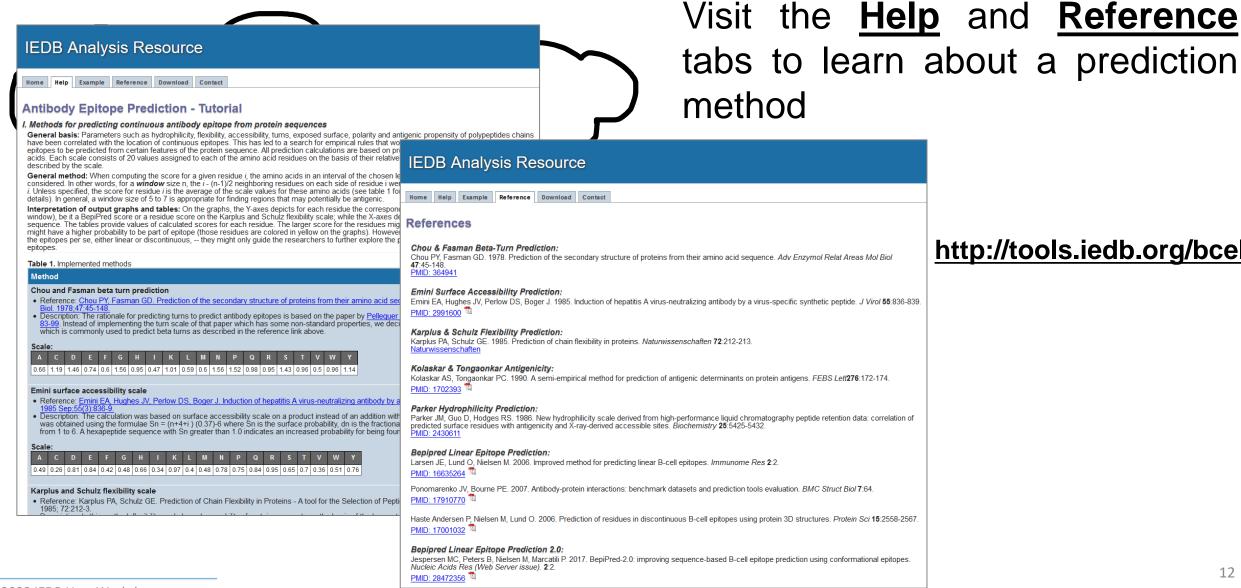


You have verified thoroughly that no information is available in the IEDB on the antigen of your interest

You want to know all the candidate antigenic determinants in an antigen of your interest other than epitopes provided in the IEDB



Visit the <u>Help</u> and <u>Reference</u> tabs to learn about a prediction method



http://tools.iedb.org/bcell/

# Outline of this presentation:

- B cell receptor (BCR) antigen interactions: a brief introduction
- 2. B cell epitope prediction methods in the IEDB
  - A. Linear sequence-based prediction methods
  - B. Methods for predicting discontinuous epitopes

#### **Linear/Continuous Epitope Prediction Methods**

Some amino acid features are correlated with location of continuous epitopes

These methods take advantage of this fact to predict if an amino acid on an antigen is part of a continuous epitope

Flexibility

Hydrophilicity

**Amino acid features** 

Beta Turn

**Antigenic Propensity** 

Surface Accessibility

#### **Linear/Continuous Epitope Prediction Methods**

Some amino acid features are correlated with location of continuous epitopes

These methods take advantage of this fact to predict if an amino acid on an antigen is part of a continuous

epitope

Flexibility

**Karplus and Schulz Flexibility Scale** 

Hydrophilicity

**Parker Hydrophilicity Prediction** 

Methods based on physicochemical properties of amino acids in protein sequences

Beta Turn

**Chou and Fasman Beta-Turn Predictor** 

**Antigenic Propensity** 

Surface Accessibility

Kolaskar and Tongaonkar Antigenicity Scale

**Emini Surface Accessibility Scale** 

#### **Linear/Continuous Epitope Prediction Methods**

Some amino acid features are correlated with location of continuous epitopes

These methods take advantage of this fact to predict if an amino acid on an antigen is part of a continuous epitope

#### Bepipred-1.0

Uses Hidden
Markov Models and
propensity scale to
predict location of
linear B cell epitope

