



CSCI 474/597K  
Bioinformatics

Filip Jagodzinski

# Announcement

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## Article 3 Summaries/Critiques

- Engelman A, Englund G, Orenstein JM, Martin MA, and Craigie R. Multiple effects of mutations in human immunodeficiency virus type 1 integrase on viral replication. *Journal of Virology*, 1995 May; Volume 69, pgs 2729–2736.
- Edgar RC. MUSCLE: multiple sequence alignment with high accuracy and high throughput. *Nucleic Acids Research*, 2004 Mar; Volume 19, pgs 1792-1797.
- Reva B, Antipin Y, and Sander C. Predicting the functional impact of protein mutations: application to cancer genomics. *Nucleic Acids Research*, 2011 Sep; Volume 39, pgs 1-14.
- Thompson JD, Higgins DG, and Gibson TJ. CLUSTAL W: improving the sensitivity of progressive multiple sequence alignment through sequence weighting, position-specific gap penalties and weight matrix choice. *Nucleic Acids Research*, 1994 Nov; Volume 11, pgs 4673-80.

Pick one of these publications, and write a summary and critique.

Write a summary and critique that is easily digestible by somebody who has NOT read the article. Still focusing on the WHAT, WHY, and HOW

You'll be asked to assess your peer's summaries and critiques

# Course “Summary”

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DNA sequence alignment, scoring, etc.  
Protein Sequence and Structure  
Analysis of Structure (mutations)  
Simulation of Motion

**Course Design : learn by doing**

# Course Project

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## Course Project

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- Proposal Presentation
- Proof of Concept
- Initial Results
- Final Presentation
- Peer Assessment
- Final Report

# Course Project

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- **Proposal Presentation**
- Proof of Concept
- Initial Results
- Final Presentation
- Peer Assessment
- Final Report

**Submitted via Canvas  
Due 15 May**

- Slide 1 : Title
- Slide 2 : Introduction (WHAT)
- Slide 3 : Motivation (WHY)
- Slide 4 : Methods (HOW)
- Slide 5 : Expected Obstacles (these most likely will change ONCE you begin)
- You must mention at least 2 references

**This step will require you to do a quick literature search to better understand what has been done previously and/or the tool(s) or method(s) that you'll be using**

# Course Project

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- Proposal Presentation
- **Proof of Concept**
- Initial Results
- Final Presentation
- Peer Assessment
- Final Report

**Submission Via Canvas**  
**Due 22 May**  
**short report (1 page)**

- Mention data found/used
- Method(s) being tested/used ... should have been able to implement

## Course Project

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- Proposal Presentation
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## Course Project

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- Proposal Presentation
- **Proof of Concept**
- Initial Results
- Final Presentation
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**Submission Via Canvas**  
**Due 22 May**  
**short report (1 page)**

- Mention data found/used
- Method(s) being tested/used ... should have been able to implement

**This step will require you to do a quick literature search to better understand what has been done previously and/or the tool(s) or method(s) that you'll be using**

**Highly recommended : different people take on different roles ... implement, assess, write, etc. ... everybody should NOT be doing everything, but likewise don't do things in isolation**

# Course Project

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- Proposal Presentation
- Proof of Concept
- Initial Results
- Final Presentation
- Peer Assessment
- Final Report

**Submission Via Canvas**  
**Due 29 May**  
**short report (1 page)**

- Discuss initial results
- Expected Obstacles / Obstacles Encountered
- Next steps

## Course Project

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- Proposal Presentation
- Proof of Concept
- Initial Results
- **Final Presentation**
- Peer Assessment
- Final Report

**Due last week of classes**  
**Submission .pptx or .pdf via canvas**

- Zoom presentations : 5 minutes
- Introduction
- Motivation
- Methods
- Results
- Discussion

# Course Project

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- Proposal Presentation
- Proof of Concept
- Initial Results
- Final Presentation
- Peer Assessment
- Final Report

You will be asked to assess (via Canvas) the contribution of your group members

# Course Project

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- Proposal Presentation
- Proof of Concept
- Initial Results
- Final Presentation
- Peer Assessment
- Final Report

**Due on 12 June**  
**Submission via Canvas**

- Introduction
- Motivation
- Methods
- Results
- Conclusions
- Next Steps

Don't make the final report your magnum opus

If you've done the group work leading up to the final presentation, just stich together all parts, do a few read throughs, etc.

# Course Project

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- Proposal Presentation
- Proof of Concept
- Initial Results
- Final Presentation
- Peer Assessment
- Final Report

**Due on 12 June**  
**Submission via Canvas**

- Introduction
- Motivation
- Methods
- Results
- Conclusions
- Next Steps

**Any team with one or more graduate students**

The final report must use the ACM sigconf LaTeX template  
(<http://www.acm.org/publications/proceedings-template>)

# Course Project

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## Group Selection

- Each group (ideally) must have at LEAST 1 CS, and 1 bio/chem non-CS person
- 1 Person groups are not allowed
- Project 1 : SEIR Model sensitivity analysis
- Project 2 : SEIR Model extension; at risk and not (as) at risk populations, and social distancing measures
- Project 3 : SEIR Model Threshold scenarios
- Project 4 : Energy Profiles of Mutants (single AA substitution) of Covid-19 proteins
- Project 5 : Energy Profiles of Mutant(s) (double AA substitutions) of Covid-19 proteins
- Project 6 : Data Visualization / web server, for Projects 4 and 5 data
- Project 7 : PDZ domain, mutation analysis

# Course Project

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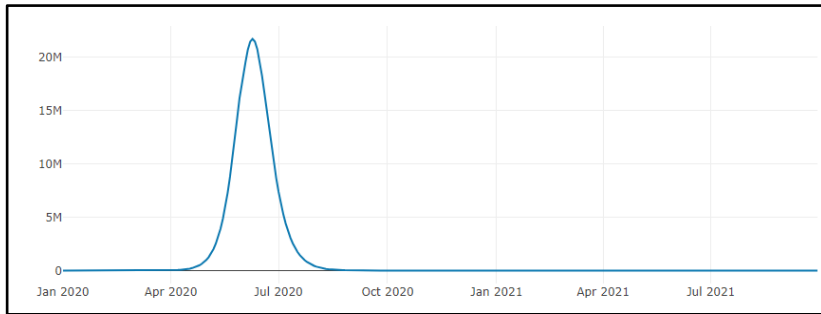
## Project 1 : SEIR Model sensitivity analysis



# Course Project

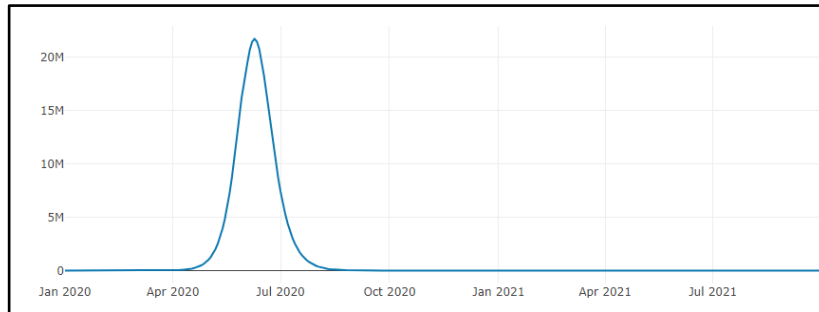
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## Project 1 : SEIR Model sensitivity analysis



