

TTSfixed

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1 TTS Data of HDPE Resins at 5 temperatures

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```
[1]: # PYTHON LIBRARIES
%matplotlib inline

import pandas as pd
import numpy as np
import datetime
import matplotlib as mpl
import matplotlib.dates as mdates
import matplotlib.pyplot as plt
import warnings
warnings.filterwarnings('ignore')
pd.options.display.max_columns = None

from adjustText import adjust_text
from sklearn.preprocessing import LabelEncoder
number = LabelEncoder()
from pandas.plotting import register_matplotlib_converters
register_matplotlib_converters()
from matplotlib.axes._axes import _log as matplotlib_axes_logger
matplotlib_axes_logger.setLevel('ERROR')
from sklearn.linear_model import LinearRegression
```

2 Question/Problem to be solved:

- 2.1 Get the master curve at 210C and get the complex viscosity at $T = 180C$ and $T = 225C$
-

3 List all the data provided:

3.1 I have the elastic ($G'(\omega)$) and the loss ($G''(\omega)$) moduli for a HDPE at five temperatures: 170, 190, 210, 230, 250C.

```
[2]: # Let's read and look at the provided data

df = pd.read_csv("./data.csv", delimiter=",");

df = df.reindex(sorted(df.columns), axis=1);
print("./data.csv"); display(df);
```

./data.csv

	G1_Sh170oC	G1_Sh190oC	G1_Sh210oC	G1_Sh230oC	G1_Sh250oC	G2_Sh170oC \
0	343000.0	298000.0	288545.00	251301.00	218582.00	175000.0
1	279000.0	241000.0	231412.00	199744.00	179203.00	155000.0
2	226000.0	192000.0	182623.00	156375.00	146499.00	136000.0
3	179000.0	151000.0	141545.00	120746.00	118516.00	118000.0
4	139000.0	116000.0	108073.00	91516.80	94743.10	101000.0
5	107000.0	87900.0	81183.40	68305.90	74972.20	83700.0
6	80300.0	65500.0	60144.90	50295.80	58668.40	68100.0
7	59600.0	48100.0	43975.30	36564.70	45439.30	54500.0
8	43600.0	34800.0	31760.00	26301.90	34878.80	42700.0
9	31500.0	24900.0	22724.80	18728.20	26547.30	33000.0
10	22600.0	17600.0	16066.50	13228.90	20058.60	25000.0
11	16000.0	12400.0	11355.50	9269.49	15067.60	18700.0
12	11200.0	8590.0	7857.97	6441.07	11244.90	13900.0
13	7840.0	5920.0	5467.97	4457.20	8336.15	10100.0
14	5450.0	4060.0	NaN	3065.34	6159.25	7350.0
15	NaN	2760.0	NaN	2134.04	4534.14	NaN
16	NaN	1880.0	NaN	1377.14	3324.96	NaN
17	NaN	1320.0	NaN	NaN	2418.17	NaN
18	NaN	944.0	NaN	NaN	1766.42	NaN

	G2_Sh190oC	G2_Sh210oC	G2_Sh230oC	G2_Sh250oC	frecuencia_Sh170oC \
0	163000.0	169359.00	150515.00	137616.00	500.000
1	142000.0	146049.00	128738.00	120310.00	281.000
2	123000.0	124870.00	109503.00	105154.00	158.000
3	105000.0	105000.00	91613.60	91057.70	88.900
4	88500.0	86653.80	75213.80	77870.90	50.000
5	72700.0	70188.50	60615.80	65873.40	28.100
6	58500.0	55798.10	47883.30	54882.00	15.800
7	46200.0	43587.80	37176.90	45151.80	8.890
8	35800.0	33575.10	28394.40	36729.00	5.000
9	27400.0	25403.80	21383.50	29542.20	2.810
10	20600.0	18996.10	15923.30	23515.30	1.580
11	15300.0	14030.40	11700.70	18530.00	0.889

12	11200.0	10253.40	8512.25	14497.10	0.500
13	8110.0	7445.87	6158.84	11208.90	0.281
14	5840.0	NaN	4399.15	8641.05	0.158
15	4160.0	NaN	3093.10	6595.03	NaN
16	2950.0	NaN	2211.87	5019.15	NaN
17	2100.0	NaN	NaN	3805.66	NaN
18	1450.0	NaN	NaN	2858.24	NaN

	frecuencia_Sh190oC	frecuencia_Sh210oC	frecuencia_Sh230oC	\
0	500.0000	500.000000	500.000000	
1	281.0000	281.172000	281.172000	
2	158.0000	158.117000	158.117000	
3	88.9000	88.916000	88.916000	
4	50.0000	50.002000	50.002000	
5	28.1000	28.118700	28.118700	
6	15.8000	15.812500	15.812500	
7	8.8900	8.892090	8.892090	
8	5.0000	5.000490	5.000490	
9	2.8100	2.812010	2.812010	
10	1.5800	1.581330	1.581330	
11	0.8890	0.889252	0.889252	
12	0.5000	0.500061	0.500061	
13	0.2810	0.281212	0.281212	
14	0.1580	NaN	0.158138	
15	0.0889	NaN	0.088928	
16	0.0500	NaN	0.050009	
17	0.0281	NaN	NaN	
18	0.0158	NaN	NaN	

	frecuencia_Sh250oC
0	500.000000
1	315.477000
2	199.051000
3	125.592000
4	79.242200
5	49.998000
6	31.546400
7	19.904300
8	12.558600
9	7.923950
10	4.999630
11	3.154540
12	1.990390
13	1.255830
14	0.792374
15	0.499954
16	0.315445
17	0.199032

4 List of assumptions, justifying each of them:

All the specimens were run at the same % strain and using the same geometry and gap between the plates.

The polymer was protected with antioxidants, so decomposition is not present.

Assume that the lowest temperature is greater than $T_g + 100$ so I can use the Arrhenius equation for the calculation of the shift factors

Linear polymers (HDPE, LLDPE, PP) and EVOH do not require a vertical shift, but long chain branched polymers do (LDPE, EVA)

5 Algorithm for the solution

Decide the reference temperature

Do the calculations of $\tan \delta$ and G^* where: $\tan \delta = \frac{G''(\omega)}{G'(\omega)}$ $G^*(\omega) = \left[G''(\omega)^2 + G'(\omega)^2 \right]^{0.5}$

According to the abstract of the Mavridis paper

Get the $\tan \delta$ vs. frequency using the data at each T to get a_T

Get the loss tangent vs. G^* to get b_T

Plot $\tan \delta$ vs. ω for all temperatures in the same graph.

Multiply all the frequencies of a given temperature by a factor a_T until it coincides with the reference plotted data.

Do that for each temperature

Plot $\tan \delta$ vs. $G^*(\omega)$

If needed multiply $G^*(\omega)$ by a b_T like in point 4

6 Solution

6.1

$$\tan \delta = \frac{G''(\omega)}{G'(\omega)}$$

```
[3]: def _tand(G1, G2):
      tand = G2 / G1;
      return tand;
```

```

# Iterate the data per sample
sample_id = '';
for i in range(len(df.columns)):
    if ("frecuencia" in df.columns[i]):
        sample_id = df.columns[i].split('_')[1];

        # Compute tan d
        df['tand_' + sample_id] = _tand(df['G1_' + sample_id], df['G2_' +
↪sample_id]);

df = df.reindex(sorted(df.columns), axis=1);
print("./data.csv"); display(df);

```

./data.csv

	G1_Sh170oC	G1_Sh190oC	G1_Sh210oC	G1_Sh230oC	G1_Sh250oC	G2_Sh170oC	\
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	G2_Sh190oC	G2_Sh210oC	G2_Sh230oC	G2_Sh250oC	frecuencia_Sh170oC	\
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2	123000.0	124870.00	109503.00	105154.00	158.000	
3	105000.0	105000.00	91613.60	91057.70	88.900	
4	88500.0	86653.80	75213.80	77870.90	50.000	
5	72700.0	70188.50	60615.80	65873.40	28.100	
6	58500.0	55798.10	47883.30	54882.00	15.800	
7	46200.0	43587.80	37176.90	45151.80	8.890	
8	35800.0	33575.10	28394.40	36729.00	5.000	
9	27400.0	25403.80	21383.50	29542.20	2.810	
10	20600.0	18996.10	15923.30	23515.30	1.580	

11	15300.0	14030.40	11700.70	18530.00	0.889
12	11200.0	10253.40	8512.25	14497.10	0.500
13	8110.0	7445.87	6158.84	11208.90	0.281
14	5840.0	NaN	4399.15	8641.05	0.158
15	4160.0	NaN	3093.10	6595.03	NaN
16	2950.0	NaN	2211.87	5019.15	NaN
17	2100.0	NaN	NaN	3805.66	NaN
18	1450.0	NaN	NaN	2858.24	NaN

	frecuencia_Sh190oC	frecuencia_Sh210oC	frecuencia_Sh230oC	\
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2	158.0000	158.117000	158.117000	
3	88.9000	88.916000	88.916000	
4	50.0000	50.002000	50.002000	
5	28.1000	28.118700	28.118700	
6	15.8000	15.812500	15.812500	
7	8.8900	8.892090	8.892090	
8	5.0000	5.000490	5.000490	
9	2.8100	2.812010	2.812010	
10	1.5800	1.581330	1.581330	
11	0.8890	0.889252	0.889252	
12	0.5000	0.500061	0.500061	
13	0.2810	0.281212	0.281212	
14	0.1580	NaN	0.158138	
15	0.0889	NaN	0.088928	
16	0.0500	NaN	0.050009	
17	0.0281	NaN	NaN	
18	0.0158	NaN	NaN	

	frecuencia_Sh250oC	tand_Sh170oC	tand_Sh190oC	tand_Sh210oC	\
0	500.000000	0.510204	0.546980	0.586941	
1	315.477000	0.555556	0.589212	0.631121	
2	199.051000	0.601770	0.640625	0.683758	
3	125.592000	0.659218	0.695364	0.741814	
4	79.242200	0.726619	0.762931	0.801808	
5	49.998000	0.782243	0.827076	0.864567	
6	31.546400	0.848070	0.893130	0.927728	
7	19.904300	0.914430	0.960499	0.991188	
8	12.558600	0.979358	1.028736	1.057151	
9	7.923950	1.047619	1.100402	1.117889	
10	4.999630	1.106195	1.170455	1.182342	
11	3.154540	1.168750	1.233871	1.235560	
12	1.990390	1.241071	1.303842	1.304841	
13	1.255830	1.288265	1.369932	1.361725	
14	0.792374	1.348624	1.438424	NaN	
15	0.499954	NaN	1.507246	NaN	
16	0.315445	NaN	1.569149	NaN	

17	0.199032	NaN	1.590909	NaN
18	0.125580	NaN	1.536017	NaN

	tand_Sh230oC	tand_Sh250oC
0	0.598943	0.629585
1	0.644515	0.671362
2	0.700259	0.717780
3	0.758730	0.768316
4	0.821858	0.821916
5	0.887417	0.878638
6	0.952034	0.935461
7	1.016743	0.993673
8	1.079557	1.053047
9	1.141781	1.112814
10	1.203675	1.172330
11	1.262281	1.229791
12	1.321558	1.289216
13	1.381773	1.344614
14	1.435126	1.402939
15	1.449411	1.454527
16	1.606133	1.509537
17	NaN	1.573777
18	NaN	1.618098

6.2 Plot $\tan\delta$ vs. frequency for each T

