

MTF_Interp_Polar_Plots

September 23, 2015

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In [1]: import pandas as pd
import pickle
import seaborn as snb
import matplotlib.pyplot as plt
import numpy as np
%matplotlib inline

In [2]: polar_halfs_dat = pd.read_pickle('MTFHalfPolar.p')
interp_halfs_dat = pd.read_pickle('MTFHalfInterp.p')

In [17]: grouped_polar = polar_halfs_dat.groupby(['Soffset', 'Doffset'])

polar_halfs = {}
for a,b in grouped_polar:
    group = b[['xslice', 'yslice', 'zslice', 'xslice_radius', 'yslice_radius', 'zslice_radius'\
, 'xslice_slope', 'yslice_slope', 'zslice_slope', 'mag', 'Soffset', 'Doffset']]
    polar_halfs[a] = {'means':group.groupby("mag").mean(),
                     'vars':group.groupby("mag").var(ddof=1),
                     'stds':group.groupby("mag").std(ddof=1)}

grouped_interp = interp_halfs_dat.groupby(['S', 'D'])

interp_halfs = {}
for a,b in grouped_interp:
    group = b[['X1', 'X2', 'X3', 'X4', 'Y1', 'Y2', 'Y3', 'Y4', 'Z1', 'Z2', 'Z3', 'Z4', 'mag', 'D', 'S']]
    interp_halfs[a] = {'means':group.groupby("mag").mean(),
                     'vars':group.groupby("mag").var(ddof=1),
                     'stds':group.groupby("mag").std(ddof=1)}

In [4]: S1D1 = interp_halfs[(1,1)]['means']
avs_S1D1 = pd.DataFrame(columns=['X', 'Y', 'Z'])
avs_S1D1.X = S1D1[['X1', 'X2', 'X3', 'X4']].transpose().mean()
avs_S1D1.Y = S1D1[['Y1', 'Y2', 'Y3', 'Y4']].transpose().mean()
avs_S1D1.Z = S1D1[['Z1', 'Z2', 'Z3', 'Z4']].transpose().mean()

S1D1 = interp_halfs[(1,1)]['stds']
stds_S1D1 = pd.DataFrame(columns=['X', 'Y', 'Z'])
stds_S1D1.X = S1D1[['X1', 'X2', 'X3', 'X4']].transpose().mean()
stds_S1D1.Y = S1D1[['Y1', 'Y2', 'Y3', 'Y4']].transpose().mean()
stds_S1D1.Z = S1D1[['Z1', 'Z2', 'Z3', 'Z4']].transpose().mean()

S0D1 = interp_halfs[(0,1)]['means']
avs_S0D1 = pd.DataFrame(columns=['X', 'Y', 'Z'])
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avs_SOD1.X = SOD1[['X1', 'X2', 'X3', 'X4']].transpose().mean()
avs_SOD1.Y = SOD1[['Y1', 'Y2', 'Y3', 'Y4']].transpose().mean()
avs_SOD1.Z = SOD1[['Z1', 'Z2', 'Z3', 'Z4']].transpose().mean()

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SOD1 = interp_halfs[(0,1)]['stds']
stds_SOD1 = pd.DataFrame(columns=['X', 'Y', 'Z'])
stds_SOD1.X = SOD1[['X1', 'X2', 'X3', 'X4']].transpose().mean()
stds_SOD1.Y = SOD1[['Y1', 'Y2', 'Y3', 'Y4']].transpose().mean()
stds_SOD1.Z = SOD1[['Z1', 'Z2', 'Z3', 'Z4']].transpose().mean()

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S1D0 = interp_halfs[(1,0)]['means']
avs_S1D0 = pd.DataFrame(columns=['X', 'Y', 'Z'])
avs_S1D0.X = S1D0[['X1', 'X2', 'X3', 'X4']].transpose().mean()
avs_S1D0.Y = S1D0[['Y1', 'Y2', 'Y3', 'Y4']].transpose().mean()
avs_S1D0.Z = S1D0[['Z1', 'Z2', 'Z3', 'Z4']].transpose().mean()