# Course Project

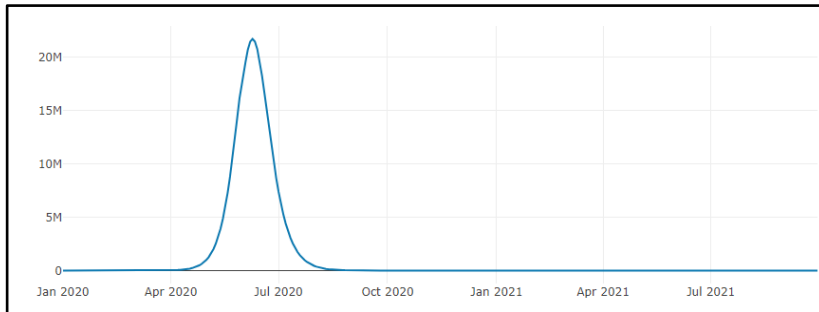
## Project 1 : SEIR Model sensitivity analysis



```
var Time_to_death      = 32
var logN               = Math.log(7e6)
var N                 = 327000000
var I0                = 1
var R0               = 2.2
var D_incubation       = 5.2
var D_infectious       = 2.9
var D_recovery_mild    = (14 - 2.9)
var D_recovery_severe  = (31.5 - 2.9)
var D_hospital_lag     = 5
var D_death            = Time_to_death - D_infectious
var CFR               = 0.02
var InterventionTime   = 10000
var InterventionAmt    = 1/3
var Time              = 220
var Xmax              = 110000
var dt                = 2
var P_SEVERE          = 0.2
var duration           = 7*12*1e10
```

# Course Project

## Project 1 : SEIR Model sensitivity analysis



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var dt                = 2
var P_SEVERE          = 0.2
var duration           = 7*12*1e10
```

- Q: How sensitive is this model to each of these variables?
- Q: What are the ranges of “valid” values for  $R_0$ ,  $I_0$ , hospital Lag?
- Q: What does the S, E, I and R in SEIR refer to?
- Code: <https://facultyweb.cs.wvu.edu/~jagodzif/covid-19/>
- Rewrite code (java, python, C) ... your choice
- For a subset of these variables, do exhaustive runs of the model, and report on outliers

## Course Project

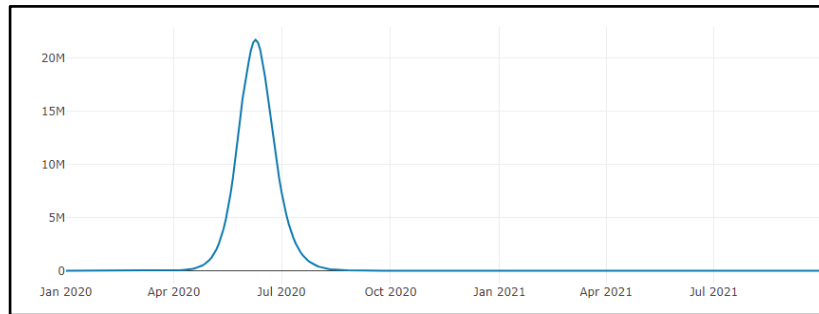
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Project 2 : SEIR Model extension; at risk and not (as)  
at risk populations, and social distancing measures

# Course Project

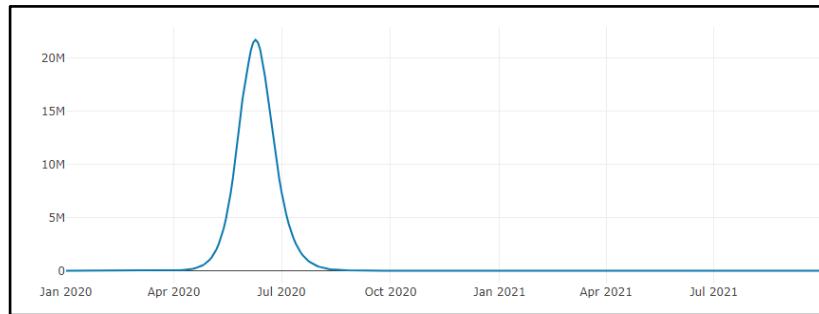
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Project 2 : SEIR Model extension; at risk and not (as)  
at risk populations, and social distancing measures



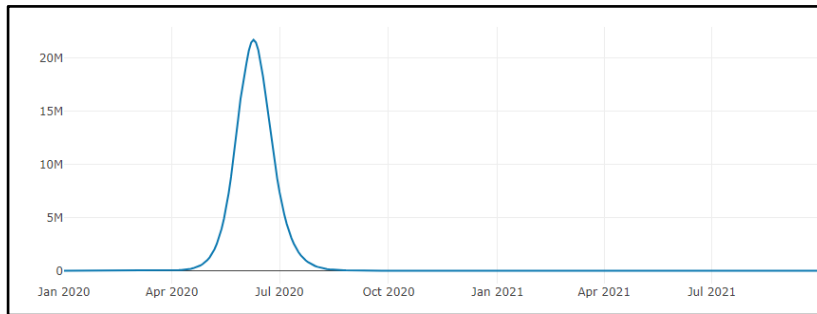
# Course Project

## Project 2 : SEIR Model extension; at risk and not (as) at risk populations, and social distancing measures



# Course Project

## Project 2 : SEIR Model extension; at risk and not (as) at risk populations, and social distancing measures



- Q: How can the “R” of SEIR be extended to take into account at risk versus (not as much) at risk populations?
- Code: <https://facultyweb.cs.wvu.edu/~jagodzif/covid-19/>
- Rewrite code (java, python, C) ... your choice (can work with Project 1 team)

# Course Project

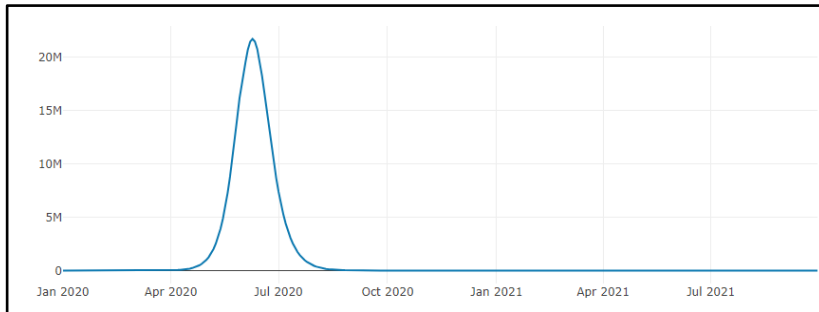
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## Project 3 : SEIR Model Threshold scenarios



# Course Project

## Project 3 : SEIR Model Threshold scenarios



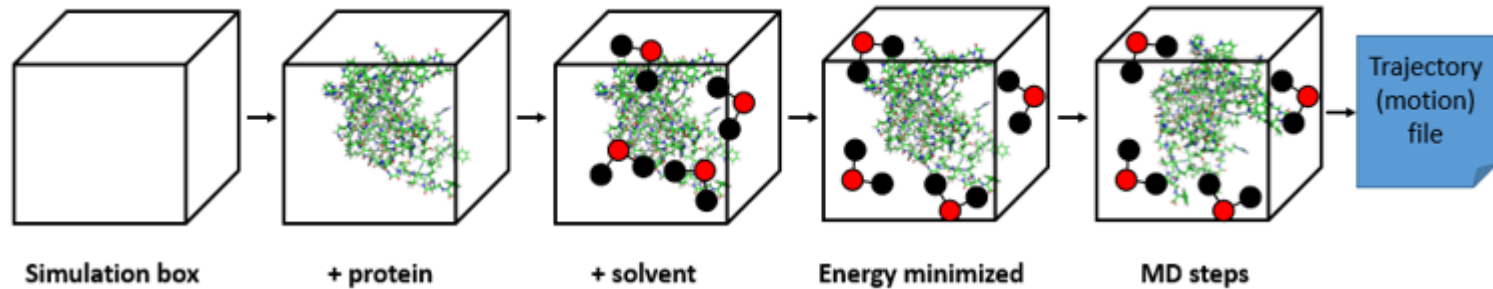
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var Time              = 220
var Xmax              = 110000
var dt                = 2
var P_SEVERE          = 0.2
var duration           = 7*12*1e10
```