```
[4]: # Set plot size and axis labels' font size
pltname = "loss tangent vs frequency (raw)";
scale    = 6;
fig      = plt.figure(figsize=(3*scale, 2*scale));
plt.rc('xtick', labelsz=15);
plt.rc('ytick', labelsz=15);
plt.tight_layout();

# Iterate the data per sample
sample_id = '';
for i in range(len(df.columns)):
    if ("frecuencia" in df.columns[i]):
        sample_id = df.columns[i].split('_')[1];

    # Define x axis as the date axis
    x_str = 'frecuencia_' + sample_id; x_units = r'$[\frac{\text{rad}}{\text{s}}]$';
    y_str = 'tand_' + sample_id;      y_units = '';

    # Remove NaNs from interesting x,y data
```

```

df_fil = pd.DataFrame(df);
df_fil = df_fil.dropna(subset=[x_str, y_str]);

# Stablish the plot area
ax0 = plt.gca();

# Extract data from a specific country
x = df_fil.iloc[:, x_str];
y = df_fil.iloc[:, y_str];

# Scatter the data and plot a curve to join the points
plt.scatter(x, y, s=45, marker='o', label=sample_id);
plt.plot(x, y, linewidth=1, linestyle='-.');

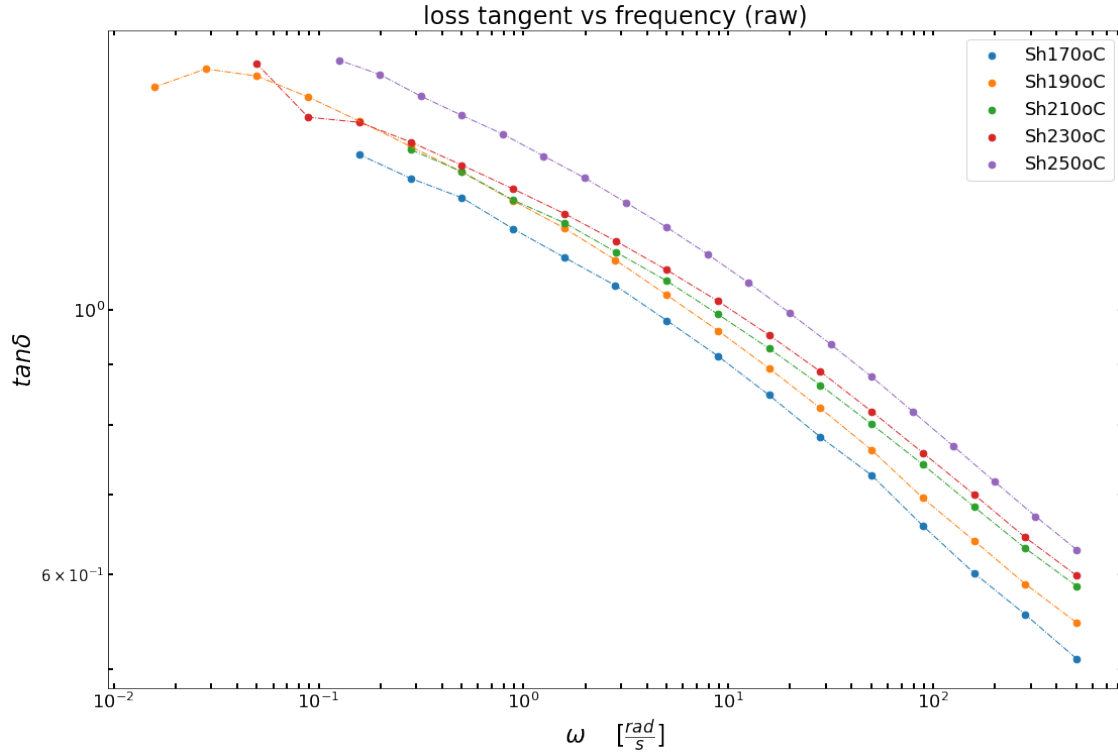
# Show the plot legend to link colors and polymer names
handles, labels = ax0.get_legend_handles_labels();
lgd = dict(zip(labels, handles));

# fig.autofmt_xdate();
ax0.set_xlabel(r'$\omega$' + ' ' + x_units, fontsize=24);
ax0.set_ylabel(r'$\tan \delta$', fontsize=24);

for tick in ax0.xaxis.get_major_ticks(): tick.label.set_fontsize(18);
for tick in ax0.yaxis.get_major_ticks(): tick.label.set_fontsize(18);
ax0.tick_params(which='both', direction='in', length=5, width=2, bottom=True,
    ↳top=True, left=True, right=True);

# Display main plot
plt.yscale('log');
plt.xscale('log');
plt.legend(lgd.values(), lgd.keys(), prop={'size': 18}, loc="best");
plt.title(pltname, size=24);
plt.savefig(pltname + '.png', dpi=200, bbox_inches='tight');
plt.show();
mpl.rcParams.update(mpl.rcParamsDefault); # Recover matplotlib defaults

```

6.3 Manually shift the curves to obtain the horizontal shift factor a_T

```
[5]: #  $a_T$  was manually tuned until TTS
a_T = pd.Series([1.90, 1.20, 1.00, 0.85, 0.50]);

# Iterate the data per sample
sample_id = '';
sample_cnt = 0;
for i in range(len(df.columns)):
    if ("frecuencia_" in df.columns[i]):
        sample_id = df.columns[i].split('_')[1];

        # Compute  $\tan \delta$ 
        df['aT_frequency_' + sample_id] = df['frecuencia_' + sample_id] * _
        ↪ a_T[sample_cnt];

        sample_cnt = sample_cnt + 1;

df = df.reindex(sorted(df.columns), axis=1);
print("./data.csv"); display(df);
```

./data.csv

	G1_Sh170oC	G1_Sh190oC	G1_Sh210oC	G1_Sh230oC	G1_Sh250oC	G2_Sh170oC	\
0	343000.0	298000.0	288545.00	251301.00	218582.00	175000.0	
1	279000.0	241000.0	231412.00	199744.00	179203.00	155000.0	
2	226000.0	192000.0	182623.00	156375.00	146499.00	136000.0	
3	179000.0	151000.0	141545.00	120746.00	118516.00	118000.0	
4	139000.0	116000.0	108073.00	91516.80	94743.10	101000.0	
5	107000.0	87900.0	81183.40	68305.90	74972.20	83700.0	
6	80300.0	65500.0	60144.90	50295.80	58668.40	68100.0	
7	59600.0	48100.0	43975.30	36564.70	45439.30	54500.0	
8	43600.0	34800.0	31760.00	26301.90	34878.80	42700.0	
9	31500.0	24900.0	22724.80	18728.20	26547.30	33000.0	
10	22600.0	17600.0	16066.50	13228.90	20058.60	25000.0	
11	16000.0	12400.0	11355.50	9269.49	15067.60	18700.0	
12	11200.0	8590.0	7857.97	6441.07	11244.90	13900.0	
13	7840.0	5920.0	5467.97	4457.20	8336.15	10100.0	
14	5450.0	4060.0	NaN	3065.34	6159.25	7350.0	
15	NaN	2760.0	NaN	2134.04	4534.14	NaN	
16	NaN	1880.0	NaN	1377.14	3324.96	NaN	
17	NaN	1320.0	NaN	NaN	2418.17	NaN	
18	NaN	944.0	NaN	NaN	1766.42	NaN	

	G2_Sh190oC	G2_Sh210oC	G2_Sh230oC	G2_Sh250oC	aT_frequency_Sh170oC	\
0	163000.0	169359.00	150515.00	137616.00	950.0000	
1	142000.0	146049.00	128738.00	120310.00	533.9000	
2	123000.0	124870.00	109503.00	105154.00	300.2000	
3	105000.0	105000.00	91613.60	91057.70	168.9100	
4	88500.0	86653.80	75213.80	77870.90	95.0000	
5	72700.0	70188.50	60615.80	65873.40	53.3900	
6	58500.0	55798.10	47883.30	54882.00	30.0200	
7	46200.0	43587.80	37176.90	45151.80	16.8910	
8	35800.0	33575.10	28394.40	36729.00	9.5000	
9	27400.0	25403.80	21383.50	29542.20	5.3390	
10	20600.0	18996.10	15923.30	23515.30	3.0020	
11	15300.0	14030.40	11700.70	18530.00	1.6891	
12	11200.0	10253.40	8512.25	14497.10	0.9500	
13	8110.0	7445.87	6158.84	11208.90	0.5339	
14	5840.0	NaN	4399.15	8641.05	0.3002	
15	4160.0	NaN	3093.10	6595.03	NaN	
16	2950.0	NaN	2211.87	5019.15	NaN	
17	2100.0	NaN	NaN	3805.66	NaN	
18	1450.0	NaN	NaN	2858.24	NaN	

	aT_frequency_Sh190oC	aT_frequency_Sh210oC	aT_frequency_Sh230oC	\
0	600.00000	500.000000	425.000000	
1	337.20000	281.172000	238.996200	
2	189.60000	158.117000	134.399450	

3	106.68000	88.916000	75.578600
4	60.00000	50.002000	42.501700
5	33.72000	28.118700	23.900895
6	18.96000	15.812500	13.440625
7	10.66800	8.892090	7.558276
8	6.00000	5.000490	4.250417
9	3.37200	2.812010	2.390208
10	1.89600	1.581330	1.344130
11	1.06680	0.889252	0.755864
12	0.60000	0.500061	0.425052
13	0.33720	0.281212	0.239030
14	0.18960	NaN	0.134417
15	0.10668	NaN	0.075589
16	0.06000	NaN	0.042507
17	0.03372	NaN	NaN
18	0.01896	NaN	NaN

	aT_frequency_Sh250oC	frecuencia_Sh170oC	frecuencia_Sh190oC	\
0	250.000000	500.000	500.0000	
1	157.738500	281.000	281.0000	
2	99.525500	158.000	158.0000	
3	62.796000	88.900	88.9000	
4	39.621100	50.000	50.0000	
5	24.999000	28.100	28.1000	
6	15.773200	15.800	15.8000	
7	9.952150	8.890	8.8900	
8	6.279300	5.000	5.0000	
9	3.961975	2.810	2.8100	
10	2.499815	1.580	1.5800	
11	1.577270	0.889	0.8890	
12	0.995195	0.500	0.5000	
13	0.627915	0.281	0.2810	
14	0.396187	0.158	0.1580	
15	0.249977	NaN	0.0889	
16	0.157722	NaN	0.0500	
17	0.099516	NaN	0.0281	
18	0.062790	NaN	0.0158	

	frecuencia_Sh210oC	frecuencia_Sh230oC	frecuencia_Sh250oC	tand_Sh170oC	\
0	500.000000	500.000000	500.000000	0.510204	
1	281.172000	281.172000	315.477000	0.555556	
2	158.117000	158.117000	199.051000	0.601770	
3	88.916000	88.916000	125.592000	0.659218	
4	50.002000	50.002000	79.242200	0.726619	
5	28.118700	28.118700	49.998000	0.782243	
6	15.812500	15.812500	31.546400	0.848070	
7	8.892090	8.892090	19.904300	0.914430	
8	5.000490	5.000490	12.558600	0.979358	

9	2.812010	2.812010	7.923950	1.047619
10	1.581330	1.581330	4.999630	1.106195
11	0.889252	0.889252	3.154540	1.168750
12	0.500061	0.500061	1.990390	1.241071
13	0.281212	0.281212	1.255830	1.288265
14	NaN	0.158138	0.792374	1.348624
15	NaN	0.088928	0.499954	NaN
16	NaN	0.050009	0.315445	NaN
17	NaN	NaN	0.199032	NaN
18	NaN	NaN	0.125580	NaN

	tand_Sh190oC	tand_Sh210oC	tand_Sh230oC	tand_Sh250oC
0	0.546980	0.586941	0.598943	0.629585
1	0.589212	0.631121	0.644515	0.671362
2	0.640625	0.683758	0.700259	0.717780
3	0.695364	0.741814	0.758730	0.768316
4	0.762931	0.801808	0.821858	0.821916
5	0.827076	0.864567	0.887417	0.878638
6	0.893130	0.927728	0.952034	0.935461
7	0.960499	0.991188	1.016743	0.993673
8	1.028736	1.057151	1.079557	1.053047
9	1.100402	1.117889	1.141781	1.112814
10	1.170455	1.182342	1.203675	1.172330
11	1.233871	1.235560	1.262281	1.229791
12	1.303842	1.304841	1.321558	1.289216
13	1.369932	1.361725	1.381773	1.344614
14	1.438424	NaN	1.435126	1.402939
15	1.507246	NaN	1.449411	1.454527
16	1.569149	NaN	1.606133	1.509537
17	1.590909	NaN	NaN	1.573777
18	1.536017	NaN	NaN	1.618098

6.4 Plot $\tan \delta$ vs. frequency for each T

