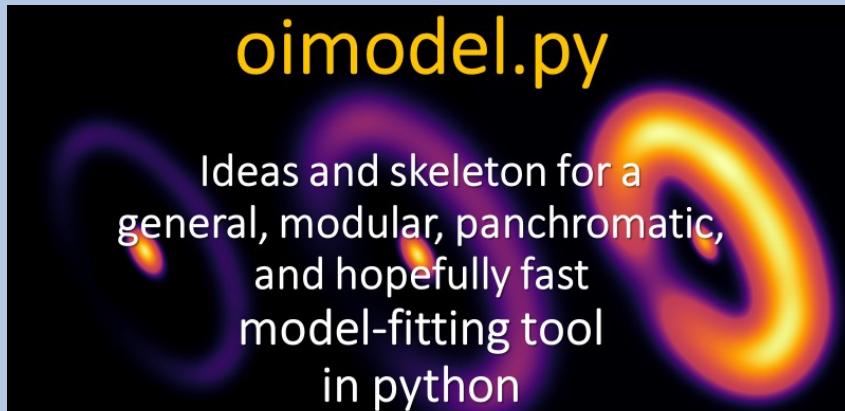


OPTIMODELER

A modular modelling software
for optical interferometry

Context of the project

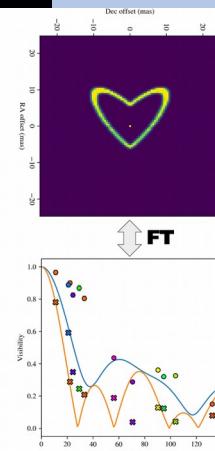


July 2021

The quest for the ultimate modeling tool for optical-IR interferometry

The MATISSE modeling working group:
 Bill Danchi, Julien Devron, Violeta Gámez Rossas, Michiel Hogerheijde, Jacob Isbell, Julia Kobus, Bruno Lopez, Alexis Matter, **Anthony Meilland**, Florentin Millour, Eric Pantin, Dieter Schertl, Marten Scheuck, Roy van Boekel, **József Varga**, Rens Waters, Gerd Weigelt

MATISSE Science Team meeting, 2021 November 18



Real time astrophysical models



Kinematic Be disk

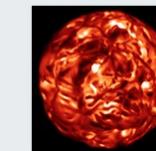
Model of the geometry (size and shape) and kinematics (rotation and expansion) of circumstellar, flat, rotating disks, relevant to Be stars. It is suited to interpret spectro-interferometric data obtained on emission lines formed in the disk.



Disk and stellar continuum – DISCO

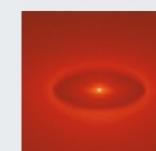
Model of the continuum emission from a star surrounded by a gaseous circumstellar disk (free-free and bound-free), with partially ionized and geometrically thin disk with a physical structure given by the viscous Keplerian decretion disk model. DISCO is well suited to model Be stars.

Precalculated grids of astrophysical models



Evolved star

Stellar surface simulation with famous RSG B



Supergiant B[e] with HDUST

Grid of models for B[e] supergiant stars computed with the 3d Monte Carlo radiative transfer code HDUST. The non-spherical circumstellar envelope (CSE), composed of gas (hydrogen) and dust (silicate), is modelled considering a bimodal outflow description (two-component wind).



Binary spiral

Phenomenology of massive stars



Limb-darkening with SAtlas

Grid of models providing intensity maps for spherically symmetric stars, showing the limb darkening effect. The models were computed with the SAtlas model stellar atmospheres for several spectral bands. Data is provided for FGK dwarfs and red giants.