Methods based on physicochemical properties of amino acids in protein sequences

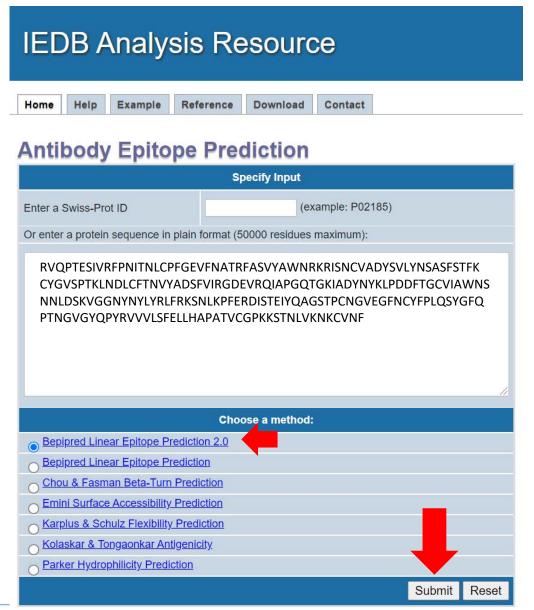
AND

machine learning

#### Bepipred-2.0

Uses Random
Forest algorithm
trained on
experimentallyverified epitopes
and non-epitopes

### Linear/Continuous Epitope Prediction Method - An Example



Let us now try to predict linear epitopes on an antigen using one of the methods

- 1. Go to http://tools.iedb.org/bcell/
- 2. Enter in an antigen protein sequence using either its Swiss-Prot ID or manually into the text box provided

#### **Example Sequence:**

RBD region from SARS-Cov-2 Spike glycoprotein

Swiss-Prot ID: P0DTC2

- 3. Select any one of the prediction methods
- 4. Click "Submit"

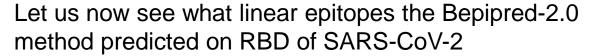
### Linear/Continuous Epitope Prediction Method - An Example

#### http://tools.iedb.org/bcell/

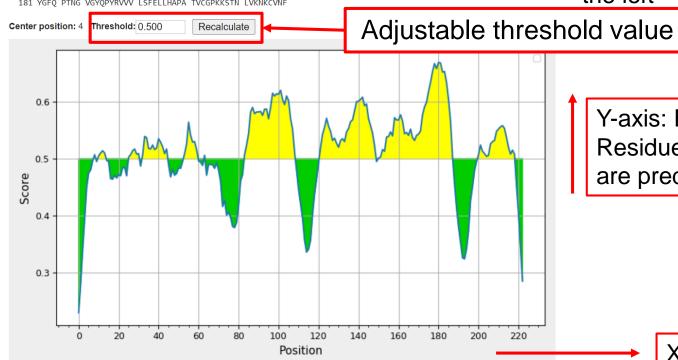
#### **Bepipred Linear Epitope Prediction 2.0 Results**

#### Input Sequences

- 1 RVOPTESIVR FPNITNLCPF GEVFNATRFA SVYAWNRKRI SNCVADYSVL YNSASFSTFK
- 61 CYGVSPTK LNDLCFTNVY ADSFVIRGDE VROIAPGOTG KIADYNYKLP DDFTGCVIAW
- 121 NS NNLDSK VGGNYNYLYR LFRKSNLKPF ERDISTEIYQ AGSTPCNGVE GFNCYFPLQS



After submitting the sequence, it returns a graph shown on the left



Y-axis: Bepipred-2.0 score for each residue number Residue numbers having scores above a threshold value are predicted to be epitope residues

X-axis: Residue numbers of RBD protein sequence

Average: 0.511 Minimum: 0.230 Maximum: 0.669

Average score of a protein chosen as a threshold by default

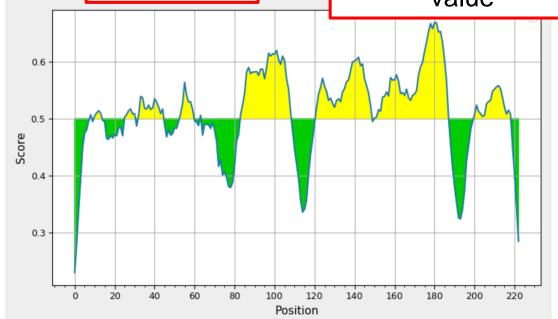
### Linear/Continuous Epitope Prediction Method - An Example

#### http://tools.iedb.org/bcell/

#### **Bepipred Linear Epitope Prediction 2.0 Results**

#### **Input Sequences**





Average: 0.511 Minimum: 0.230 Maximum: 0.669

Average score of a protein chosen as a threshold by default

#### Predicted peptides:

No. <b>♦</b>	Start 🔷	End 🔷	Peptide	Length 🔷
1	9	9	V	1
2	11	14	FPNI	4
3	26	31	ATRFAS	6
4	33	45	YAWNRKRISNCVA	13
5	54	60	ASFSTFK	7
6	64	64	V	1
7	84	109	IRGDEVRQIAPGQTGKIADYNYKLPD	26
8	122	149	NLDSKVGGNYNYLYRLFRKSNLKPFERD	28
9	151	188	STEIYQAGSTPCNGVEGFNCYFPLQSYGFQPTNGVGYQ	38
10	201	219	HAPATVCGPKKSTNLVKNK	19

Results: a table of predicted linear epitopes, their starting and ending positions, and length