```
[6]: # Set plot size and axis labels' font size
pltname = "loss tangent vs frequency (" + r'$T_{ref} = 210^{\circ}C$' + ")";
scale    = 6;
fig      = plt.figure(figsize=(3*scale, 2*scale));
plt.rc('xtick', labelsizes=15);
plt.rc('ytick', labelsizes=15);
plt.tight_layout();

# Iterate the data per sample
sample_id = '';
for i in range(len(df.columns)):
```

```

if ("frecuencia" in df.columns[i]):
    sample_id = df.columns[i].split('_')[1];

    # Define x axis as the date axis
    x_str = 'aT_frequency_' + sample_id; x_units = r'$[\frac{rad}{s}]$';
    y_str = 'tand_' + sample_id; y_units = '';

    # Remove NaNs from interesting x,y data
    df_fil = pd.DataFrame(df);
    df_fil = df_fil.dropna(subset=[x_str, y_str]);

    # Stablish the plot area
    ax0 = plt.gca();

    # Extract data from a specific country
    x = df_fil.iloc[:, x_str];
    y = df_fil.iloc[:, y_str];

    # Scatter the data and plot a curve to join the points
    plt.scatter(x, y, s=45, marker='o', label=sample_id);
    plt.plot(x, y, linewidth=1, linestyle='-.');

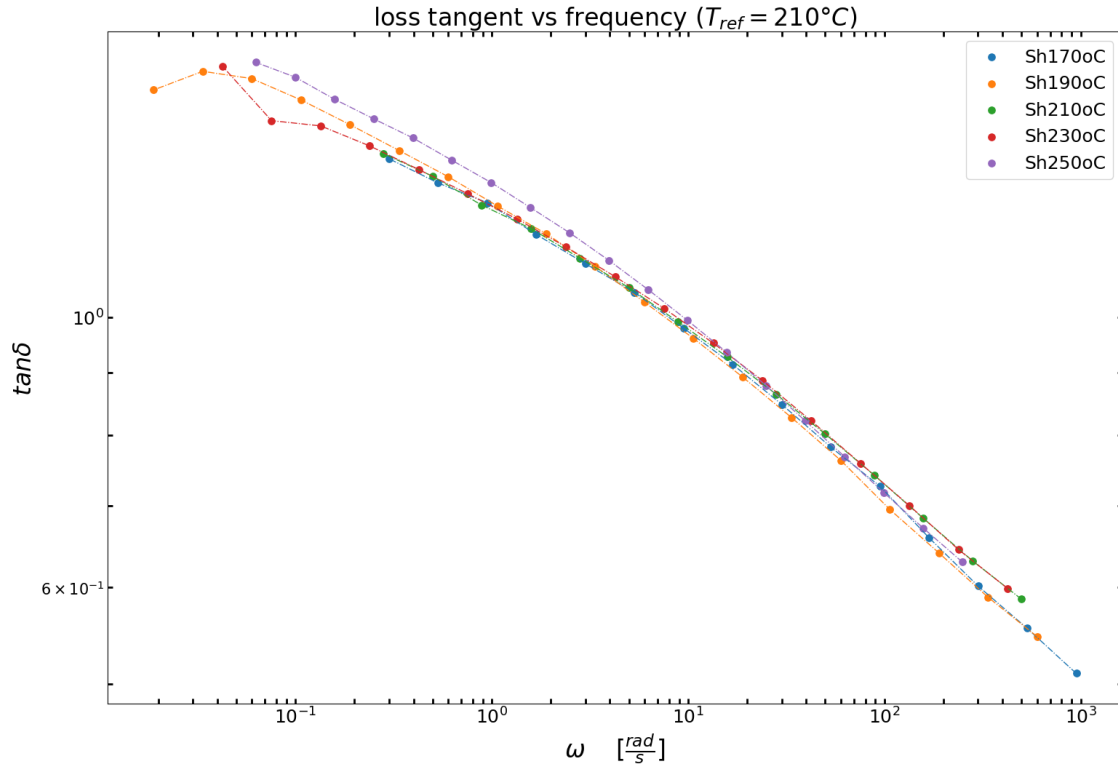
# Show the plot legend to link colors and polymer names
handles, labels = ax0.get_legend_handles_labels();
lgd = dict(zip(labels, handles));

# fig.autofmt_xdate();
ax0.set_xlabel(r'$\omega$' + ' ' + x_units, fontsize=24);
ax0.set_ylabel(r'$\tan \delta$' + ' ' + y_units, fontsize=24);

for tick in ax0.xaxis.get_major_ticks(): tick.label.set_fontsize(18);
for tick in ax0.yaxis.get_major_ticks(): tick.label.set_fontsize(18);
ax0.tick_params(which='both', direction='in', length=5, width=2, bottom=True,
    ↳ top=True, left=True, right=True);

# Display main plot
plt.yscale('log');
plt.xscale('log');
plt.legend(lgd.values(), lgd.keys(), prop={'size': 18}, loc="best");
plt.title(pltname, size=24);
plt.savefig(pltname + '.png', dpi=200, bbox_inches='tight');
plt.show();
mpl.rcParams.update(mpl.rcParamsDefault); # Recover matplotlib defaults

```



6.5

$$G^*(\omega) = \left[G''(\omega)^2 + G'(\omega)^2 \right]^{0.5}$$

```
[7]: def _Gc(G1, G2):
    Gc = np.sqrt(G2**2 + G1**2);
    return Gc;

    # Iterate the data per sample
    sample_id = '';
    for i in range(len(df.columns)):
        if ("frecuencia" in df.columns[i]):
            sample_id = df.columns[i].split('_')[1];

            # Compute Complex Viscosity
            df['Gc_' + sample_id] = _Gc(df['G1_' + sample_id], df['G2_' +
↪sample_id]);

    df = df.reindex(sorted(df.columns), axis=1);
    print("./data.csv"); display(df);
```

./data.csv

	G1_Sh170oC	G1_Sh190oC	G1_Sh210oC	G1_Sh230oC	G1_Sh250oC	G2_Sh170oC	\
0	343000.0	298000.0	288545.00	251301.00	218582.00	175000.0	
1	279000.0	241000.0	231412.00	199744.00	179203.00	155000.0	
2	226000.0	192000.0	182623.00	156375.00	146499.00	136000.0	
3	179000.0	151000.0	141545.00	120746.00	118516.00	118000.0	
4	139000.0	116000.0	108073.00	91516.80	94743.10	101000.0	
5	107000.0	87900.0	81183.40	68305.90	74972.20	83700.0	
6	80300.0	65500.0	60144.90	50295.80	58668.40	68100.0	
7	59600.0	48100.0	43975.30	36564.70	45439.30	54500.0	
8	43600.0	34800.0	31760.00	26301.90	34878.80	42700.0	
9	31500.0	24900.0	22724.80	18728.20	26547.30	33000.0	
10	22600.0	17600.0	16066.50	13228.90	20058.60	25000.0	
11	16000.0	12400.0	11355.50	9269.49	15067.60	18700.0	
12	11200.0	8590.0	7857.97	6441.07	11244.90	13900.0	
13	7840.0	5920.0	5467.97	4457.20	8336.15	10100.0	
14	5450.0	4060.0	NaN	3065.34	6159.25	7350.0	
15	NaN	2760.0	NaN	2134.04	4534.14	NaN	
16	NaN	1880.0	NaN	1377.14	3324.96	NaN	
17	NaN	1320.0	NaN	NaN	2418.17	NaN	
18	NaN	944.0	NaN	NaN	1766.42	NaN	

	G2_Sh190oC	G2_Sh210oC	G2_Sh230oC	G2_Sh250oC	Gc_Sh170oC	\
0	163000.0	169359.00	150515.00	137616.00	385063.631105	
1	142000.0	146049.00	128738.00	120310.00	319164.534371	
2	123000.0	124870.00	109503.00	105154.00	263765.046964	
3	105000.0	105000.00	91613.60	91057.70	214394.496198	
4	88500.0	86653.80	75213.80	77870.90	171819.672913	
5	72700.0	70188.50	60615.80	65873.40	135848.040104	
6	58500.0	55798.10	47883.30	54882.00	105288.650860	
7	46200.0	43587.80	37176.90	45151.80	80761.438818	
8	35800.0	33575.10	28394.40	36729.00	61026.633530	
9	27400.0	25403.80	21383.50	29542.20	45620.718977	
10	20600.0	18996.10	15923.30	23515.30	33701.038560	
11	15300.0	14030.40	11700.70	18530.00	24610.770000	
12	11200.0	10253.40	8512.25	14497.10	17850.770292	
13	8110.0	7445.87	6158.84	11208.90	12785.757701	
14	5840.0	NaN	4399.15	8641.05	9150.136611	
15	4160.0	NaN	3093.10	6595.03	NaN	
16	2950.0	NaN	2211.87	5019.15	NaN	
17	2100.0	NaN	NaN	3805.66	NaN	
18	1450.0	NaN	NaN	2858.24	NaN	

	Gc_Sh190oC	Gc_Sh210oC	Gc_Sh230oC	Gc_Sh250oC	\
0	339666.012430	334575.384489	292928.246890	258294.897704	
1	279723.077346	273645.435089	237636.567430	215843.024694	
2	228019.735988	221232.179009	190903.241549	180331.141839	

3	183918.460194	176238.437990	151567.305910	149457.508963
4	145904.934803	138523.118588	118458.602021	122638.216166
5	114068.838865	107318.078476	91323.442688	99800.478959
6	87820.840351	82041.678186	69444.063220	80336.884944
7	66693.702851	61917.068074	52144.982306	64057.903710
8	49926.746339	46216.717106	38704.416996	50651.259910
9	37023.911193	34084.741300	28425.332847	39717.763257
10	27094.648918	24879.393832	20701.576706	30908.199042
11	19693.907687	18049.917019	14927.485567	23882.911668
12	14114.818454	12918.200497	10674.538997	18347.034758
13	10040.841598	9237.947606	7602.495773	13968.923940
14	7112.608523	NaN	5361.793547	10611.508171
15	4992.314093	NaN	3757.844373	8003.302208
16	3498.128071	NaN	2605.548594	6020.566894
17	2480.403193	NaN	NaN	4508.946017
18	1730.212704	NaN	NaN	3360.026118

	aT_frequency_Sh170oC	aT_frequency_Sh190oC	aT_frequency_Sh210oC	\
0	950.0000	600.00000	500.000000	
1	533.9000	337.20000	281.172000	
2	300.2000	189.60000	158.117000	
3	168.9100	106.68000	88.916000	
4	95.0000	60.00000	50.002000	
5	53.3900	33.72000	28.118700	
6	30.0200	18.96000	15.812500	
7	16.8910	10.66800	8.892090	
8	9.5000	6.00000	5.000490	
9	5.3390	3.37200	2.812010	
10	3.0020	1.89600	1.581330	
11	1.6891	1.06680	0.889252	
12	0.9500	0.60000	0.500061	
13	0.5339	0.33720	0.281212	
14	0.3002	0.18960	NaN	
15	NaN	0.10668	NaN	
16	NaN	0.06000	NaN	
17	NaN	0.03372	NaN	
18	NaN	0.01896	NaN	

	aT_frequency_Sh230oC	aT_frequency_Sh250oC	frecuencia_Sh170oC	\
0	425.000000	250.000000	500.000	
1	238.996200	157.738500	281.000	
2	134.399450	99.525500	158.000	
3	75.578600	62.796000	88.900	
4	42.501700	39.621100	50.000	
5	23.900895	24.999000	28.100	
6	13.440625	15.773200	15.800	
7	7.558276	9.952150	8.890	
8	4.250417	6.279300	5.000	

9	2.390208	3.961975	2.810
10	1.344130	2.499815	1.580
11	0.755864	1.577270	0.889
12	0.425052	0.995195	0.500
13	0.239030	0.627915	0.281
14	0.134417	0.396187	0.158
15	0.075589	0.249977	NaN
16	0.042507	0.157722	NaN
17	NaN	0.099516	NaN
18	NaN	0.062790	NaN

	frecuencia_Sh190oC	frecuencia_Sh210oC	frecuencia_Sh230oC	\
0	500.0000	500.000000	500.000000	
1	281.0000	281.172000	281.172000	
2	158.0000	158.117000	158.117000	
3	88.9000	88.916000	88.916000	
4	50.0000	50.002000	50.002000	
5	28.1000	28.118700	28.118700	
6	15.8000	15.812500	15.812500	
7	8.8900	8.892090	8.892090	
8	5.0000	5.000490	5.000490	
9	2.8100	2.812010	2.812010	
10	1.5800	1.581330	1.581330	
11	0.8890	0.889252	0.889252	
12	0.5000	0.500061	0.500061	
13	0.2810	0.281212	0.281212	
14	0.1580	NaN	0.158138	
15	0.0889	NaN	0.088928	
16	0.0500	NaN	0.050009	
17	0.0281	NaN	NaN	
18	0.0158	NaN	NaN	

	frecuencia_Sh250oC	tand_Sh170oC	tand_Sh190oC	tand_Sh210oC	\
0	500.000000	0.510204	0.546980	0.586941	
1	315.477000	0.555556	0.589212	0.631121	
2	199.051000	0.601770	0.640625	0.683758	
3	125.592000	0.659218	0.695364	0.741814	
4	79.242200	0.726619	0.762931	0.801808	
5	49.998000	0.782243	0.827076	0.864567	
6	31.546400	0.848070	0.893130	0.927728	
7	19.904300	0.914430	0.960499	0.991188	
8	12.558600	0.979358	1.028736	1.057151	
9	7.923950	1.047619	1.100402	1.117889	
10	4.999630	1.106195	1.170455	1.182342	
11	3.154540	1.168750	1.233871	1.235560	
12	1.990390	1.241071	1.303842	1.304841	
13	1.255830	1.288265	1.369932	1.361725	
14	0.792374	1.348624	1.438424	NaN	

15	0.499954	NaN	1.507246	NaN
16	0.315445	NaN	1.569149	NaN
17	0.199032	NaN	1.590909	NaN
18	0.125580	NaN	1.536017	NaN

	tand_Sh230oC	tand_Sh250oC
0	0.598943	0.629585
1	0.644515	0.671362
2	0.700259	0.717780
3	0.758730	0.768316
4	0.821858	0.821916
5	0.887417	0.878638
6	0.952034	0.935461
7	1.016743	0.993673
8	1.079557	1.053047
9	1.141781	1.112814
10	1.203675	1.172330
11	1.262281	1.229791
12	1.321558	1.289216
13	1.381773	1.344614
14	1.435126	1.402939
15	1.449411	1.454527
16	1.606133	1.509537
17	NaN	1.573777
18	NaN	1.618098

6.6 Plot $\tan \delta$ vs. $G^*(\omega)$ for each T