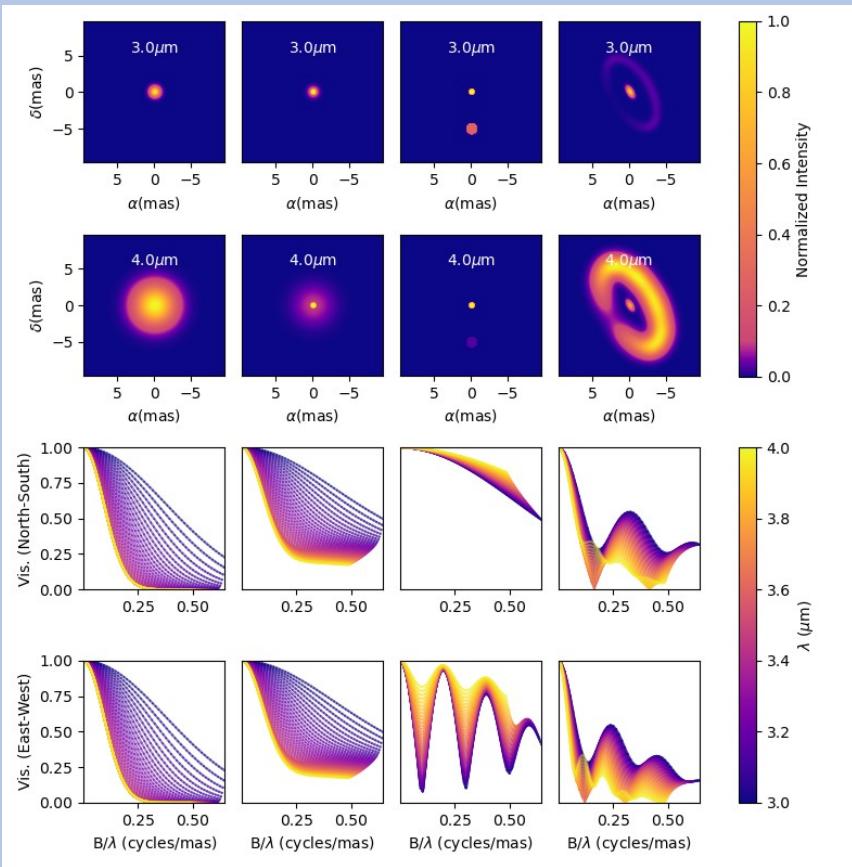
Analytical Limb-darkening Elliptical or Spherical – ALDES

ALDES provides intensity maps (images) or 1d intensity profiles for spherical or elliptical stars showing the limb darkening (LD) effect. Different LD laws are offered: uniform disk, linear, power law, quadratic, square root, logarithmic and four-parameter.

