pyebsd: an open-source tool for processing EBSD data and determining accurate orientation relationship

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July 6, 2018

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Introduction

EBSD analysis tools

- Electron Backscattered Diffraction
- EBSD analysis is mostly limited to commercial tools (EDAX OIM, Oxford Chanel 5)
- Although quite powerful, licenses are expensive and limited
- MTEX (mtex-toolbox.github.io): Package for EBSD analysis implemented in Matlab
- MTEX is very complete, but Matlab isn't free
- pyebsd: python + ebsd!

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Introduction

Why Python?

- Python is an interpreted high level programming language
- Fast growing user base
- Supports many programming features (imperative, object-oriented, functional programming)
- dynamic-typing (no need to declare variable types)
- Performance not as good as C, C++, Fortran, etc, but coding is very fast

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```
print("Hello world!")
```

```
# defining functions is easy!
def fun(x):
    # return x squared
    return x**2
```

```
import numpy as np
# creates array x = [0, 0.1, ..., 9.9],
x = np.arange(0, 10, .1)
# then calculates sin(x)
y = np.sin(x)
```

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PYTHON! YOU'RE FLYING! HOW? I DUNNO ... DYNAMIC TYPING? I JUST TYPED import antigravity WHITESPACE? THAT'S IT? COME JOIN US! PROGRAMMING ... I ALSO SAMPLED I LEARNED IT LAST IS FUN AGAIN! EVERYTHING IN THE NIGHT! EVERYTHING IT'S A WHOLE MEDICINE CABINET 15 50 SIMPLE! NEW WORLD FOR COMPARISON. UP HERE! HELLO WORLD IS JUST print "Hello, world!" BUT I THINK THIS BUT HOW ARE IS THE PYTHON. YOU FLYING?

¹xkcd.com/353 A. Nishikawa

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Outline





Accurate Orientation Relationship

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pyebsd

- pyebsd does not perform phases indexing
- pyebsd loads a file containing the Euler angles of the indexed phases (text file, normally .ang extension); any EBSD scanning software can generate such file
- Rotation and orientation matrices are calculated from Euler angles using ZXZ convention
- Implementation takes advantage of python modularity: numpy and scipy → linear algebra operations; matplotlib → plotting

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Plot Inverse Pole Figure (IPF)

```
import pyebsd
import matplotlib.pyplot as plt
```

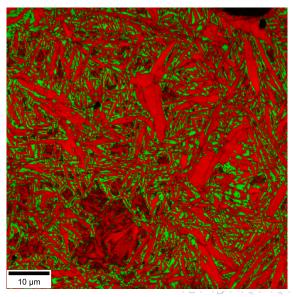
```
# enables interactive mode
plt.ion()
```

```
# loading scan datafile
scan = pyebsd.load_scandata("path/to/.ang/file")
# plotting phase map; IQ as gray scale
ph = scan.plot_phase(gray=scan.IQ)
# plotting ipf
ipf = scan.plot_IPF(gray=scan.IQ)
```

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martensite + bainitic ferrite + austenite (Q&P 170/375 °C, 0.8 C)



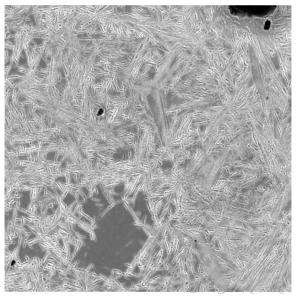
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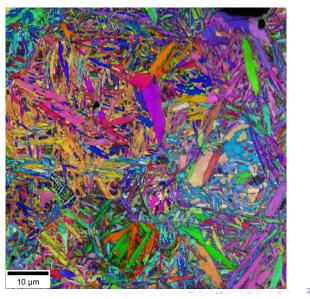
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martensite + bainitic ferrite + austenite (Q&P 170/375 °C, 0.8 C)



martensite + bainitic ferrite + austenite (Q&P 170/375 °C, 0.8 C)



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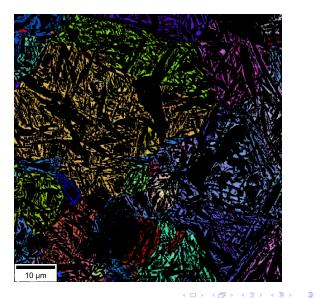
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- Boolean logic in python is very powerful.
- In pyebsd it can be used to select phases, regions with specific values of confidence index, etc.

```
import numpy as np
x = np.arange(0, 10, .1)
y = np.sin(x)
selection = y > 0
x2 = x[selection]
y2 = y[selection]
```

austenite indexed as phase #2
ipf = scan.plot_IPF(sel=(scan.ph == 2), gray=scan.IQ)



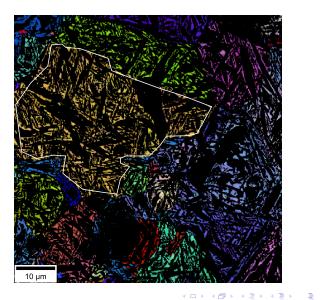
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ipf as defined before
ipf.lasso_selector()



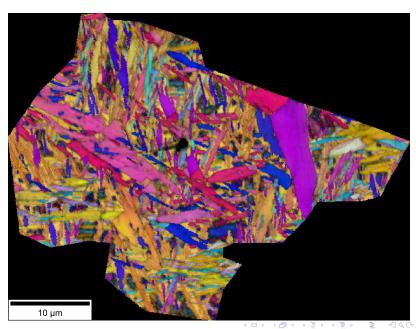
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ipf2 = scan.plot_IPF(sel=ipf.sel, gray=scan.IQ)

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14/30 14 / 30 # bcc phase indexed as phase #1
scan.plot_PF(sel=ipf.sel & (scan.ph == 1))

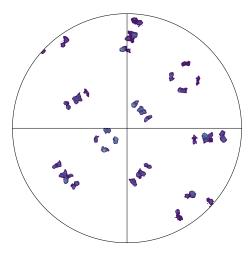


Figure: 001_{bcc} pole figure

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Accurate OR

- Martensite, Widmanstätten ferrite, bainite grow with OR near to KS — normally indexed as bcc
- Miyamoto et al., 2009²: method to accurately determine near KS OR using EBSD (accurate OR).
- Austenite orientation matrix M^{fcc} is necessary; it can be obtained from RA
- \bullet Miyamoto: RA is not needed \longrightarrow reconstruction from expected near-KS OR

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²Miyamoto, G., Takayama, N. & Furuhara, T. Accurate measurement of the orientation relationship of lath martensite and bainite by electron backscatter diffraction analysis. Scr. Mater. 60, 1113–1116 (2009).

• For each pixel indexed as bcc (orientation matrix M^{bcc}), OR matrix $V^{fcc \rightarrow bcc}$ is calculated:

$$V^{\mathit{fcc}
ightarrow \mathit{bcc}} = \mathit{M}^{\mathit{bcc}} \cdot \mathit{M}^{\mathit{fcc}^{-1}}$$

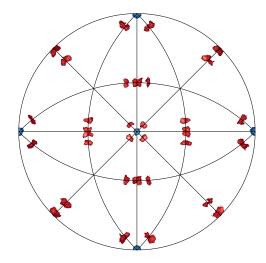
- Going further, the 24 variants are determined from $V^{fcc \rightarrow bcc}$
- Finally, $V^{fcc \rightarrow bcc}$ for each variant can be compared to KS OR matrix $V_{KS}^{fcc \rightarrow bcc} \longrightarrow$ checking for deviations

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- Besides QP sample (martensite + bainitic ferrite + austenite), austempered sample also analyzed (only bainite ferrite + austenite)
- High carbon (0.8 wt.%). Partitioning temp. = austempering temp. = 375 $^{\circ}\text{C}$
- Orientation of parent austenite determined from (RA)
- Austenite reconstruction not implemented yet!

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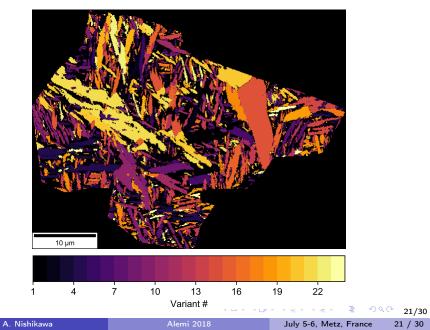
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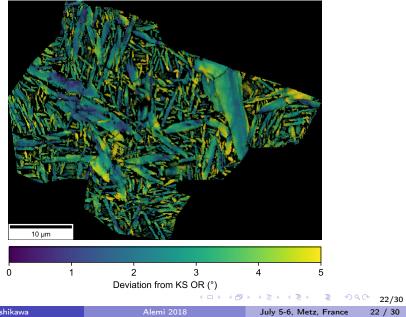
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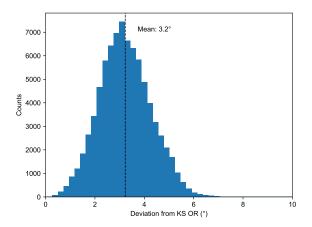
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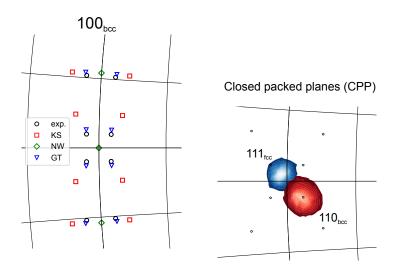
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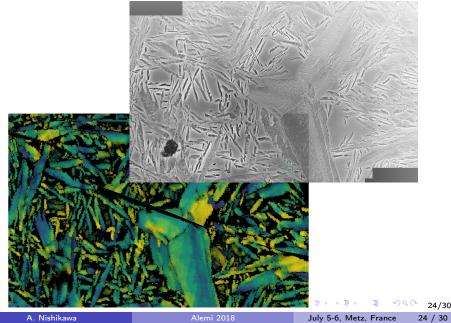
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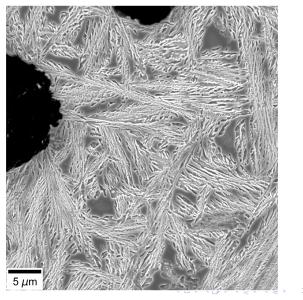


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bainitic ferrite + austenite (austempering at 375 °C, 0.8 C)

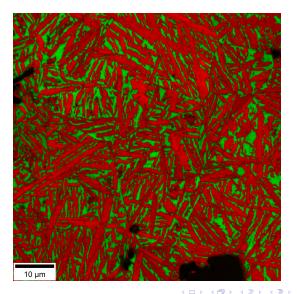


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bainitic ferrite + austenite (austempering at 375 °C, 0.8 C)



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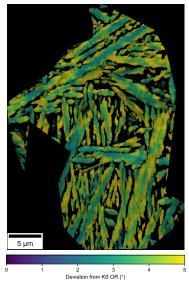
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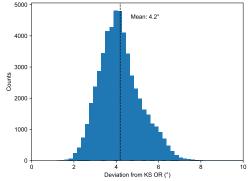
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bainitic ferrite + austenite

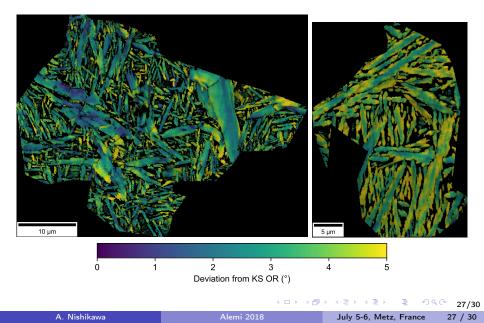


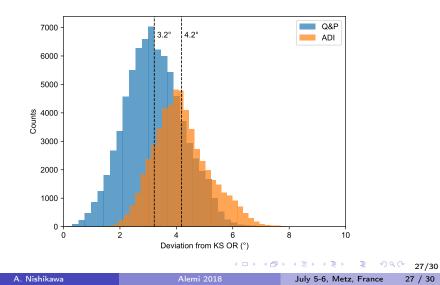


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- Small deviations from KS expected from deformation of austenite during growth of M and BF
- Does BF inherently deviates more from KS than M? BF grows much slower than martensite, defects are accumulated at the interface
- Some kind of effect to nucleation at martensite/austenite interfaces?
- $\bullet\,$ High carbon alloy: large strain associated to $\mathit{fcc} \rightarrow \mathit{bcc}$ transformation

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To test these hypothesis:

- EBSD data from alloy with lower carbon
- Smaller step size
- M: accurate OR from fully martensitic sample (implement austenite reconstruction!)
- BF + M, where bainitic ferrite is formed first
- M + BF, where martensite is formed first
- BF: sample fully bainitic

Differentiate tempered martensite from bainite in low carbon alloys?

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github.com/arthursn/pyebsd

Thanks for your attention!

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