```
[8]: # Set plot size and axis labels' font size
pltname = "loss tangent vs complex viscosity (raw)";
scale    = 6;
fig      = plt.figure(figsize=(3*scale, 2*scale));
plt.rc('xtick', labelsz=15);
plt.rc('ytick', labelsz=15);
plt.tight_layout();

# Iterate the data per sample
sample_id = '';
for i in range(len(df.columns)):
    if ("frecuencia" in df.columns[i]):
        sample_id = df.columns[i].split('_')[1];

    # Define x axis as the date axis
    x_str = 'Gc_' + sample_id; x_units = r'$[Pa \cdot s]$';
    y_str = 'tand_' + sample_id;      y_units = '';
```

```

# Remove NaNs from interesting x,y data
df_fil = pd.DataFrame(df);
df_fil = df_fil.dropna(subset=[x_str, y_str]);

# Stablish the plot area
ax0 = plt.gca();

# Extract data from a specific country
x = df_fil.iloc[:, x_str];
y = df_fil.iloc[:, y_str];

# Scatter the data and plot a curve to join the points
plt.scatter(x, y, s=45, marker='o', label=sample_id);
plt.plot(x, y, linewidth=1, linestyle='-.');

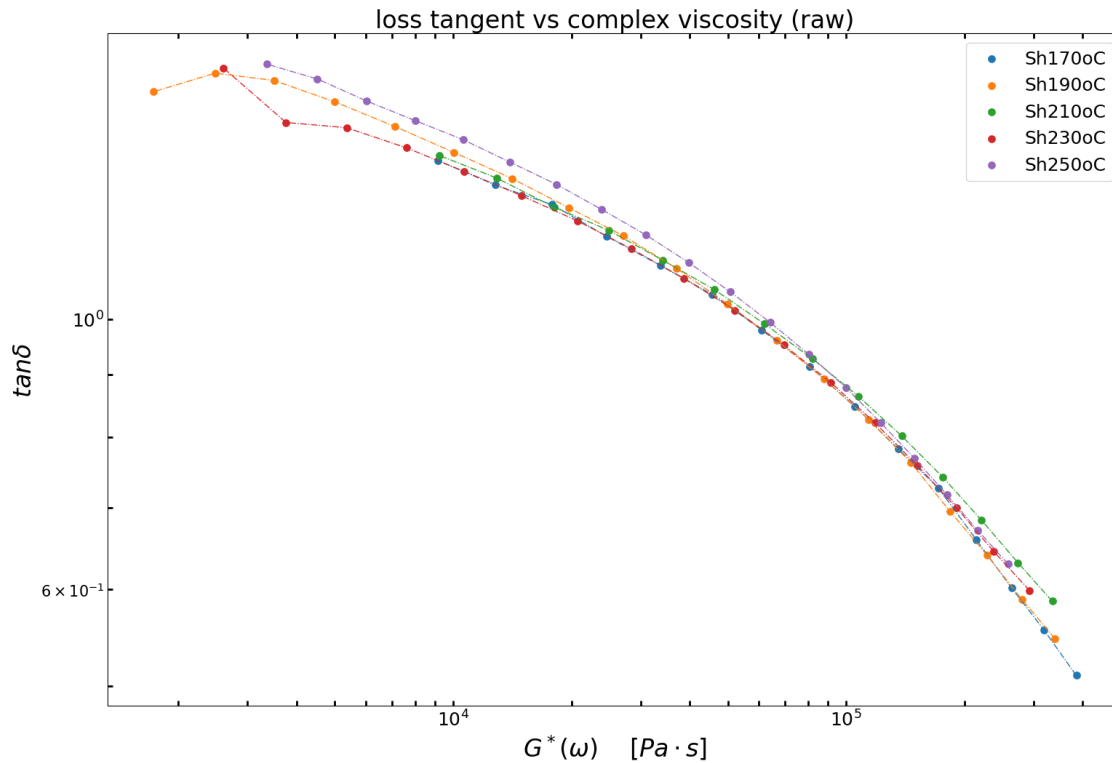
# Show the plot llegend to link colors and polymer names
handles, labels = ax0.get_legend_handles_labels();
lgd = dict(zip(labels, handles));

# fig.autofmt_xdate();
ax0.set_xlabel(r'$G^*(\omega)$' + ' ' + x_units, fontsize=24);
ax0.set_ylabel(r'$\tan \delta$', fontsize=24);

for tick in ax0.xaxis.get_major_ticks(): tick.label.set_fontsize(18);
for tick in ax0.yaxis.get_major_ticks(): tick.label.set_fontsize(18);
ax0.tick_params(which='both', direction='in', length=5, width=2, bottom=True,
    ↳top=True, left=True, right=True);

# Display main plot
plt.yscale('log');
plt.xscale('log');
plt.legend(lgd.values(), lgd.keys(), prop={'size': 18}, loc="best");
plt.title(pltname, size=24);
plt.savefig(pltname + '.png', dpi=200, bbox_inches='tight');
plt.show();
mpl.rcParams.update(mpl.rcParamsDefault); # Recover matplotlib defaults

```



6.7 Manually shift the curves to obtain the vertical shift factor b_T

```
[9]: # a_T was manually tuned until TTS
b_T = pd.Series([1.1, 1.05, 1, 1.1, 1.08]);

# Iterate the data per sample
sample_id = '';
sample_cnt = 0;
for i in range(len(df.columns)):
    if ("frecuencia_" in df.columns[i]):
        sample_id = df.columns[i].split('_')[1];