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S1D0 = interp_halfs[(1,0)]['stds']
stds_S1D0 = pd.DataFrame(columns=['X', 'Y', 'Z'])
stds_S1D0.X = S1D0[['X1', 'X2', 'X3', 'X4']].transpose().mean()
stds_S1D0.Y = S1D0[['Y1', 'Y2', 'Y3', 'Y4']].transpose().mean()
stds_S1D0.Z = S1D0[['Z1', 'Z2', 'Z3', 'Z4']].transpose().mean()

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SOD0 = interp_halfs[(0,0)]['means']
avs_SOD0 = pd.DataFrame(columns=['X', 'Y', 'Z'])
avs_SOD0.X = SOD0[['X1', 'X2', 'X3', 'X4']].transpose().mean()
avs_SOD0.Y = SOD0[['Y1', 'Y2', 'Y3', 'Y4']].transpose().mean()
avs_SOD0.Z = SOD0[['Z1', 'Z2', 'Z3', 'Z4']].transpose().mean()

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SOD0 = interp_halfs[(0,0)]['stds']
stds_SOD0 = pd.DataFrame(columns=['X', 'Y', 'Z'])
stds_SOD0.X = SOD0[['X1', 'X2', 'X3', 'X4']].transpose().mean()
stds_SOD0.Y = SOD0[['Y1', 'Y2', 'Y3', 'Y4']].transpose().mean()
stds_SOD0.Z = SOD0[['Z1', 'Z2', 'Z3', 'Z4']].transpose().mean()

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In [22]: from scipy.optimize import curve_fit
         mags = polar_halfs[(0,1)]['stds'].index

         def recip(x,A,B):
             return A/x + B

         def lin(x,A,B):
             return A*x + B

         def reciplin(x,A,B,C,D):
             return A*np.exp(-B*x) + C*x + D

         popt1_e, pcov = curve_fit(recip, mags.data.tolist(), polar_halfs[(1,0)]['means'].\\
                                   xslice.as_matrix())
         popt2_e, pcov = curve_fit(recip, mags.data.tolist(), polar_halfs[(1,0)]['means'].\\
                                   yslice.as_matrix())
         popt3_e, pcov = curve_fit(recip, mags.data.tolist(), polar_halfs[(1,0)]['means'].\\
                                   zslice.as_matrix())

         popt4_e, pcov = curve_fit(recip, mags.data.tolist(), avs_S1D0.X.as_matrix())

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popt5_e, pcov = curve_fit(recip, mags.data.tolist(), avs_S1D0.Y.as_matrix())
popt6_e, pcov = curve_fit(recip, mags.data.tolist(), avs_S1D0.Z.as_matrix())

rmse_px10 = np.sqrt(np.mean((recip(np.array(mags.data.tolist()),*popt1_e)- \
                                polar_halfs[(1,0)]['means'].xslice.as_matrix())**2))
rmse_py10 = np.sqrt(np.mean((recip(np.array(mags.data.tolist()),*popt2_e)- \
                                polar_halfs[(1,0)]['means'].yslice.as_matrix())**2))
rmse_pz10 = np.sqrt(np.mean((recip(np.array(mags.data.tolist()),*popt3_e)- \
                                polar_halfs[(1,0)]['means'].zslice.as_matrix())**2))

rmse_ix10 = np.sqrt(np.mean((recip(np.array(mags.data.tolist()),*popt4_e)-avs_S1D0.\
                                X.as_matrix())**2))
rmse_ix10 = np.sqrt(np.mean((recip(np.array(mags.data.tolist()),*popt5_e)-avs_S1D0.\
                                Y.as_matrix())**2))
rmse_iz10 = np.sqrt(np.mean((recip(np.array(mags.data.tolist()),*popt6_e)-avs_S1D0.\
                                Z.as_matrix())**2))

