



TECHNISCHE UNIVERSITÄT  
BERGAKADEMIE FREIBERG

Die Ressourcenuniversität. Seit 1765.

PERSONAL PROGRAMMING PROJECT

**Big Data Visualization of Large and Ultra-Large Scale Atomistic Simulations (with >10Mio atoms)**

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## **ACKNOWLEDGEMENTS**

I am grateful to Dr.-Ing. Arun Prakash, for his wonderful supervision throughout the project. His constant motivation and careful guidance play a crucial role in completion of this project. He always encouraged me for an "out of the box" thinking, which helped me a lot in approaching things differently.

## ABSTRACT

Because of the anisotropic behaviour of the polycrystalline and the existence of grain to grain interactions, the stress calculated by Hooke's Law would not be too reliable using the lattice strains. The stress/strain states of the material are obtained by averaging over all stresses in the constituent grains with different orientations. With knowledge of the average stress state tensor in each grain (which can be significantly different from the global stress state tensor, the resolved shear stress (RSS) on the corresponding activated slip system can be directly calculated and directly identified as the CRSS value. For these reasons, an analysis for properties of the grains in a polycrystal is proposed. This includes an analysis of over 20 million atoms for the average properties like average stress tensor, orientation and other required quantities.

In this Personal Programming Project, the big data analysis of large and ultra large scale atomistic simulations which analyses different property parameters and assembles the average properties of a grain in a polycrystal for different structure types using FORTRAN programming language. The project also extends over to Visualization of the analysis using PYTHON programming language. The visualizations depict the variations in average volume of grains in a conglomerate(nearest neighbour grains) and average stresses with respect to average volume and average stress in the polycrystal with the help of polar plots.

## MOTIVATION

Big Data Analysis is the future of Materials Science. It changed the way researchers conduct their work, analyse properties and trends in their data, and even discover new materials. The ease of generating atomic structure by performing atomistic simulations and using it again and again for different analysis is the key advantage of Data Science in Material science. MGI and DSi have revolutionised the method of research in Materials Science. Big-data analytics tools plays a crucial role in searching for meaningful patterns in the large amounts of data. Big data unifies the three paradigms of theory, experiment, and computation/simulation. In comparison to data encountered in other fields, Materials science data tend to be particularly heterogeneous in terms of their type and source. So, processing the data is relatively complex than generating it. By using existing dataset of large and ultra large atomistic simulations , extracting and processing the data and then extending it for identifying the micromechanical properties like CRSS, Local Stress/Strain states in a grain in a Polycrystalline Material helps in improving material modelling techniques for further research.

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# 1 INTRODUCTION

## 1.1 BIG DATA:WHY, WHAT AND HOW?

In the current scenario of rapid advancement in digital technologies, data is generated from various sources and the fast transition has led to the growth of Big Data. Data science aims at researching big data and knowledge extraction from data. Big Data Analytics has an evolutionary breakthrough in many fields like banking, agriculture, chemistry and marketing with the collection of large datasets. Digitalization is the key concept and foundation for the enhancement of Big Data which is beyond the traditional processing database management techniques. The three Vs (Volume, Variety and Velocity) are three defining properties of Big Data referring to the amount of data, number of types of data and speed of the data respectively. Two more Vs have emerged over the past few decades, namely, Value and Veracity referring to the quality of the data and its reliability.

According to Oracle, benefits of Big Data and Data Analytics are :

- Big Data makes it possible for gaining complete answers with the availability of quality information.
- More complete answers reflect more confidence in the data and provides a reliable approach to tackling problems.

The crucial challenge for big data analysis techniques is its scalability and security. The major challenge in this case is to pay more attention for designing storage systems and to elevate efficient data analysis tool that provide guarantees on the output when the data comes from different sources. Furthermore, design of machine learning algorithms to analyze data is essential for improving efficiency and scalability. Big data analytics and data science are becoming the research focal point in industries and academia. [1–4]. Although the initiation of the concept of Big Data ("information explosion") and its research started a few decades ago, its applications and benefits have just begun.

## 1.2 DATA SCIENCE IN MATERIALS SCIENCE

Materials Science is the field which depends on experimental observations and the simulation results to understand the behaviour of different models. Big Data being generated by experiments and simulations of Materials Science in its approach to understand different characteristics, has lead to many opportunities in the field of Data driven techniques supporting Materials Genome Initiative(MGI). As mentioned in [5, 6], the Materials Genome Initiative(MGI) has emphasized the need for data informatics for further upcoming research in the emerging fields of materials informatics, identifying the human ability to collect data "Big Data". The budding of materials informatics has lead to Data-Driven techniques which play a crucial role in estimating the processing-structure-property-performance relationships in materials. Its forward models(property prediction) and inverse models(materials discovery) utilize the current areas of regression techniques and methods of Machine Learning creating a major research and development area.

According to [6], the standardization of data formats and interfaces, integrated workflow tools, training on best practices for software development can lead to major digitalization in materials science which enables a researcher to focus more on analysing the data and study the behaviour of models rather than spending a lot of time in generating the data.

## 1.3 DRIVING CONCEPT IN A NUTSHELL

In a single crystal, the physical and mechanical properties often differ with orientation. It can be observed from looking at a model of crystalline structure, that atoms should be able to slip over one another or distort in relation to one another easier in some directions than others. Slip generally

occurs in closed packed planes, those containing greatest number of atoms per length. A slip plane and slip direction constitute a slip system. Critical resolved shear stress (CRSS) is the component of shear stress, resolved in the direction of slip, necessary to initiate slip in a grain. Resolved shear stress (RSS) is the shear component of an applied tensile or compressive stress resolved along a slip plane that is other than perpendicular or parallel to the stress axis. The RSS is related to the applied stress by a geometrical factor,  $m$ , typically the Schmid factor. The *Taylor* factor has been shown to be more accurate for polycrystal metals.

A polycrystalline Representative Volume Element (RVE) is a material piece which must include a sufficient number of grains, in terms of crystallographic orientation, shape and size. The unique stress and strain tensor would represent the material. The local analysis of the stress and strain field is the only one which preserves both the local behaviour and the local load balance, and which can give a realistic evaluation of the heterogeneity inside the material. As the stress state in each grain is not necessarily equal to the macroscopic applied stress, this introduces variability into the conditions in which slip occurs. With the knowledge of the average stress tensor in each grain (which can be significantly different from the global stress tensor), RSS can be directly calculated and identified as CRSS value.

Hence, the analysis of average properties of grains based on their structure type enables the user to estimate the stress concentration which will activate dislocation motion in the available glide planes. These dislocations are geometrically necessary to ensure that the strain in each grain is equivalent at the grain boundary, so that the compatibility criteria are satisfied and also to estimate onset of plasticity in polycrystals.

## 2 GROUND WORK

### 2.1 COMPARISON OF SPEED

In order to estimate the performance efficiency of programming languages in reading Big Data files, a preliminary comparison study is done between FORTRAN, PYTHON(Pandas using python engine) and Cython for a task. The task includes:

- opening Big Data Files of various sizes.
- reading and storing the data.
- appending the time elapsed for opening and reading each file
- a comparison plot is drawn between Number of Lines and Time elapsed using each language.

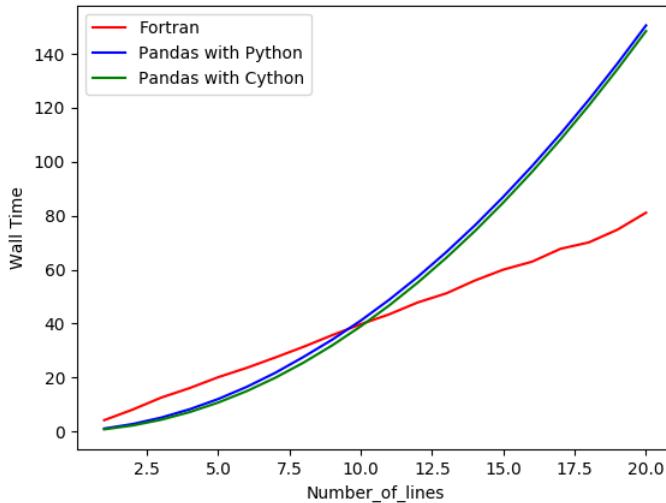


Figure 1: Comparison of Speed

**Input Files:** `python_pandas_func.py`, `cython_pandas_func.pyx`, `read_array2d.f90`

**Output File:** `cython_pandas_timeline.dat`, `python_pandas_timelines.dat`, `timelines.dat`, `plot_py_cy_fo.py`

**Command:** `$ gfortran -o <read_array2d.f90>`

**Inference:** The Comparison of speeds can be observed in the fig.1 for Number of lines in a file vs Wall Time. With expertise, a User can alter the speeds of a program which can help reduce the computational cost of the program. Parallel Computing can be another alternative to increase the processing speed of any program.

#### 2.1.1 DESIGNING THE PARAMETER FILE

The most important feature here is the *parameter file* which is designed in a such a way that it provides a wide variety of options to the User. The user, instead of being controlled by the options provided by the programme, has complete authority over the programme via the *parameter file*. In general, Big Data programmes being heavily time consuming and costly, cannot be repeatedly analysed whenever data is required. It is highly effective if the User extracts all the information needed from a single analysis of the Big Data file. The Paramater File fulfils this purpose.

```

1 # Number of Files to be Read
2 2
3 # File Name || Number of rows || Number of columns || Number of header lines
4 Sorted_GrNum_00200.txt 18632909 11 8
5 Sorted_Stress_00200.txt 18632910 13 9
6 # Data Info: Number of Columns || File Number || Column Number in the File
7 # User:Please specify the Number of Parameters required from the files:
8 6
9 atomID 1 1 1
10 Coord 3 1 3
11 struct_type 1 1 10
12 GrNum 1 1 11
13 Stress 6 2 6
14 Volume 1 2 13
15 # User: Please specify the Output filename into which the analysis is to be written:
16 Out_Average_Properties.txt
17
18

```

Figure 2: Parameter File

**File Name:** <Parameter\_File\_BigData.txt>

**Inference:**All the required properties of a User can be analysed just by altering the data of Parameter File without accessing the program(User Friendly). In the fig.2, the following properties can be observed:

- **Number of Files to be Read:**In line 2, the user can specify N number of Data files(**No Limit**) from which the programme should read certain parameters.
- **File Name:** From line 4 to line (4+N), the User needs to mention the names of the data files.
- **File attributes:**Along with the file names, the attributes of the files like Number of rows, Number of columns, Number of header lines are specified; each separated by a 'tab'.
- **Number of parameters:**In line 8, the User can specify the number of required/interested parameters(unlimited).
- **Parameters:** From line 9 and below the user can specify the required parameters with appropriate Tags which can be used later for 'tag check' while running the programming.**The Parameter Tag should NOT be changed.**It means 'atomID' should remain same and any other name like 'ATOMID' cannot be used.
- **Parameter Attributes:** Alongside the Parameter names, their attributes like Number of columns(it occupies in the file), File number(w.r.t the sequence of filenames mentioned) and Column number(it's start column in the file) should be specied; each separated by a 'tab'.
- **Output File name:** In line 16, the name of the output file into which the Average Properties of the Polycrystal after analysis should be written is to be specified.

## 2.2 COMMON NEIGHBOR ANALYSIS

While observing the Grains and their properties in a polycrystalline material via OVITO using the supplied Big Data file, the common neighbour analysis and color coding is performed and the Neighbor Grains are noted down manually in fig.3. The grains and their corresponding neighbours are stored in a text file with grain number being the starting number and separated by a 'tab' in between each other.

24	24	19	23	66	68	16	25	42	8	15
25	25	30	75	94	19	24	42	26	4	
26	26	4	25	42	38	39				
27	27	36	52	102	73					
28	28	43	91	70	52	68				
29	29	51	6	18	83	112	106	94		
30	30	60	75	25	4	96				

Figure 3: Nearest Neighbor Grains

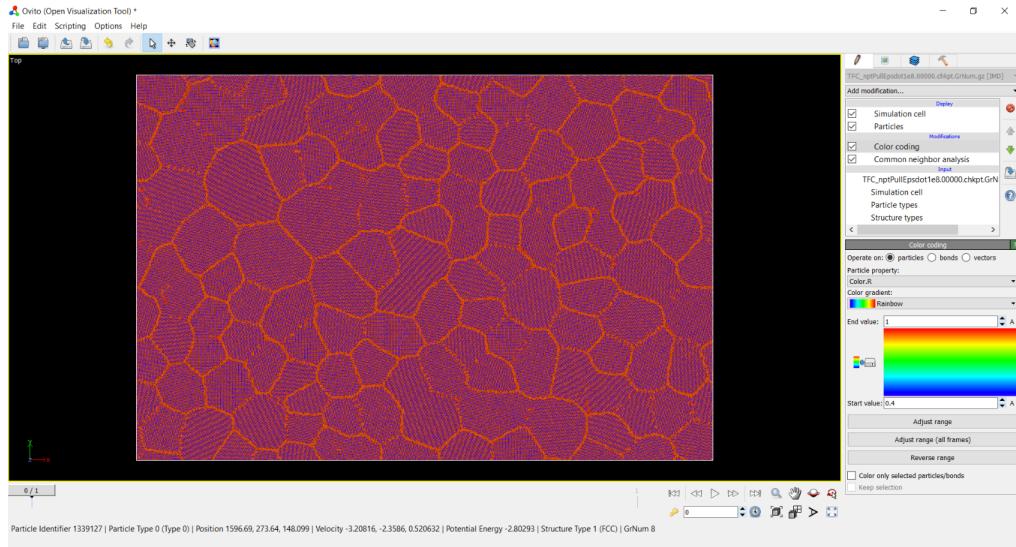


Figure 4: Common Neighbor Analysis

**File Name:** <Neighbours.txt>

According to CNA [7, 8], which pairs of particles are considered nearest neighbors (bonded) is determined by the cutoff radius parameter. Particles closer to each other than the cutoff radius are considered bonded. For face-centered cubic (FCC) and hexagonal close-packed (HCP) structures the cutoff radius must lie midway between the first and the second neighbor shell of neighbors. For body-centered cubic (BCC) materials the cutoff radius should lie between the second and the third neighbor shell. OVITO provides a list of optimal cutoff distances for fcc and bcc crystal structures formed by common pure elements. The coordination structure types are encoded as integer values:

- 0 = Other, unknown coordination structure
- 1 = FCC, face-centered cubic
- 2 = HCP, hexagonal close-packed
- 3 = BCC, body-centered cubic
- 4 = ICO, icosahedral coordination
- 5 = DIA, cubic diamond structure

### 3 IMPLEMENTATION OF ALGORITHM

#### 3.1 PART 1: BIG DATA ANALYSIS USING FORTRAN

##### 3.1.1 SORTING THE DATA FILE

The primieval task before working with large data files is to make the files ready for analysis. The data files need to be sorted with respect to their atomic\_id number. Two important prerequisites for the programme to work perfectly fine is that:

- Each data file should contain 'Atom\_ID' number in their first column irrespective of any data in the other available columns
- Each data file needs to be sorted based on their Atom\_Id (first)column.

Command:\$:sort -n <Input File> <Output File>

Input File\$:<TFC\_nptPullEpsdot1e8.00000.chkpt.GrNum.txt>

Output File\$:<Sorted\_TFC\_nptPullEpsdot1e8.00000.chkpt.GrNum.txt>

##### 3.1.2 READING THE PARAMETER FILE

The first step in analysing a Big Data file is to know what are the requirements/interests of the User. The parameter file, as mentioned in fig.2, is read and the source information of the files(Number of Files and their attributes), Parameters(Number of parameters and their attributes) are stored.

```
31      !***OPEN AND READ THE PARAMETER FILE FOR THE USER INPUT***!
32      open (unit=201, file='Parameter_File_BigData.txt', iostat = error)
33      if (error .ne. 0) then
34          write(*,*) "file cannot be opened"
35      end if
36      read(201, *)
37      read(201,*)num_files
38      print*, "Number of Files==",num_files
39      read(201, *)
40      allocate(filename_arr(num_files))
41      allocate(file_attributes_arr(3,num_files))
42      !READ FOR STORING THE FILE NAMES AND FILE ATTRIBUTES
43      a = 0
44      do while(a<num_files)
45          read(201,*)filename_arr(a+1), file_attributes_arr(:,a+1)
46          a = a+1
47      end do
48      a = 1
49      do a = 1,num_files
50          print*, "filename:::",filename_arr(a)
51          print*, "file attributes:::",file_attributes_arr(:,a)
52      end do
53      read(201,*)
54      read(201,*)
55      read(201,*)num_props
56      !!ALLOCATE THE ALLOCATABLE ARRAY DIMENSIONS FROM THE INPUT READ FROM PARAMETER FILE
57      allocate(prop_name_arr(num_props))
58      allocate(prop_attributes_arr(3,num_props))
59      b = 0
60      do while(b<num_props)
61          read(201,*)prop_name_arr(b+1), prop_attributes_arr(:,b+1)
62          b = b+1
63      end do
64      read(201,*)
65      read(201,*) output_filename      !!Specify the output File Name
66      close(201)
67      !CLOSE THE PARAMETER FILE
```

Figure 5: Code for Reading Parameter File

### **FORTRAN File:\$<Big\_Data\_Avg.f90>Parameter\_File\_BigData.**

**Inference:** In line 31, Parameter file is opened and the User data is stored in variables. From the fig.2 and fig.5:

- *num\_files* stores the value of number of files the User wants to read.
- *filename\_arr* is a 1D array which stores the names of the files inputted by User.
- *file\_attributes\_arr* is a 2D array which stores the attributes of each file in corresponding order of rows as file numbers.
- *prop\_name\_arr* is a 1D array which stores the Parameter properties in the same sequence.
- *prop\_attributes\_arr* is a 2D array which stores the attributes of parameter properties in corresponding order of rows as file numbers.
- *Output\_filename* is a 'character' variable which reads the name of the Output file into which the Average Properties after analysis are to be written.