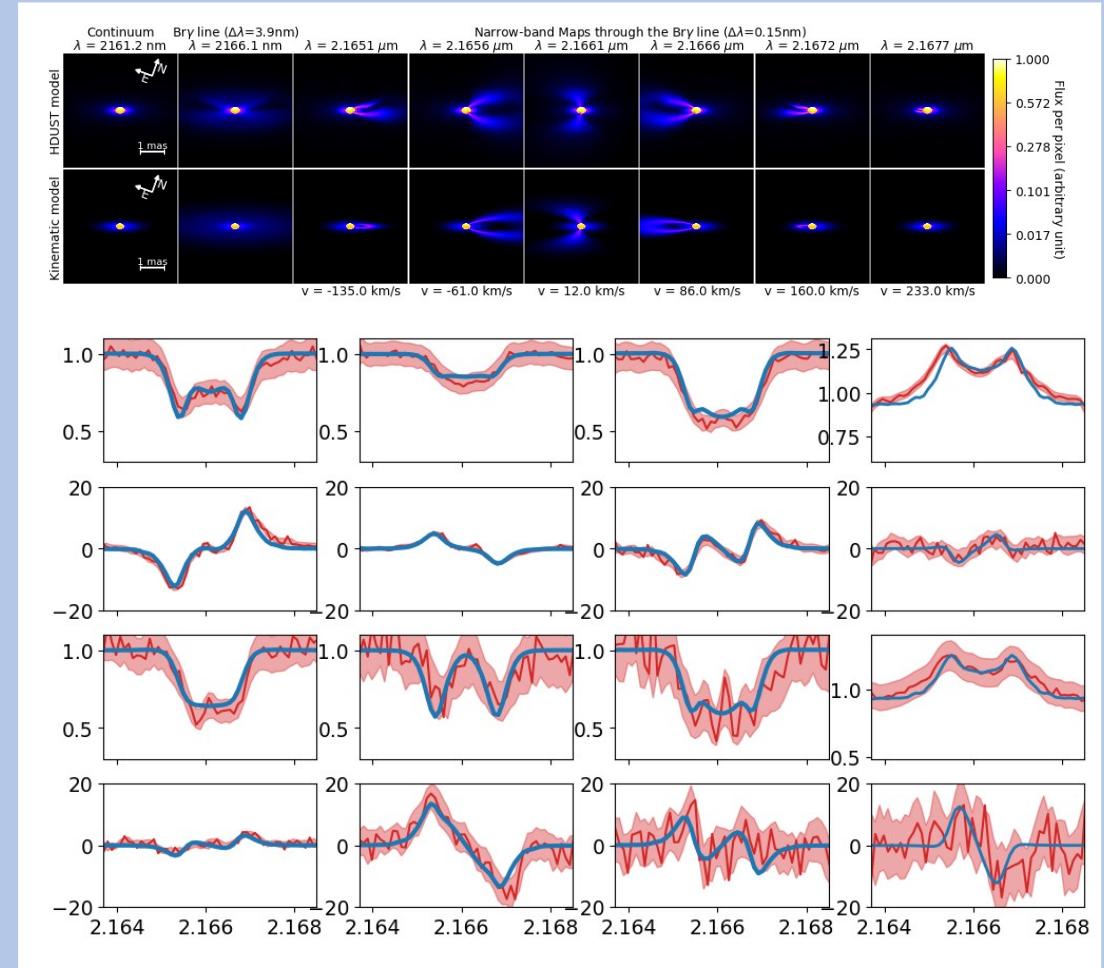
MATISSE group

JMMC/AMHRA

Context of the project



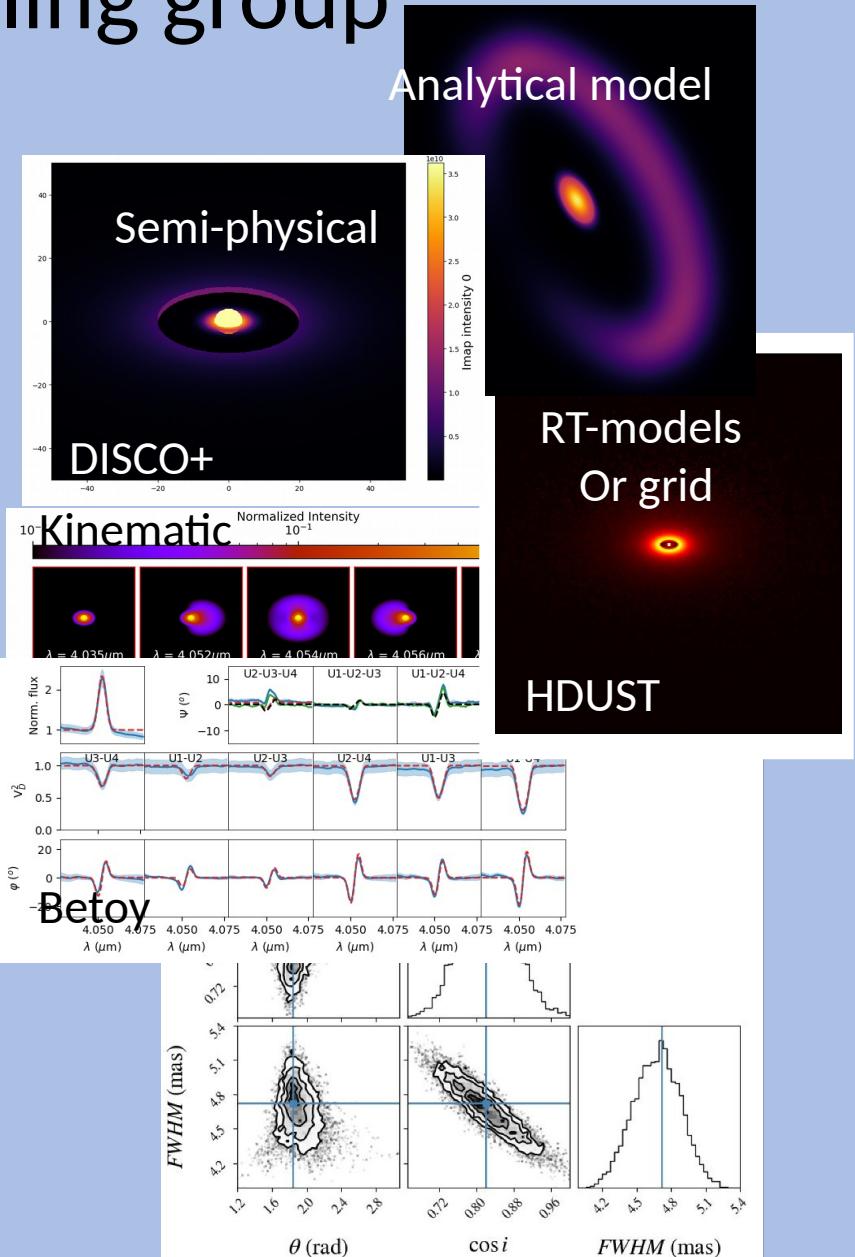
A modular & Fourier-based chromatic modelling tool
with a emcee (MCMC) fitter