popt1_l, pcov = curve_fit(lin, mags.data.tolist(), polar_halfs[(0,1)]['means'].\
                                xslice.as_matrix())
popt2_l, pcov = curve_fit(lin, mags.data.tolist(), polar_halfs[(0,1)]['means'].\
                                yslice.as_matrix())
popt3_l, pcov = curve_fit(lin, mags.data.tolist(), polar_halfs[(0,1)]['means'].\
                                zslice.as_matrix())

popt4_l, pcov = curve_fit(lin, mags.data.tolist(), avs_SOD1.X.as_matrix())
popt5_l, pcov = curve_fit(lin, mags.data.tolist(), avs_SOD1.Y.as_matrix())
popt6_l, pcov = curve_fit(lin, mags.data.tolist(), avs_SOD1.Z.as_matrix())

rmse_px01 = np.sqrt(np.mean((lin(np.array(mags.data.tolist()),*popt1_l)- \
                                polar_halfs[(0,1)]['means'].xslice.as_matrix())**2))
rmse_py01 = np.sqrt(np.mean((lin(np.array(mags.data.tolist()),*popt2_l)- \
                                polar_halfs[(0,1)]['means'].yslice.as_matrix())**2))
rmse_pz01 = np.sqrt(np.mean((lin(np.array(mags.data.tolist()),*popt3_l)- \
                                polar_halfs[(0,1)]['means'].zslice.as_matrix())**2))

rmse_ix01 = np.sqrt(np.mean((lin(np.array(mags.data.tolist()),*popt4_l)-avs_SOD1.\
                                X.as_matrix())**2))
rmse_iy01 = np.sqrt(np.mean((lin(np.array(mags.data.tolist()),*popt5_l)-avs_SOD1.\
                                Y.as_matrix())**2))
rmse_iz01 = np.sqrt(np.mean((lin(np.array(mags.data.tolist()),*popt6_l)-avs_SOD1.\
                                Z.as_matrix())**2))

popt1, pcov = curve_fit(ripln, mags.data.tolist(), polar_halfs[(1,1)]['means'].\
                                xslice.as_matrix())
popt2, pcov = curve_fit(ripln, mags.data.tolist(), polar_halfs[(1,1)]['means'].\
                                yslice.as_matrix())
popt3, pcov = curve_fit(ripln, mags.data.tolist(), polar_halfs[(1,1)]['means'].\
                                zslice.as_matrix())

popt4, pcov = curve_fit(ripln, mags.data.tolist(), avs_S1D1.X.as_matrix())
popt5, pcov = curve_fit(ripln, mags.data.tolist(), avs_S1D1.Y.as_matrix())
popt6, pcov = curve_fit(ripln, mags.data.tolist(), avs_S1D1.Z.as_matrix())

rmse_px11 = np.sqrt(np.mean((ripln(np.array(mags.data.tolist()),*popt1)- \

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        polar_halfs[(1,1)][‘means’].xslice.as_matrix())**2))
rmse_py11 = np.sqrt(np.mean((reciplin(np.array(mags.data.tolist()),*popt2)- \
        polar_halfs[(1,1)][‘means’].yslice.as_matrix())**2))
rmse_pz11 = np.sqrt(np.mean((reciplin(np.array(mags.data.tolist()),*popt3)- \
        polar_halfs[(1,1)][‘means’].zslice.as_matrix())**2))

rmse_ix11 = np.sqrt(np.mean((reciplin(np.array(mags.data.tolist()),*popt4)-avs_S1D1.\
        X.as_matrix())**2))
rmse_iy11 = np.sqrt(np.mean((reciplin(np.array(mags.data.tolist()),*popt5)-avs_S1D1.\
        Y.as_matrix())**2))
rmse_iz11 = np.sqrt(np.mean((reciplin(np.array(mags.data.tolist()),*popt6)-avs_S1D1.\
        Z.as_matrix())**2))