#### **3.1.3 EXTRACTION OF DATA**

- **Assigning Atom\_ID array:** Once the attributes of the parameter properties from data files are known from the fig.5, immediate step is to extract the necessary data quantities into a location which can be used repeatedly for analysis. For extracting the data, one needs have a reference point in each file which maintains the data accuracy or its quality and extracts necessary data quantitites w.r.t the reference point. The reference point here is the '*Atom\_ID Number*'. This number is the first column of each file which is used for extracting data from these files and saving into an array. The User mentions the reference '*atomID*' column number from a certain file. This is obtained from the 'Parameter tag check' for '*atomID*'. Inorder to extract the '*atomID*' column the data from the file, the data file needs to be read into a 2D array '*temp\_arr*'. This array is an *allocatable array* which can be reused agin later.
- **Parameter Tag Check:** Since a Big Data File is already read into an array,for the benefit of Computation Cost, a check should be condicited for the presence of any other Parameters mentioned by the User in the same file. This check is conducted by '*Parameter Tag check*' via the help of *prop\_name\_arr* and *prop\_attribute\_arr* obtained in fig.5. Firstly, the property name is checked (like *Coord*) and then their file number is verified like at line 114 and 116 in fig.6.

```

109      !EXTRACTING THE ATOM ID ARRAY FROM TEMPORARY ARRAY
110      atomid_arr = temp_arr(1:1:file_attributes_arr(1,atomid_filenum)-file_attributes_arr(3,atomid_filenum))
111      iprop_arr(1,:)=atomid_arr
112      !ASSIGNING ATOM_ID ARRAY TO THE FIRST COLUMN OF IPROP ARRAY
113      !!!!!*START CHECKING FOR PARAMETER TAGS***!!!
114      do while (d<=num_props)
115          if (prop_attributes_arr(2,d)==atomid_filenum)then
116              !-----*!
117              if (trim(prop_name_arr(d))=='Coord') then
118                  iprop_arr(2:4,:)=temp_arr(prop_attributes_arr(3,d):prop_attributes_arr(3,d)+2,:)
119                  !print*, "===== ", iprop_arr(1:4,:)
120              else if (trim(prop_name_arr(d))=='struct_type') then
121                  iprop_arr(5,:)=temp_arr(prop_attributes_arr(3,d),:)
122                  !print*, "===== ", iprop_arr(1:5,:)
123              else if (trim(prop_name_arr(d))=='GrNum') then
124                  iprop_arr(6,:)=temp_arr(prop_attributes_arr(3,d),:)
125                  !print*, "===== ", iprop_arr(1:6,:)
126              else if (trim(prop_name_arr(d))=='Stress') then
127                  iprop_arr(7:12,:)=temp_arr(prop_attributes_arr(3,d):prop_attributes_arr(3,d)+5,:)
128                  !print*, "===== ", iprop_arr(1:12,:)
129              else if (trim(prop_name_arr(d))=='Volume') then
130                  iprop_arr(13,:)=temp_arr(prop_attributes_arr(3,d),:)
131                  !print*, "===== ", iprop_arr(1:13,:)
132              end if
133              !-----*!
134          end if
135          d = d+1
136      end do

```

Figure 6: Parameter Tag Check

- **Assembling an array of desired quantities:** The extracted *atomid\_array* and other quantities, if any, in the same file are assembled in the *iprop\_arr*. It is a 2D array which assembles all the necessary quantities in different columns. At line 126, in fig.6 it can be observed that *Stress* is extracted from a file and is assembled in it from 7 to 12 columns.
- **Properties in other Files:** At line 18, in fig.6, looping over files other than the one containing *atomid\_arr* for properties and extracting them into *iprop\_arr*. At line 244, in fig.6, the speciality of the program is its feature called *counter*, which speeds up the iteration by terminating the program after extracting the quantities w.r.t *atomID*, instead of looping over the entire file even after extracting the data.

```

235      !*CHECK FOR STRESS*
236      else if (trim(prop_name_arr(f))==>'Stress') then
237          g = 1
238          counter = 1
239          do while(g<=size(atomid_arr))
240              h = counter
241              do while(h<=span)
242                  if (atomid_arr(g)==temp_arr(1,h))then
243                      iprop_arr(7:12,g)=temp_arr(prop_attributes_arr(3,f):prop_attributes_arr(3,f)+5,h)
244                      counter = h !COUNTS THE NO. OF LINES READ AND STARTS FROM THIS LINE IN THE NEXT ITERATION, SAVING TIME
245                      goto 65
246                  end if
247                  h = h+1
248              end do
249 65 continue
250          g = g+1
251      end do

```

Figure 7: Assembling iprop array

- **THREE DIMENSIONAL AVERAGE PROPERTIES ARRAY:** Looping over the size of the *atomID array*, level1 is considered as the structure type, Columns as Average Properties like *Coordinates, Stresses, Grain Volume, Number of atoms, Von Mises Stress* and Rows as Grain Numbers. The structure type ranges from 0,1,2,..Maximum structure type in the file and additionally 3 more variants like *fcc+hcp, fcc+hcp+other defects, All structure types*. Therefore, the size of array *avg\_props* is (*Maximum Structure type in file+4,12, Number of Grains in the crystal*). It is +4 instead of 3 because Structure Type start from 0, which is other defects, and FORTRAN indexing starts from 1. In fig.8, the highly efficient 3D array with intricate operations can be observed. At line 315, the Summation of volume over a grain number can be observed and the values are saved in the 10 column of the *avg\_prop\_arr*.

```

309      !**LEVEL 1 = STRUCTURE TYPE; COLUMNS = AVERAGE PROPERTIES, NUMBER OF ATOMS, GRAIN VOLUME, VON MISES STRESS; ROWS = GRAIN NUMBER**!
310      q = 1
311      n = 1
312      do q = 1,size(atomid_arr)
313          avg_props(int(iprop_arr(5,q))+1,4:9,int(iprop_arr(6,q)))= &
314              & avg_props(int(iprop_arr(5,q))+1,4:9,int(iprop_arr(6,q)))+ iprop_arr(7:12,q)*iprop_arr(13,q) !STRESS * VOLUME
315          avg_props(int(iprop_arr(5,q))+1,10,int(iprop_arr(6,q))) = &
316              & avg_props(int(iprop_arr(5,q))+1,10,int(iprop_arr(6,q)))+ iprop_arr(13,q) !SUMMATION OF VOLUME FOR A GRAIN
317          avg_props(int(iprop_arr(5,q))+1,1:3,int(iprop_arr(6,q))) = &
318              & avg_props(int(iprop_arr(5,q))+1,1:3,int(iprop_arr(6,q)))+ iprop_arr(2:4,q) !SUMMATION OF COORDINATES FOR A GRAIN
319          avg_props(int(iprop_arr(5,q))+1,11,int(iprop_arr(6,q))) = &
320              & avg_props(int(iprop_arr(5,q))+1,11,int(iprop_arr(6,q)))+ 1 !NUMBER OF ATOMS IN A PARTICULAR GRAIN FOR A STRUCTURE TYPE
321      end do
322      !**ADDING THREE ELEMENTS IN LEVEL-1: 4->FCC+HCP, 5->FCC+HCP+OTHER DEFECTS, 6->ALL STRUCTURE TYPES**!
323      p = 1
324      r = 1
325      do p = 1,grnmax
326          avg_props(structmax+2,:,p)=avg_props(2,:,p)+avg_props(3,:,p)
327          avg_props(structmax+3,:,p)=avg_props(1,:,p)+avg_props(2,:,p)+avg_props(3,:,p)
328          do r=1,structmax+1
329              avg_props(structmax+4,:,p)=avg_props(structmax+4,:,p)+avg_props(r,:,p)
330          end do
331      end do

```

Figure 8: 3D Average Property Array

- **Writing Output File:** Once the analysis is complete, the Output is written into the Output file with filename mentioned by the user in the Parameter File. The file automatically is stored in the same folder as program. For the benefit of user, some Terminal printing facility is available which informs the user when the analysis is finished and the program is writing the output to a file and its name.

```

367      !|WRITING THE DATA TO A TEXT FILE|
368      !For other defect structure types!
369      print*, "DEAR USER, THE AVERAGE PROPERTIES ARE CALCULATED AND BEING WRITTEN INTO A FILE"
370      !!!**OPEN THE FILE INTO WHICH THE RESULT IS TO BE STORED***!!!
371      open(210, file = Output_filename, status="new") !!!THE FILE NAME INTO WHICH THE DATA IS TO BE WRITTEN IS SPECIFIED***!!!
372      write(210,*)"*****PERSONAL PROGRAMMING PROJECT*****"
373      write(210,*)"AUTHOR: PADMANABHA PAVAN CHANDRA VUNDURTHY(G2758) (Msc.Computational Materials Science) &
374      & under the supervision of DR. ARUN PRAKASH"
375      write(210,*)"#TITLE: Big Data Visualization of Large and Ultra Large Scale&
376      & Atomatic Simulation"
377      write(210,*)"#Analysis of Average Properties of the Grain separated &
378      & in blocks of structure types: 0:Other Unknown Defects,1=FCC,2=HCP,3=BCC,...&
379      & FCC+HCP, FCC+HCP+0, All structure types."
380      do t = 1,num_files
381          write(210,"#file name->,t,:=",trim(filename_arr(t)))
382          write(210,"#file attributes in sequence:-", file_attributes_arr(:,t))
383      end do
384      write(210,*)"#Macroscopic Von Mises Stress:->",Macro_VM
385      u = 1
386      o = 1
387      do u = 1,structmax+4
388          do o = 1,gmax
389              if (o==1)then
390                  if(u==structmax+2)then
391                      write(210,"=====STRUCTURE TYPES:FCC+HCP=====")
392                  else if(u==structmax+3)then
393                      write(210,"=====STRUCTURE TYPES:FCC+HCP+other defects=====")
394                  else if (u==structmax+4)then
395                      write(210,"=====ALL STRUCTURE TYPES=====")
396                  else
397                      write(210,"=====STRUCTURE TYPE->,u-1,=====")
398                  end if
399                  write(210,"#GRAIN NUMBER COORDINATES: X Y Z | STRESS XX YY ZZ ZY ZX XY | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |")
400                  write(210,*)"#AVERAGE VON MISES STRESS FOR THIS STRUCTURE TYPE IS",vm_struct_arr(u)
401              end if
402              write(210,o,avg_props(u,:,o))
403          end do
404      end do
405      close(210)

```

Figure 9: Writing the Output File

At line 371, in fig.9, the output file name read from the 'parameter file' is provided for the program to write the Output.

## 3.2 PART2: VISUALIZATION USING PYTHON

### 3.2.1 ARGPARSE MODULE

- The **argparse module** makes it easy to write user-friendly command-line interfaces. The program defines what arguments it requires, and *argparse* will figure out how to parse those out of *sys.argv*. The argparse module also automatically generates help and usage messages and issues errors when users give the program invalid arguments. Filling an ArgumentParser with information about program arguments is done by making calls to the *add\_argument()* method. Generally, these calls tell the ArgumentParser how to take the strings on the command line and turn them into objects. This information is stored and used when *parse\_args()* is called.

```

189 implementation of Argparse Module for taking User Input from Command Line Interface
190 ...
191 parser = argparse.ArgumentParser(description='Big Data Visualization of Large and Ultra Large Scale Atomistic Simulations')
192 #SET: ranges from 1 to 4 types of visualization Plots
193 parser.add_argument('set', type=int, help='Select the set of visualization:Set1:Average Volume Polar Plots;Set2:Average Stress Polar Plots;Set3:Distribution Plots;Set4:All the plots')
194 parser.add_argument('Max_GrainNumber', type=int, help='Specify the Maximum grains in the polycrystal')
195 parser.add_argument('Max_Struct_Typ', type=int, help='Specify the Maximum Structure type in the polycrystal')
196 parser.add_argument('start_grnnum', type=int, help='Specify the start of grain number the user is interested in..')
197 parser.add_argument('iteration', type=int, help='an integer specifying the iteration of grain numbers at interest')
198 parser.add_argument('end_grnnum', type=int, help='Specify the end of grain number the user is interested in..')
199 parser.add_argument('structure_type', help='Mention the interested structure type/types to be considered for visualization\nA:Other defects\nB:Fcc\nC:Hcp\nD:Fcc+hcp\nE:fcc+hcp+other de
200 parser.add_argument('Avg_prop_file_name', default = [], nargs='?', type=argparse.FileType('r'), help=
201 | 'File containing the Average properties of grains analysed from the Big Data file')
202 parser.add_argument('Neighbour_Grains', default=[], nargs='?', type=argparse.FileType('r'), help='File containing the Nearest Neighbouring Grains')
203 ##User input are read into the 'sys.argv' list in their original format
204 args = parser.parse_args()
205 for l in range(1,7):
206     sys.argv[l]=int(sys.argv[l])

```

Figure 10: Code for Parsing

In fig.10, the following arguments were passed:

- **set**:Select the set of visualization;Set1:Average Volume Polar Plots;Set2:Average Stress Polar Plots;Set3:Distribution Plots;Set4:All the Plots
- **Max\_GrainNumber**:Specify the Maximum grains in the polycrystal.
- **Max\_Struct\_Typ**:Specify the Maximum Structure Type in the polycrystal
- **start\_grnnum**:Specify the start of grain number the user is interested in..
- **iteration**:an integer specifying the iteration of grain numbers at interest
- **end\_grnnum**:Specify the end of grain number the user is interested in
- **structure\_type**:Mentions the interested structure type/types to be considered for visualization;A:Other defects;B:Fcc;C:Hcp;D:Fcc+hcp;E:fcc+hcp+other defects;F:all structure types
- **Avg\_prop\_filename**:File containing the Average properties of grains analysed from the Big Data file
- **Neighbour\_Grains**:File containing the Nearest Neighbouring Grains

With the help of *sys.argv*, all the User information can be handled as in line 204.

### 3.2.2 PLOTTING FUNCTIONS

- *Volume\_Plots*:This function is useful for plotting Polar plots depicting the Average Volumes in a conglomerate w.r.t the Average Volume in a polycrystal.The complete circle depicts the 'Average Fraction of grain in the polycrystal'; the sector angle is the Volume Fraction w.r.t neighbours in the conglomerate;the radius of the sector is the Volume fraction of grain in polycrystal; color scheme of each sector is based on the 'divergence color mapping' based on the polarized Von Mises stress values from 'blue' to 'white' to 'red'.  
*Input Command*:\$ Volume\_Plots(f,gr\_vol\_frac,vol\_list,tot\_cong\_stress,nng,vol\_mean)
- *Stress\_Plots*:This function is useful for plotting Polar plots depicting the Average Stresses in a conglomerate. The two complete circles depict the Average stress in a Polycrystal and Average stress in the conglomerate. The angle of sector is the Volume fraction w.r.t neighbors(in the current conglomerate); Radii if the sectors is the Stress in Grains(calculated Von Mises);color scheme of each sector is based on the 'divergence color mapping' based on the polarized Von Mises stress values transition from 'blue' to 'white' to 'red' or in between them.  
*Input Command*\$: Stress\_Plots(q,gr\_vol\_frac,vol\_list,tot\_cong\_stress,nng,Macro\_VM, stress\_in\_cong,hydstress\_cong)

– *Distribution\_Plots*: This function plots 2 dimensional graphs for 3cases. The Grain size is calculated from its volume using equation for Volume of a sphere. Its dimensions are as specified in the supplied data file.