Discussion in MATISSE modelling group

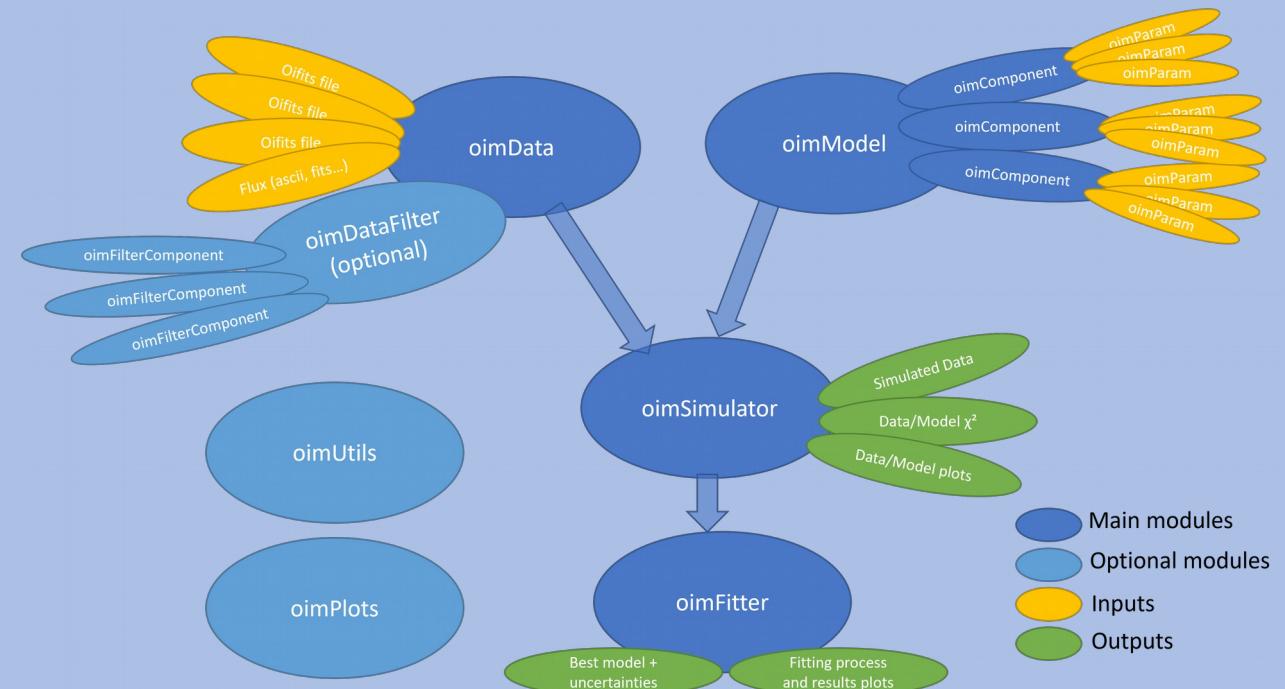
By the end of 2021

- Python3
- Modularity and flexibility
 - Analytical models in Fourier-plan
 - Analytical & numerical models in Image-plan
 - Use outputs from radiative transfer and explore grids of models
 - Build more complex geometries by mixing components
- Chromaticity and time dependence
 - Of the components parameters
 - Chromatic components (such as temperature gradient, binary)
 - Kinematics through line models
- Ability to use interferometric data from all instruments (oifits)
- Produce high-quality publishable outputs
 - Robust estimation of parameters with uncertainties and correlations
 - Nice customizable plots
 - Export simulated data and images to standard format (oifits and fits images)
- Expandability
 - Easily create new components for models (inheritance, wrapping functions)
 - But also other features: type of data, filters, fitters, plots
- Well documented (and with a test suite, examples, tutorials)
- Open source & easily available (Github)