In [6]: fig,(ax1,ax2,ax3) = plt.subplots(ncols=3,nrows=1,figsize = (15,7),sharey=True)

fig.suptitle(‘SOD0 - MTF halfwidth as magnification increases’,fontsize=16)

polar_halfs[(0,0)][‘means’].xslice.plot(ax=ax1,label=‘polar method’,fontsize=16)
avs_SOD0.X.plot(ax=ax1,label = ‘intepolation method’,fontsize=16)
ax1.legend(loc=0,fontsize=16)
ax1.set_ylabel(‘MTF half width (1/mm)’,fontsize = 16)
ax1.set_xlabel(‘Magnification’,fontsize = 16)
ax1.set_title("yz-plane",fontsize = 16)
ax1.tick_params(axis=‘both’, which=‘major’, labels=16)

polar_halfs[(0,0)][‘means’].yslice.plot(ax=ax2,label=‘polar method’,fontsize=16)
avs_SOD0.Y.plot(ax=ax2,label = ‘intepolation method’,fontsize=16)
ax2.set_title("xz-plane",fontsize = 16)
ax2.set_xlabel(‘Magnification’,fontsize = 16)
ax2.tick_params(axis=‘both’, which=‘major’, labels=16)

polar_halfs[(0,0)][‘means’].zslice.plot(ax=ax3,label=‘polar method’,fontsize=16)
avs_SOD0.Z.plot(ax=ax3,label = ‘intepolation method’,fontsize=16)
ax3.set_title("xy-plane",fontsize = 16)
ax3.tick_params(axis=‘both’, which=‘major’, labels=16)
ax3.set_xlabel(‘Magnification’,fontsize = 16)

Out[6]: <matplotlib.text.Text at 0x109f87a10>

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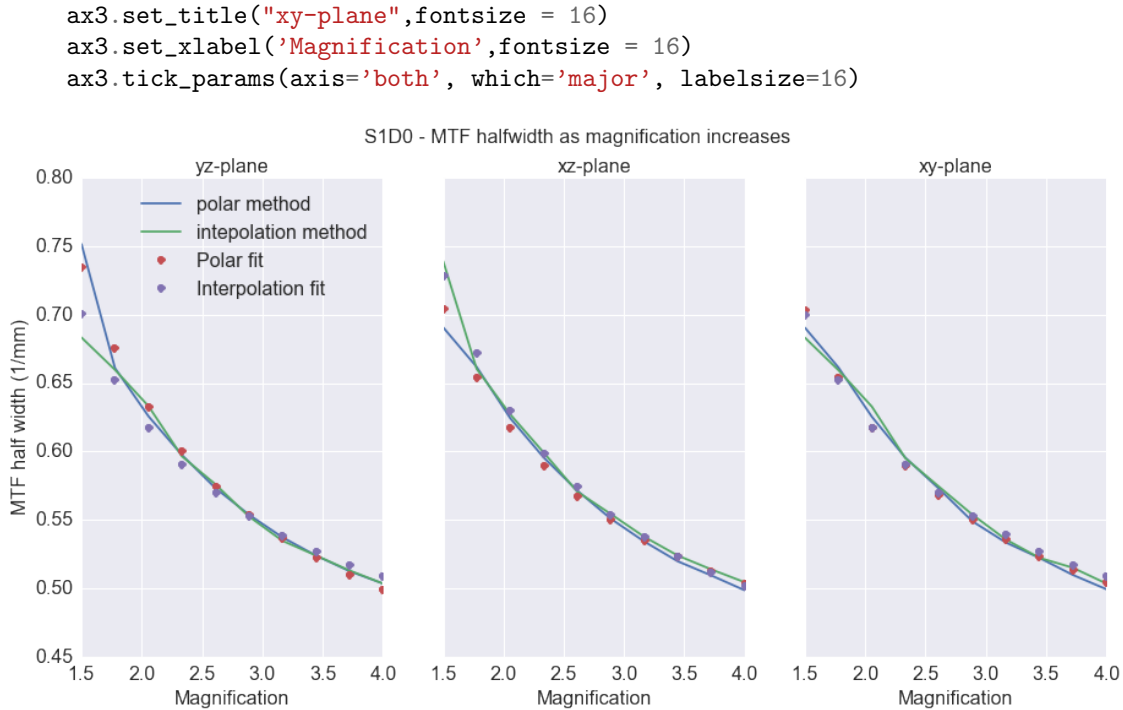
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In [20]: fig,(ax1,ax2,ax3) = plt.subplots(ncols=3,nrows=1,figsize = (15,7),sharey=True)