- Q: What are the range(s) of variable values such that a threshold of number of infected people is NOT reached by time  $t_1$ ,  $t_2$ ,  $t_3$ , etc.
- Note that between  $t_1$  and  $t_2$ , for example, there may be a different  $R_0$  than between  $t_2$  and  $t_3$ , due to social distancing measures
- Code: <https://facultyweb.cs.wvu.edu/~jagodzif/covid-19/>
- Rewrite code (java, python, C) ... your choice (can work with Project 1 and 2 teams)

### Project 4 : Energy Profiles of Mutants (single AA substitution) of Covid-19 proteins

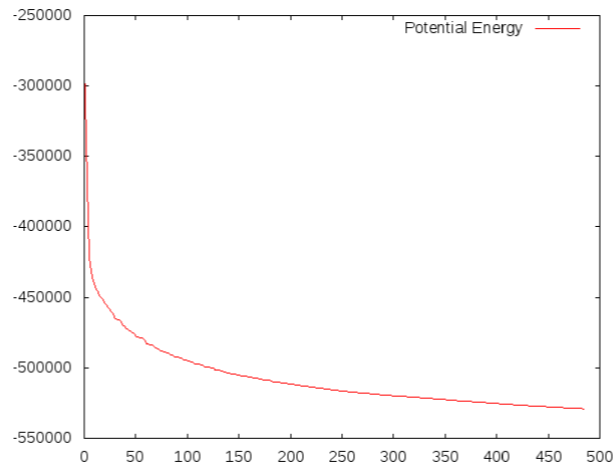
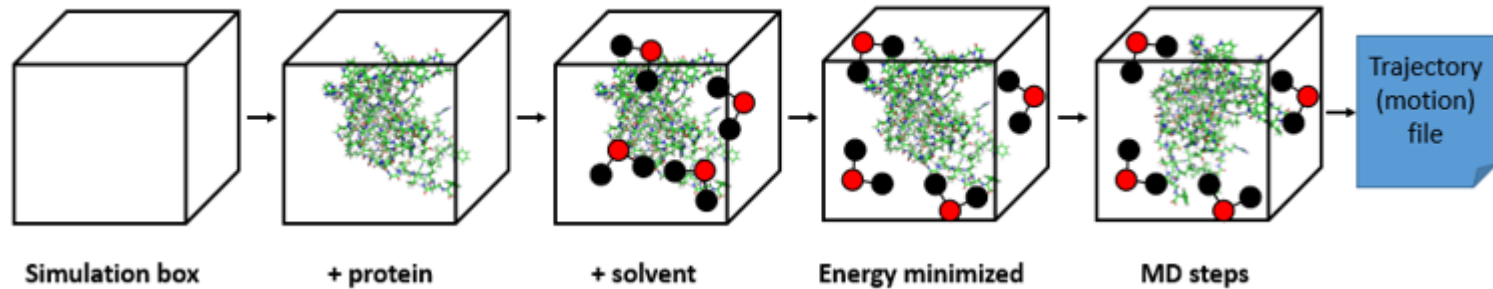
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### Project 4 : Energy Profiles of Mutants (single AA substitution) of Covid-19 proteins