- \* Grain size vs Polarized hydrostatic\_stress, hydrostatic\_stress, triaxiality.
- \* Grain size vs Polarized Von Mises,Von Mises stress
- \* Grain size vs Hydrostatic stress, triaxiality

#### Von Mises Stress in a Grain:

$$\sigma_v = \sqrt{\frac{1}{2} \left[ (\sigma_{11} - \sigma_{22})^2 + (\sigma_{22} - \sigma_{33})^2 + (\sigma_{33} - \sigma_{11})^2 \right] + 3(\sigma_{12}^2 + \sigma_{23}^2 + \sigma_{31}^2)} \quad (1)$$

#### Polarized Von Mises Stress in a Grain:

$$\sigma_{polarised\_VM} = \sigma_{MacroVonMisesStress} - \sigma_v \quad (2)$$

#### Hydrostatic Stress in a Grain

$$\sigma_m = \frac{1}{3} I_1 = \frac{1}{3} (\sigma_1 + \sigma_2 + \sigma_3) \quad (3)$$

#### Polarized Hydrostatic Stress in a Grain

$$\sigma_{polarised\_Hyd} = \sigma_{MacroHydrostaticStress} - \sigma_m \quad (4)$$

**Triaxiality:** The Ratio of Hydrostatic Stresses and Von Mises Stresses. The stress triaxiality is an important parameter in explaining the geometry dependence of J-R curves. By comparing the stress triaxiality across the ligament for the specimen and the cracked component it is possible to assess whether the cracked component exhibits the similar fracture behaviour as the specimen.

$$\text{Triaxiality, } \eta = \frac{\sigma_m}{\sigma_{VM}} \quad (5)$$

$$\eta = \frac{(\sigma_1 + \sigma_2 + \sigma_3) / 3}{\sqrt{\frac{1}{2} \left[ (\sigma_1 - \sigma_2)^2 + (\sigma_2 - \sigma_3)^2 + (\sigma_3 - \sigma_1)^2 \right]}} \quad (6)$$

Input Command:\$Distribution\_Plots(r,gr\_size,polarized\_stress\_hyd,hyd\_stress,triaxiality,polarized\_stress\_vm,vm\_s  
Final Input Command\$visualize\_data.py 1 122 2 8 0 0 D test2.txt neighbors.txt

The user input is function\_1; grain number 8; structure type Fcc+hcp which can be read from the command line

## 4 RUN! & OUTPUT

### 4.1 OUTPUT OF ANALYSIS: FORTRAN

*Input Filename:* Big\_Data\_Avg.f90

*Output Filename:* Out\_Average\_Properties\_000.txt

*Command Used:* gfortran -o BigData Big\_Data\_Avg.f90

```

1 | ****PERSONAL PROGRAMMING PROJECT*****
2 | #AUTHOR: FADMANABH FAVAN CHANDRA VUNDURHY(62750) under the supervision of DR. ARUN PRAKASH
3 | #TITLE: Big Data Visualization of Large and Ultra Large Scale Atomistic Simulation
4 | #Analysis of Average Properties of the atoms separated in blocks of structure types: 0=Other Unknown Defects, 1=FCC, 2=HCP, 3=BCC, ... FCC+HCP, HCP+FCC, All structure types.
5 | #File names of the output files generated: GenNN.txt
6 | #file attributes in sequence:-> 18632508 11 8
7 | #file name-> 2 :Sorted_Stress_00001.txt
8 | #file attributes in sequence:-> 18632910 13 9
9 | #Macroscopic Von Mises Stress:-> 36.3858125
10 | =====STRUCTURE TYPE=====
11 | #GRAIN NUMBER| COORDINATES| X Y Z | STRESS XX YY ZZ XY XZ YX | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |
12 | #AVERAGE VON MISES STRESS FOR THIS STRUCTURE TYPE IS 326.650948
13 | 1 432.741547 1034.44836 77.3495483 -811.026428 -716.803345 -610.946533 -67.5365067 -79.6209946 0.659035504 421322.719
14 | 2 406.115051 799.608459 75.918124 -789.860413 -770.771240 -828.792480 -95.57763577 -51.3218269 -16.3815689 306090.750
15 | 3 888.489624 655.835632 75.9183670 -991.877747 -1033.17993 -637.436768 -81.16437721 -11.8227434 -10.1940355 357057.094
16 | 4 1384.20996 608.589966 74.7481461 -805.394714 -679.517151 -609.736267 39.5209618 -7.58723354 -53.8090324 350403.250
17 | 5 497.694275 259.767578 75.0820389 -669.968750 -781.577637 -383.774933 -30.9644871 17.8341599 81.4959717 287461.625
18 | 6 130.113358 840.379150 76.5878983 -1086.48950 -1087.50867 -653.679321 -28.2191124 -73.8073578 -100.556442 424181.031
19 | 7 769.827271 155.372955 75.8221893 -808.344543 -846.308472 -412.757996 -21.1091900 -73.2035675 6.44057941 336378.031
20 | 8 1624.18860 313.291954 76.5558319 -679.980945 -593.929016 -372.642731 5.53026962 15.0568019 68.6287231 50177.250
21 | 9 743.418335 303.223938 77.0325699 -773.728394 -693.703735 -789.049011 60.4842644 41.1435814 -8.10856247 368593.094
22 | 10 1151.30005 723.310974 76.9029770 -501.962891 -298.072021 -412.825043 74.8614120 73.2609558 -49.4360123 272336.668
23 | 11 1126.58228 257.324890 77.2834473 -602.725464 -707.894653 -817.555054 25.7849636 -17.5692596 -37.6587715 336139.812
24 | 12 543.836975 351.313690 77.5519562 -813.284973 -812.297546 -469.028229 23.2262840 15.3496704 -20.2469254 265500.156
25 | 13 529.162170 187.050354 76.2216034 -710.003174 -670.335205 -298.208069 -62.6268845 43.2074242 -30.2464313 292890.344
26 | 14 307.184246 508.551666 76.3852615 -720.233218 -564.223783 -528.043396 -15.7117195 23.6106396 82.4603173 303005.168
27 | 15 179.582114 270.181049 76.5232314 -780.233548 -847.35765 -337.804414 -14.7807795 -14.7807795 -33.804414 -51.3136711 333511.459
28 | 16 708.928884 315.666779 76.8193156 -693.615019 -786.770508 -317.447192 1.4688454 -40.596329 1.4688454 -40.596329 51.3136711 404527.344
29 | 17 1294.36084 946.118286 76.9160538 -571.489929 -832.604309 -292.712952 -49.76564799 -49.3524370 14.6376820 427022.719
30 | 18 593.924805 721.379211 75.4556533 -1086.09094 -866.227051 -667.543701 -57.3405775 -15.5207167 -124.159706 269466.875
31 | 19 1287.80591 601.410278 76.8024521 -733.278625 -836.402893 -399.716766 -11.7273788 33.3333969 8.09501076 402635.969
32 | 20 1131.69824 1125.99902 76.3123703 -875.842590 -982.650757 -694.604736 23.7355022 13.0347471 215199.844
33 | 21 453.341003 909.125244 76.4666443 -759.030151 -843.186523 -447.797699 -6.44706249 -39.2174606 16.1598949 393575.219
34 | 22 1556.66877 1080.55469 75.4864807 -916.226624 -1030.620808 -325.841064 1.76506376 -20.1628268 106.220314 33511.469
35 | 23 64.0333176 595.339172 75.9362106 -936.080688 -978.175903 -622.508972 -63.8120270 -49.2293557 107.777634 263335.812
36 | 24 992.215576 459.316132 75.0406265 -1132.43066 -1158.69617 -551.078857 7.45950937 -13.0121326 -34.5318069 466899.688
37 | 25 1586.65747 600.721985 76.9979019 -1113.02942 -598.060669 -589.133179 -24.3848858 -22.2088833 50.7378731 477434.031
38 | 26 1419.48242 517.992737 76.2396622 -699.999207 -878.550781 -686.997192 49.8789139 -39.2118454 -135.210388 395318.031
39 | 27 84.1235657 92.9419479 76.3966064 -858.131104 -707.361633 -802.770874 -60.9660339 38.46494939 -7.58636236 309649.625
40 | 28 222.524658 320.382294 76.8099289 -880.661926 -784.881775 -571.594421 16.4166069 12.2184534 -89.6977539 284557.250
41 | 29 1617.87366 832.300293 75.2613373 -1082.21082 -1127.65947 -398.712555 -9.29895210 -24.2657738 82.5025330 207283.750

```

Figure 11: Average Properties Output File

**Inference:** Fig.11 is a snapshot of the bigger output file, attached in the appendix, which contains all the analysed average properties in an efficient format along with the mention of the Input File names, File attributes, Macroscopic Von Mises Stress, Von Mises Stress of each structure type. The headers and comments make the output file easier for the User to understand and self explanatory. Each block of structure type is separated by headers mentioning the structure type, sequence of quantities, Von Mises stress in that particular structure type.

## 4.2 OUTPUT OF VISUALIZATION: PYTHON

### 4.2.1 VOLUME PLOTS

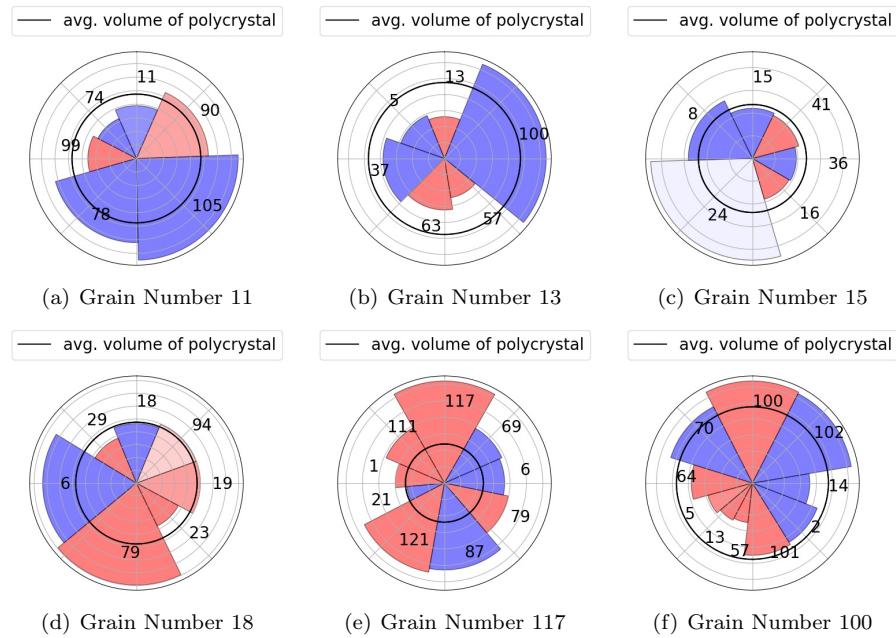


Figure 12: Visualization of Average Volume of Grains in a conglomerate w.r.t Average Volume of Polycrystal

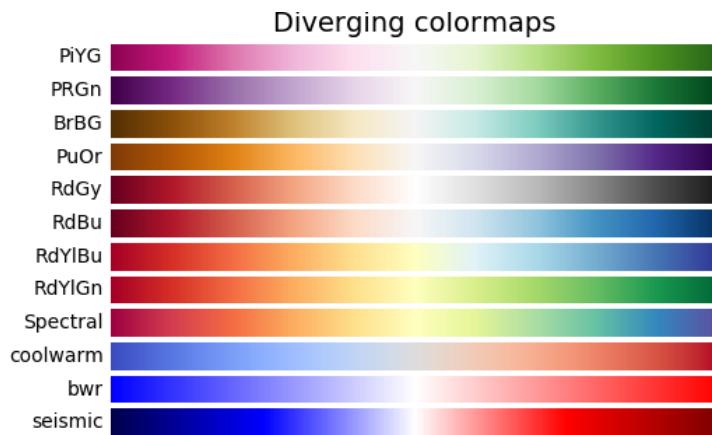


Figure 13: Diverging Color Maps

**Inference:** It can be observed from the above plots that the circle in 'black' represents the average volume of polycrystal. The angle between the sectors is the volume fraction with respect to neighbors(in terms of current conglomerate). The radius of the sector is the average volume of the grain in the polycrystal. Color of each sector is based on 'Divergence color maps' known as blue-white-red transition(bwr) which is based on of the polarization stress tensor. This particular plots are for Fcc+Hcp structure type by selecting 'D' in the parsing options of the file. In the fig.13, the diverging color map scheme 'bwr' is used for coloring the sectors based on the polarized stress tensors.'The structure type considered is fcc+hcp.

#### 4.2.2 STRESS PLOTS

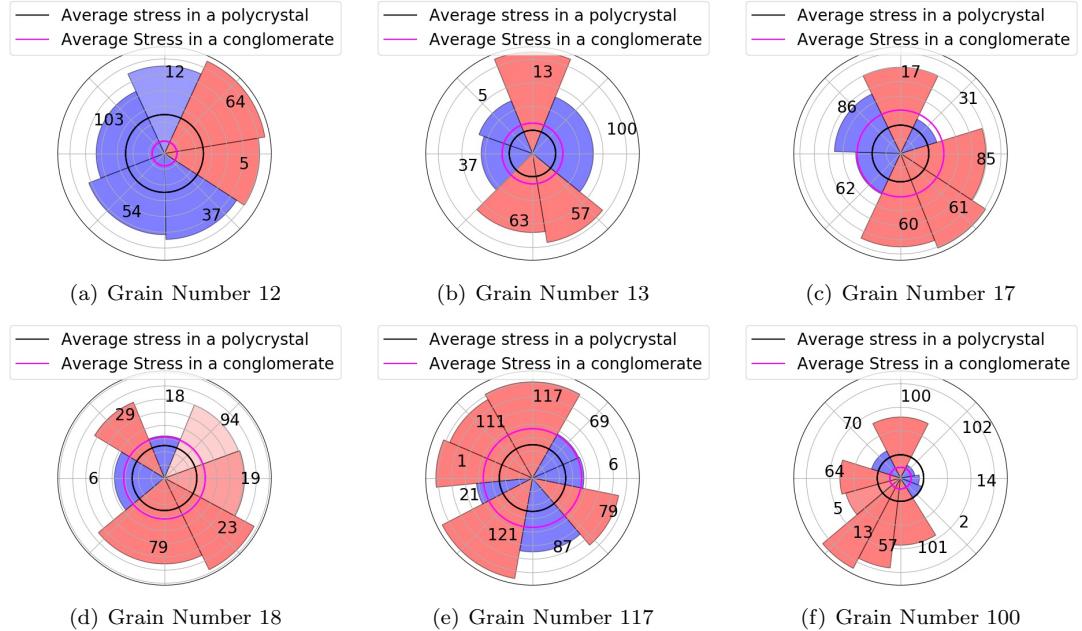


Figure 14: Visualization of average stress in grains in a conglomerate with respect to average stress of polycrystal and average stress of the conglomerate

**Inference:** It can be observed from the above plots that the circle in 'black' represents the average stress in a polycrystal and a circle in 'magenta' represents average stress in a conglomerate. The angle between the sectors is the volume fraction with respect to neighbors(in terms of current conglomerate). The radius of the sector is the average stress of the grain in the polycrystal. Color of each sector is based on 'Divergence color maps' known as blue-white-red transition(bwr) which is based on the polarization stress tensor. This particular plots are for Fcc+Hcp structure type by selecting 'D' in the parsing options of the file. Similarly, like in fig.13the diverging color map scheme 'bwr' is used.The structure type considered here is fcc+hcp

#### 4.2.3 DISTRIBUTION PLOTS

- Function:**Distribution\_Plots** : CASE 1

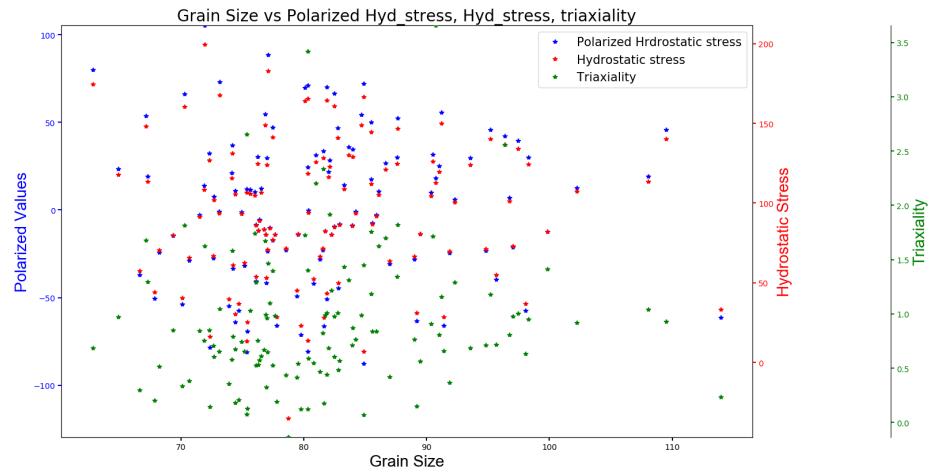


Figure 15: Visualization of Grain size vs polarized hydrostatic stress, hydrostatic stress, triaxiality

- **Function:Distribution\_Plots : CASE 2**

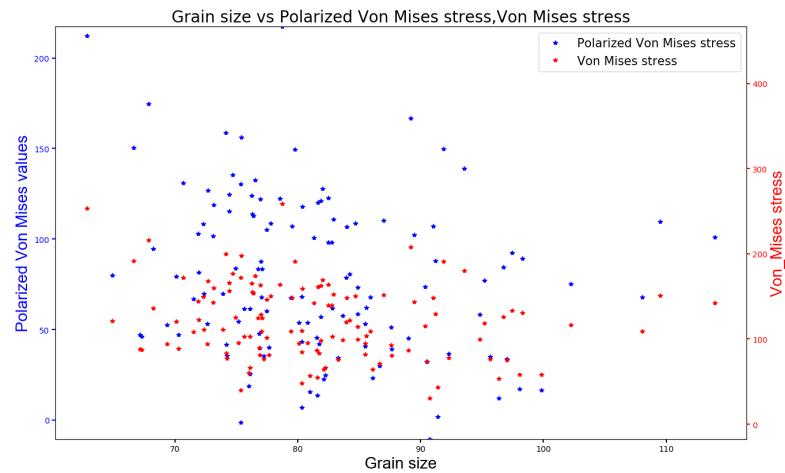


Figure 16: Visualization of Grain size vs polarized Von Mises stress, Von Mises stress

- **Function:Distribution\_Plots : CASE 3**

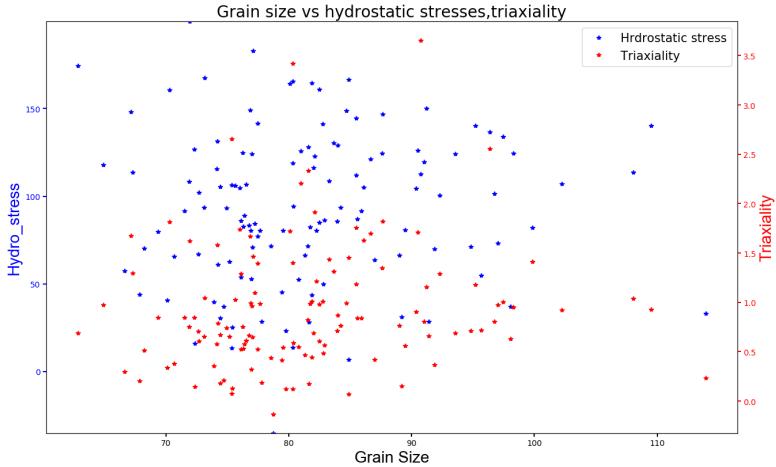


Figure 17: Visualization of Grain size vs hydrostatic stress, triaxiality

## 5 CODE TESTING

All the test cases are run via the same Fortran file. The only change is the name of the input file via parameter file.