fig.suptitle('S1D0 - MTF halfwidth as magnification increases',fontsize=16)

polar_halfs[(1,0)][ 'means' ].xslice.plot(ax=ax1,label='polar method',fontsize=16)
avs_S1D0.X.plot(ax=ax1,label = 'intepolation method',fontsize=16)
ax1.plot(mags.data.tolist(),recip(np.array(mags.data.tolist()),*popt1_e),'o' \
        ,label = 'Polar fit')
ax1.plot(mags.data.tolist(),recip(np.array(mags.data.tolist()),*popt4_e),'o' \
        ,label = 'Interpolation fit')
ax1.legend(loc=0,fontsize=16)
ax1.set_xlabel('Magnification',fontsize = 16)
ax1.set_title("yz-plane",fontsize = 16)
ax1.set_ylabel('MTF half width (1/mm)',fontsize = 16)
ax1.tick_params(axis='both', which='major', labels=16)

polar_halfs[(1,0)][ 'means' ].yslice.plot(ax=ax2,label='polar method',fontsize=16)
avs_S1D0.Y.plot(ax=ax2,label = 'intepolation method',fontsize=16)
ax2.plot(mags.data.tolist(),recip(np.array(mags.data.tolist()),*popt2_e),'o' \
        ,label = 'Polar fit')
ax2.plot(mags.data.tolist(),recip(np.array(mags.data.tolist()),*popt5_e),'o' \
        ,label = 'Interpolation fit')
ax2.set_title("xz-plane",fontsize = 16)
ax2.set_xlabel('Magnification',fontsize = 16)
ax2.tick_params(axis='both', which='major', labels=16)

polar_halfs[(1,0)][ 'means' ].zslice.plot(ax=ax3,label='polar method',fontsize=16)
avs_S1D0.Z.plot(ax=ax3,label = 'intepolation method',fontsize=16)
ax3.plot(mags.data.tolist(),recip(np.array(mags.data.tolist()),*popt3_e),'o' \
        ,label = 'Polar fit')
ax3.plot(mags.data.tolist(),recip(np.array(mags.data.tolist()),*popt6_e),'o' \
        ,label = 'Interpolation fit')
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In [21]: fig,(ax1,ax2,ax3) = plt.subplots(ncols=3,nrows=1,figsize = (15,7),sharey=True)

fig.suptitle('SOD1 - MTF halfwidth as magnification increases',fontsize=16)