        # Compute tan d
        df['bT_Gc_' + sample_id] = df['Gc_' + sample_id] * b_T[sample_cnt];

        sample_cnt = sample_cnt + 1;

df = df.reindex(sorted(df.columns), axis=1);
print("./data.csv"); display(df);
```

./data.csv

	G1_Sh170oC	G1_Sh190oC	G1_Sh210oC	G1_Sh230oC	G1_Sh250oC	G2_Sh170oC \
0	343000.0	298000.0	288545.00	251301.00	218582.00	175000.0
1	279000.0	241000.0	231412.00	199744.00	179203.00	155000.0
2	226000.0	192000.0	182623.00	156375.00	146499.00	136000.0
3	179000.0	151000.0	141545.00	120746.00	118516.00	118000.0
4	139000.0	116000.0	108073.00	91516.80	94743.10	101000.0
5	107000.0	87900.0	81183.40	68305.90	74972.20	83700.0
6	80300.0	65500.0	60144.90	50295.80	58668.40	68100.0
7	59600.0	48100.0	43975.30	36564.70	45439.30	54500.0
8	43600.0	34800.0	31760.00	26301.90	34878.80	42700.0
9	31500.0	24900.0	22724.80	18728.20	26547.30	33000.0
10	22600.0	17600.0	16066.50	13228.90	20058.60	25000.0
11	16000.0	12400.0	11355.50	9269.49	15067.60	18700.0
12	11200.0	8590.0	7857.97	6441.07	11244.90	13900.0
13	7840.0	5920.0	5467.97	4457.20	8336.15	10100.0
14	5450.0	4060.0	NaN	3065.34	6159.25	7350.0
15	NaN	2760.0	NaN	2134.04	4534.14	NaN
16	NaN	1880.0	NaN	1377.14	3324.96	NaN
17	NaN	1320.0	NaN	NaN	2418.17	NaN
18	NaN	944.0	NaN	NaN	1766.42	NaN

	G2_Sh190oC	G2_Sh210oC	G2_Sh230oC	G2_Sh250oC	Gc_Sh170oC \
0	163000.0	169359.00	150515.00	137616.00	385063.631105
1	142000.0	146049.00	128738.00	120310.00	319164.534371
2	123000.0	124870.00	109503.00	105154.00	263765.046964
3	105000.0	105000.00	91613.60	91057.70	214394.496198
4	88500.0	86653.80	75213.80	77870.90	171819.672913
5	72700.0	70188.50	60615.80	65873.40	135848.040104
6	58500.0	55798.10	47883.30	54882.00	105288.650860
7	46200.0	43587.80	37176.90	45151.80	80761.438818
8	35800.0	33575.10	28394.40	36729.00	61026.633530
9	27400.0	25403.80	21383.50	29542.20	45620.718977
10	20600.0	18996.10	15923.30	23515.30	33701.038560
11	15300.0	14030.40	11700.70	18530.00	24610.770000
12	11200.0	10253.40	8512.25	14497.10	17850.770292
13	8110.0	7445.87	6158.84	11208.90	12785.757701
14	5840.0	NaN	4399.15	8641.05	9150.136611
15	4160.0	NaN	3093.10	6595.03	NaN
16	2950.0	NaN	2211.87	5019.15	NaN
17	2100.0	NaN	NaN	3805.66	NaN
18	1450.0	NaN	NaN	2858.24	NaN

	Gc_Sh190oC	Gc_Sh210oC	Gc_Sh230oC	Gc_Sh250oC \
0	339666.012430	334575.384489	292928.246890	258294.897704
1	279723.077346	273645.435089	237636.567430	215843.024694
2	228019.735988	221232.179009	190903.241549	180331.141839
3	183918.460194	176238.437990	151567.305910	149457.508963
4	145904.934803	138523.118588	118458.602021	122638.216166

5	114068.838865	107318.078476	91323.442688	99800.478959
6	87820.840351	82041.678186	69444.063220	80336.884944
7	66693.702851	61917.068074	52144.982306	64057.903710
8	49926.746339	46216.717106	38704.416996	50651.259910
9	37023.911193	34084.741300	28425.332847	39717.763257
10	27094.648918	24879.393832	20701.576706	30908.199042
11	19693.907687	18049.917019	14927.485567	23882.911668
12	14114.818454	12918.200497	10674.538997	18347.034758
13	10040.841598	9237.947606	7602.495773	13968.923940
14	7112.608523	NaN	5361.793547	10611.508171
15	4992.314093	NaN	3757.844373	8003.302208
16	3498.128071	NaN	2605.548594	6020.566894
17	2480.403193	NaN	NaN	4508.946017
18	1730.212704	NaN	NaN	3360.026118

	aT_frequency_Sh170oC	aT_frequency_Sh190oC	aT_frequency_Sh210oC	\
0	950.0000	600.00000	500.000000	
1	533.9000	337.20000	281.172000	
2	300.2000	189.60000	158.117000	
3	168.9100	106.68000	88.916000	
4	95.0000	60.00000	50.002000	
5	53.3900	33.72000	28.118700	
6	30.0200	18.96000	15.812500	
7	16.8910	10.66800	8.892090	
8	9.5000	6.00000	5.000490	
9	5.3390	3.37200	2.812010	
10	3.0020	1.89600	1.581330	
11	1.6891	1.06680	0.889252	
12	0.9500	0.60000	0.500061	
13	0.5339	0.33720	0.281212	
14	0.3002	0.18960	NaN	
15	NaN	0.10668	NaN	
16	NaN	0.06000	NaN	
17	NaN	0.03372	NaN	
18	NaN	0.01896	NaN	

	aT_frequency_Sh230oC	aT_frequency_Sh250oC	bT_Gc_Sh170oC	bT_Gc_Sh190oC	\
0	425.000000	250.000000	423569.994216	356649.313051	
1	238.996200	157.738500	351080.987808	293709.231213	
2	134.399450	99.525500	290141.551661	239420.722787	
3	75.578600	62.796000	235833.945818	193114.383203	
4	42.501700	39.621100	189001.640205	153200.181544	
5	23.900895	24.999000	149432.844114	119772.280808	
6	13.440625	15.773200	115817.515946	92211.882369	
7	7.558276	9.952150	88837.582700	70028.387994	
8	4.250417	6.279300	67129.296883	52423.083656	
9	2.390208	3.961975	50182.790875	38875.106752	
10	1.344130	2.499815	37071.142416	28449.381364	

11	0.755864	1.577270	27071.847000	20678.603072
12	0.425052	0.995195	19635.847321	14820.559377
13	0.239030	0.627915	14064.333472	10542.883678
14	0.134417	0.396187	10065.150272	7468.238949
15	0.075589	0.249977	NaN	5241.929797
16	0.042507	0.157722	NaN	3673.034474
17	NaN	0.099516	NaN	2604.423353
18	NaN	0.062790	NaN	1816.723339

	bT_Gc_Sh210oC	bT_Gc_Sh230oC	bT_Gc_Sh250oC	frecuencia_Sh170oC \
0	334575.384489	322221.071579	278958.489520	500.000
1	273645.435089	261400.224173	233110.466669	281.000
2	221232.179009	209993.565704	194757.633186	158.000
3	176238.437990	166724.036502	161414.109680	88.900
4	138523.118588	130304.462223	132449.273459	50.000
5	107318.078476	100455.786957	107784.517275	28.100
6	82041.678186	76388.469542	86763.835740	15.800
7	61917.068074	57359.480537	69182.536007	8.890
8	46216.717106	42574.858695	54703.360702	5.000
9	34084.741300	31267.866132	42895.184317	2.810
10	24879.393832	22771.734376	33380.854966	1.580
11	18049.917019	16420.234124	25793.544602	0.889
12	12918.200497	11741.992897	19814.797539	0.500
13	9237.947606	8362.745351	15086.437855	0.281
14	NaN	5897.972901	11460.428825	0.158
15	NaN	4133.628810	8643.566385	NaN
16	NaN	2866.103454	6502.212245	NaN
17	NaN	NaN	4869.661698	NaN
18	NaN	NaN	3628.828207	NaN

	frecuencia_Sh190oC	frecuencia_Sh210oC	frecuencia_Sh230oC \
0	500.0000	500.000000	500.000000
1	281.0000	281.172000	281.172000
2	158.0000	158.117000	158.117000
3	88.9000	88.916000	88.916000
4	50.0000	50.002000	50.002000
5	28.1000	28.118700	28.118700
6	15.8000	15.812500	15.812500
7	8.8900	8.892090	8.892090
8	5.0000	5.000490	5.000490
9	2.8100	2.812010	2.812010
10	1.5800	1.581330	1.581330
11	0.8890	0.889252	0.889252
12	0.5000	0.500061	0.500061
13	0.2810	0.281212	0.281212
14	0.1580	NaN	0.158138
15	0.0889	NaN	0.088928
16	0.0500	NaN	0.050009

17	0.0281		NaN	NaN
18	0.0158		NaN	NaN
	frecuencia_Sh250oC	tand_Sh170oC	tand_Sh190oC	tand_Sh210oC \
0	500.000000	0.510204	0.546980	0.586941
1	315.477000	0.555556	0.589212	0.631121
2	199.051000	0.601770	0.640625	0.683758
3	125.592000	0.659218	0.695364	0.741814
4	79.242200	0.726619	0.762931	0.801808
5	49.998000	0.782243	0.827076	0.864567
6	31.546400	0.848070	0.893130	0.927728
7	19.904300	0.914430	0.960499	0.991188
8	12.558600	0.979358	1.028736	1.057151
9	7.923950	1.047619	1.100402	1.117889
10	4.999630	1.106195	1.170455	1.182342
11	3.154540	1.168750	1.233871	1.235560
12	1.990390	1.241071	1.303842	1.304841
13	1.255830	1.288265	1.369932	1.361725
14	0.792374	1.348624	1.438424	NaN
15	0.499954	NaN	1.507246	NaN
16	0.315445	NaN	1.569149	NaN
17	0.199032	NaN	1.590909	NaN
18	0.125580	NaN	1.536017	NaN
	tand_Sh230oC	tand_Sh250oC		
0	0.598943	0.629585		
1	0.644515	0.671362		
2	0.700259	0.717780		
3	0.758730	0.768316		
4	0.821858	0.821916		
5	0.887417	0.878638		
6	0.952034	0.935461		
7	1.016743	0.993673		
8	1.079557	1.053047		
9	1.141781	1.112814		
10	1.203675	1.172330		
11	1.262281	1.229791		
12	1.321558	1.289216		
13	1.381773	1.344614		
14	1.435126	1.402939		
15	1.449411	1.454527		
16	1.606133	1.509537		
17	NaN	1.573777		
18	NaN	1.618098		

6.8 Plot $\tan \delta$ vs. $G^*(\omega)$ for each T

```
[10]: # Set plot size and axis labels' font size
pltname = "loss tangent vs complex viscosity (" + r'$T_{ref} = 210^\circ\text{C}$' + ")";
scale = 6;
fig = plt.figure(figsize=(3*scale, 2*scale));
plt.rc('xtick', labelsizes=15);
plt.rc('ytick', labelsizes=15);
plt.tight_layout();

# Iterate the data per sample
sample_id = '';
for i in range(len(df.columns)):
    if ("frecuencia" in df.columns[i]):
        sample_id = df.columns[i].split('_')[1];

        # Define x axis as the date axis
        x_str = 'bT_Gc_' + sample_id; x_units = r'$[\text{Pa} \cdot \text{s}]$';
        y_str = 'tand_' + sample_id; y_units = '';

        # Remove NaNs from interesting x,y data
        df_fil = pd.DataFrame(df);
        df_fil = df_fil.dropna(subset=[x_str, y_str]);

        # Stablish the plot area
        ax0 = plt.gca();

        # Extract data from a specific country
        x = df_fil.iloc[:, x_str];
        y = df_fil.iloc[:, y_str];

        # Scatter the data and plot a curve to join the points
        plt.scatter(x, y, s=45, marker='o', label=sample_id);
        plt.plot(x, y, linewidth=1, linestyle='-.');

# Show the plot llegend to link colors and polymer names
handles, labels = ax0.get_legend_handles_labels();
lgs = dict(zip(labels, handles));