## 5.1 TEST CASE 1

**Aim:** To verify the analysis of Stress\_xx by replacing the Stress\_xx value in all atoms w.r.t their Grain Number and considering all other stresses as '0' and constant volume(=0.5).

**File Used:** Generate Data file using *testcase\_sig\_xx\_1.f90* and replace it in the place of stress file name in parameter file.

**Expected Result:** Since all other stresses are '0'. The Stress\_xx and Von Mises Stress should be same as generated for each Grain for all Structure Types.

### Obtained Result:

Figure 18: Test Case 1

Inference:!!Verified!! Output File: Out\_Average\_Properties\_testcase1.txt

## 5.2 TEST CASE 2

**Aim:** To verify the analysis of Stress\_yy by replacing the Stress\_yy value in all atoms w.r.t their Grain Number\*2 and considering all other stresses as '0' and constant volume(=0.5).

**File Used:** Generate Data file using *testcase.sig-yy-2.f90* and replace it in the place of stress file name in parameter file.

**Expected Result:** Since all other stresses are '0'. The Stress<sub>yy</sub> and Von Mises Stress should be same as generated for each Grain for all Structure Types.

### Obtained Result:

```

135 *****STRUCTURE TYPE-> 2 *****
136 1 NUMBER COORDINATES: X Y Z | STRESS XX YY ZZ ZX XY | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |
137 2 VON MISES STRESS FOR THIS STRUCTURE TYPE IS 127.987524
138 3 1 444.394331 1047.9670 76.4400536 0.0000000 2.0000000 0.0000000 0.0000000 0.0000000 66078.0000 17314.000 2.0000000
139 4 5 444.394331 1047.9670 76.4400536 0.0000000 2.0000000 0.0000000 0.0000000 0.0000000 62291.5000 12487.0000 4.0000000
140 3 890.211357 636.470715 76.4579785 0.0000000 0.0000000 0.0000000 0.0000000 0.0000000 65249.0000 17049.0000 6.0000000
141 4 1391.74634 613.161926 76.45791168 0.0000000 0.0000000 0.0000000 0.0000000 0.0000000 69426.9000 138953.000 8.0000000
142 5 9 239.295202 76.45791168 76.45791168 0.0000000 10.0000000 0.0000000 0.0000000 0.0000000 41876.0000 82746.0000 18.000000
143 5 119.832876 75.8556445 76.45791168 0.0000000 12.0000000 0.0000000 0.0000000 0.0000000 505522.5000 238745.0000 18.000000
144 7 741.791748 305.136230 76.4595537 0.0000000 14.0000000 0.0000000 0.0000000 0.0000000 75126.0000 150252.000 14.000000
145 8 1412.59190 305.136230 76.4595537 0.0000000 14.0000000 0.0000000 0.0000000 0.0000000 59444.0000 14258.000 14.000000
146 9 1412.59190 305.136230 76.4595537 0.0000000 14.0000000 0.0000000 0.0000000 0.0000000 10702.0000 14258.000 14.000000
147 10 1153.03625 721.435913 76.2339950 0.0000000 20.0000000 0.0000000 0.0000000 0.0000000 36425.0000 72586.0000 20.000000

```

Figure 19: Test Case 2

**Inference:** !!Verified!! **Output File:** Out\_Average\_Properties\_testcase2.txt

### 5.3 TEST CASE 3

**Aim:** To verify the analysis of Stress<sub>zz</sub> by replacing the Stress<sub>zz</sub> value in all atoms w.r.t their Grain Number\*3 and considering all other stresses as '0'.

**File Used:** Generate Data file using *testcase\_sig\_zz\_1.f90* and replace it in the place of stress file name in parameter file.

**Expected Result:** Since all other stresses are '0'. The Stress<sub>zz</sub> and Von Mises Stress should be same for all Grains and for all Structure Types.

### Obtained Result:

```

240 *****STRUCTURE TYPE-> 2 *****
241 1 NUMBER COORDINATES: X Y Z | STRESS XX YY ZZ ZX XY | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |
242 2 VON MISES STRESS FOR THIS STRUCTURE TYPE IS 190.109358
243 3 1 441.114195 1069.32249 68.5295578 0.0000000 3.0000000 0.0000000 0.0000000 0.0000000 92.1590000 181.00000 3.0000000
244 4 5 441.114195 1069.32249 68.5295578 0.0000000 3.0000000 0.0000000 0.0000000 0.0000000 111.000000 232.00000 4.0000000
245 3 589.182307 676.206404 53.1725907 0.0000000 9.0000000 0.0000000 0.0000000 0.0000000 95.000000 134.00000 9.0000000
246 4 1393.68701 629.143494 57.3501392 0.0000000 12.0000000 0.0000000 0.0000000 0.0000000 125.500000 251.00000 12.000000
247 5 127.143494 629.143494 57.3501392 0.0000000 12.0000000 0.0000000 0.0000000 0.0000000 495.000000 139.00000 12.000000
248 6 104.293971 840.446933 76.4259109 0.0000000 15.0000000 0.0000000 0.0000000 0.0000000 354.000000 712.00000 15.000000
249 7 764.366438 130.636368 74.4622559 0.0000000 21.0000000 0.0000000 0.0000000 0.0000000 82.500000 145.00000 21.000000
250 7 1697.499597 154.266790 73.424241 0.0000000 24.0000000 0.0000000 0.0000000 0.0000000 398.500000 717.00000 24.000000
251 9 1697.499597 203.256450 86.274800 0.0000000 27.0000000 0.0000000 0.0000000 0.0000000 231.000000 42.000000 27.000000
252 10 1135.14270 695.40526 72.7494660 0.0000000 30.0000000 0.0000000 0.0000000 0.0000000 231.000000 46.000000 30.000000

```

Figure 20: Test Case 3

**Inference:** !!Verified!! **Output File:** Out\_Average\_Properties\_testcase3.txt

### 5.4 TEST CASE 4

**Aim:** To verify the analysis of Stress<sub>yz</sub> by replacing the Stress<sub>yz</sub> value in all atoms w.r.t their Grain Number\*4 and considering all other stresses as '0' and constant volume(=0.5).

**File Used:** Generate Data file using *testcase\_sig\_yz\_4.f90* and replace it in the place of stress file name in parameter file.

**Expected Result:** Since all other stresses are '0'. The Stress<sub>yz</sub> should be same as generated for each Grain in all structure type and Von Mises Stress should be constant throughout the structure type.

### Obtained Result:

```

10 *****STRUCTURE TYPE-> 0 *****
11 1 NUMBER COORDINATES: X Y Z | STRESS XX YY ZZ ZX XY | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |
12 2 VON MISES STRESS FOR THIS STRUCTURE TYPE IS 436.041951
13 1 432.741547 1034.44836 77.3495453 0.0000000 0.0000000 0.0000000 0.0000000 0.0000000 1894.0000 1478.0000 6.9320311
14 5 432.741547 1034.44836 77.3495453 0.0000000 0.0000000 0.0000000 0.0000000 0.0000000 7125.5000 14195.0000 11.8564940
15 3 891.459424 655.835632 75.8183970 0.0000000 0.0000000 12.0000000 0.0000000 0.0000000 8124.50000 12489.0000 20.7846988
16 4 1394.20996 605.559966 74.7451461 0.0000000 0.0000000 14.0000000 0.0000000 0.0000000 8261.50000 16827.0000 27.7120124
17 5 1697.499597 203.256450 86.274800 0.0000000 0.0000000 16.0000000 0.0000000 0.0000000 1401.50000 14411.50000 34.5850177
18 6 130.636368 74.4622559 76.5579383 0.0000000 0.0000000 24.0000000 0.0000000 0.0000000 8598.50000 15183.0000 41.5850177
19 7 769.827271 155.3729585 75.8221893 0.0000000 0.0000000 28.0000000 0.0000000 0.0000000 7815.00000 15630.00000 40.4974213
20 8 1625.00000 318.299164 76.5556549 0.0000000 0.0000000 32.0000000 0.0000000 0.0000000 1222.50000 24424.00000 55.4262447
21 9 1625.00000 318.299164 76.5556549 0.0000000 0.0000000 36.0000000 0.0000000 0.0000000 1515.50000 27553.00000 62.5332294
22 10 1151.30005 723.310974 76.9029770 0.0000000 0.0000000 40.0000000 0.0000000 0.0000000 8725.00000 13450.00000 69.3023035
23 11 1124.58228 257.324890 77.2834473 0.0000000 0.0000000 44.0000000 0.0000000 0.0000000 8074.50000 16153.00000 76.2102356

```

Figure 21: Test Case 4\_1

Figure 22: Test Case 4\_2

**Inference: !!Verified!! Output File: Out\_Average\_Properties\_testcase4.txt**

## 5.5 TEST CASE 5

**Aim:** To verify the analysis of Stress\_xz by replacing the Stress\_xz value in all atoms w.r.t their Grain Number\*5 and considering all other stresses as '0' and constant volume(=0.5).

**File Used:** Generate Data file using *testcase\_sig\_xz\_5.f90* and replace it in the place of stress file name in parameter file.

**Expected Result:** Since all other stresses are '0'. The Stress\_xz should be same as generated for each Grain in all structure type and Von Mises Stress should be constant throughout the structure type.

### Obtained Result:

Figure 23: Test Case 5\_1

Figure 24: Test Case 5\_2

**Inference: !!Verified!! Output File: Out\_Average\_Properties\_testcase5.txt**

## 5.6 TEST CASE 6

**Aim:** To verify the analysis of Stress\_xy by replacing the Stress\_xy value in all atoms w.r.t their Grain Number\*5 and considering all other stresses as '0' and constant volume(=0.5).

**File Used:** Generate Data file using *testcase\_sig\_xy\_6.f90* and replace it in the place of stress file name in parameter file.

**Expected Result:** Since all other stresses are '0'. The Stress<sub>xy</sub> should be same as generated for each Grain in all structure type and Von Mises Stress should be constant throughout the structure type.

### Obtained Result:

```

510 =====STRUCTURE TYPES:FCC+HCP+other defect=====
511 IN NUMBER) COORDINATES: X Y Z | STRESS XX YY ZZ XY XZ YZ | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |
512 RAGE VON MISES STRESS FOR THIS STRUCTURE TYPE IS 664.06425
513 1 444.351022 1047.459875 76.4359812 0.0000000 0.0000000 0.0000000 6.0000000 66044.5000 152120.000 10.2953044
514 2 397.799505 945.655229 76.4245497 0.0000000 0.0000000 0.0000000 12.0000000 69552.0000 139104.000 20.7844008
515 3 890.020203 638.379883 76.434471 0.0000000 0.0000000 0.0000000 18.0000000 93481.5000 169431.000 31.1769142
516 4 410.401209 1047.459875 76.4359812 0.0000000 0.0000000 0.0000000 24.0000000 69552.0000 139104.000 40.2953077
517 5 495.401254 256.357605 76.4793194 0.0000000 0.0000000 0.0000000 30.0000000 48457.5000 96915.0000 51.9615250
518 6 120.688240 836.424812 75.9276942 0.0000000 0.0000000 0.0000000 36.0000000 114975.0000 229950.000 62.3532384
519 7 740.452576 302.957194 76.3755172 0.0000000 0.0000000 0.0000000 42.0000000 114975.0000 229950.000 72.7441319
520 8 1414.59492 320.4589483 76.4647599 0.0000000 0.0000000 0.0000000 48.0000000 93229.5000 184459.000 53.1284354
521 9 740.452576 302.957194 76.3755172 0.0000000 0.0000000 0.0000000 54.0000000 62034.0000 124065.000 53.5507465
522 10 1152.75623 717.495605 76.3755172 0.0000000 0.0000000 0.0000000 60.0000000 43176.0000 86352.0000 103.923050

```

Figure 25: Test Case 6\_1

```

513 =====STRUCTURE TYPES:FCC+HCP+other defect=====
514 IN NUMBER) COORDINATES: X Y Z | STRESS XX YY ZZ XY XZ YZ | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |
515 RAGE VON MISES STRESS FOR THIS STRUCTURE TYPE IS 664.06425
516 1 444.351022 1047.459875 76.4359812 0.0000000 0.0000000 0.0000000 6.0000000 66044.5000 152120.000 10.2953044
517 2 397.799505 945.655229 76.4245497 0.0000000 0.0000000 0.0000000 12.0000000 69552.0000 139104.000 20.7844008
518 3 890.020203 638.379883 76.434471 0.0000000 0.0000000 0.0000000 18.0000000 93481.5000 169431.000 31.1769142
519 4 410.401209 1047.459875 76.4359812 0.0000000 0.0000000 0.0000000 24.0000000 69552.0000 139104.000 40.2953077
520 5 495.401254 256.357605 76.4793194 0.0000000 0.0000000 0.0000000 30.0000000 48457.5000 96915.0000 51.9615250
521 6 120.688240 836.424812 75.9276942 0.0000000 0.0000000 0.0000000 36.0000000 114975.0000 229950.000 62.3532384
522 7 740.452576 302.957194 76.3755172 0.0000000 0.0000000 0.0000000 42.0000000 114975.0000 229950.000 72.7441319
523 8 1414.59492 320.4589483 76.4647599 0.0000000 0.0000000 0.0000000 48.0000000 93229.5000 184459.000 53.1284354
524 9 740.452576 302.957194 76.3755172 0.0000000 0.0000000 0.0000000 54.0000000 62034.0000 124065.000 53.5507465
525 10 1152.75623 717.495605 76.3755172 0.0000000 0.0000000 0.0000000 60.0000000 43176.0000 86352.0000 103.923050

```

Figure 26: Test Case 6\_2

**Inference:** !!Verified!! **Output File:** Out\_Average\_Properties-testcase6.txt

## 5.7 TEST CASE 7

**Aim:** To verify the analysis of Volume by replacing the Volume for half of the grains with 0.5 and other half grains with 2.0 and the stress values constant as 1.0 2.0 3.0 4.0 5.0 6.0 respectively for all grains.

**File Used:** Generate Data file using *testcase\_sig\_volchange\_7.f90* and replace it in the place of stress file name in parameter file.

**Expected Result:** Since all other stresses are constant, the Von Mises Stress should be constant throughout all grains throughout all the structure types.