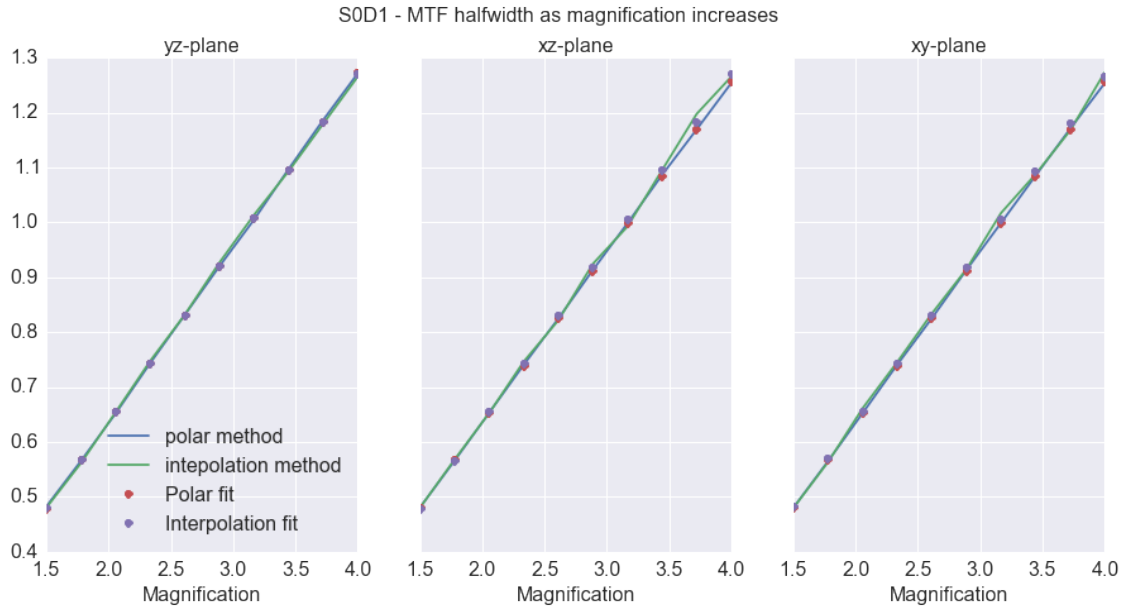
polar_halfs[(0,1)][ 'means' ].xslice.plot(ax=ax1,label='polar method',fontsize=16)
avs_SOD1.X.plot(ax=ax1,label = 'intepolation method',fontsize=16)
ax1.plot(mags.data.tolist(),lin(np.array(mags.data.tolist()),*popt1_1),'o' \
        ,label = 'Polar fit')
ax1.plot(mags.data.tolist(),lin(np.array(mags.data.tolist()),*popt4_1),'o' \
        ,label = 'Interpolation fit')
ax1.legend(loc=0,fontsize=16)
ax1.set_title("yz-plane",fontsize = 16)
ax1.set_xlabel('Magnification',fontsize = 16)
ax1.tick_params(axis='both', which='major', labels=16)

polar_halfs[(0,1)][ 'means' ].yslice.plot(ax=ax2,label='polar method',fontsize=16)
avs_SOD1.Y.plot(ax=ax2,label = 'intepolation method',fontsize=16)
ax2.plot(mags.data.tolist(),lin(np.array(mags.data.tolist()),*popt2_1),'o' \
        ,label = 'Polar fit')
ax2.plot(mags.data.tolist(),lin(np.array(mags.data.tolist()),*popt5_1),'o' \
        ,label = 'Interpolation fit')
ax2.set_title("xz-plane",fontsize = 16)
ax2.set_xlabel('Magnification',fontsize = 16)
ax2.tick_params(axis='both', which='major', labels=16)

polar_halfs[(0,1)][ 'means' ].zslice.plot(ax=ax3,label='polar method',fontsize=16)
avs_SOD1.Z.plot(ax=ax3,label = 'intepolation method',fontsize=16)
ax3.plot(mags.data.tolist(),lin(np.array(mags.data.tolist()),*popt3_1),'o' \

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,label = 'Polar fit')
ax3.plot(mags.data.tolist(),lin(np.array(mags.data.tolist()),*popt6_1),'o' \
,label = 'Interpolation fit')
ax3.set_title("xy-plane",fontsize = 16)
ax3.set_xlabel('Magnification',fontsize = 16)
ax3.tick_params(axis='both', which='major', labels=16)
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In [9]: fig,(ax1,ax2,ax3) = plt.subplots(ncols=3,nrows=1,figsize = (15,7),sharey=True)

fig.suptitle('S1D1 - MTF halfwidth as magnification increases',fontsize=16)

polar_halfs[(1,1)]['means'].xslice.plot(ax=ax1,label='polar method',fontsize=16)
avs_S1D1.X.plot(ax=ax1,label = 'intepolation method',fontsize=16)
ax1.plot(mags.data.tolist(),reciplin(np.array(mags.data.tolist()),*popt1),'o' \
,label = 'Polar fit')
ax1.plot(mags.data.tolist(),reciplin(np.array(mags.data.tolist()),*popt4),'o' \
,label = 'Interpolation fit')
ax1.legend(loc=0,fontsize=16)
ax1.set_ylabel('MTF half width (1/mm)',fontsize = 16)
ax1.set_xlabel('Magnification',fontsize = 16)
ax1.set_title("yz-plane",fontsize = 16)
ax1.tick_params(axis='both', which='major', labels=16)