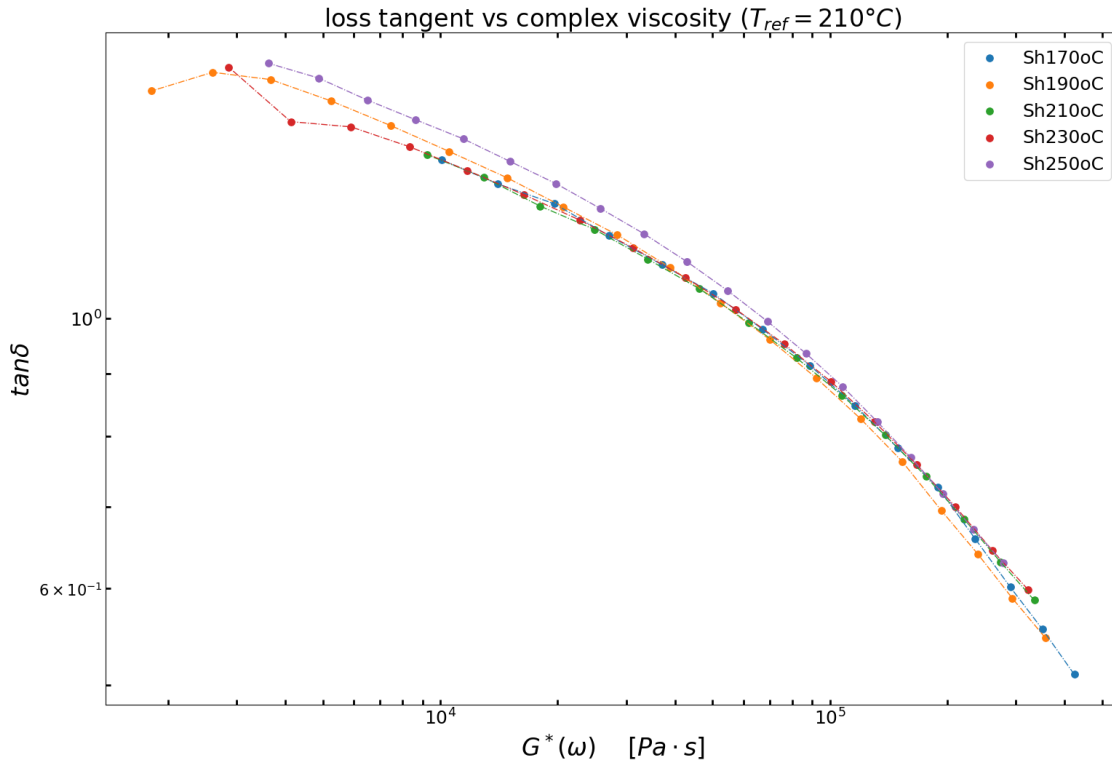
# fig.autofmt_xdate();
ax0.set_xlabel(r'$G^*(\omega)$' + ' ' + x_units, fontsize=24);
ax0.set_ylabel(r'$\tan \delta$', fontsize=24);

for tick in ax0.xaxis.get_major_ticks(): tick.label.set_fontsize(18);
for tick in ax0.yaxis.get_major_ticks(): tick.label.set_fontsize(18);
ax0.tick_params(which='both', direction='in', length=5, width=2, bottom=True,
    ↳top=True, left=True, right=True);
```

```

# Display main plot
plt.yscale('log');
plt.xscale('log');
plt.legend(lgd.values(), lgd.keys(), prop={'size': 18}, loc="best");
plt.title(pltname, size=24);
plt.savefig(pltname + '.png', dpi=200, bbox_inches='tight');
plt.show();
mpl.rcParams.update(mpl.rcParamsDefault); # Recover matplotlib defaults

```



6.9 Get the activation energy E_H and E_V

6.10

$$\log a_T \text{ vs. } \left(\frac{1}{T} - \frac{1}{T_0} \right)$$

```

[11]: def _invT(T, T0):
        invT = (1/T) - (1/T0);
        return invT;

# Declare sample temperatures in Celsius and Kelvin

```

```

T_C    = pd.Series([170, 190, 210, 230, 250, 180, 225]);
T_K    = T_C + 273.15;
T_Cref = T_C[2];
T_Kref = T_K[2];

```

6.11 Plot $\log a_T$ and $\log b_T$ vs. $\left(\frac{1}{T} - \frac{1}{T_0}\right)$ and fit a linear regression to get E_H and E_V

```

[12]: # Set plot size and axis labels' font size
pltname = "slope of the lin. fit is $E_H$";
scale    = 6;
fig      = plt.figure(figsize=(3*scale, 2*scale));
plt.rc('xtick', labels=15);
plt.rc('ytick', labels=15);
plt.tight_layout();
ax0 = plt.gca();

# calculate variables
x = _invT(T_K[:-2], T_Kref);

# HORIZONTAL ACTIVATION ENERGY EH

# perform a linear regression
y = np.log(a_T);
model = LinearRegression().fit(np.array(x).reshape((-1, 1)), np.array(y));
# get the slope
E_H = model.coef_[0];

# plot variables and lin. fit
plt.scatter(x, y, s=25, label='horizontal activation energy ' + r'$E_H$' + " = " +
    "\u2192" + str(round(E_H, 2)) + r'$\frac{kJ}{mol}$');
plt.plot(x, model.predict(np.array(x).reshape((-1, 1))), linewidth=1);

# VERTICAL ACTIVATION ENERGY EV

# perform a linear regression
y = np.log(b_T);
model = LinearRegression().fit(np.array(x).reshape((-1, 1)), np.array(y));
# get the slope
E_V = model.coef_[0];

# plot variables and lin. fit
plt.scatter(x, y, s=25, label='vertical activation energy ' + r'$E_V$' + " = " +
    "\u2192" + str(round(E_V, 2)) + r'$\frac{kJ}{mol}$');
plt.plot(x, model.predict(np.array(x).reshape((-1, 1))), linewidth=1);

```

```

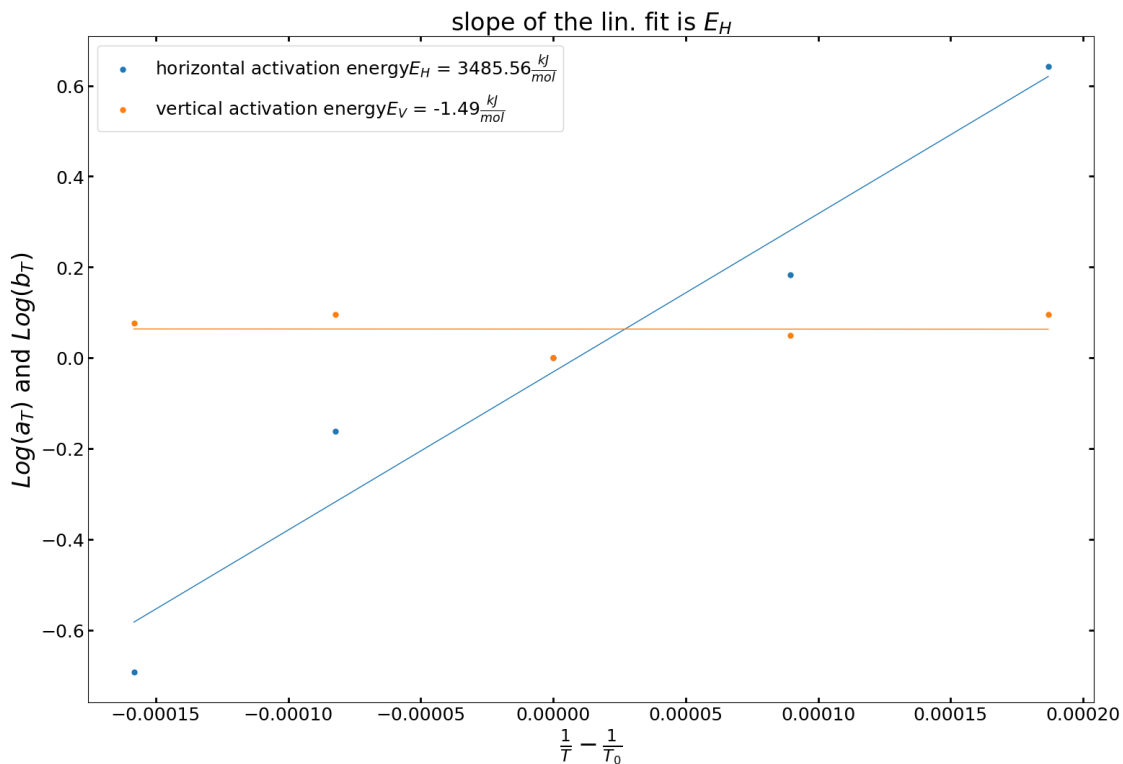
# Show the plot llegend to link colors and polymer names
handles, labels = ax0.get_legend_handles_labels();
lgd = dict(zip(labels, handles));

# fig.autofmt_xdate();
ax0.set_xlabel(r'$\frac{1}{T} - \frac{1}{T_0}$', fontsize=24);
ax0.set_ylabel(r'$\text{Log}(a_T)$' + ' and ' + r'$\text{Log}(b_T)$', fontsize=24);

for tick in ax0.xaxis.get_major_ticks(): tick.label.set_fontsize(18);
for tick in ax0.yaxis.get_major_ticks(): tick.label.set_fontsize(18);
ax0.tick_params(which='both', direction='in', length=5, width=2, bottom=True,
    ↳top=True, left=True, right=True);

# Display main plot
plt.yscale('linear');
plt.xscale('linear');
plt.legend(lgd.values(), lgd.keys(), prop={'size': 18}, loc="best");
plt.title(pltname, size=24);
plt.savefig(pltname + '.png', dpi=200, bbox_inches='tight');
plt.show();
mpl.rcParams.update(mpl.rcParamsDefault); # Recover matplotlib defaults

```



6.12 Compute the shift factor a_T for arbitrary temperatures

$$a_T = \exp \left[E_H \left(\frac{1}{T} - \frac{1}{T_0} \right) \right]$$
$$b_T = \exp \left[E_V \left(\frac{1}{T} - \frac{1}{T_0} \right) \right]$$

```
[13]: at1 = np.exp(E_H*_invT(T_K[5], T_Kref));
      at2 = np.exp(E_H*_invT(T_K[6], T_Kref));

      bt1 = np.exp(E_V*_invT(T_K[5], T_Kref));
      bt2 = np.exp(E_V*_invT(T_K[6], T_Kref));

      a_T = a_T.append(pd.Series([at1, at2]));
      b_T = b_T.append(pd.Series([bt1, bt2]));

      display('a_T'); display(a_T);
      display('b_T'); display(b_T);
      display('T_C'); display(T_C);
```

'a_T'

```
0    1.900000
1    1.200000
2    1.000000
3    0.850000
4    0.500000
0    1.612211
1    0.804744
dtype: float64
```

'b_T'

```
0    1.100000
1    1.050000
2    1.000000
3    1.100000
4    1.080000
0    0.999795
1    1.000093
dtype: float64
```

'T_C'

```
0    170
1    190
2    210
3    230
4    250
5    180
6    225
dtype: int64
```

6.13

$$\eta^*(\omega) = \frac{G^*(\omega)}{\omega}$$

```
[14]: def _etac(G2, w):
        etac = G2/w;
        return etac;

# Iterate the data per sample
sample_id = '';
etacmaster_Sh210oC = pd.Series([]);
freqmaster_Sh210oC = pd.Series([]);
for i in range(len(df.columns)):
    if ("frecuencia" in df.columns[i]):
        sample_id = df.columns[i].split('_')[1];

        # Compute Complex Viscosity
        df['aT_etac_' + sample_id] = _etac(df['bT_Gc_' + sample_id],
        ↪df['aT_frequency_' + sample_id]);

        # Store master curve
        etacmaster_Sh210oC = etacmaster_Sh210oC.append(df['aT_etac_' +
        ↪sample_id]);
        freqmaster_Sh210oC = freqmaster_Sh210oC.append(df['aT_frequency_' +
        ↪sample_id]);

# Sort data
freqmaster_Sh210oC = freqmaster_Sh210oC.reset_index(drop=True)
etacmaster_Sh210oC = etacmaster_Sh210oC.reset_index(drop=True)
mastercurve = pd.DataFrame()
mastercurve['freq'] = pd.Series(freqmaster_Sh210oC)
mastercurve['eta'] = pd.Series(etacmaster_Sh210oC)
mastercurve = mastercurve.sort_values('freq')

df = df.reindex(sorted(df.columns), axis=1);
print("./data.csv"); display(df);
```

./data.csv

	G1_Sh170oC	G1_Sh190oC	G1_Sh210oC	G1_Sh230oC	G1_Sh250oC	G2_Sh170oC	\
0	343000.0	298000.0	288545.00	251301.00	218582.00	175000.0	
1	279000.0	241000.0	231412.00	199744.00	179203.00	155000.0	
2	226000.0	192000.0	182623.00	156375.00	146499.00	136000.0	
3	179000.0	151000.0	141545.00	120746.00	118516.00	118000.0	
4	139000.0	116000.0	108073.00	91516.80	94743.10	101000.0	
5	107000.0	87900.0	81183.40	68305.90	74972.20	83700.0	
6	80300.0	65500.0	60144.90	50295.80	58668.40	68100.0	
7	59600.0	48100.0	43975.30	36564.70	45439.30	54500.0	
8	43600.0	34800.0	31760.00	26301.90	34878.80	42700.0	
9	31500.0	24900.0	22724.80	18728.20	26547.30	33000.0	
10	22600.0	17600.0	16066.50	13228.90	20058.60	25000.0	
11	16000.0	12400.0	11355.50	9269.49	15067.60	18700.0	

12	11200.0	8590.0	7857.97	6441.07	11244.90	13900.0
13	7840.0	5920.0	5467.97	4457.20	8336.15	10100.0
14	5450.0	4060.0	NaN	3065.34	6159.25	7350.0
15	NaN	2760.0	NaN	2134.04	4534.14	NaN
16	NaN	1880.0	NaN	1377.14	3324.96	NaN
17	NaN	1320.0	NaN	NaN	2418.17	NaN
18	NaN	944.0	NaN	NaN	1766.42	NaN

	G2_Sh190oC	G2_Sh210oC	G2_Sh230oC	G2_Sh250oC	Gc_Sh170oC	\
0	163000.0	169359.00	150515.00	137616.00	385063.631105	
1	142000.0	146049.00	128738.00	120310.00	319164.534371	
2	123000.0	124870.00	109503.00	105154.00	263765.046964	
3	105000.0	105000.00	91613.60	91057.70	214394.496198	
4	88500.0	86653.80	75213.80	77870.90	171819.672913	
5	72700.0	70188.50	60615.80	65873.40	135848.040104	
6	58500.0	55798.10	47883.30	54882.00	105288.650860	
7	46200.0	43587.80	37176.90	45151.80	80761.438818	
8	35800.0	33575.10	28394.40	36729.00	61026.633530	
9	27400.0	25403.80	21383.50	29542.20	45620.718977	
10	20600.0	18996.10	15923.30	23515.30	33701.038560	
11	15300.0	14030.40	11700.70	18530.00	24610.770000	
12	11200.0	10253.40	8512.25	14497.10	17850.770292	
13	8110.0	7445.87	6158.84	11208.90	12785.757701	
14	5840.0	NaN	4399.15	8641.05	9150.136611	
15	4160.0	NaN	3093.10	6595.03	NaN	
16	2950.0	NaN	2211.87	5019.15	NaN	
17	2100.0	NaN	NaN	3805.66	NaN	
18	1450.0	NaN	NaN	2858.24	NaN	

	Gc_Sh190oC	Gc_Sh210oC	Gc_Sh230oC	Gc_Sh250oC	\
0	339666.012430	334575.384489	292928.246890	258294.897704	
1	279723.077346	273645.435089	237636.567430	215843.024694	
2	228019.735988	221232.179009	190903.241549	180331.141839	
3	183918.460194	176238.437990	151567.305910	149457.508963	
4	145904.934803	138523.118588	118458.602021	122638.216166	
5	114068.838865	107318.078476	91323.442688	99800.478959	
6	87820.840351	82041.678186	69444.063220	80336.884944	
7	66693.702851	61917.068074	52144.982306	64057.903710	
8	49926.746339	46216.717106	38704.416996	50651.259910	
9	37023.911193	34084.741300	28425.332847	39717.763257	
10	27094.648918	24879.393832	20701.576706	30908.199042	
11	19693.907687	18049.917019	14927.485567	23882.911668	
12	14114.818454	12918.200497	10674.538997	18347.034758	
13	10040.841598	9237.947606	7602.495773	13968.923940	
14	7112.608523	NaN	5361.793547	10611.508171	
15	4992.314093	NaN	3757.844373	8003.302208	
16	3498.128071	NaN	2605.548594	6020.566894	
17	2480.403193	NaN	NaN	4508.946017	

18	1730.212704	NaN	NaN	3360.026118
----	-------------	-----	-----	-------------

	aT_etac_Sh170oC	aT_etac_Sh190oC	aT_etac_Sh210oC	aT_etac_Sh230oC	\
0	445.863152	594.415522	669.150769	758.167227	
1	657.578175	871.023817	973.231457	1093.742177	
2	966.494176	1262.767525	1399.167572	1562.458520	
3	1396.210679	1810.221065	1982.077894	2205.968839	
4	1989.490950	2553.336359	2770.351558	3065.864712	
5	2798.892004	3551.965623	3816.608822	4203.013609	
6	3858.011857	4863.495906	5188.406526	5683.401593	
7	5259.462595	6564.340832	6963.162549	7588.962978	
8	7066.241777	8737.180609	9242.437662	10016.632181	
9	9399.286547	11528.797969	12121.130899	13081.647953	
10	12348.814929	15004.947977	15733.208016	16941.609744	
11	16027.379670	19383.767409	20297.864969	21723.788643	
12	20669.312969	24700.932295	25833.249338	27624.848350	
13	26342.636208	31265.965831	32850.474398	34986.145478	
14	33528.148808	39389.445934	NaN	43878.078948	
15	NaN	49136.949731	NaN	54685.608367	
16	NaN	61217.241240	NaN	67425.861368	
17	NaN	77236.754231	NaN	NaN	
18	NaN	95818.741502	NaN	NaN	

	aT_etac_Sh250oC	aT_frequency_Sh170oC	aT_frequency_Sh190oC	\
0	1115.833958	950.0000	600.00000	
1	1477.828600	533.9000	337.20000	
2	1956.861640	300.2000	189.60000	
3	2570.452094	168.9100	106.68000	
4	3342.897432	95.0000	60.00000	
5	4311.553153	53.3900	33.72000	
6	5500.712331	30.0200	18.96000	
7	6951.516608	16.8910	10.66800	
8	8711.697276	9.5000	6.00000	
9	10826.717563	5.3390	3.37200	
10	13353.330133	3.0020	1.89600	
11	16353.284220	1.6891	1.06680	
12	19910.467334	0.9500	0.60000	
13	24026.242174	0.5339	0.33720	
14	28926.816944	0.3002	0.18960	
15	34577.446666	NaN	0.10668	
16	41225.647865	NaN	0.06000	
17	48933.454906	NaN	0.03372	
18	57793.091376	NaN	0.01896	

	aT_frequency_Sh210oC	aT_frequency_Sh230oC	aT_frequency_Sh250oC	\
0	500.000000	425.000000	250.000000	
1	281.172000	238.996200	157.738500	
2	158.117000	134.399450	99.525500	

3	88.916000	75.578600	62.796000
4	50.002000	42.501700	39.621100
5	28.118700	23.900895	24.999000
6	15.812500	13.440625	15.773200
7	8.892090	7.558276	9.952150
8	5.000490	4.250417	6.279300
9	2.812010	2.390208	3.961975
10	1.581330	1.344130	2.499815
11	0.889252	0.755864	1.577270
12	0.500061	0.425052	0.995195
13	0.281212	0.239030	0.627915
14	NaN	0.134417	0.396187
15	NaN	0.075589	0.249977
16	NaN	0.042507	0.157722
17	NaN	NaN	0.099516
18	NaN	NaN	0.062790

	bT_Gc_Sh170oC	bT_Gc_Sh190oC	bT_Gc_Sh210oC	bT_Gc_Sh230oC	bT_Gc_Sh250oC	\
0	423569.994216	356649.313051	334575.384489	322221.071579	278958.489520	
1	351080.987808	293709.231213	273645.435089	261400.224173	233110.466669	
2	290141.551661	239420.722787	221232.179009	209993.565704	194757.633186	
3	235833.945818	193114.383203	176238.437990	166724.036502	161414.109680	
4	189001.640205	153200.181544	138523.118588	130304.462223	132449.273459	
5	149432.844114	119772.280808	107318.078476	100455.786957	107784.517275	
6	115817.515946	92211.882369	82041.678186	76388.469542	86763.835740	
7	88837.582700	70028.387994	61917.068074	57359.480537	69182.536007	
8	67129.296883	52423.083656	46216.717106	42574.858695	54703.360702	
9	50182.790875	38875.106752	34084.741300	31267.866132	42895.184317	
10	37071.142416	28449.381364	24879.393832	22771.734376	33380.854966	
11	27071.847000	20678.603072	18049.917019	16420.234124	25793.544602	
12	19635.847321	14820.559377	12918.200497	11741.992897	19814.797539	
13	14064.333472	10542.883678	9237.947606	8362.745351	15086.437855	
14	10065.150272	7468.238949	NaN	5897.972901	11460.428825	
15	NaN	5241.929797	NaN	4133.628810	8643.566385	
16	NaN	3673.034474	NaN	2866.103454	6502.212245	
17	NaN	2604.423353	NaN	NaN	4869.661698	
18	NaN	1816.723339	NaN	NaN	3628.828207	

	frecuencia_Sh170oC	frecuencia_Sh190oC	frecuencia_Sh210oC	\
0	500.000	500.0000	500.000000	
1	281.000	281.0000	281.172000	
2	158.000	158.0000	158.117000	
3	88.900	88.9000	88.916000	
4	50.000	50.0000	50.002000	
5	28.100	28.1000	28.118700	
6	15.800	15.8000	15.812500	
7	8.890	8.8900	8.892090	
8	5.000	5.0000	5.000490	

9	2.810	2.8100	2.812010
10	1.580	1.5800	1.581330
11	0.889	0.8890	0.889252
12	0.500	0.5000	0.500061
13	0.281	0.2810	0.281212
14	0.158	0.1580	NaN
15	NaN	0.0889	NaN
16	NaN	0.0500	NaN
17	NaN	0.0281	NaN
18	NaN	0.0158	NaN

	frecuencia_Sh230oC	frecuencia_Sh250oC	tand_Sh170oC	tand_Sh190oC \
0	500.000000	500.000000	0.510204	0.546980
1	281.172000	315.477000	0.555556	0.589212
2	158.117000	199.051000	0.601770	0.640625
3	88.916000	125.592000	0.659218	0.695364
4	50.002000	79.242200	0.726619	0.762931
5	28.118700	49.998000	0.782243	0.827076
6	15.812500	31.546400	0.848070	0.893130
7	8.892090	19.904300	0.914430	0.960499
8	5.000490	12.558600	0.979358	1.028736
9	2.812010	7.923950	1.047619	1.100402
10	1.581330	4.999630	1.106195	1.170455
11	0.889252	3.154540	1.168750	1.233871
12	0.500061	1.990390	1.241071	1.303842
13	0.281212	1.255830	1.288265	1.369932
14	0.158138	0.792374	1.348624	1.438424
15	0.088928	0.499954	NaN	1.507246
16	0.050009	0.315445	NaN	1.569149
17	NaN	0.199032	NaN	1.590909
18	NaN	0.125580	NaN	1.536017

	tand_Sh210oC	tand_Sh230oC	tand_Sh250oC
0	0.586941	0.598943	0.629585
1	0.631121	0.644515	0.671362
2	0.683758	0.700259	0.717780
3	0.741814	0.758730	0.768316
4	0.801808	0.821858	0.821916
5	0.864567	0.887417	0.878638
6	0.927728	0.952034	0.935461
7	0.991188	1.016743	0.993673
8	1.057151	1.079557	1.053047
9	1.117889	1.141781	1.112814
10	1.182342	1.203675	1.172330
11	1.235560	1.262281	1.229791
12	1.304841	1.321558	1.289216
13	1.361725	1.381773	1.344614
14	NaN	1.435126	1.402939

15	NaN	1.449411	1.454527
16	NaN	1.606133	1.509537
17	NaN	NaN	1.573777
18	NaN	NaN	1.618098

6.14 Plot master curve for complex viscosity vs frequency