#### Predicted residue scores:

Position 🔷	Residue 🔷	Score 🔷	Assignment
0	R	0.230	
1	v	0.280	
2	Q	0.339	
3	Р	0.394	
4	Т	0.449	
5	Е	0.475	
6	S	0.480	
7	I	0.496	
8	v	0.507	E
9	R	0.495	
10	F	0.505	E
11	Р	0.510	E
12	N	0.514	Е
13	I	0.510	E
14	Т	0.497	
15	N	0.495	
16	L	0.465	
17	С	0.464	
18	Р	0.471	
19	F	0.466	

Results: a table of residues and their predicted scores "E" = epitope

### Do multiple methods give the same predictions?

Let us check! As an example, we will compare predictions made on the RBD of SARS-CoV-2

#### Chou & Fasman Beta-Turn Prediction Results Input Sequences 1 RVQPTESIVR FPNITNLCPF GEVFNATRFA SVYAWNRKRI SNCVADYSVL YNSASFSTFK Karplus & Schulz Flexibility Prediction Results 61 CYGVSPTK LNDLCFTNVY ADSFVIRGDE VROIAPGOTG KIADYNYKLP DDFTGCVIAW Bepipred Linear Epitope Prediction 2.0 Results 121 NS NNLDSK VGGNYNYLYR LFRKSNLKPF ERDISTEIYQ AGSTPCNGVE GFNCYFPLQS 181 YGFQ PTNG VGYQPYRVVV LSFELLHAPA TVCGPKKSTN LVKNKCVNF Input Sequences Input Sequences 1 RVQPTESIVR FPNITNLCPF GEVFNATRFA SVYAWNRKRI SNCVADYSVL YNSASFSTFK 1 RVOPTESIVR FPNITNLCPF GEVFNATRFA SVYAMNRKRI SNCVADYSVL YNSASFSTFK Center position: 4 Window size: 7 Threshold: 1,039 Recalculate 61 CYGVSPTK LNDLCFTNVY ADSFVIRGDE VROIAPGOTG KIADYNYKLP DDFTGCVIAW 61 CYGVSPTK LNDLCFTNVY ADSFVIRGDE VROIAPGOTG KIADYNYKLP DDFTGCVIAN 121 NS NNLDSK VGGNYNYLYR LFRKSNLKPF ERDISTEIYQ AGSTPCNGVE GFNCYFPLQS 121 NS NNLDSK VGGNYNYLYR LFRKSNLKPF ERDISTEIYQ AGSTPCNGVE GFNCYFPLQS 181 YGFQ PTNG VGYQPYRVVV LSFELLHAPA TVCGPKKSTN LVKNKCVNF 181 YGFQ PTNG VGYQPYRVVV LSFELLHAPA TVCGPKKSTN LVKNKCVNF Center position: 4 Threshold: 0,500 Recalculate Center position: 4 Window size: 7 Threshold: 0.992 1.3 1.05 1.00 0.3 100 120 140 160 180 200 0.90 Position 120 140 160 180 200 120 220 Average: 0.511 Minimum: 0.230 Maximum: 0.669 200

It is better to use a **consensus** of different methods rather than relying on a single method

Average: 0.992 Minimum: 0.896 Maximum: 1.112

Position

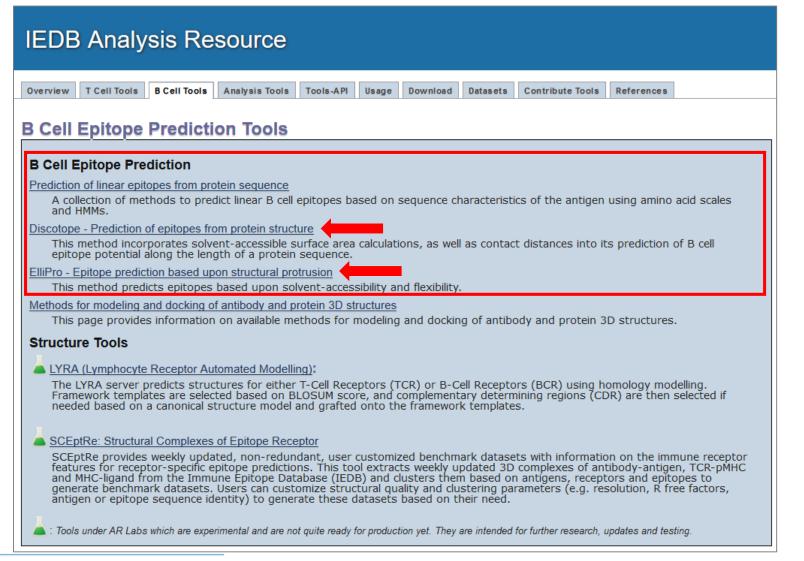
Average: 1.039 Minimum: 0.694 Maximum: 1.397

Position

# Outline of this presentation:

- B cell receptor (BCR) antigen interactions: a brief introduction
- 2. B cell epitope prediction methods in the IEDB
  - A. Linear sequence-based prediction methods
  - B. Methods for predicting discontinuous epitopes

#### Discontinuous/Conformational Epitope Prediction Methods



http://tools.iedb.org/main/bcell/

DiscoTope

ElliPro

#### Discontinuous/Conformational Epitope Prediction Methods

**Version 1**: Takes into account **statistics**, **spatial location** and **surface accessibility of amino acids** in protein structures to predict epitope residues

Protein Sci. 2006 Nov;15(11):2558-67. Epub 2006 Sep 25.

Prediction of residues in discontinuous B-cell epitopes using protein 3D structures.

Haste Andersen P<sup>1</sup>, Nielsen M, Lund O.

PMID: 17001032 PMCID: PMC2242418 DOI: 10.1110/ps.062405906

Logic: Discontinuous epitopes are present on protein surface.

Certain amino acids are found more on the surface.

Residues that are far apart in sequence may be close to one another in the 3D structure and could be part of the epitope

#### Discontinuous/Conformational Epitope Prediction Methods

**Version 1**: Takes into account **statistics**, **spatial location** and **surface accessibility of amino acids** in protein structures to predict epitope residues

### DiscoTope

Protein Sci. 2006 Nov;15(11):2558-67. Epub 2006 Sep 25.

Prediction of residues in discontinuous B-cell epitopes using protein 3D structures.

Haste Andersen P1, Nielsen M, Lund O.

PMID: 17001032 PMCID: PMC2242418 DOI: 10.1110/ps.062405906

**Version 2**: Improved over version 1 Takes into account multiple epitopes on an antigen

Assigns a score for each residue Score = linear combination of normalized values PLoS Comput Biol. 2012;8(12):e1002829. doi: 10.1371/journal.pcbi.1002829. Epub 2012 Dec 27.

Reliable B cell epitope predictions: impacts of method development and improved benchmarking.

Kringelum JV<sup>1</sup>, Lundegaard C, Lund O, Nielsen M.

PMID: 23300419 PMCID: PMC3531324 DOI: 10.1371/journal.pcbi.1002829

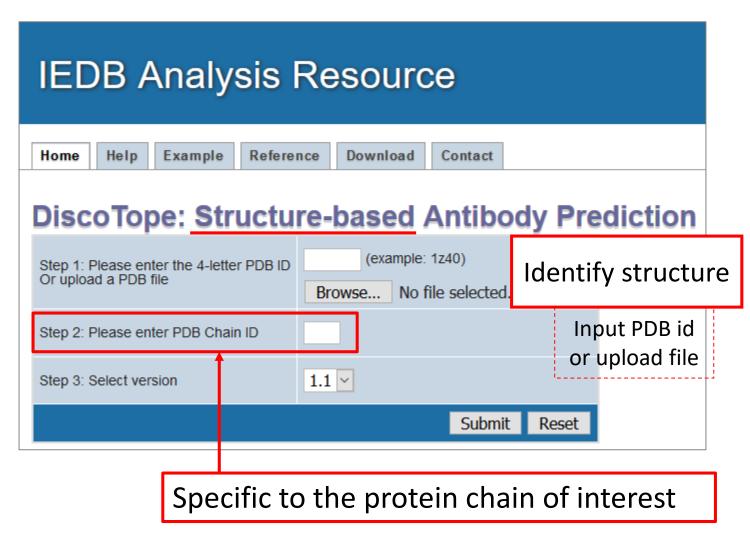
Parker's hydrophilicity scale

Amino acid occurrence

Number of contacts within 10Å

Area of relative solvent accessibility

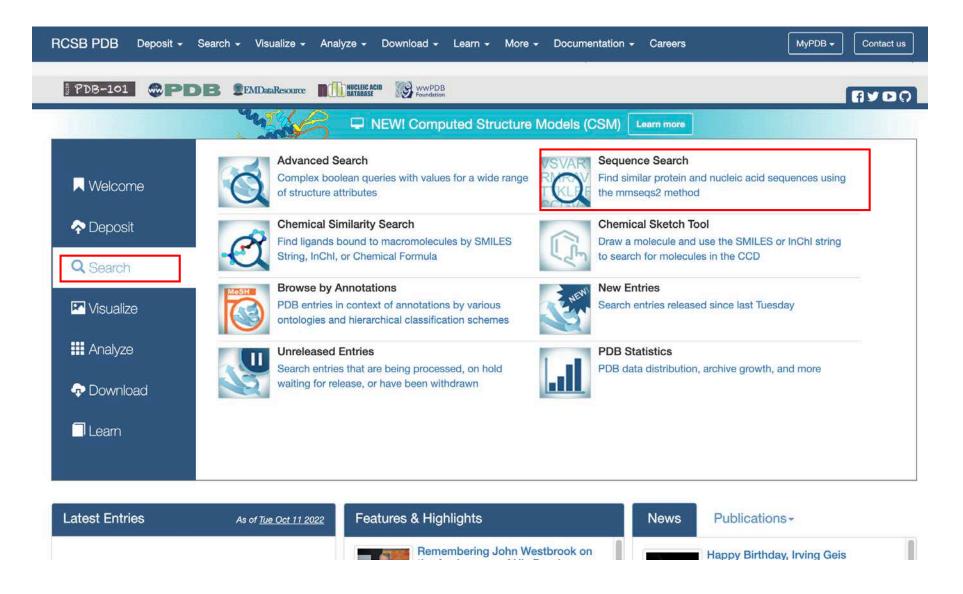
Using DiscoTope to Predict Discontinuous Epitopes



- 1.Go to <a href="http://tools.iedb.org/discotope/">http://tools.iedb.org/discotope/</a>
- 2. Provide a 3D structure of the antigen by:

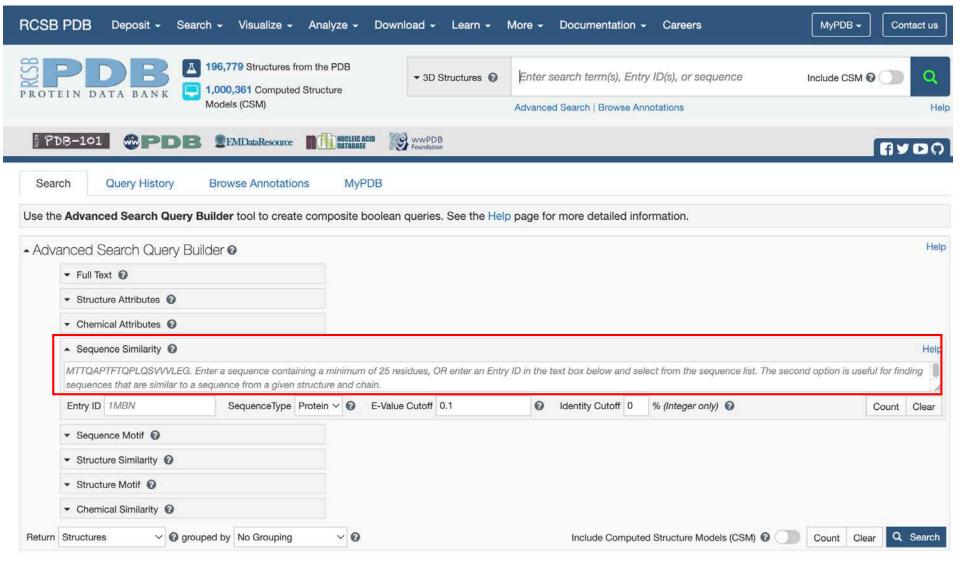
Using its PDB ID
OR
Uploading the PDB file

3. PDB structures have multiple chains. Choose a chain of interest by specifying its chain ID.

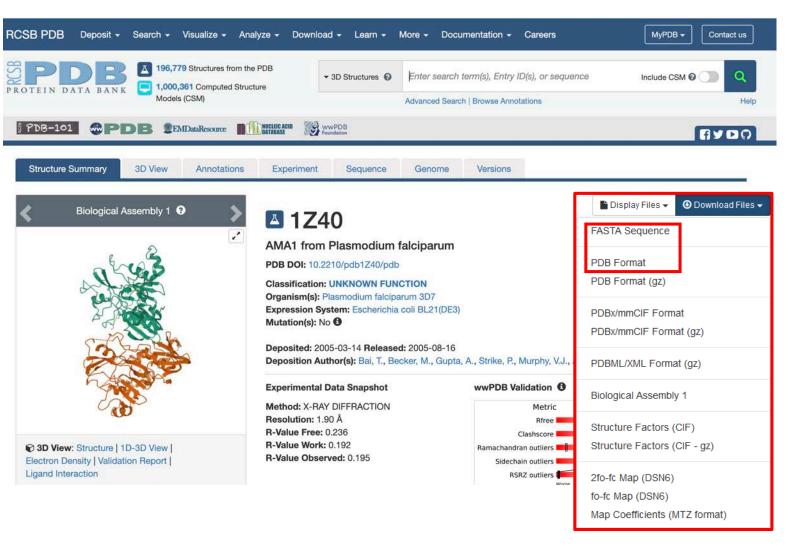


- 1. Go to <a href="http://www.rcsb.org/">http://www.rcsb.org/</a>
- 2. Click on "Search" on the left-hand side
- 3. Click on "Sequence Search"

27



- **4.** Paste the sequence of your protein antigen for which you want to predict epitopes and then click on "Search" in the bottom right corner of the page.
- **5.** We will enter in the sequence of the AMA1 protein from *Plasmodium falciparum*

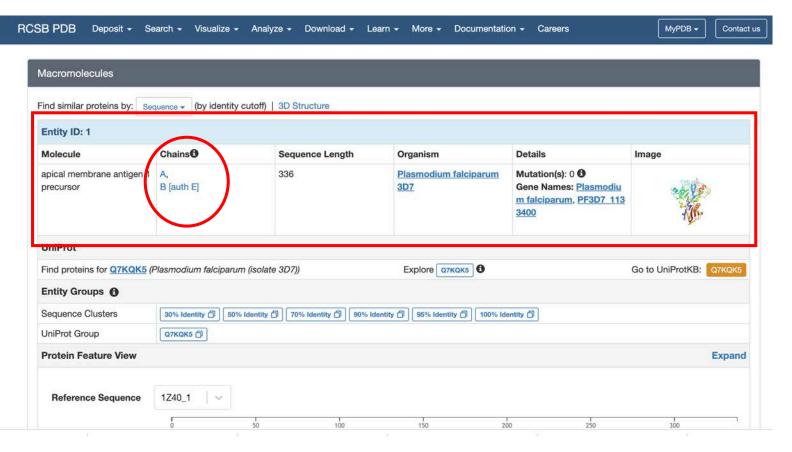


**6.** It will take us to a page containing details of the structure of the AMA1 protein

PDB ID: 1Z40

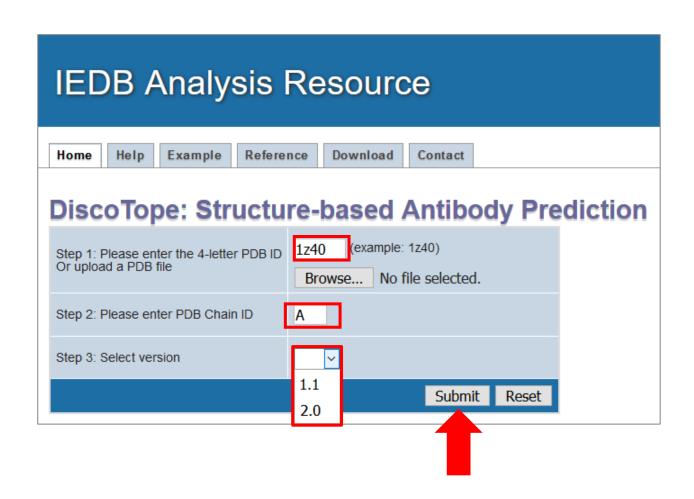
The structure file can be downloaded in PDB format by clicking on "Download Files" and selecting "PDB Format" from the dropdown menu

- **7.** We will choose this PDB ID to predict discontinuous epitopes on the AMA1 protein using Discotope
- **8.** Scrolling down this page will give us information about Chain Ids in the AMA1 protein structure



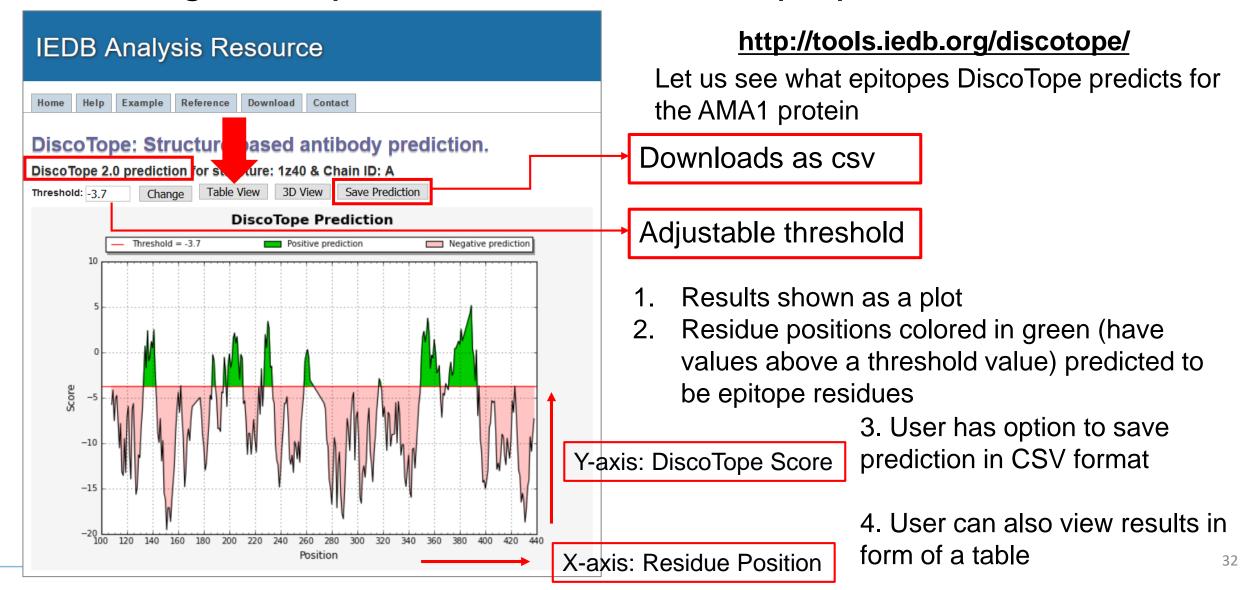
- **9.** There are two units of the AMA1 protein in the crystal structure, one with chain id 'A' and the other with 'B/E"
- 10. We need to select only one chain ID

#### Using DiscoTope to Predict Discontinuous Epitopes in AMA1 Protein



- 1. Enter in the PDB ID of AMA1 protein (1z40) and the chain ID ('A')
- **2.** Select the version of DiscoTope (1.1 or 2.0)
- 3. Click 'Submit'

Using DiscoTope to Predict Discontinuous Epitopes in AMA1 Protein



#### Using DiscoTope to Predict Discontinuous Epitopes in AMA1 Protein



#### http://tools.iedb.org/discotope/

- 1. Table view of DiscoTope predictions
- 2. DiscoTope scores for each residue
- 3. Residues predicted to be epitope residues (positive predictions) highlighted in green
- 4. User has option to view epitope residues on 3D structure by clicking on '3D View'

#### Discontinuous/Conformational Epitope Prediction Methods



Predicts linear and discontinuous antibody epitopes based the geometrical properties of protein structure

Uses Thornton's Method

Performs the following steps to estimate a score for each predicted epitope:

- i. Protein shape approximated by multiple ellipsoids
- ii. Residue protrusion index (PI) calculated for each ellipsoid PI = 0.8: 80% of protein residues included in the ellipsoid, 20% outside the ellipsoid
- iii. Clustering of neighboring residues based on PI values

BMC Bioinformatics. 2008 Dec 2;9:514. doi: 10.1186/1471-2105-9-514.

ElliPro: a new structure-based tool for the prediction of antibody epitopes.

Ponomarenko J<sup>1</sup>, Bui HH, Li W, Fusseder N, Bourne PE, Sette A, Peters B.

PMID: 19055730 PMCID: PMC2607291 DOI: 10.1186/1471-2105-9-514

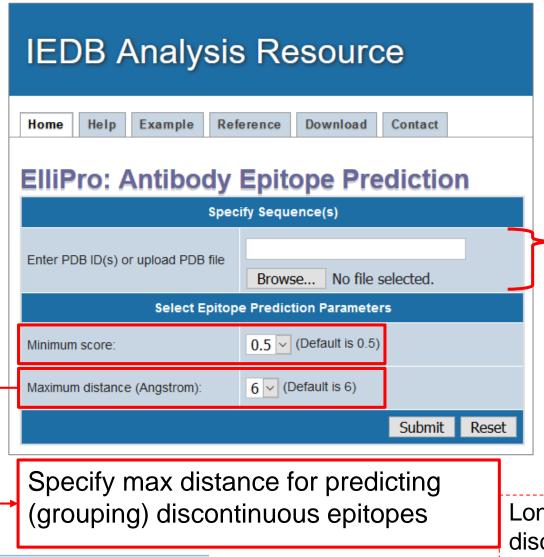
EMBO J. 1986 Feb;5(2):409-13

Location of 'continuous' antigenic determinants in the protruding regions of proteins.

Thornton JM, Edwards MS, Taylor WR, Barlow DJ.

PMID: 2423325 PMCID: PMC1166746

#### Using ElliPro to Predict Discontinuous Epitopes



- 1. Go to http://tools.iedb.org/ellipro/
- 2. Enter the PDB ID or upload PDB file of protein of interest

#### Identify structure

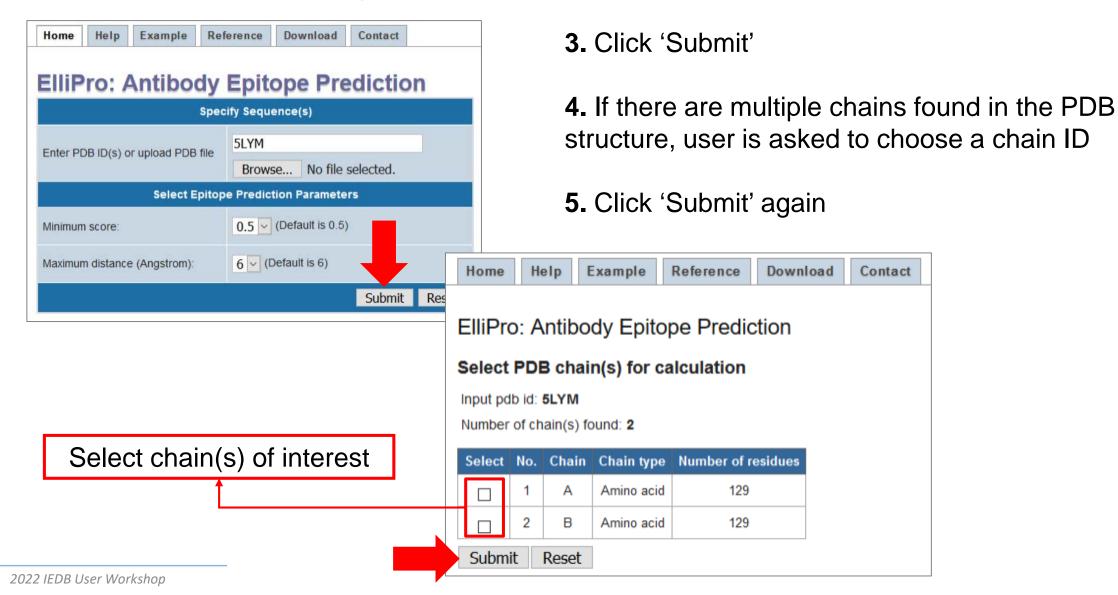
Input PDB id or upload file

#### Select min. PI value

- Averaged over epitope residues
- Higher scores predict fewer epitopes

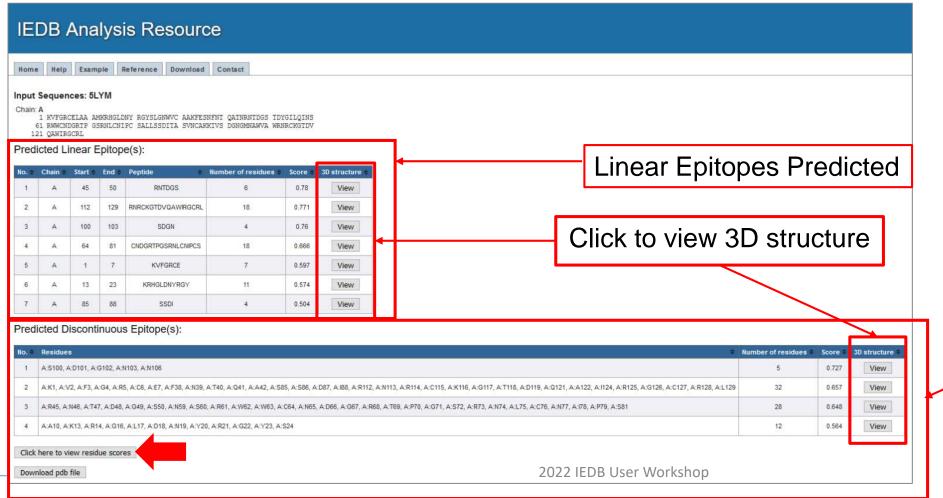
Longer distances predict discontinuous epitopes spanning larger regions

#### Using ElliPro to Predict Discontinuous Epitopes



#### Using ElliPro to Predict Discontinuous Epitopes

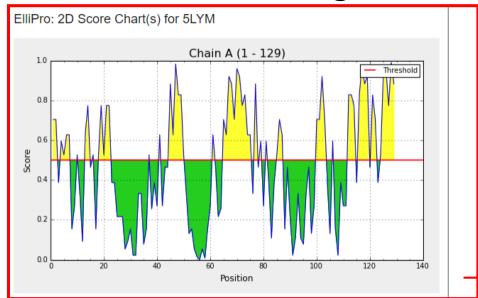
ElliPro predicts both linear and discontinuous epitopes



For each predicted epitope, ElliPro provides a score

Discontinuous Epitopes Predicted

#### Using ElliPro to Predict Discontinuous Epitopes



Graph View of Per-Residue Scores

Y-axis: ElliPro score Residues having ElliPro score above a threshold are predicted to be epitope residues

X-axis: Residue Position

Data table

No.	Chain	Residue number	Residue name	Score
1	Α	1	LYS	0.705
2	Α	2	VAL	0.705
3	Α	3	PHE	0.388
4	Α	4	GLY	0.597
5	Α	5	ARG	0.527
6	Α	6	CYS	0.628
7	Α	7	GLU	0.628
8	Α	8	LEU	0.155
9	Α	9	ALA	0.271
10	Α	10	ALA	0.527
11	Α	11	ALA	0.333
12	Α	12	MET	0.093
13	Α	13	LYS	0.628
14	Α	14	ARG	0.775
15	Α	15	HIS	0.465
16	Α	16	GLY	0.527
47		47	1511	0.455

Table View

Linear and discontinuous (conformational) epitopes can be overlapping, depending on method of discovery

Traditional B cell epitope prediction methods largely predict surface accessibility

If a 3D structure of the antigen is available (or a reliable model thereof), predictions can be further improved.

# **Thank You!**