polar_halfs[(1,1)]['means'].yslice.plot(ax=ax2,label='polar method',fontsize=16)
avs_S1D1.Y.plot(ax=ax2,label = 'intepolation method',fontsize=16)
ax2.plot(mags.data.tolist(),reciplin(np.array(mags.data.tolist()),*popt2),'o' \
,label = 'Polar fit')
ax2.plot(mags.data.tolist(),reciplin(np.array(mags.data.tolist()),*popt5),'o' \
,label = 'Interpolation fit')
ax2.set_title("xz-plane",fontsize = 16)
ax2.tick_params(axis='both', which='major', labels=16)
```

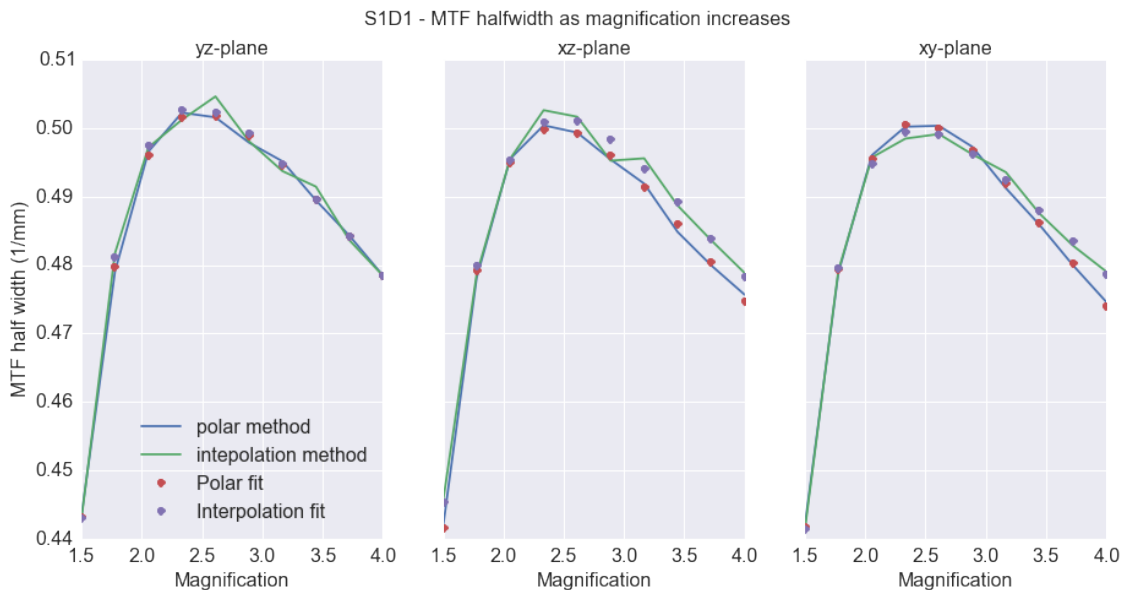
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ax2.set_xlabel('Magnification',fontsize = 16)

polar_halfs[(1,1)]['means'].zslice.plot(ax=ax3,label='polar method',fontsize=16)
avs_S1D1.Z.plot(ax=ax3,label = 'intepolation method',fontsize=16)
ax3.plot(mags.data.tolist(),reciplin(np.array(mags.data.tolist()),*popt3),'o' \
        ,label = 'Polar fit')
ax3.plot(mags.data.tolist(),reciplin(np.array(mags.data.tolist()),*popt6),'o' \
        ,label = 'Interpolation fit')
ax3.set_title("xy-plane",fontsize = 16)
ax3.tick_params(axis='both', which='major', labels=16)