```
[15]: # Set plot size and axis labels' font size
pltname = "Master curve for complex viscosity vs frequency (" + r'$T_{ref} = \rightarrow 210^{\circ}C$' + ")";
scale = 6;
fig = plt.figure(figsize=(3*scale, 2*scale));
plt.rc('xtick', labelsiz=15);
plt.rc('ytick', labelsiz=15);
plt.tight_layout();

# Iterate the data per sample

sample_id = '';
for i in range(len(df.columns)):
    if ("frecuencia" in df.columns[i]):
        sample_id = df.columns[i].split('_')[1];

        # Define x axis as the date axis
        x_str = 'aT_frequency_' + sample_id; x_units = r'$[\frac{rad}{s}]$';
        y_str = 'aT_etac_' + sample_id; y_units = r'$[Pa \cdot s]$';

        # Remove NANs from interesting x,y data
        df_fil = pd.DataFrame(df);
        df_fil = df_fil.dropna(subset=[x_str, y_str]);

        # Stablsh the plot area
        ax0 = plt.gca();

        # Extract data from a specific country
        x = df_fil.iloc[:, x_str];
        y = df_fil.iloc[:, y_str];

        # Scatter the data and plot a curve to join the points
        plt.scatter(x, y, s=45, marker='o', label=sample_id);
        plt.plot(x, y, linewidth=1, linestyle='-.');

# Show the plot lengend to link colors and polymer names
handles, labels = ax0.get_legend_handles_labels();
lgd = dict(zip(labels, handles));
```

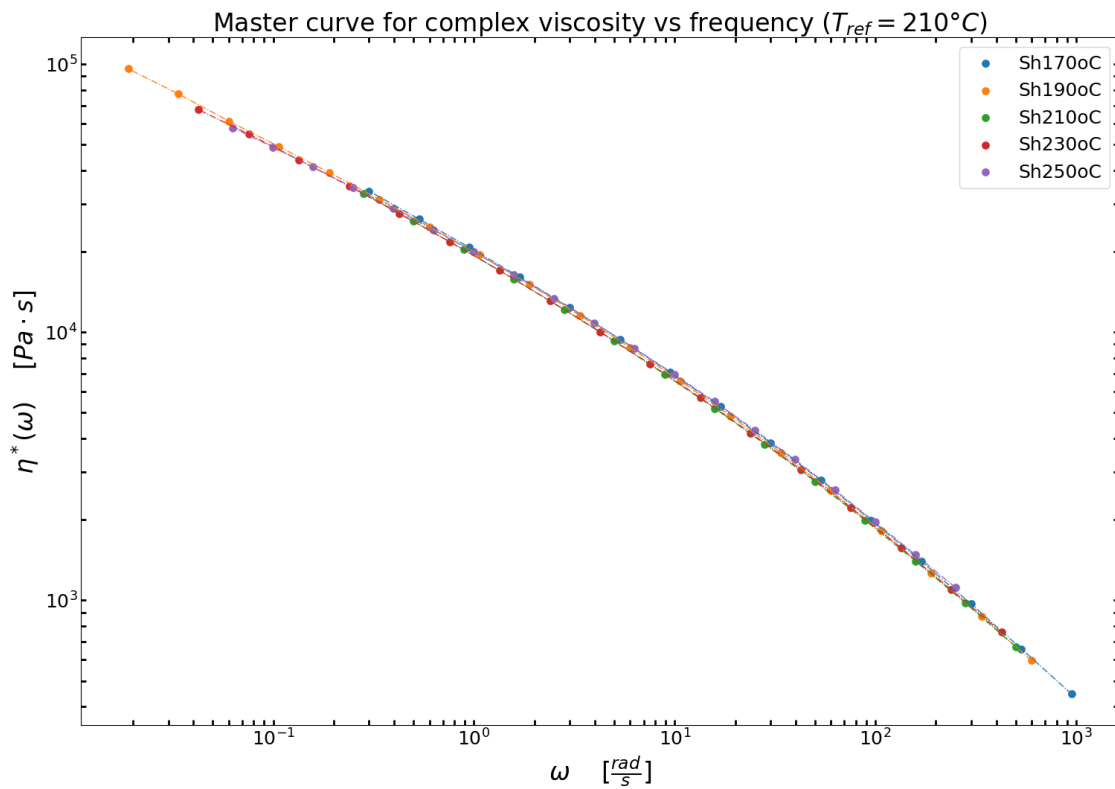
```

# fig.autofmt_xdate();
ax0.set_xlabel(r'$\omega$' + ' ' + x_units, fontsize=24);
ax0.set_ylabel(r'$\eta^*(\omega)$' + ' ' + y_units, fontsize=24);

for tick in ax0.xaxis.get_major_ticks(): tick.label.set_fontsize(18);
for tick in ax0.yaxis.get_major_ticks(): tick.label.set_fontsize(18);
ax0.tick_params(which='both', direction='in', length=5, width=2, bottom=True,
    ↳top=True, left=True, right=True);

# Display main plot
plt.yscale('log');
plt.xscale('log');
plt.legend(lgd.values(), lgd.keys(), prop={'size': 18}, loc="best");
plt.title(pltname, size=24);
plt.savefig(pltname + '.png', dpi=200, bbox_inches='tight');
plt.show();
mpl.rcParams.update(mpl.rcParamsDefault); # Recover matplotlib defaults

```



6.15 Plot complex viscosity vs frequency @different temperatures

```
[16]: # Set plot size and axis labels' font size
pltname = "complex viscosity vs frequency @different temperatures";
scale    = 6;
fig      = plt.figure(figsize=(3*scale, 2*scale));
plt.rc('xtick', labelsizes=15);
plt.rc('ytick', labelsizes=15);
plt.tight_layout();

# Stablish the plot area
ax0 = plt.gca();

# Extract data from a specific country
x = mastercurve['freq'];
y = mastercurve['eta'];

# Scatter the data and plot a curve to join the points
print(np.array(T_C))
for T, a, b in zip(T_C, a_T, b_T):
    if T in [210, 180, 225]:
        plt.scatter(x*a, y*b, s=25, marker='o');
        plt.plot(x*a, y*b, linewidth=2, linestyle='-.', label=r'$T = $' + _
→str(T) + '$ °C$');

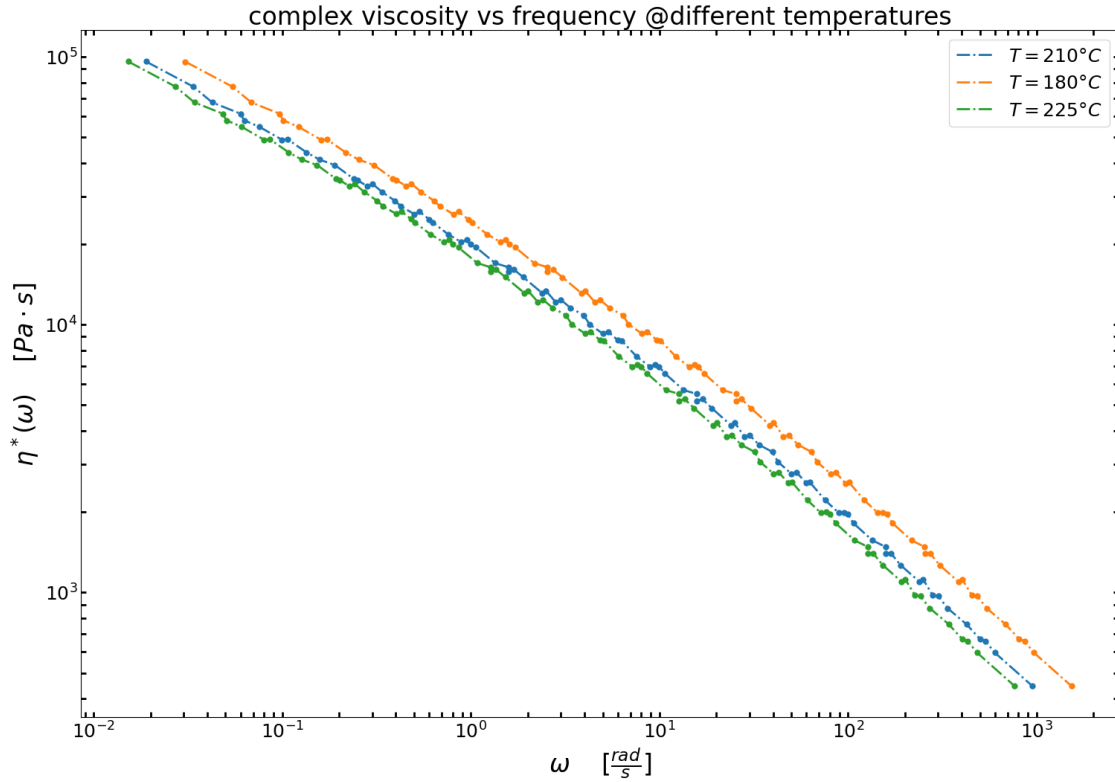
# Show the plot lengend to link colors and polymer names
handles, labels = ax0.get_legend_handles_labels();
lgd = dict(zip(labels, handles));

# fig.autofmt_xdate();
ax0.set_xlabel(r'$\omega$' + ' ' + x_units, fontsize=24);
ax0.set_ylabel(r'$\eta^*(\omega)$' + ' ' + y_units, fontsize=24);

for tick in ax0.xaxis.get_major_ticks(): tick.label.set_fontsize(18);
for tick in ax0.yaxis.get_major_ticks(): tick.label.set_fontsize(18);
ax0.tick_params(which='both', direction='in', length=5, width=2, bottom=True, _
→top=True, left=True, right=True);

# Display main plot
plt.yscale('log');
plt.xscale('log');
plt.legend(lgd.values(), lgd.keys(), prop={'size': 18}, loc="best");
plt.title(pltname, size=24);
plt.savefig(pltname + '.png', dpi=200, bbox_inches='tight');
plt.show();
mpl.rcParams.update(mpl.rcParamsDefault); # Recover matplotlib defaults
```

[170 190 210 230 250 180 225]



7 References

- J. Ahmed, Time–Temperature Superposition Principle and its Application to Biopolymer and Food Rheology, in: Adv. Food Rheol. Its Appl., Elsevier, 2017: pp. 209–241. <https://doi.org/10.1016/B978-0-08-100431-9.00009-7>.
- A. Oseli, A. Aulova, M. Gergesova, I. Emri, Time-Temperature Superposition in Linear and Non-linear Domain, Mater. Today Proc. 3 (2016) 1118–1123. <https://doi.org/10.1016/j.matpr.2016.03.059>.
- H. Mavridis, R.N. Shroff, Temperature dependence of polyolefin melt rheology, Polym. Eng. Sci. 32 (1992) 1778–1791. <https://doi.org/10.1002/pen.760322307>.

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