**Obtained Result:**

```

526 =====STRUCTURE TYPE=====
527 IN NUMBER) COORDINATES: X Y Z | STRESS XX YY ZZ XY XZ YZ | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |
528 RAGE VON MISES STRESS FOR THIS STRUCTURE TYPE IS 15.2970581
529 1 432.715147 1034.44636 77.3498453 1.0000000 2.0000000 3.0000000 4.0000000 8584.0000 15798.0000 15.2970581
530 2 394.401254 945.4554957 76.4245497 0.0000000 0.0000000 0.0000000 12.0000000 69552.0000 139104.000 20.7844008
531 3 890.020203 638.379883 76.434471 0.0000000 0.0000000 0.0000000 18.0000000 93481.5000 169431.000 31.1769142
532 4 1390.94910 612.702209 76.3536632 0.0000000 0.0000000 0.0000000 24.0000000 77115.0000 155831.000 41.569317
533 5 495.401254 256.357605 76.4793194 0.0000000 0.0000000 0.0000000 30.0000000 48457.5000 96915.0000 51.9615250
534 6 120.688240 836.424812 75.9276942 0.0000000 0.0000000 0.0000000 36.0000000 114975.0000 229950.000 62.3532384
535 7 742.559720 146.449464 75.9878004 0.0000000 0.0000000 0.0000000 42.0000000 93023.5000 166047.000 72.7441319
536 8 1414.59492 320.4589483 76.4647599 0.0000000 0.0000000 0.0000000 48.0000000 93229.5000 184459.000 53.1284354
537 9 740.452576 302.957194 76.3755172 0.0000000 0.0000000 0.0000000 54.0000000 62034.0000 124065.000 53.5507465
538 10 1152.75623 717.495605 76.3755172 0.0000000 0.0000000 0.0000000 60.0000000 43176.0000 86352.0000 103.923050

```

Figure 27: Test Case 7\_1

```

539 =====STRUCTURE TYPE=====
540 IN NUMBER) COORDINATES: X Y Z | STRESS XX YY ZZ XY XZ YZ | GRAIN VOLUME | NUMBER OF ATOMS | VON-MISES STRESS |
541 RAGE VON MISES STRESS FOR THIS STRUCTURE TYPE IS 15.2970581
542 1 444.351022 1047.459875 76.4359812 0.0000000 2.0000000 3.0000000 4.0000000 86176.0000 157981.000 15.2970581
543 2 394.401254 945.4554957 76.4245497 0.0000000 0.0000000 0.0000000 12.0000000 69552.0000 139104.000 20.7844008
544 3 890.020203 638.379883 76.434471 0.0000000 0.0000000 0.0000000 18.0000000 93481.5000 169431.000 31.1769142
545 4 1390.94910 612.702209 76.3536632 0.0000000 0.0000000 0.0000000 24.0000000 77115.0000 155831.000 41.569317
546 5 495.401254 256.357605 76.4793194 0.0000000 0.0000000 0.0000000 30.0000000 48457.5000 96915.0000 51.9615250
547 6 120.688240 836.424812 75.9276942 0.0000000 0.0000000 0.0000000 36.0000000 114975.0000 229950.000 62.3532384
548 7 742.559720 146.449464 75.9878004 0.0000000 0.0000000 0.0000000 42.0000000 93023.5000 166047.000 72.7441319
549 8 1414.59492 320.4589483 76.4647599 0.0000000 0.0000000 0.0000000 48.0000000 93229.5000 184459.000 53.1284354
550 9 740.452576 302.957194 76.3755172 0.0000000 0.0000000 0.0000000 54.0000000 62034.0000 124065.000 53.5507465
551 10 1152.75623 717.495605 76.3755172 0.0000000 0.0000000 0.0000000 60.0000000 43176.0000 86352.0000 103.923050

```

Figure 28: Test Case 7\_2

**Inference:** !!Verified!! **Output File:** Out\_Average\_Properties-testcase7.txt

## 5.8 TEST CASE 8

**Aim:** To verify the analysis of Average Von Mises Stress for all grains in each Structure Type.

**File Used:** Generate a Data file from *testcase\_VM.f90* and replace it in the place of stress file name in parameter file.

**Expected Result:** Since all other stresses are '0' except sigma\_xx which is equal to '1' in all cases, the Von Mises Stress should be constant(=1) throughout all grains throughout all the structure types. The Von Mises stress written in begining of each structure type should be same.

**Obtained Result:**

260	STRUCTURE TYPE->	2	N	COORDINATES X Y Z   STRESS XX YY ZZ XY XZ YZ   GRAIN VOLUME   NUMBER OF ATOMS   VON-MISES STRESS	
261	VON MISES STRESS FOR THIS STRUCTURE TYPE IS	1.00000000			
262					
263				1.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 185.000000 185.000000 1.00000000	
264			2	393.059557 888.370544 84.9665222 1.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 232.000000 232.000000 1.00000000	
265			3	849.182007 676.206004 83.1729507 1.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 196.000000 196.000000 1.00000000	
266			4	624.124124 624.124124 83.1729507 1.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 251.000000 251.000000 1.00000000	
267			5	502.152457 248.055618 82.0598120 1.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 138.000000 138.000000 1.00000000	
268			6	104.293957 840.446933 76.4259109 1.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 712.000000 712.000000 1.00000000	
269			7	764.124124 150.646569 76.4259109 1.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 145.000000 145.000000 1.00000000	
270			8	157.449527 304.137705 73.1216124 1.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 171.000000 171.000000 1.00000000	

Figure 29: Test Case 8\_1

**Inference:** !!Verified!! **Output File:** Out\_Average\_Properties-test8.txt

## 5.9 TEST CASE 9

**Aim:** To test the Volume Plots, if the Neighbors are accurate and the plotted Volumes are true.

**File Used:** Neighbors.txt and fig12(e)

**Expected Result:** Neighbours are exactly beside each other and their Volume positions match comparitively.

**Obtained Result:** They are perfectly beside each other according to fig:30 and their volumes comparison reflect their true values

115	115	79	87	92	43	66
116	116	51	69	73	55	73
117	117	111	1	21	121	87
118	118	35	104	95	58	53
						69

Figure 30: Test Case 9\_1

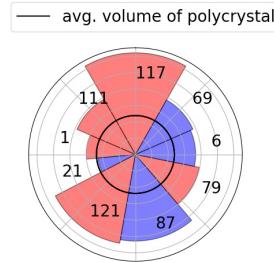


Figure 31: Test Case 9\_2

**Inference:** !!Verified!!

## 5.10 TEST CASE 10

**Aim:** To test the Stress Plots, if the stress is same in all the grains.

**File Used:** Neighbors.txt, Input file from testcase 7 and fig12(e)

**Expected Result:** Since the stress tensor in fig.27 in all the grains is same and the corresponding Von Mised stress is also same, the plot shold have equivalent stresses, that means, radius of all the sectors is same.

**Obtained Result:** As in below figure:

Average Stress in a Configuration

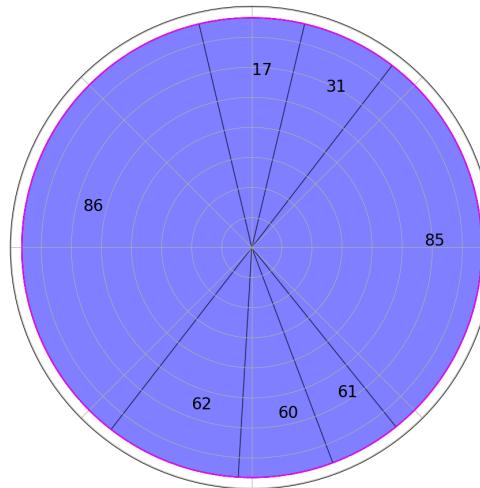


Figure 32: test case 10\_1

Average Stress in a Configuration

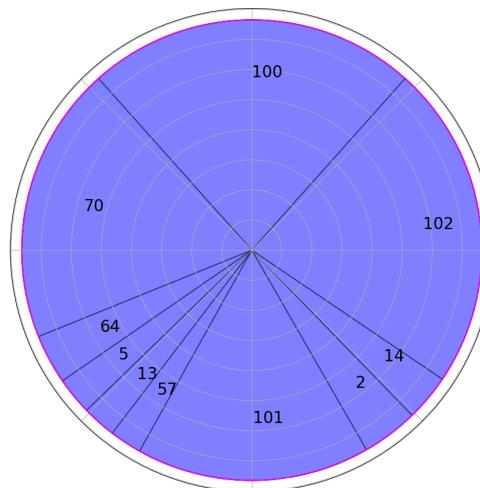


Figure 33: test case 10\_2

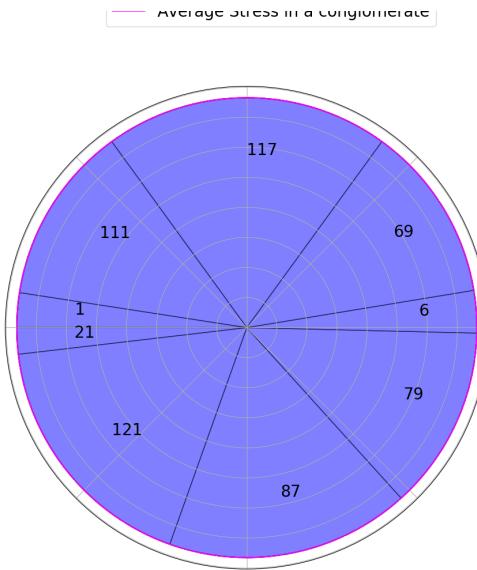


Figure 34: test case 10\_3

**Inference:**!!Verified!! As observed in above figures, in grain 17,100,117, the sectors are having same radius.

## 5.11 TEST CASE 11

**Aim:** To check for the accuracy of the Distribution Plots.

**File Used:** Input file from testcase 7 and Input file from testcase 8

**Expected Result:** The plots should be consistant, as the stress values are same for all the grains in both the files.

**Obtained Result:** As shown below:

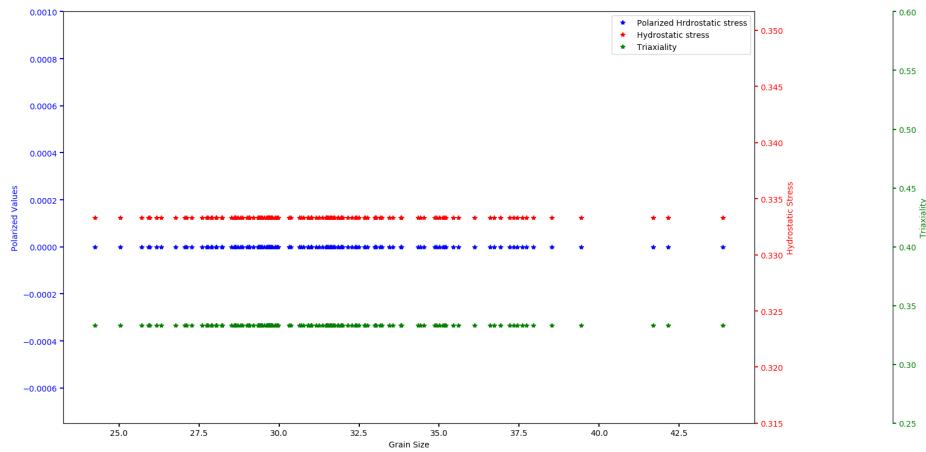


Figure 35: Test Case 11\_1

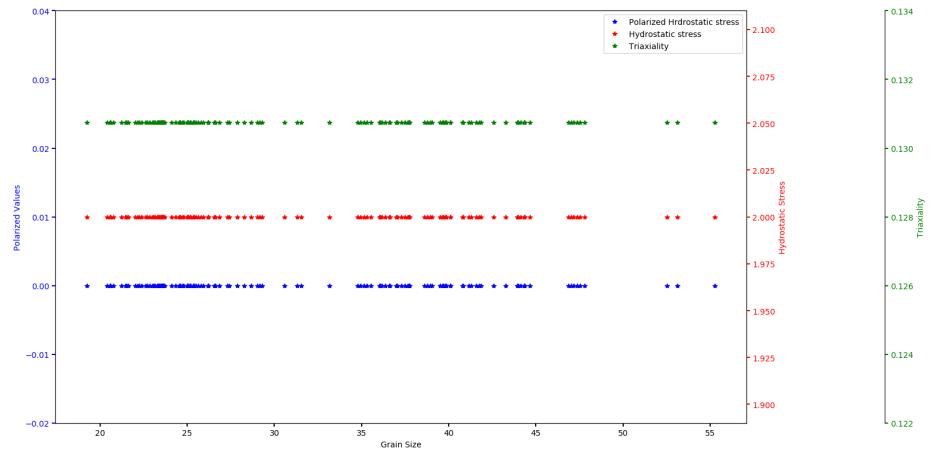


Figure 36: Test Case 11\_1

**Inference:**!!Verified!!

## 6 CONCLUSION

In the current programming project, the following tasks have been accomplished.

- A parameter file has been designed which can be used for storing the User interests and can be used as a medium to extract and analyse desired parameter properties like stress, volume, coordinates.
- The Big data files are handled as per the requirement of the user based on his interested quantities, carefully avoiding repeated handling of the file and reducing computational cost.

- With the help of a 3Dimensional array in FORTRAN, all the necessary quantities are assembled after analysis based on their structure type and grain number.
- The 3D array is later written into a file specified by the user in the 'Parameter file', separating properties related to structure types as blocks of data.
- This Output file is then used for the Visualization via Python Programming language. The data from this file is read using numpy into an array and calculations are done for obtaining quantities which are required for visualization,like, Von Mises Stresses for a conglomerate, Grain volume fraction for a conglomerate, hydrostatic stresses, Grain size and other quantities.
- Using 'Argparse module' in Python, a command line interface options are designed for the User to obtain various plots, namely
  - Visualization of Average Volume of grains in a Conglomerate with respect to average volume in the polycrystal and colored based on divergence color maps(bwr) on polar plots.
  - Visualization of Average Stress in grains in a Conglomerate with respect to average stress in the polycrystal and average stress of the conglomerate and colored based on divergence color maps(bwr) on polar plots.
  - Distribution plots, namely:
    - \* Grain size vs polarized hydrostatic stresses, hydrostatic stresses, triaxiality.
    - \* Grain size vs polarized von mises stresses, von mises stresses.
    - \* Grain size vs hydrostatic stresses, triaxiality.

With the help of these analysed and visualized data, a further research or analysis can be initiated to study the behaviour of polycrystals, grain boundaries and dislocations. This helps the user to access the properties of the polycrystal and extend to any other properties with an advantage of time.

## References

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## **APPENDIX**

**Visualization of Grain Stresses w.r.t its neighbours and the Average Stress in the polycrystal and its conglomerate.**

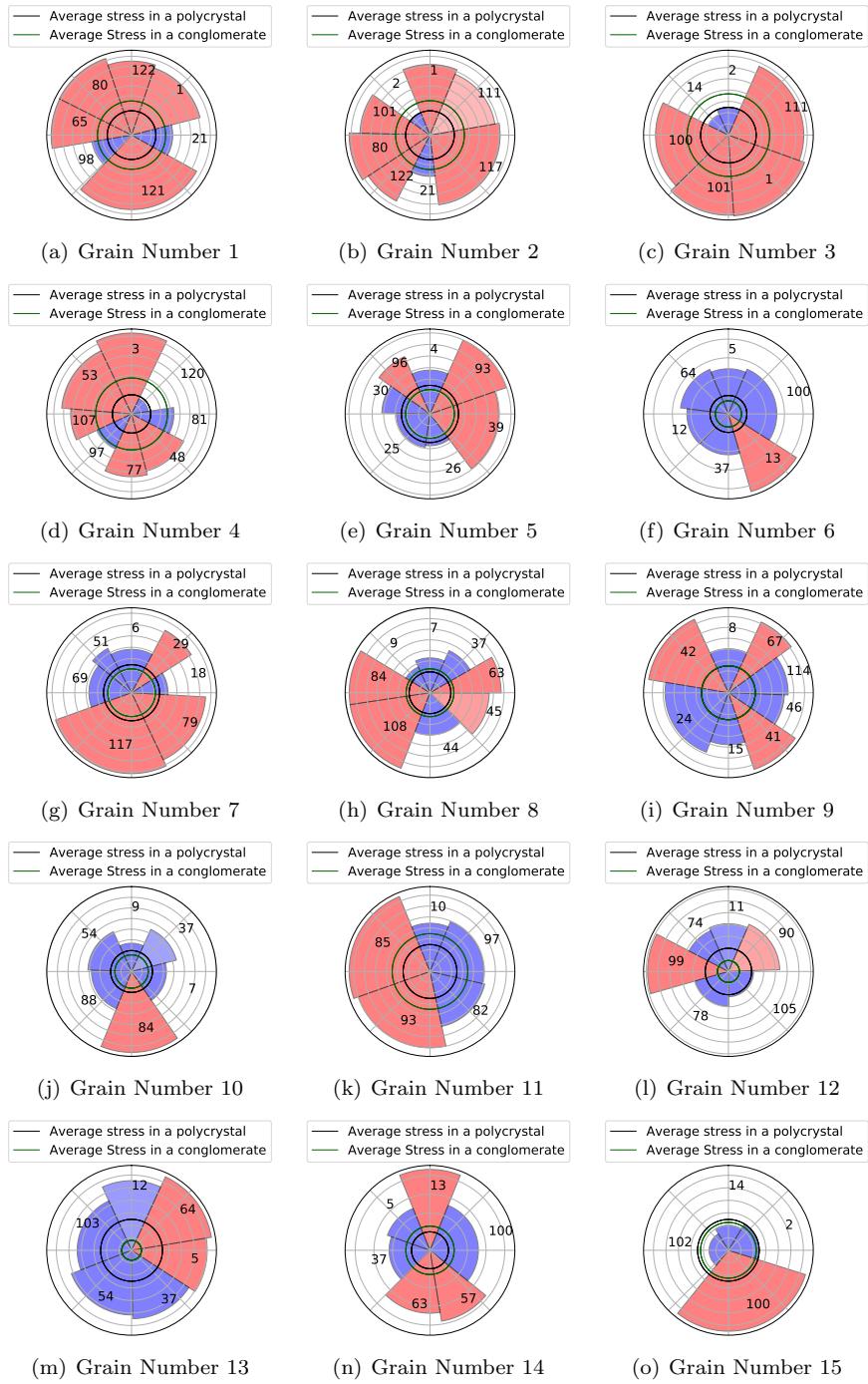


Figure 37: Visualization of Stress in Grains in a conglomerate for grain numbers 1-15

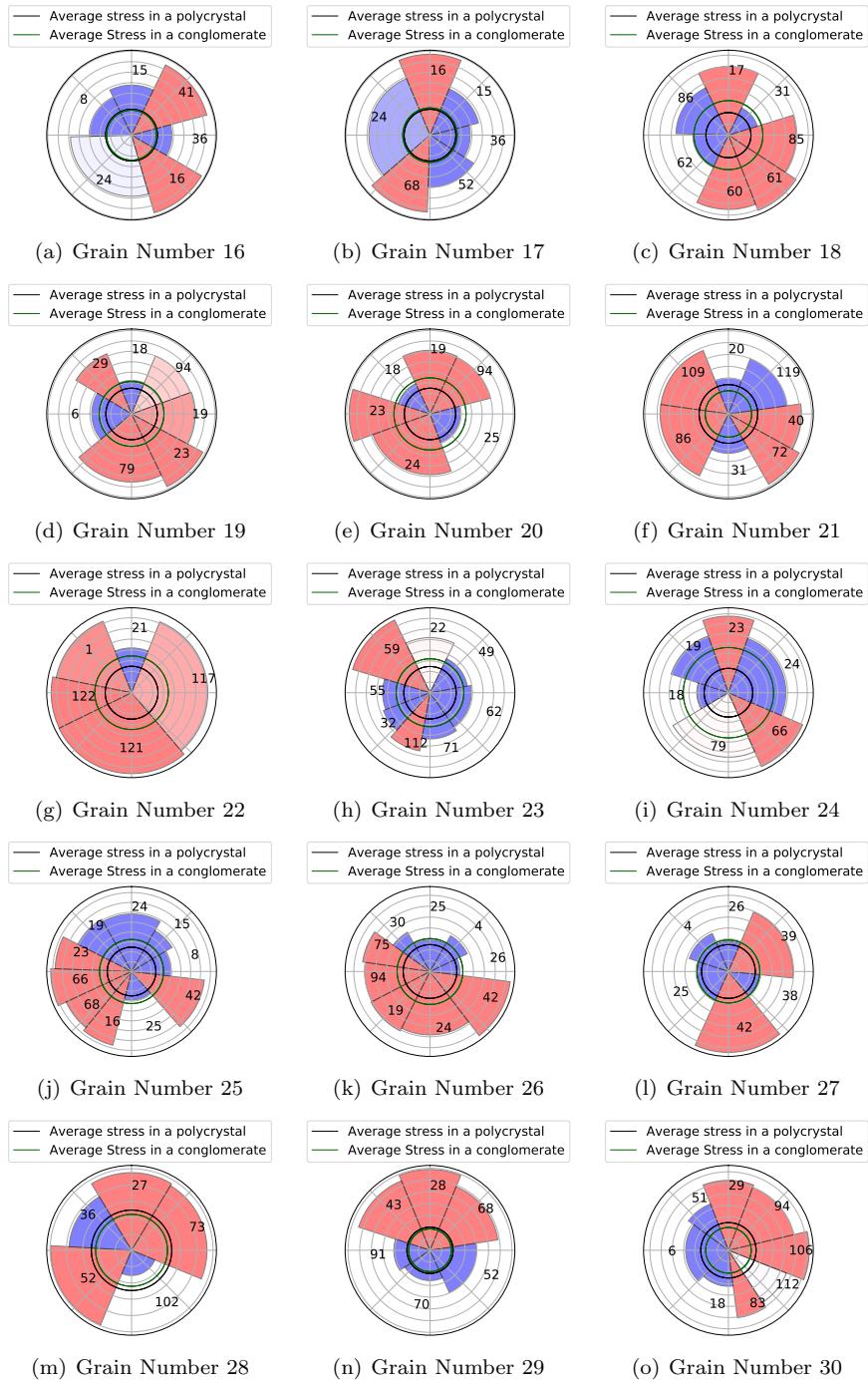


Figure 38: Visualization of Stress in Grains in a conglomerate for grain numbers 16-30

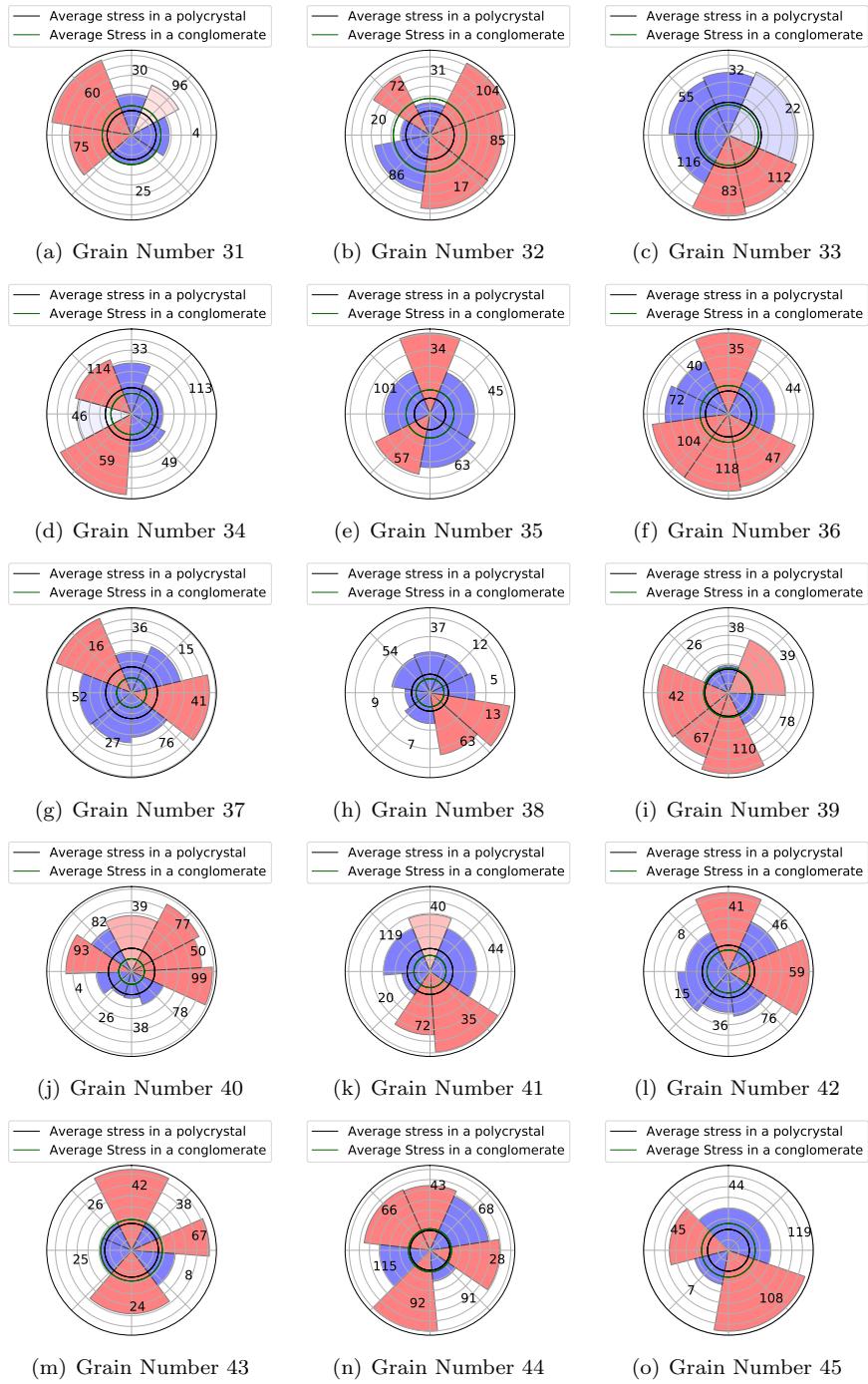


Figure 39: Visualization of Stress in Grains in a conglomerate for grain numbers 31-45

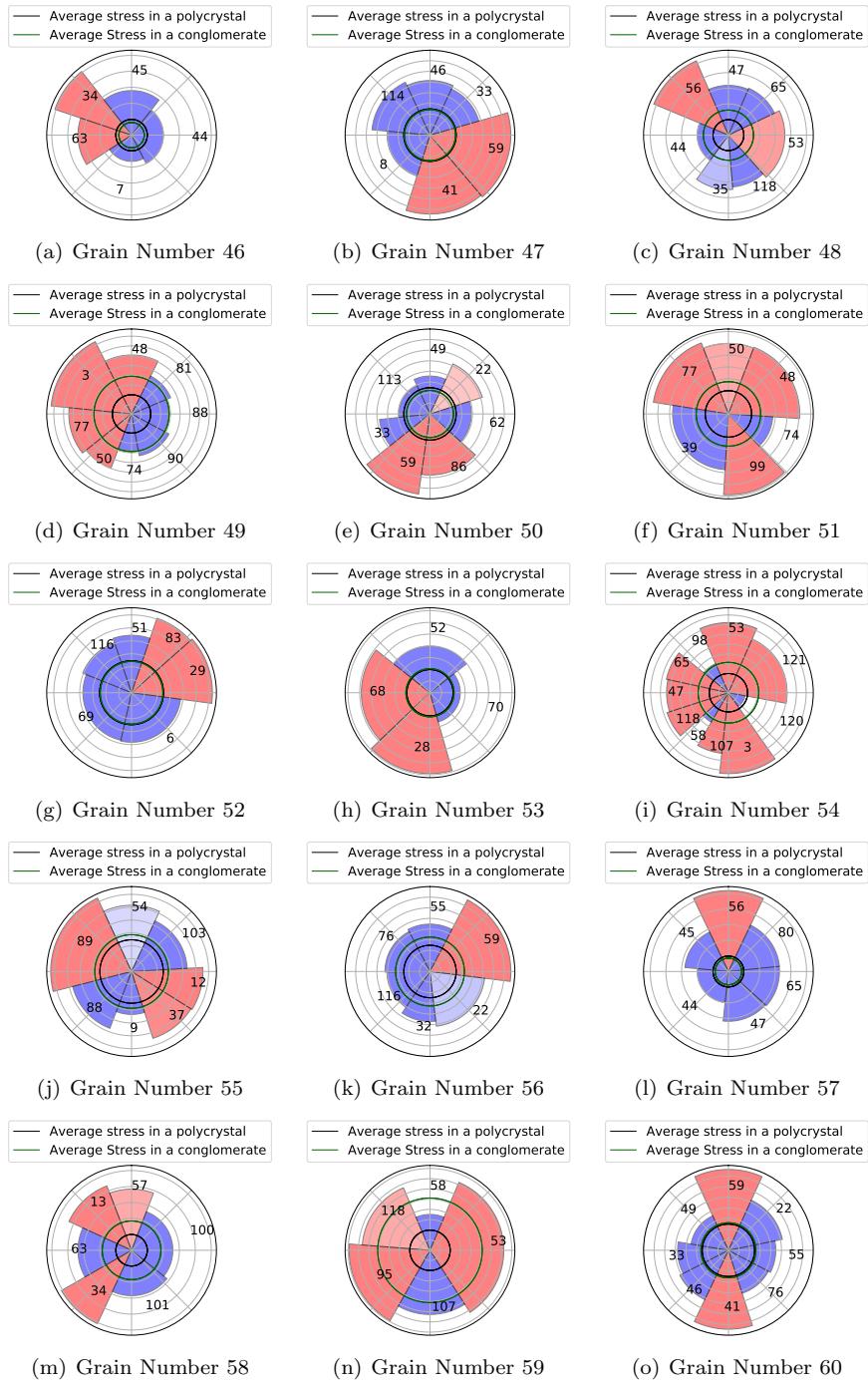


Figure 40: Visualization of Stress in Grains in a conglomerate for grain numbers 46-60

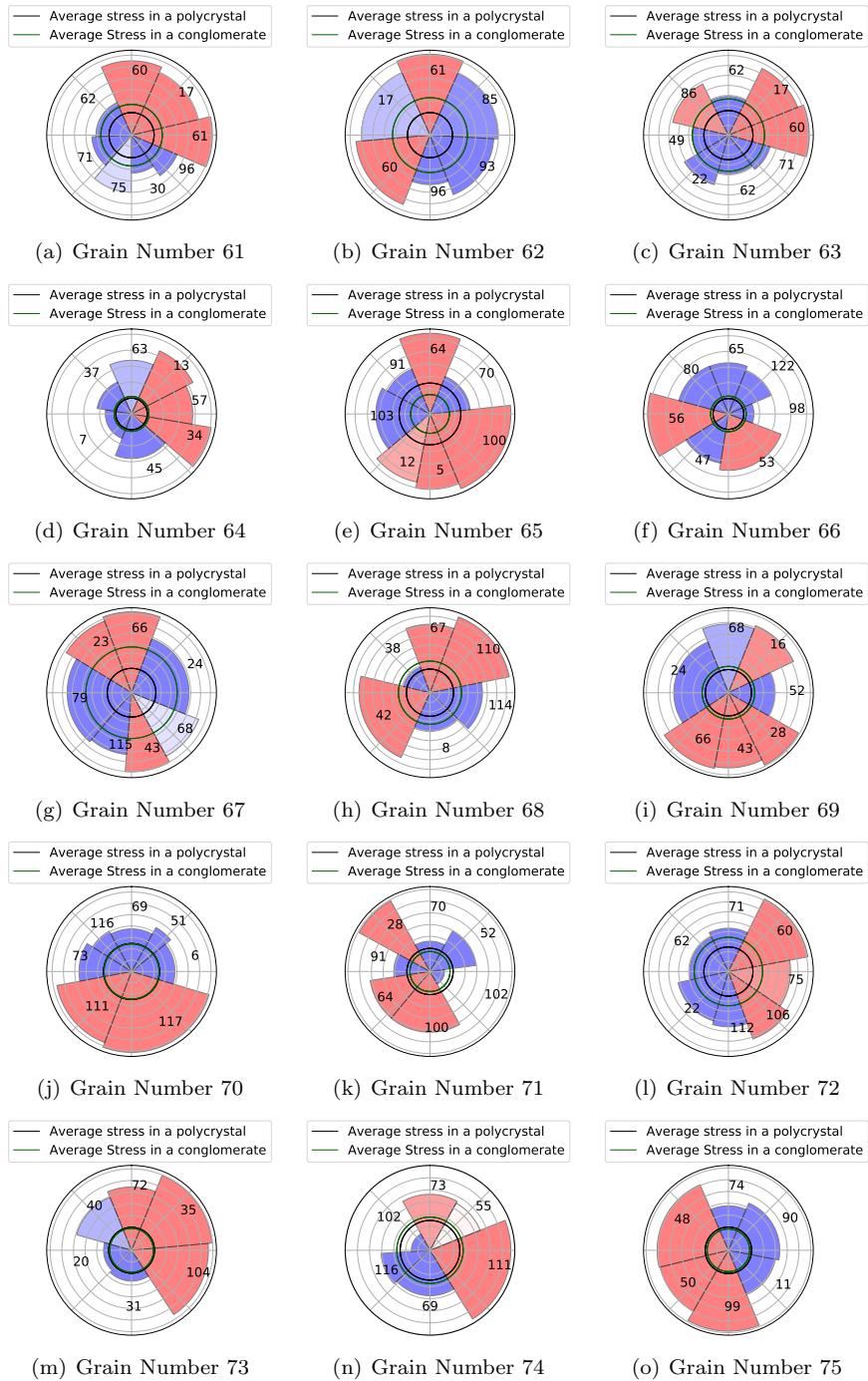


Figure 41: Visualization of Stress in Grains in a conglomerate for grain numbers 61-75

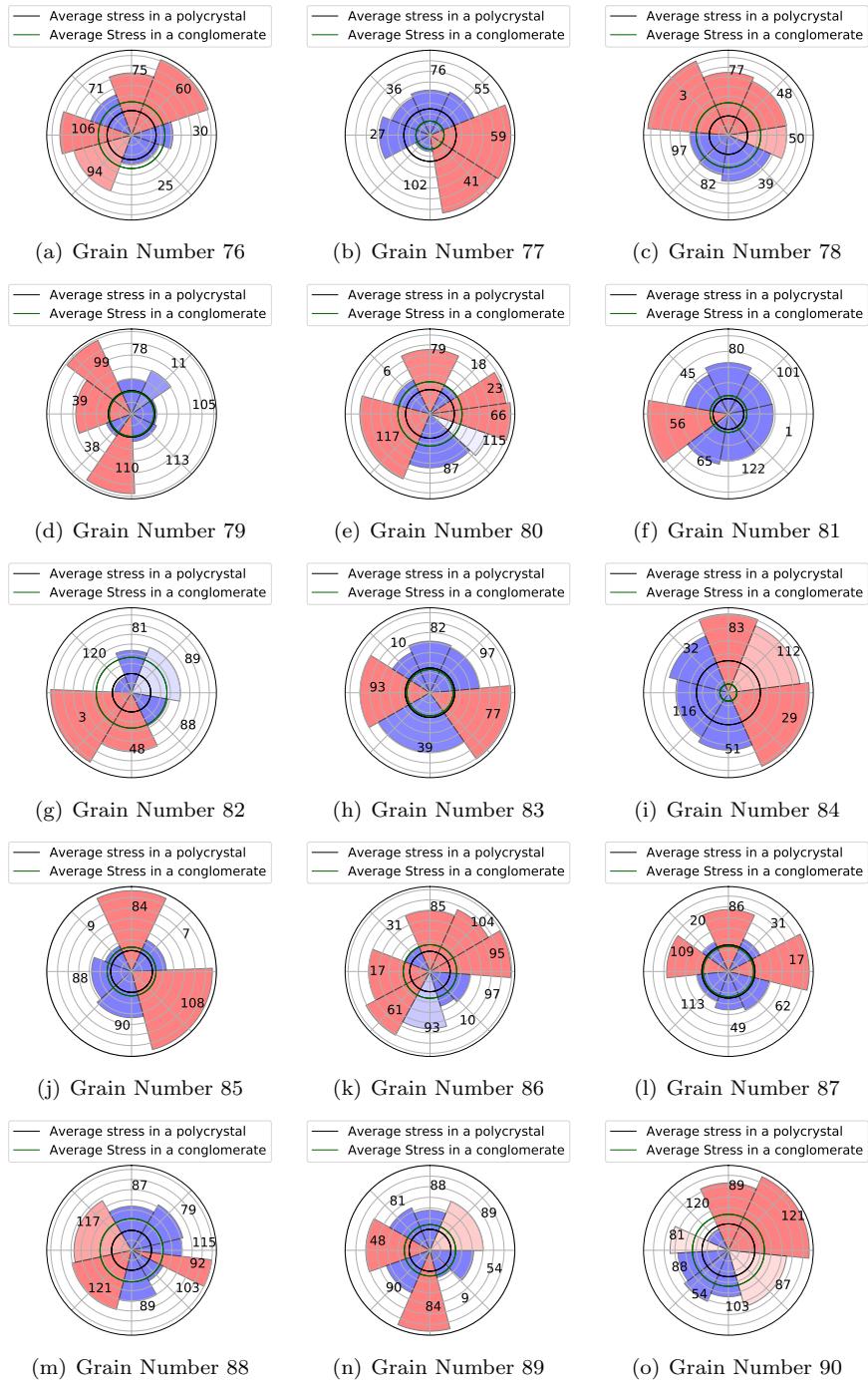


Figure 42: Visualization of Stress in Grains in a conglomerate for grain numbers 76-90

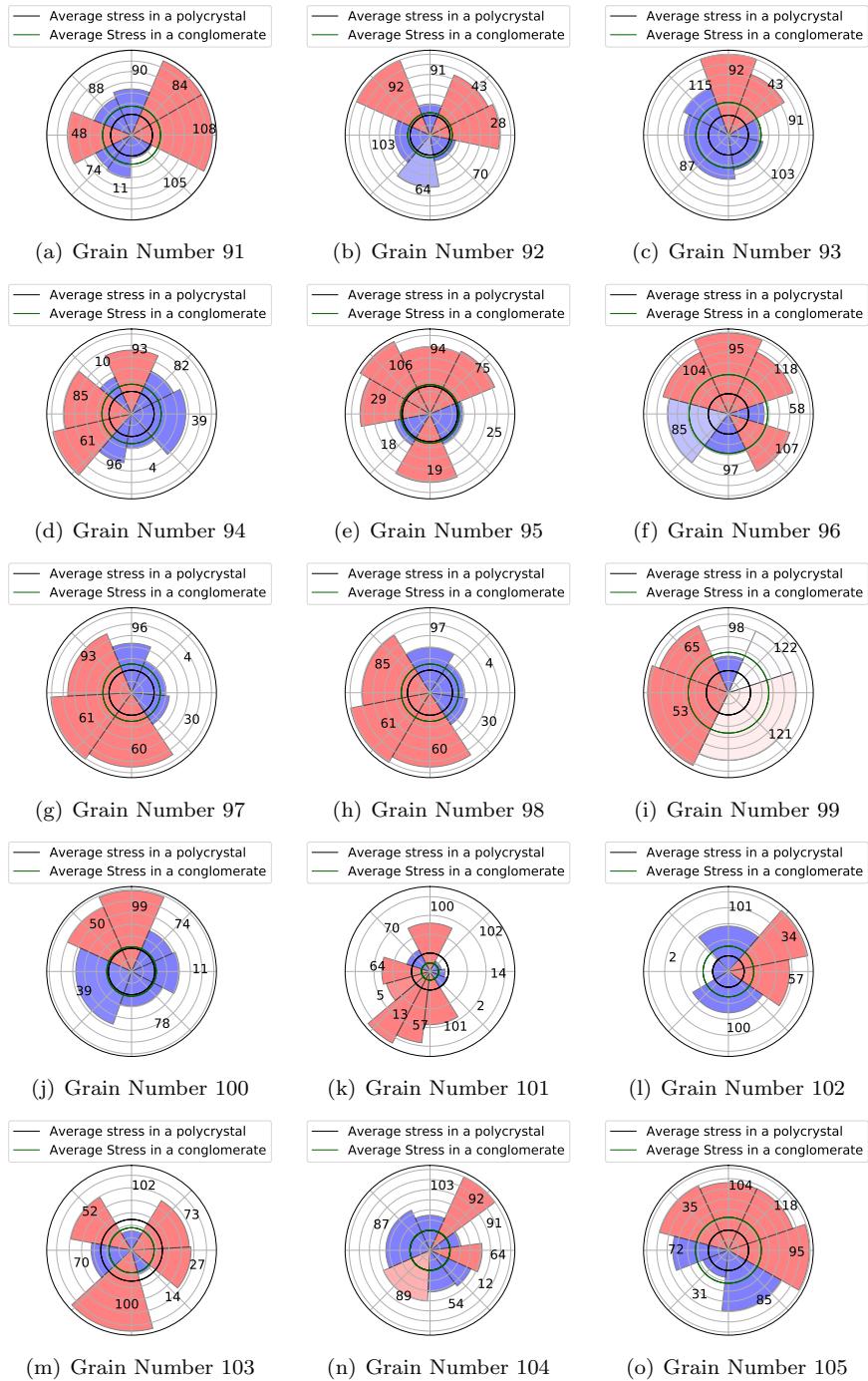


Figure 43: Visualization of Stress in Grains in a conglomerate for grain numbers 91-105

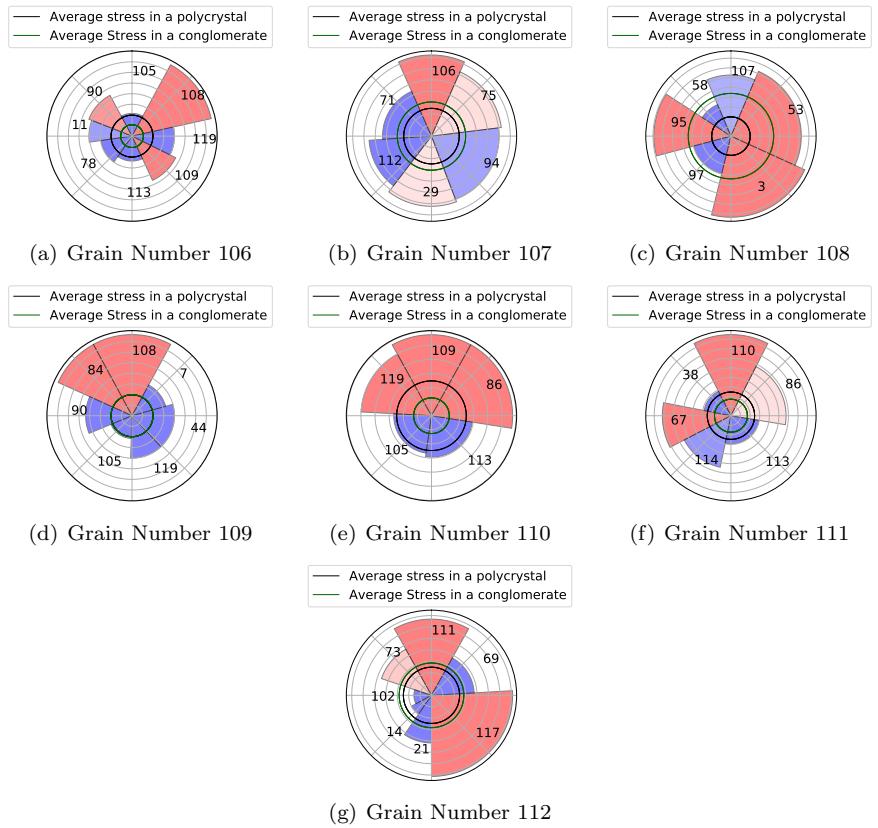


Figure 44: Visualization of Stress in Grains in a conglomerate for grain numbers 106-112

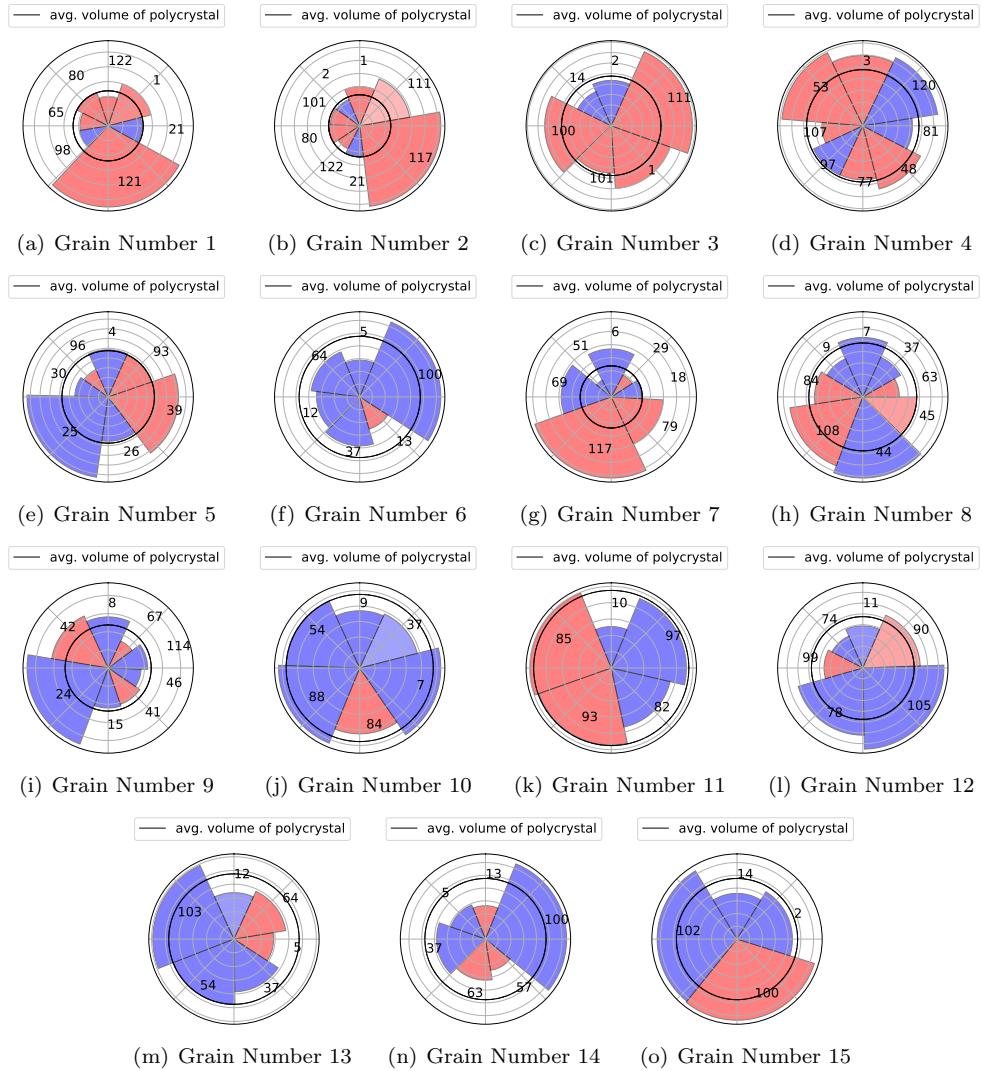


Figure 45: Visualization of Stress in Grains in a conglomerate for grain numbers 1-15

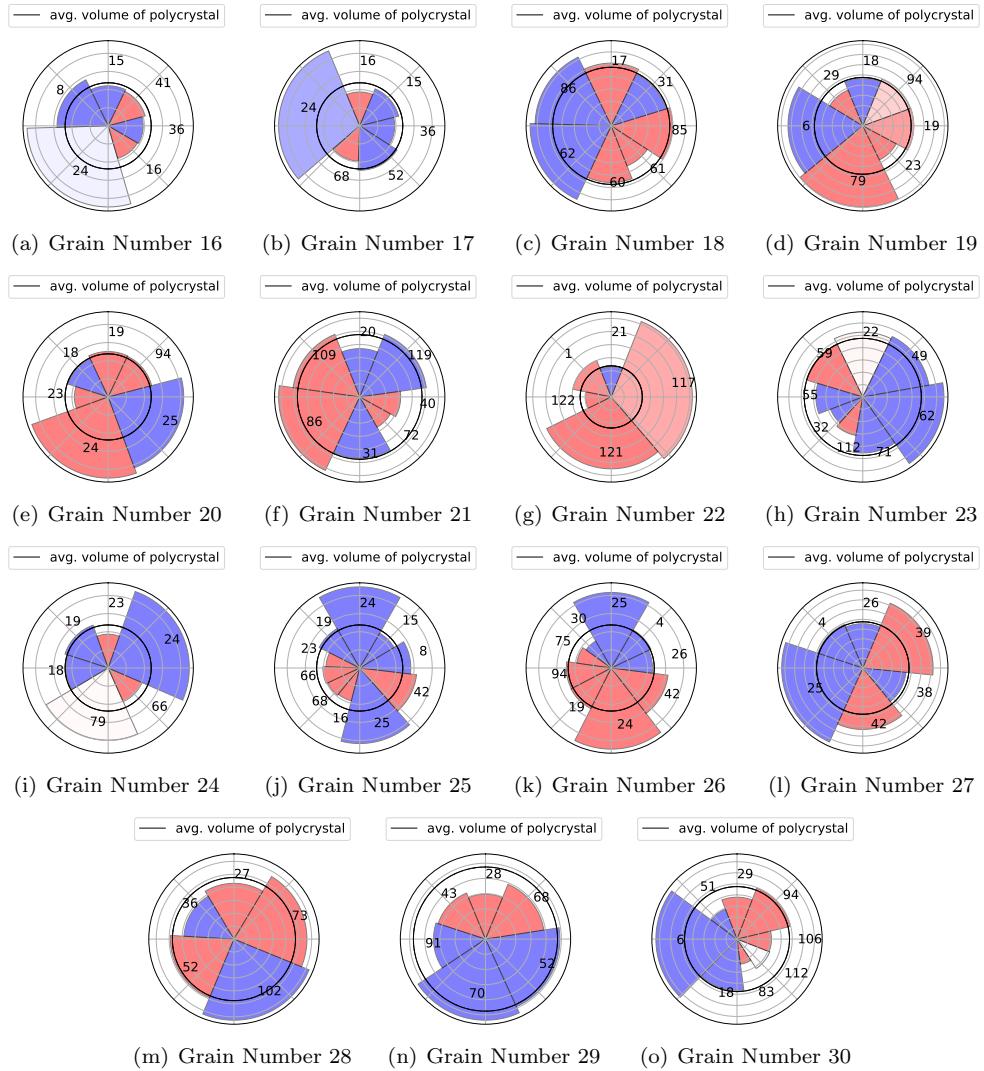


Figure 46: Visualization of Volume of Grains in a conglomerate for grain numbers 16-30

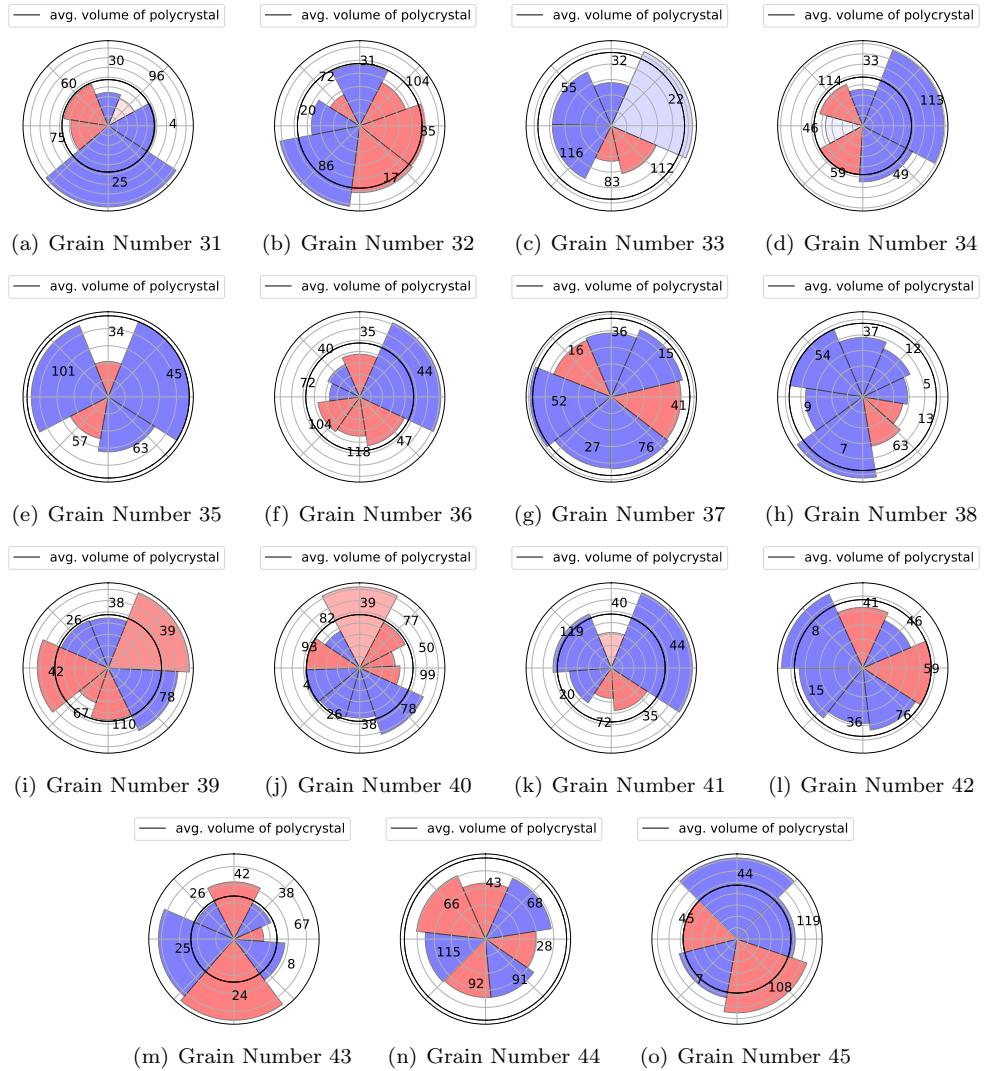


Figure 47: Visualization of Volume of Grains in a conglomerate for grain numbers 31-45

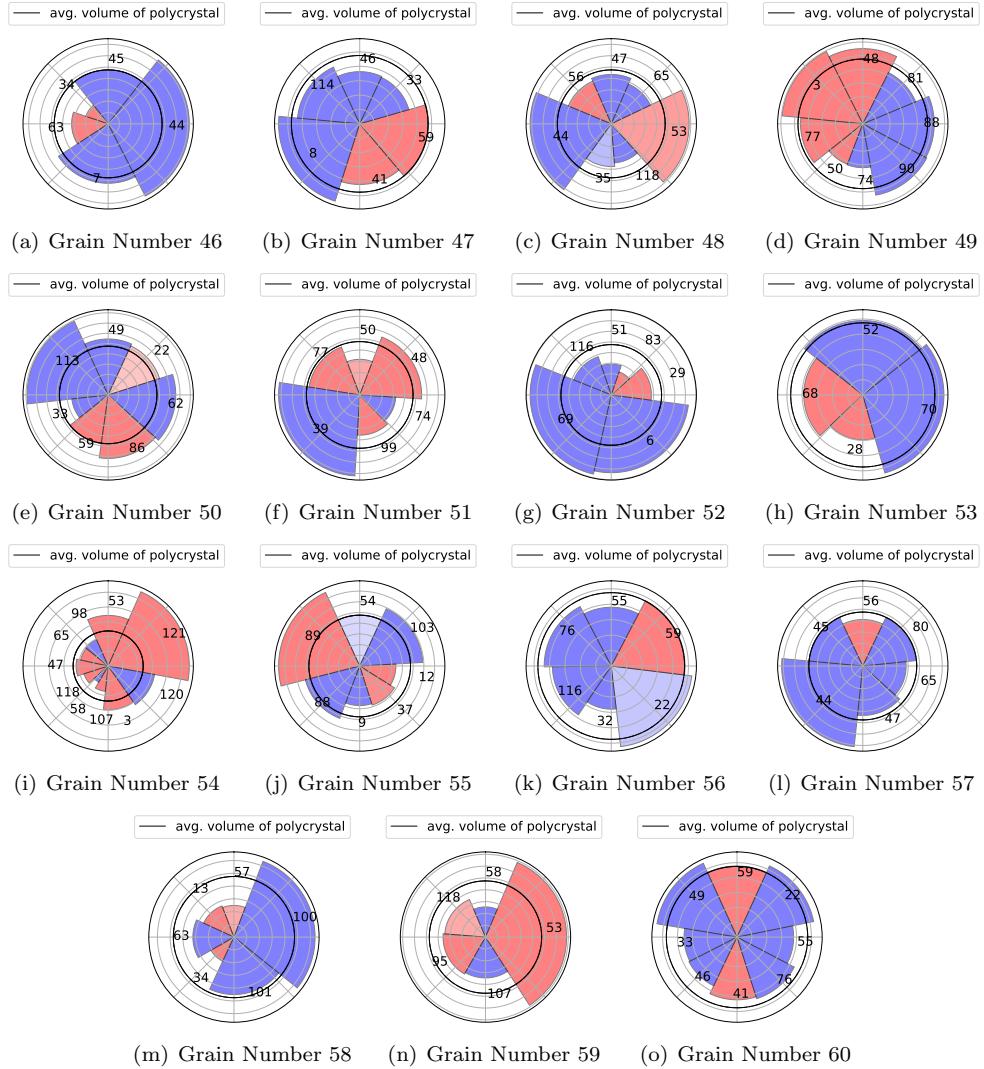


Figure 48: Visualization of Volume of Grains in a conglomerate for grain numbers 46-60

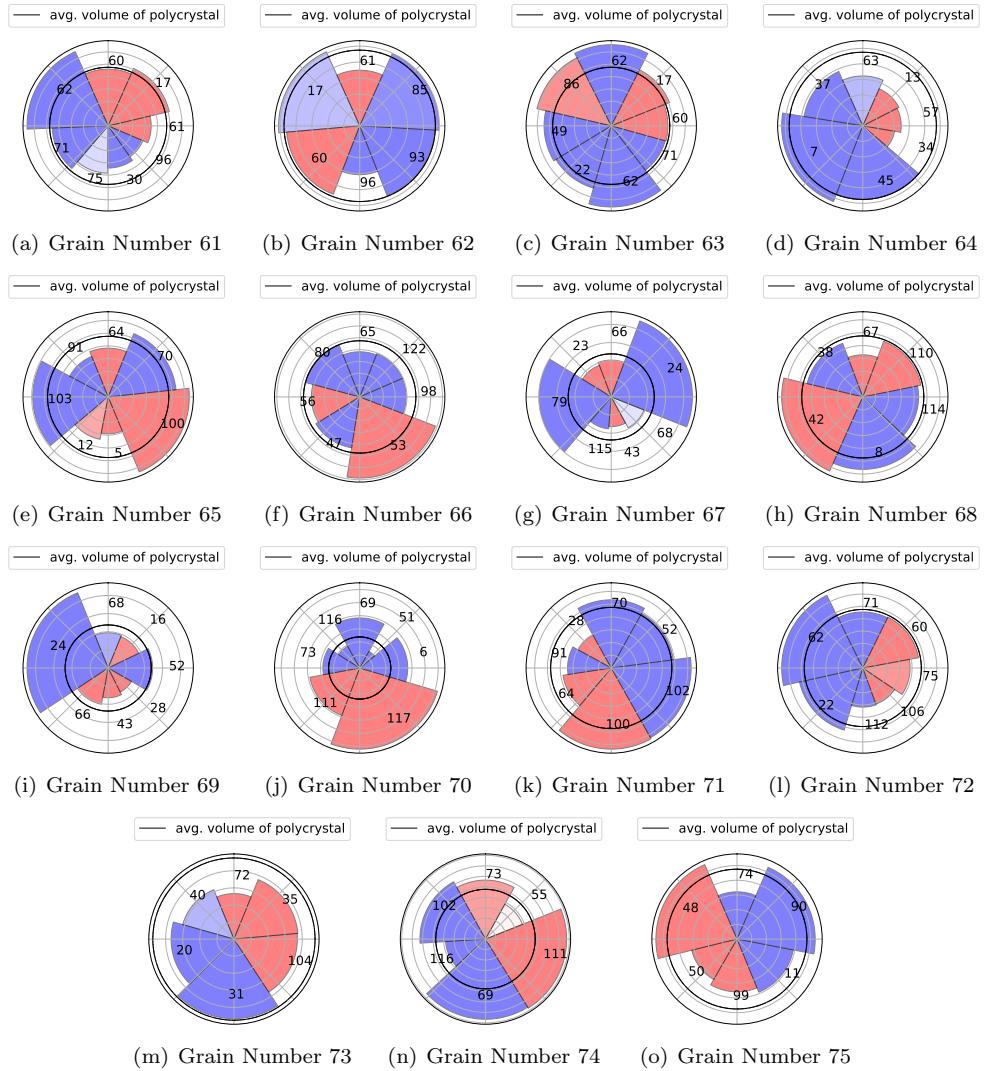


Figure 49: Visualization of Volume of Grains in a conglomerate for grain numbers 61-75

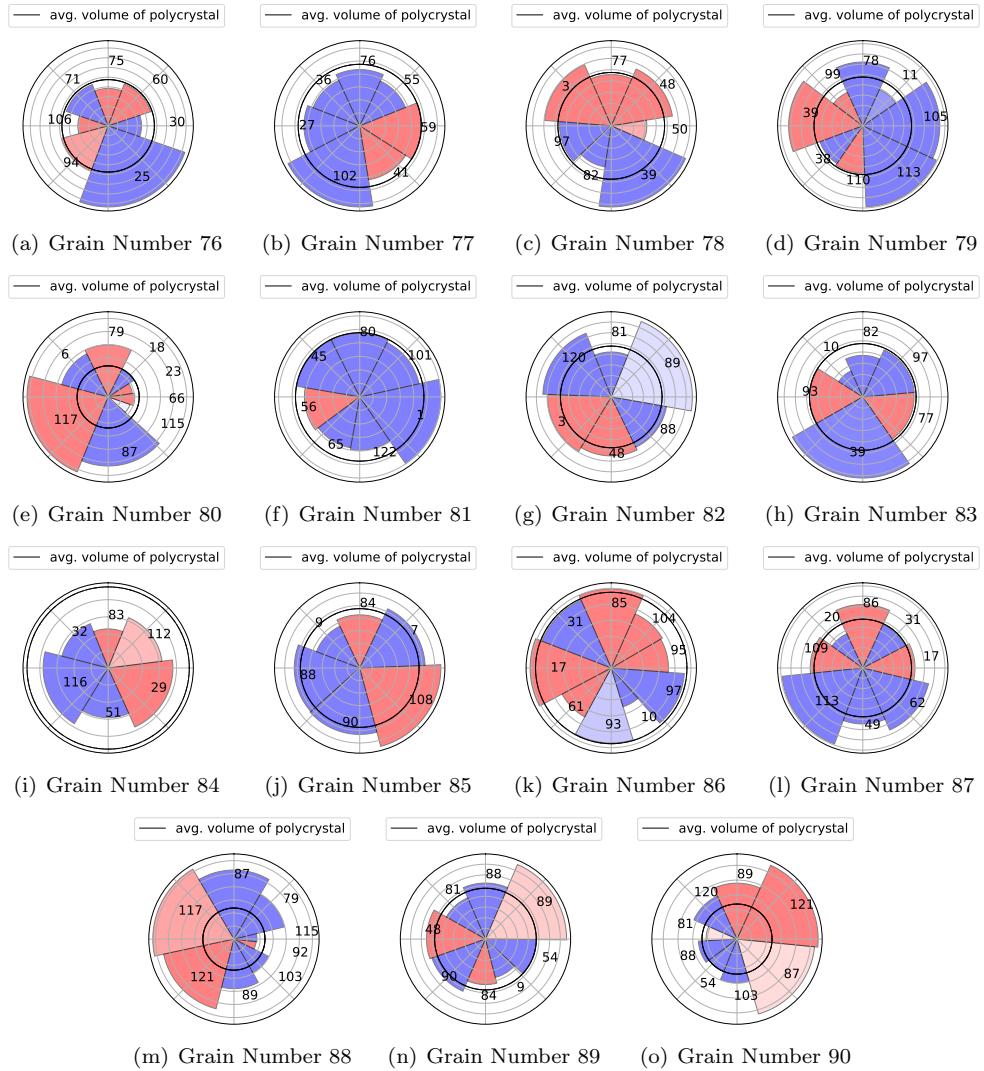


Figure 50: Visualization of Volume of Grains in a conglomerate for grain numbers 76-90

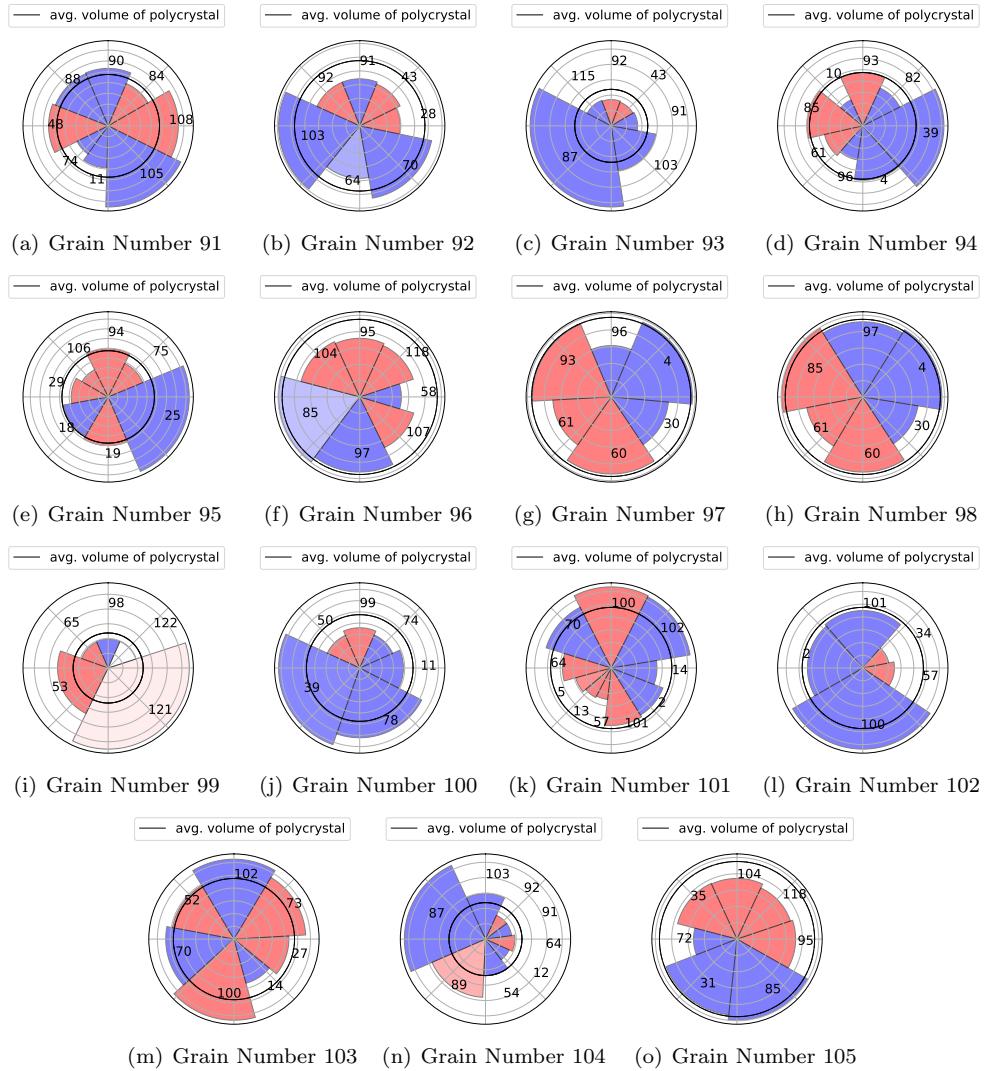


Figure 51: Visualization of Volume of Grains in a conglomerate for grain numbers 91-105

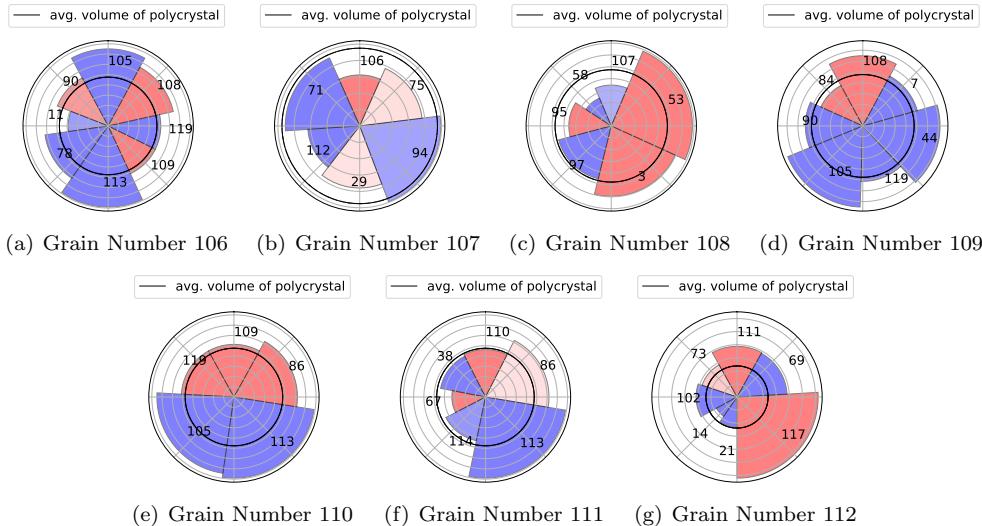


Figure 52: Visualization of Volume of Grains in a conglomerate for grain numbers 106-112