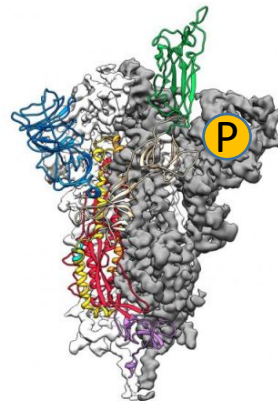
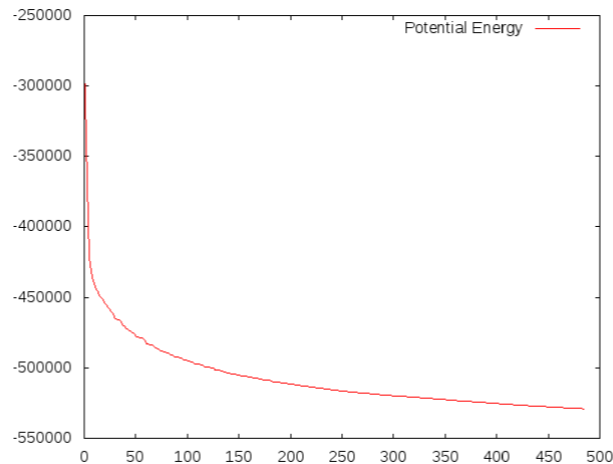
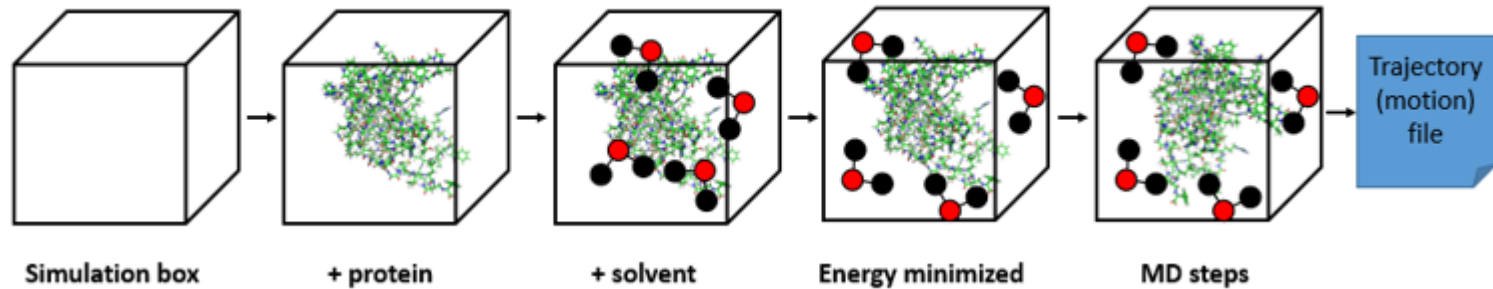
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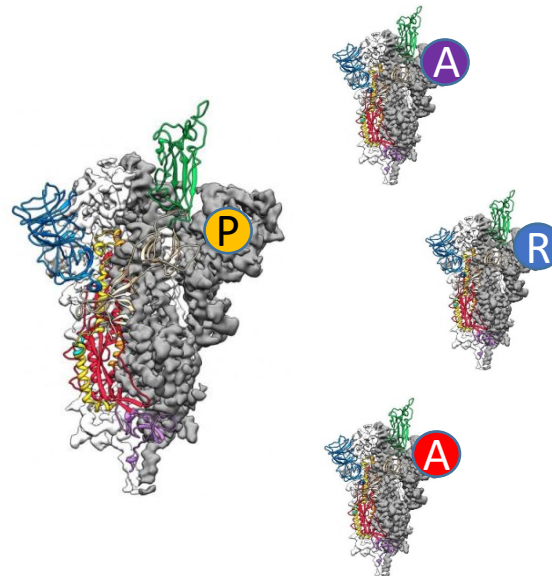
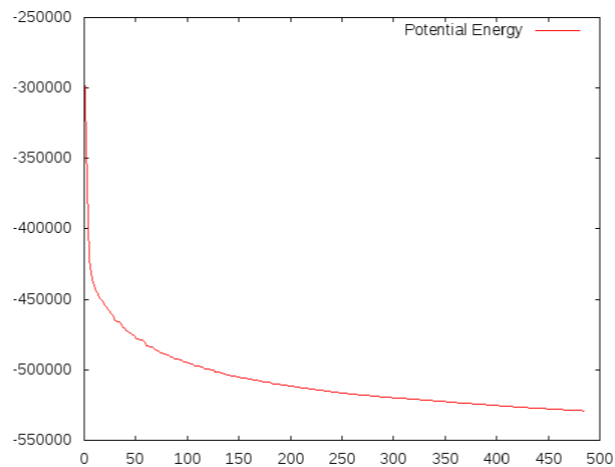
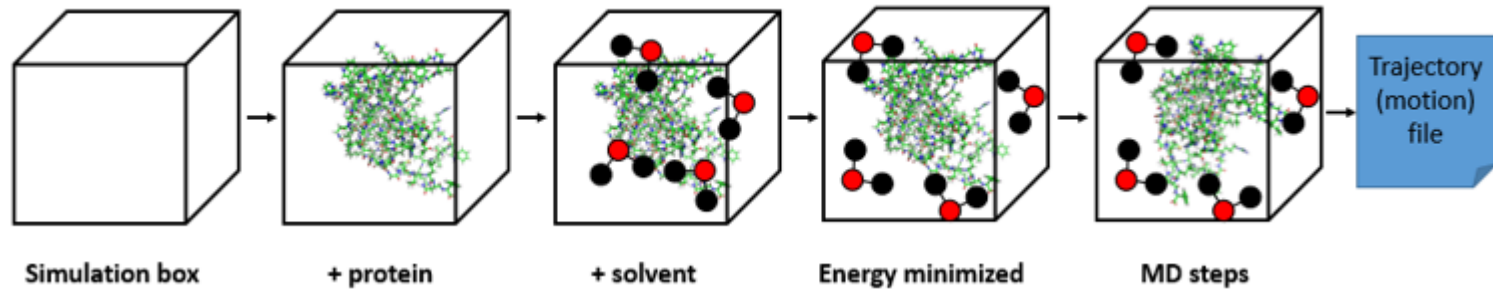
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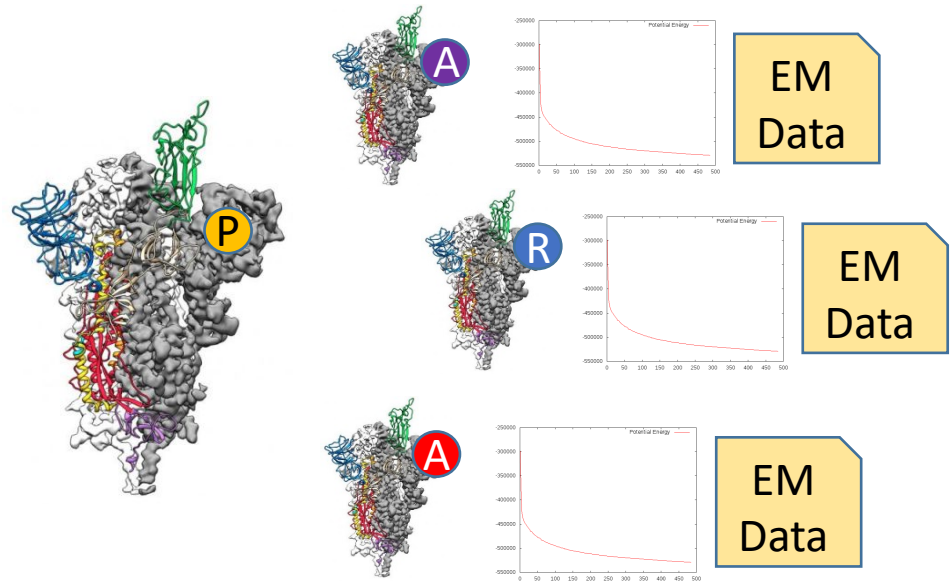
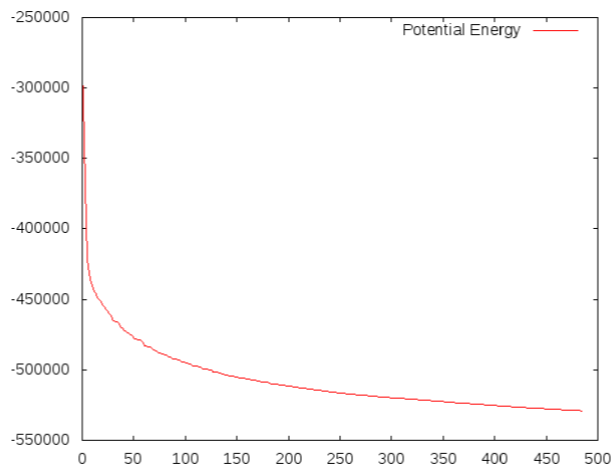
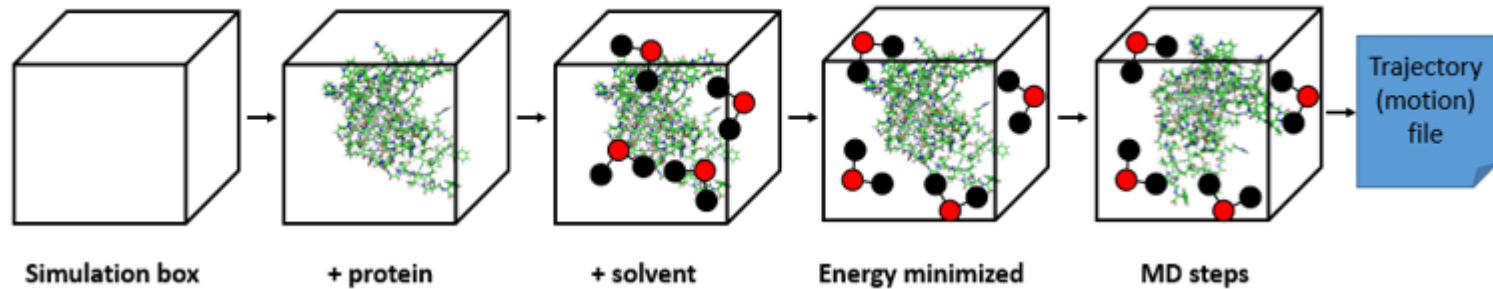
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## Project 4 : Energy Profiles of Mutants (single AA substitution) of Covid-19 proteins



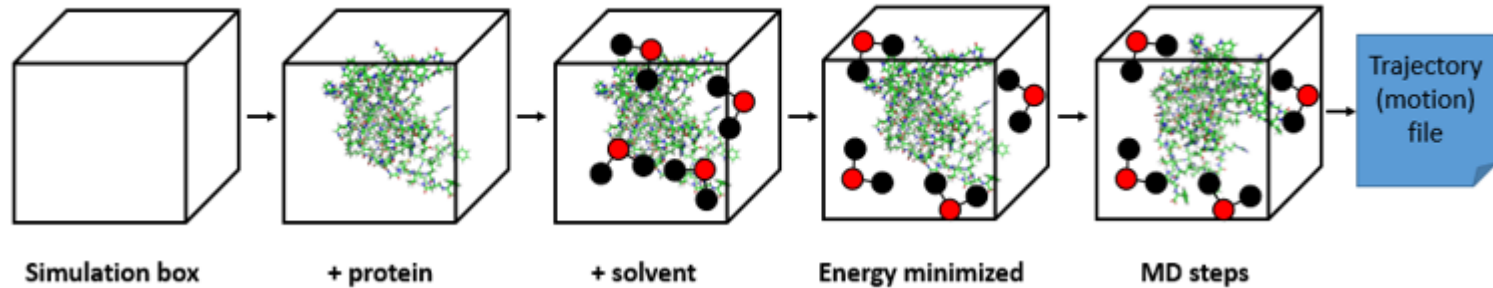
# Course Project

## Project 4 : Energy Profiles of Mutants (single AA substitution) of Covid-19 proteins

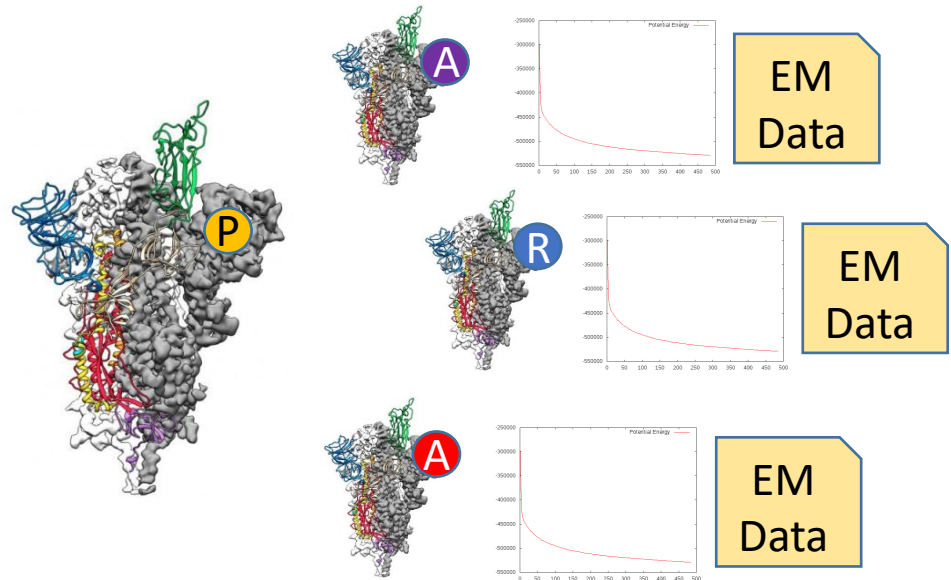


# Course Project

## Project 4 : Energy Profiles of Mutants (single AA substitution) of Covid-19 proteins



- Generate datasets of EM data for ALL single-point mutations in Covid-19 proteins
- Aggregate the results
- **Q: Which residue(s) when mutated are the most impactful in affecting the structural stability of a protein?**

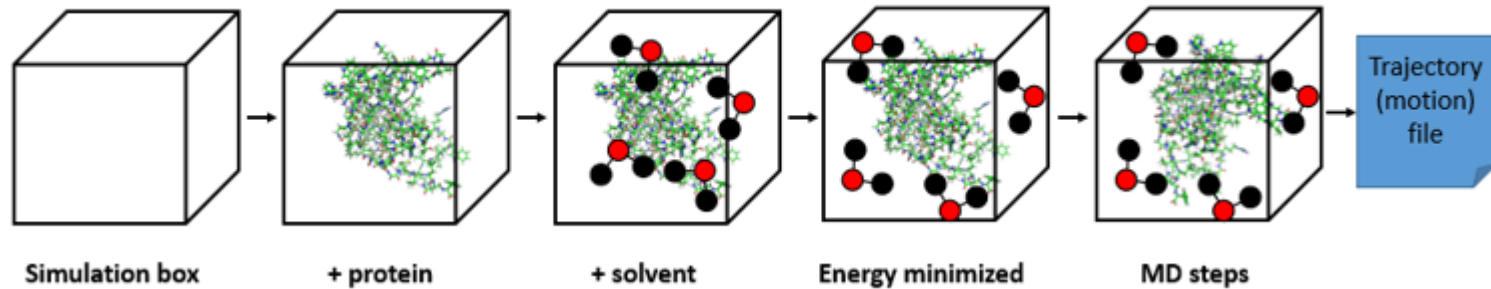




### Project 5 : Energy Profiles of Mutant(s) (double AA substitutions) of Covid-19 proteins

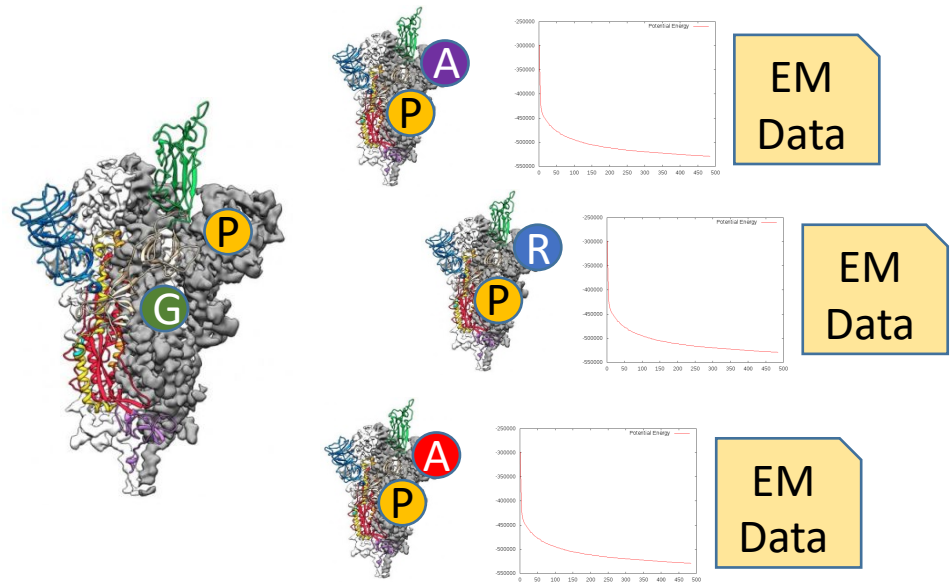
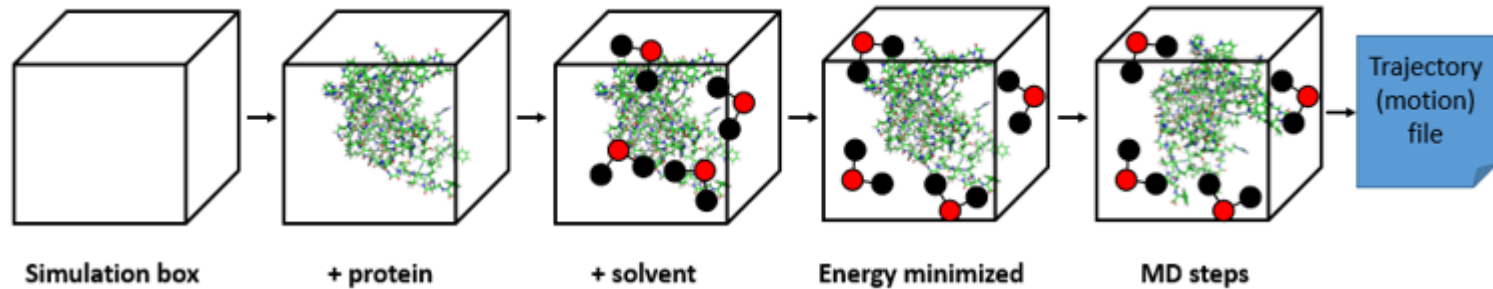
## Course Project

### Project 5 : Energy Profiles of Mutant(s) (double AA substitutions) of Covid-19 proteins



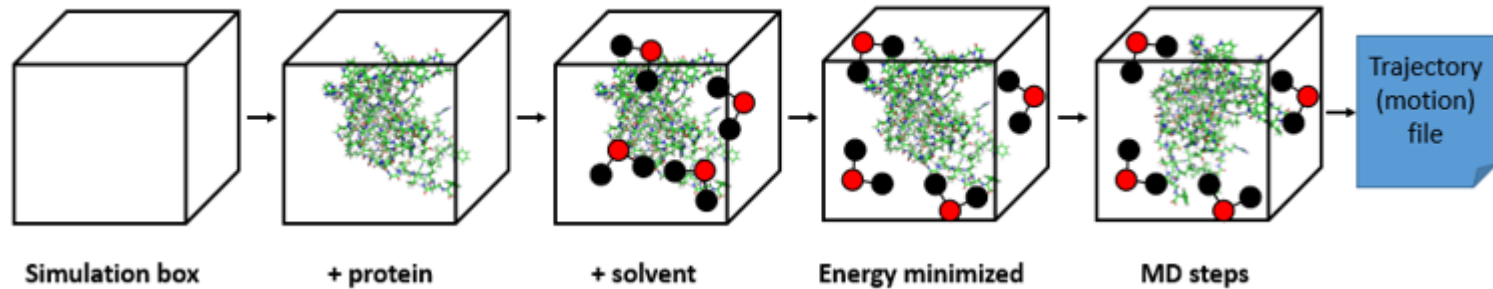
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## Project 5 : Energy Profiles of Mutant(s) (double AA substitutions) of Covid-19 proteins

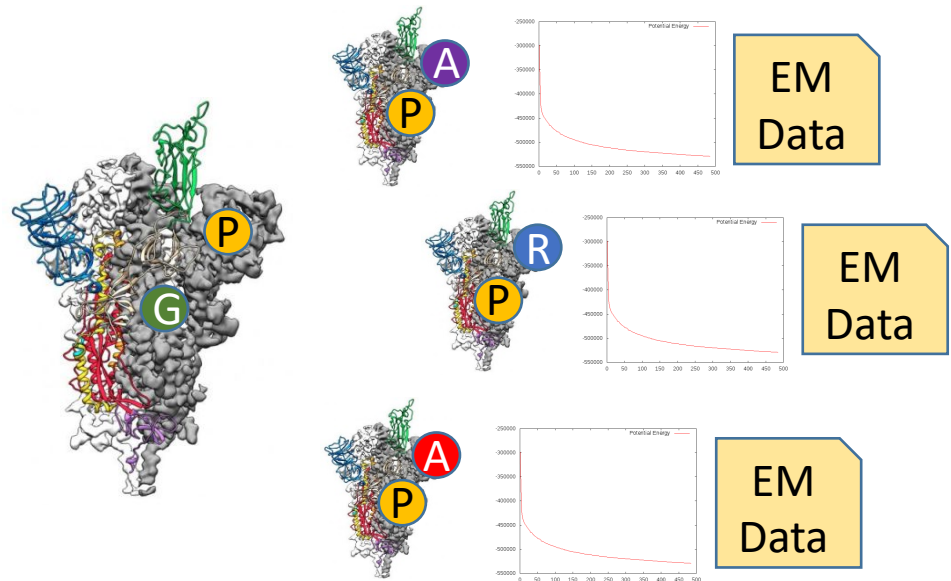


# Course Project

## Project 5 : Energy Profiles of Mutant(s) (double AA substitutions) of Covid-19 proteins



- Generate dataset(s) of EM data for ALL 2-point mutations in Covid-19 protein(s)
- Aggregate the results
- **Q: Which pairs of residue(s) when mutated are the most impactful in affecting the structural stability of a protein?**



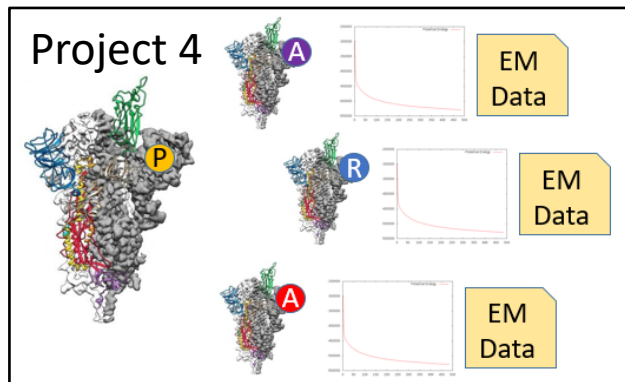
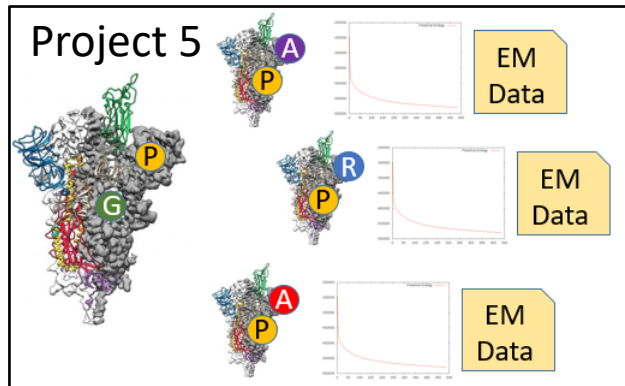
## Course Project

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Project 6 : Data Visualization / web server, for Projects 4 and 5 data

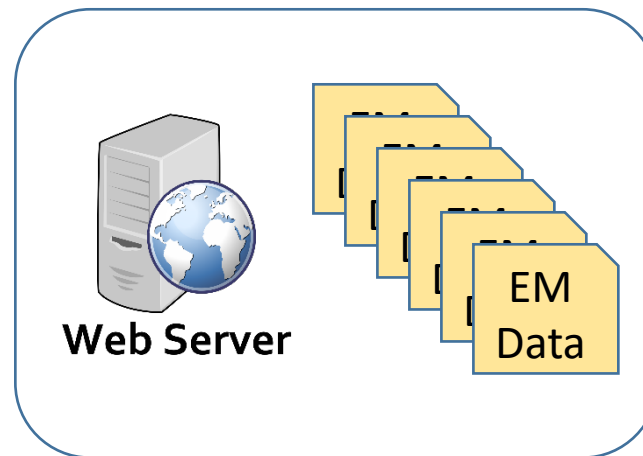
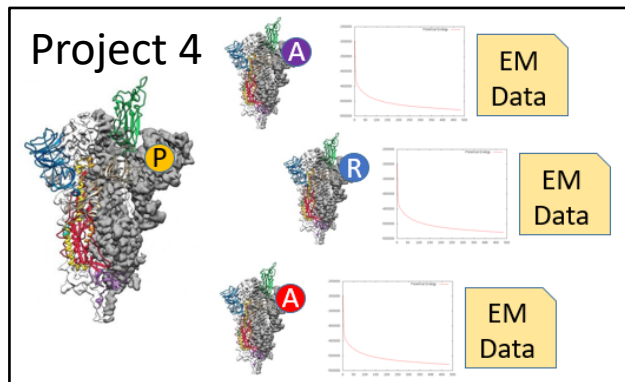
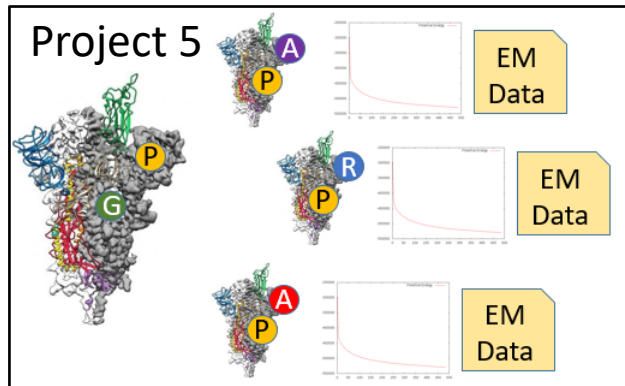
# Course Project

## Project 6 : Data Visualization / web server, for Projects 4 and 5 data



# Course Project

## Project 6 : Data Visualization / web server, for Projects 4 and 5 data



## Course Project

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Project 6 : Data Visualization / web server, for Projects 4 and 5 data



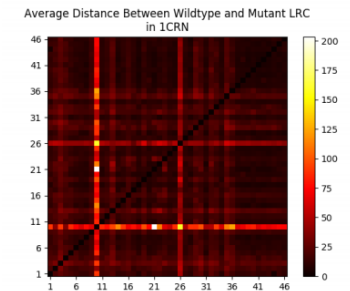
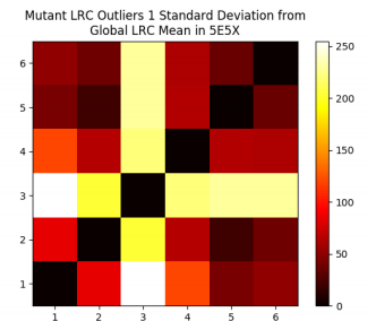


# Course Project

## Project 6 : Data Visualization / web server, for Projects 4 and 5 data



Wild type	M	W	I	K	I	P	E	D	I	A	•
ISA	M	W	I	K	•	P	E	D	I	A	•
ISC	M	W	I	K	•	P	E	D	I	A	•
ISD	M	W	I	K	•	P	E	D	I	A	•
ISE	M	W	I	K	•	P	E	D	I	A	•
ISF	M	W	I	K	•	P	E	D	I	A	•
ISG	M	W	I	K	•	P	E	D	I	A	•
ISH	M	W	I	K	•	P	E	D	I	A	•
ISK	M	W	I	K	•	P	E	D	I	A	•
ISL	M	W	I	K	•	P	E	D	I	A	•
ISM	M	W	I	K	•	P	E	D	I	A	•
ISN	M	W	I	K	•	P	E	D	I	A	•
ISP	M	W	I	K	•	P	E	D	I	A	•
ISQ	M	W	I	K	•	P	E	D	I	A	•
ISR	M	W	I	K	•	P	E	D	I	A	•
ISS	M	W	I	K	•	P	E	D	I	A	•
IST	M	W	I	K	•	P	E	D	I	A	•
ISV	M	W	I	K	•	P	E	D	I	A	•
ISW	M	W	I	K	•	P	E	D	I	A	•
ISY	M	W	I	K	•	P	E	D	I	A	•



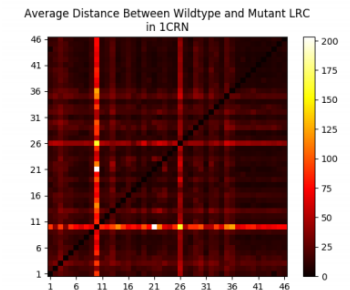
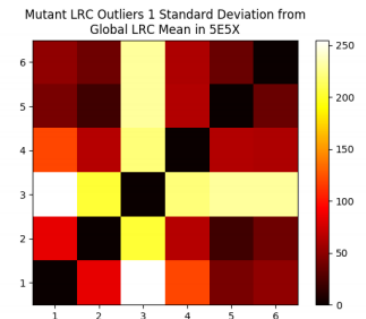
# Course Project

## Project 6 : Data Visualization / web server, for Projects 4 and 5 data

- Basic Web server infrastructure
- “simple” GUI
- Interfaces with raw data
- Presents visualizations of the raw data
- **Task: discern which residue(s) are most impactful**



Wild type	M	W	I	K	I	P	E	D	I	A	•
ISA	M	W	I	K	I	P	E	D	I	A	•
ISC	M	W	I	K	I	P	E	D	I	A	•
ISD	M	W	I	K	I	P	E	D	I	A	•
ISE	M	W	I	K	I	P	E	D	I	A	•
ISF	M	W	I	K	I	P	E	D	I	A	•
ISG	M	W	I	K	I	P	E	D	I	A	•
ISH	M	W	I	K	I	P	E	D	I	A	•
ISK	M	W	I	K	I	P	E	D	I	A	•
ISL	M	W	I	K	I	P	E	D	I	A	•
ISM	M	W	I	K	I	P	E	D	I	A	•
ISN	M	W	I	K	I	P	E	D	I	A	•
ISP	M	W	I	K	I	P	E	D	I	A	•
ISQ	M	W	I	K	I	P	E	D	I	A	•
ISR	M	W	I	K	I	P	E	D	I	A	•
ISS	M	W	I	K	I	P	E	D	I	A	•
IST	M	W	I	K	I	P	E	D	I	A	•
ISV	M	W	I	K	I	P	E	D	I	A	•
ISW	M	W	I	K	I	P	E	D	I	A	•
ISY	M	W	I	K	I	P	E	D	I	A	•



# Course Project

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## Project 7 : PDZ domain, effects of mutations

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PDZ Domains are commonly occurring sequences of upwards of 100 amino acids in signaling proteins. These PDZ domains play a role in anchoring a receptor protein to another protein, to form a complex, so that signaling can occur.



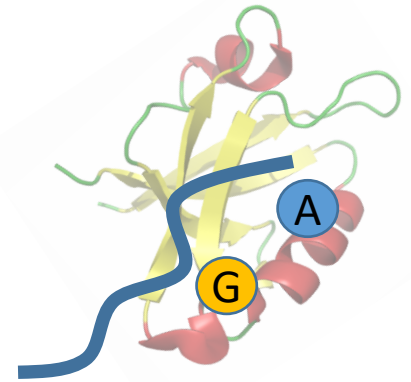
# Course Project

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## Project 7 : PDZ domain, effects of mutations

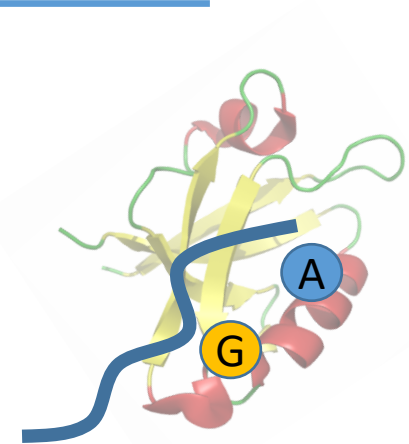
PDZ Domains are commonly occurring sequences of upwards of 100 amino acids in signaling proteins. These PDZ domains play a role in anchoring a receptor protein to another protein, to form a complex, so that signaling can occur.

Most often it is the “last” 10-or-so amino acids of these PDZ domains that are responsible for securing in place the complex.



### Project 7 : PDZ domain, effects of mutations

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Most often it is the “last” 10-or-so amino acids of these PDZ domains that are responsible for securing in place the complex.

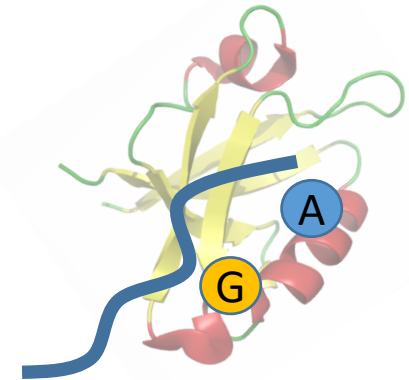
- On-going work with Jeanine Amacher (chemistry)
- We have the crystal structure of several PDZ domains bound to a larger protein
- **Q: What mutations to the 10 amino acids disrupt the binding and hence formation of the complex?**



## Course Project

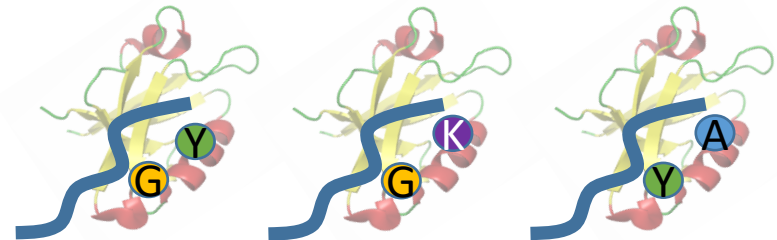
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Most often it is the “last” 10-or-so amino acids of these PDZ domains that are responsible for securing in place the complex.

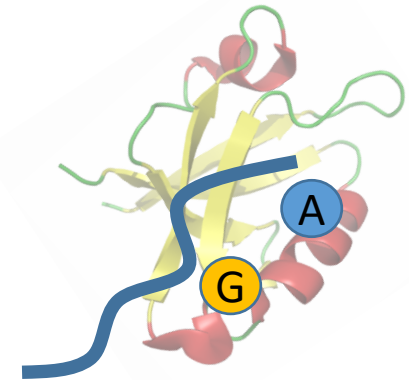
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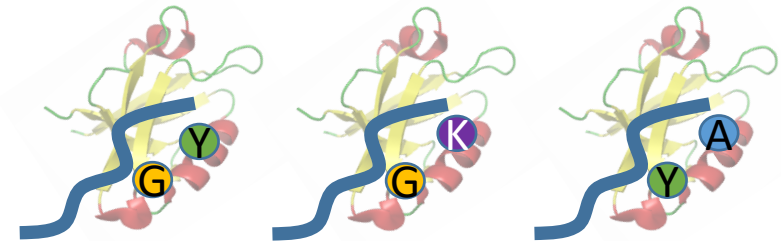
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Rigidity Analysis, and Energy Minimization

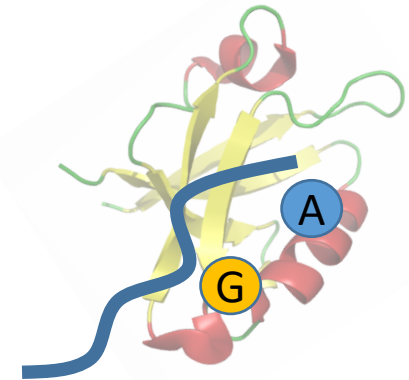




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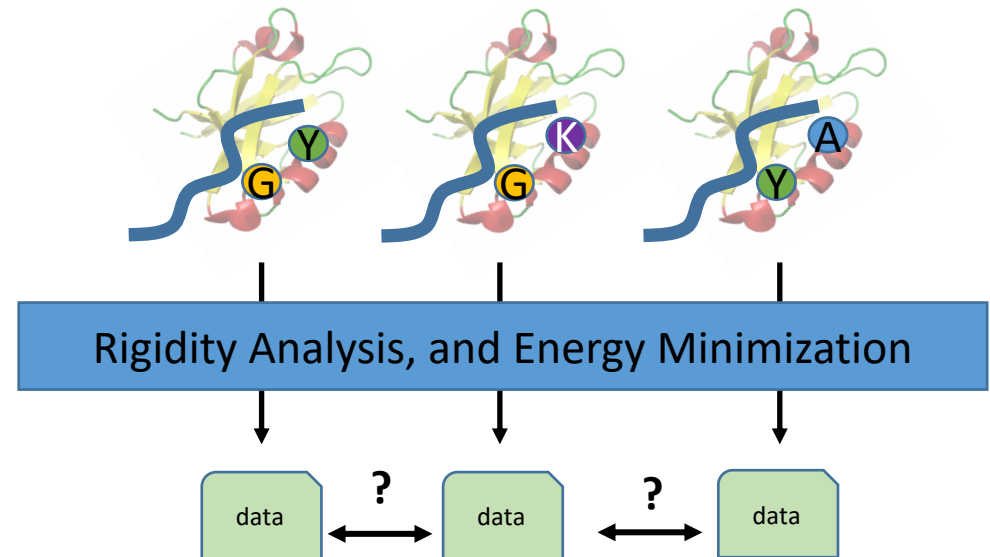
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**Use Canvas's Discussion feature to discuss group members**  
**Self-select group membership (canvas)**

### Use Canvas's Discussion feature to discuss group members Self-select group membership (canvas)

- **Proposal Presentation**
- Proof of Concept
- Initial Results
- Final Presentation
- Peer Assessment
- Final Report

### Submitted via Canvas Due 15 May

- Slide 1 : Title
- Slide 2 : Introduction (WHAT)
- Slide 3 : Motivation (WHY)
- Slide 4 : Methods (HOW)
- Slide 5 : Expected Obstacles (these most likely will change ONCE you begin)
- You must mention at least 2 references

## This Week's schedule

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Friday : Remaining labs due