ax3.set_xlabel('Magnification',fontsize = 16)

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Out[9]: <matplotlib.text.Text at 0x10a2b5fd0>



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In [10]: S1D0 = polar_halfs[(1,0)]['means'].xslice_radius.apply(lambda x:np.abs(x-30)/30).as_matrix()
SOD1 = polar_halfs[(0,1)]['means'].xslice_radius.apply(lambda x:np.abs(x-30)/30).as_matrix()
S1D1 = polar_halfs[(1,1)]['means'].xslice_radius.apply(lambda x:np.abs(x-30)/30).as_matrix()

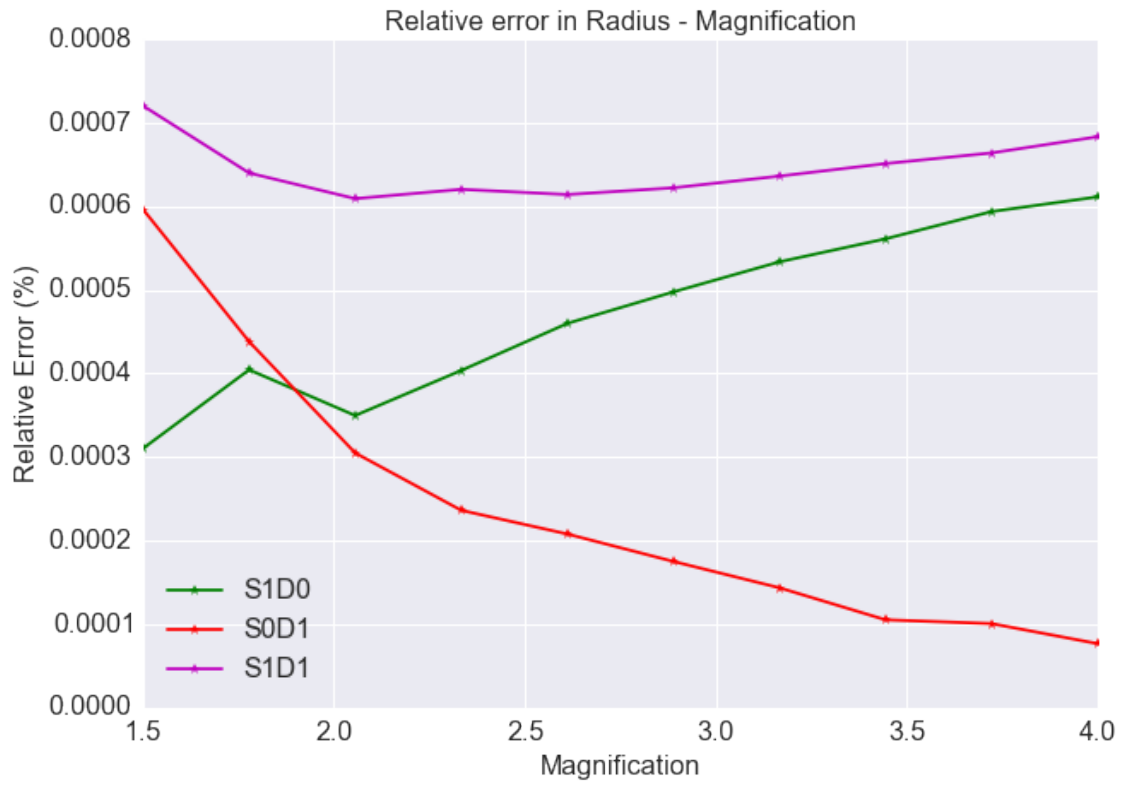
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In [11]: mags = polar_halfs_dat.mag.unique()
fig,ax = plt.subplots(ncols=1,nrows=1,figsize = (10,7))
ax.plot(mags,S1D0,'g*-',label="S1D0")
ax.plot(mags,SOD1,'r*-',label="SOD1")
ax.plot(mags,S1D1,'m*-',label="S1D1")

ax.legend(loc=0,fontsize=16)
ax.set_title("Relative error in Radius - Magnification",fontsize = 16)
ax.set_ylabel("Relative Error (%)",fontsize = 16)
ax.tick_params(axis='both', which='major', labels=16)
ax.set_xlabel("Magnification",fontsize = 16);

```

In []: