Class12: Protein Structure Prediction with AlphaFold

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Custom analysis of resulting model

```
# Change this for YOUR results dir name
results_dir <- "/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119"

pdb_files <- list.files(path = results_dir, pattern = "*.pdb", full.names = T)
# Print our PDB file names
basename(pdb_files)

[1] "HIVPrdimer_23119_unrelaxed_rank_001_alphafold2_multimer_v3_model_1_seed_000.pdb"
[2] "HIVPrdimer_23119_unrelaxed_rank_002_alphafold2_multimer_v3_model_5_seed_000.pdb"
[3] "HIVPrdimer_23119_unrelaxed_rank_003_alphafold2_multimer_v3_model_4_seed_000.pdb"
[4] "HIVPrdimer_23119_unrelaxed_rank_004_alphafold2_multimer_v3_model_2_seed_000.pdb"
[5] "HIVPrdimer_23119_unrelaxed_rank_005_alphafold2_multimer_v3_model_3_seed_000.pdb"

library(bio3d)

# Read all data from Models
# and superpose/fit coords
pdbs <- pdbaln(pdb_files, fit=TRUE, exefile="msa")</pre>
```

Reading PDB files:

```
/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119_unrelaxed_rank_001_a/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119_unrelaxed_rank_002_a/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119_unrelaxed_rank_003_a/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119_unrelaxed_rank_004_a/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119_unrelaxed_rank_005_a/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119_unrelaxed_rank_005_a/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23119/HIVPrdimer_23
```

.

Extracting sequences

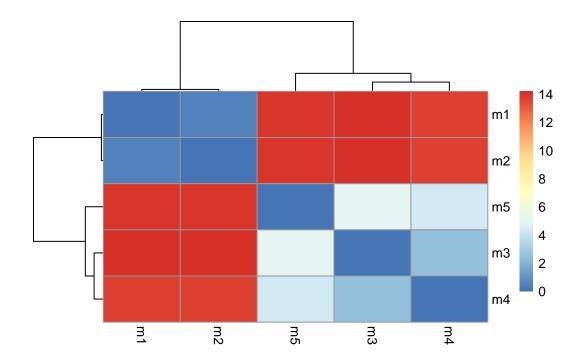
[Truncated_Name:1]HIVPrdimer

pdb/seq: 2 name: /Users/ale	ex/Desktop/	BIMM 143/	Class 12/	HIVPrdimer	_23119/HIV	Prdimer_	_23119_u
pdb/seq: 3 name: /Users/ale	ex/Desktop/	BIMM 143/	Class 12/	HIVPrdimer	_23119/HIV	Prdimer_	_23119_u
pdb/seq: 4 name: /Users/ale	ex/Desktop/	BIMM 143/	Class 12/	HIVPrdimer	_23119/HIV	Prdimer_	_23119_u
pdb/seq: 5 name: /Users/ale	ex/Desktop/	BIMM 143/	Class 12/	HIVPrdimer	_23119/HIV	Prdimer_	_23119_u
pdbs							
	1					50	
[Truncated_Name:1]HIVPrdimer	PQITLWQR	.PLVTIKIGG	QLKEALLDT	GADDTVLEEM	SLPGRWKPKM	IGGI	
[Truncated_Name:2]HIVPrdimer	PQITLWQR	.PLVTIKIGG	QLKEALLDT	GADDTVLEEM	SLPGRWKPKM	IGGI	
[Truncated_Name:3]HIVPrdimer	PQITLWQR	.PLVTIKIGG	QLKEALLDT	GADDTVLEEM	SLPGRWKPKM	IGGI	
[Truncated_Name:4]HIVPrdimer	PQITLWQR	.PLVTIKIGG	QLKEALLDT	GADDTVLEEM	SLPGRWKPKM	IGGI	
[Truncated_Name:5]HIVPrdimer	PQITLWQR	PLVTIKIGG(QLKEALLDT	GADDTVLEEM	SLPGRWKPKM	IGGI	
	******	*****	******	******	******	***	
	1	•	•	•	•	50	
	51					100	
[Truncated_Name:1]HIVPrdimer	GGFIKVRQ	YDQILIEIC	GHKAIGTVL	VGPTPVNIIG	RNLLTQIGCT	LNFP	
[Truncated_Name:2]HIVPrdimer	GGFIKVRQ	YDQILIEIC	GHKAIGTVL	VGPTPVNIIG	RNLLTQIGCT	LNFP	
[Truncated_Name:3]HIVPrdimer	GGFIKVRQ	YDQILIEIC	GHKAIGTVL	VGPTPVNIIG	RNLLTQIGCT	LNFP	
[Truncated_Name:4]HIVPrdimer	GGFIKVRQ	YDQILIEIC	GHKAIGTVL	VGPTPVNIIG	RNLLTQIGCT	LNFP	
[Truncated_Name:5]HIVPrdimer	GGFIKVRQ	YDQILIEIC	GHKAIGTVL	VGPTPVNIIG	RNLLTQIGCT	LNFP	
	******	*****	******	******	******	***	
	51	•	•			100	
	101					150	
[Truncated_Name:1]HIVPrdimer	QITLWQRP	LVTIKIGGQ	LKEALLDTG	ADDTVLEEMS	LPGRWKPKMI	GGIG	
[Truncated_Name:2]HIVPrdimer	QITLWQRP	LVTIKIGGQ	LKEALLDTG	ADDTVLEEMS	LPGRWKPKMI	GGIG	
[Truncated_Name:3]HIVPrdimer	QITLWQRP	LVTIKIGGQ	LKEALLDTG	ADDTVLEEMS	LPGRWKPKMI	GGIG	
[Truncated_Name:4]HIVPrdimer	QITLWQRP	LVTIKIGGQ	LKEALLDTG	ADDTVLEEMS	LPGRWKPKMI	GGIG	
[Truncated_Name:5]HIVPrdimer	QITLWQRP	LVTIKIGGQ	LKEALLDTG	ADDTVLEEMS	LPGRWKPKMI	GGIG	
	******	******	******	******	******	***	
	101	•	•	•	•	150	
	151					198	

pdb/seq: 1 name: /Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119_ux

 ${\tt GFIKVRQYDQILIEICGHKAIGTVLVGPTPVNIIGRNLLTQIGCTLNF}$

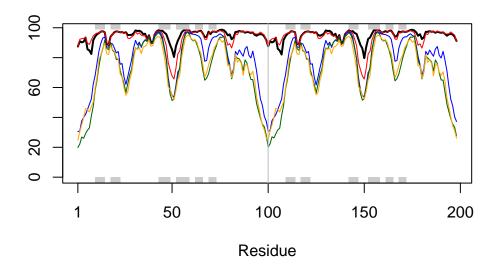
```
[Truncated_Name:2]HIVPrdimer
                              GFIKVRQYDQILIEICGHKAIGTVLVGPTPVNIIGRNLLTQIGCTLNF
[Truncated_Name:3]HIVPrdimer
                              GFIKVRQYDQILIEICGHKAIGTVLVGPTPVNIIGRNLLTQIGCTLNF
[Truncated_Name:4]HIVPrdimer
                              GFIKVRQYDQILIEICGHKAIGTVLVGPTPVNIIGRNLLTQIGCTLNF
[Truncated_Name:5]HIVPrdimer
                              GFIKVRQYDQILIEICGHKAIGTVLVGPTPVNIIGRNLLTQIGCTLNF
                               **************
                             151
                                                                             198
Call:
 pdbaln(files = pdb_files, fit = TRUE, exefile = "msa")
Class:
 pdbs, fasta
Alignment dimensions:
  5 sequence rows; 198 position columns (198 non-gap, 0 gap)
+ attr: xyz, resno, b, chain, id, ali, resid, sse, call
  rd <- rmsd(pdbs, fit=T)</pre>
Warning in rmsd(pdbs, fit = T): No indices provided, using the 198 non NA positions
  range(rd)
[1] 0.000 14.202
  library(pheatmap)
  colnames(rd) <- paste0("m",1:5)</pre>
  rownames(rd) <- paste0("m",1:5)</pre>
  pheatmap(rd)
```



```
# Read a reference PDB structure
pdb <- read.pdb("1hsg")</pre>
```

Note: Accessing on-line PDB file

```
plotb3(pdbs$b[1,], typ="l", lwd=2, sse=pdb)
points(pdbs$b[2,], typ="l", col="red")
points(pdbs$b[3,], typ="l", col="blue")
points(pdbs$b[4,], typ="l", col="darkgreen")
points(pdbs$b[5,], typ="l", col="orange")
abline(v=100, col="gray")
```



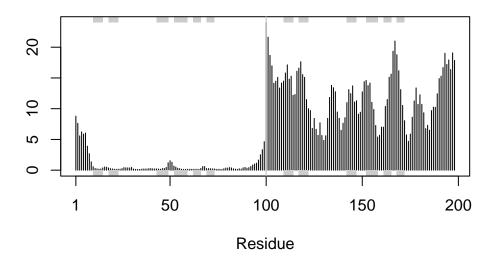
core <- core.find(pdbs)</pre>

```
core size 197 of 198
                      vol = 3124.981
core size 196 of 198
                      vol = 2920.865
                      vol = 2759.624
core size 195 of 198
core size 194 of 198
                      vol = 2621.733
core size 193 of 198
                      vol = 2506.071
core size 192 of 198
                      vol = 2431.582
core size 191 of 198
                      vol = 2389.657
core size 190 of 198
                      vol = 2361.033
                      vol = 2369.172
core size 189 of 198
core size 188 of 198
                      vol = 2363.069
                      vol = 2376.97
core size 187 of 198
core size 186 of 198
                      vol = 2355.921
core size 185 of 198
                      vol = 2346.202
core size 184 of 198
                      vol = 2306.364
core size 183 of 198
                      vol = 2255.879
core size 182 of 198
                      vol = 2190.66
core size 181 of 198
                      vol = 2116.318
core size 180 of 198
                      vol = 1992.743
core size 179 of 198
                      vol = 1949.979
core size 178 of 198
                     vol = 1893.848
```

```
core size 177 of 198 vol = 1829.776
core size 176 of 198
                      vol = 1752.867
core size 175 of 198
                      vol = 1678.032
core size 174 of 198
                      vol = 1604.948
core size 173 of 198
                      vol = 1562.782
core size 172 of 198
                      vol = 1530.89
core size 171 of 198
                      vol = 1484.997
core size 170 of 198
                      vol = 1440.142
core size 169 of 198
                      vol = 1398.997
                      vol = 1357.406
core size 168 of 198
core size 167 of 198
                      vol = 1314.435
core size 166 of 198
                      vol = 1266.822
core size 165 of 198
                      vol = 1225.549
core size 164 of 198
                      vol = 1188.069
core size 163 of 198
                      vol = 1156.625
core size 162 of 198
                      vol = 1091.281
core size 161 of 198
                      vol = 1058.554
                      vol = 1010.858
core size 160 of 198
core size 159 of 198
                      vol = 983.011
core size 158 of 198
                      vol = 957.156
core size 157 of 198
                      vol = 931.984
core size 156 of 198
                      vol = 905.998
core size 155 of 198
                      vol = 869.256
core size 154 of 198
                      vol = 843.979
core size 153 of 198
                      vol = 811.746
core size 152 of 198
                      vol = 783.827
                      vol = 758.744
core size 151 of 198
core size 150 of 198
                      vol = 728.578
core size 149 of 198
                      vol = 698.247
core size 148 of 198
                      vol = 678.144
core size 147 of 198
                      vol = 652.415
core size 146 of 198
                      vol = 636.918
core size 145 of 198
                      vol = 619.772
core size 144 of 198
                      vol = 603.09
core size 143 of 198
                      vol = 587.741
core size 142 of 198
                      vol = 573.444
core size 141 of 198
                      vol = 557.194
                      vol = 539.014
core size 140 of 198
core size 139 of 198
                      vol = 517.717
core size 138 of 198
                      vol = 496.613
core size 137 of 198
                      vol = 475.522
core size 136 of 198
                      vol = 459.062
core size 135 \text{ of } 198 \text{ vol} = 445.603
```

```
core size 134 of 198
                     vol = 430.655
core size 133 of 198
                      vol = 410.329
core size 132 of 198
                      vol = 401.041
core size 131 of 198
                      vol = 388.235
core size 130 of 198
                      vol = 375.857
core size 129 of 198
                      vol = 364.105
core size 128 of 198
                      vol = 350.53
core size 127 of 198
                      vol = 341.559
core size 126 of 198
                      vol = 328.471
core size 125 of 198
                      vol = 314.508
                      vol = 300.603
core size 124 of 198
core size 123 of 198
                      vol = 288.931
core size 122 of 198
                      vol = 277.266
core size 121 of 198
                      vol = 264.377
core size 120 of 198
                      vol = 254.347
                      vol = 242.692
core size 119 of 198
core size 118 of 198
                      vol = 231.991
core size 117 of 198
                      vol = 221.382
core size 116 of 198
                      vol = 212.788
core size 115 of 198
                      vol = 203.834
core size 114 of 198
                      vol = 194.898
core size 113 of 198
                      vol = 184.082
core size 112 of 198
                      vol = 172.93
core size 111 of 198
                      vol = 162.111
core size 110 of 198
                      vol = 151.154
core size 109 of 198
                      vol = 141.921
core size 108 of 198
                      vol = 131.714
core size 107 of 198
                      vol = 124.278
core size 106 of 198
                      vol = 118.709
core size 105 of 198
                      vol = 112.734
core size 104 of 198
                      vol = 106.464
core size 103 of 198
                      vol = 100.447
core size 102 of 198
                      vol = 92.93
core size 101 of 198
                      vol = 84.912
core size 100 of 198
                      vol = 77.129
core size 99 of 198
                     vol = 70.022
core size 98 of 198
                     vol = 62.159
core size 97 of 198
                     vol = 54.551
core size 96 of 198
                     vol = 47.345
core size 95 of 198
                     vol = 42.479
core size 94 of 198
                     vol = 37.149
core size 93 of 198
                     vol = 29.658
core size 92 of 198 vol = 22.749
```

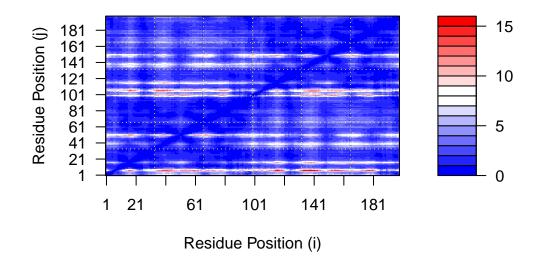
```
core size 91 of 198 vol = 14.984
 core size 90 of 198 vol = 7.932
 core size 89 of 198 vol = 4.439
 core size 88 of 198 vol = 3.189
 core size 87 of 198 vol = 2.468
 core size 86 of 198 vol = 1.901
core size 85 \text{ of } 198 \text{ vol} = 1.633
core size 84 of 198 vol = 1.295
core size 83 of 198 vol = 1.019
core size 82 of 198 vol = 0.867
core size 81 of 198 vol = 0.722
 core size 80 of 198 vol = 0.618
 core size 79 of 198 vol = 0.532
 core size 78 \text{ of } 198 \text{ vol} = 0.506
 core size 77 of 198 vol = 0.474
FINISHED: Min vol (0.5) reached
  core.inds <- print(core, vol=0.5)</pre>
# 78 positions (cumulative volume <= 0.5 Angstrom^3)</pre>
  start end length
        48
1
     10
                 39
2
     53
        66
                 14
     68 92
                 25
  xyz <- pdbfit(pdbs, core.inds, outpath="corefit_structures")</pre>
  rf <- rmsf(xyz)
  plotb3(rf, sse=pdb)
  abline(v=100, col="gray", ylab="RMSF")
```



Predicted Alignment Error for domains

```
library(jsonlite)
  # Listing of all PAE JSON files
  pae_files <- list.files(path=results_dir,</pre>
                            pattern=".*model.*\\.json",
                            full.names = TRUE)
  pae1 <- read_json(pae_files[1],simplifyVector = TRUE)</pre>
  pae5 <- read_json(pae_files[5],simplifyVector = TRUE)</pre>
  attributes(pae1)
$names
[1] "plddt"
              "max_pae" "pae"
                                    "ptm"
                                               "iptm"
  # Per-residue pLDDT scores
  # same as B-factor of PDB..
  head(pae1$plddt)
```

[1] 87.38 91.00 90.19 90.62 93.44 85.62

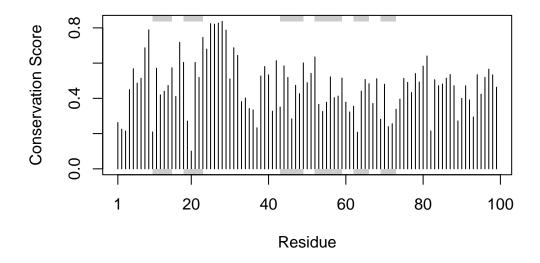


Residue conservation from alignment file

[1] "/Users/alex/Desktop/BIMM 143/Class 12/HIVPrdimer_23119/HIVPrdimer_23119.a3m"

```
aln <- read.fasta(aln_file[1], to.upper = TRUE)</pre>
```

- [1] " ** Duplicated sequence id's: 101 **"
- [2] " ** Duplicated sequence id's: 101 **"



```
con <- consensus(aln, cutoff = 0.9)
con$seq</pre>
```

```
m1.pdb <- read.pdb(pdb_files[1])
occ <- vec2resno(c(sim[1:99], sim[1:99]), m1.pdb$atom$resno)
write.pdb(m1.pdb, o=occ, file="m1_conserv.pdb")</pre>
```