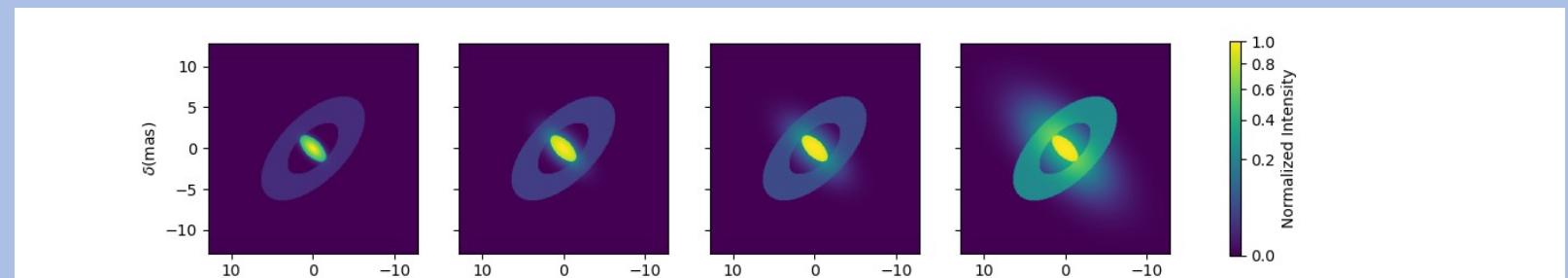
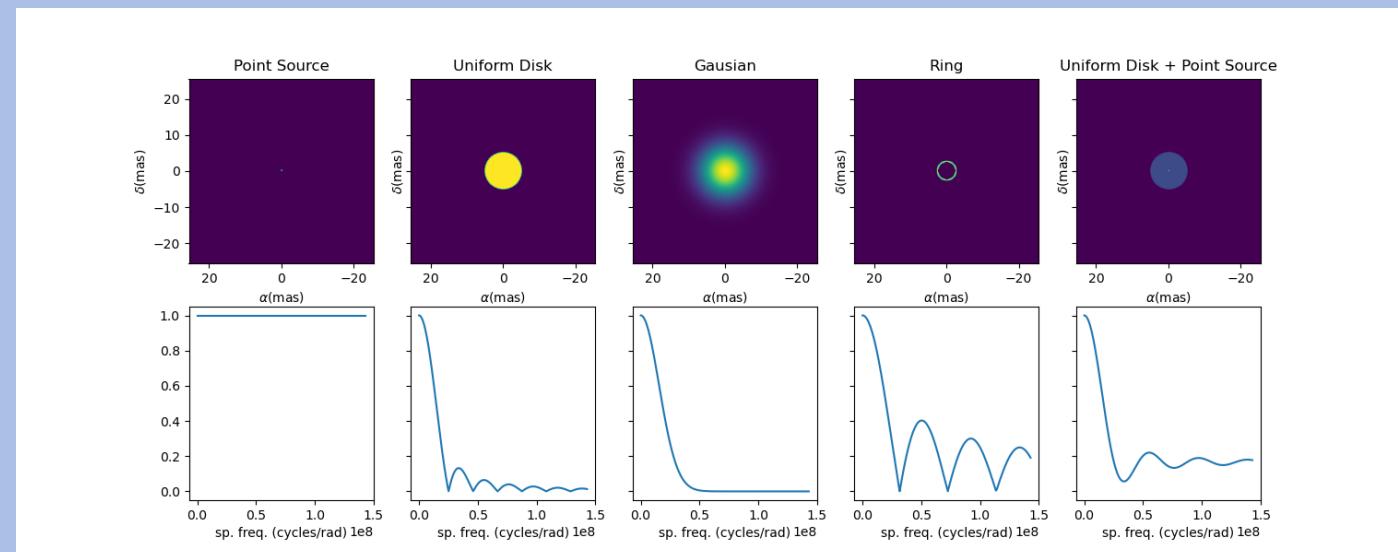
Coding started in 2022

- **January :**
 - Model skeleton : oimParam, oimComponents, oimModel



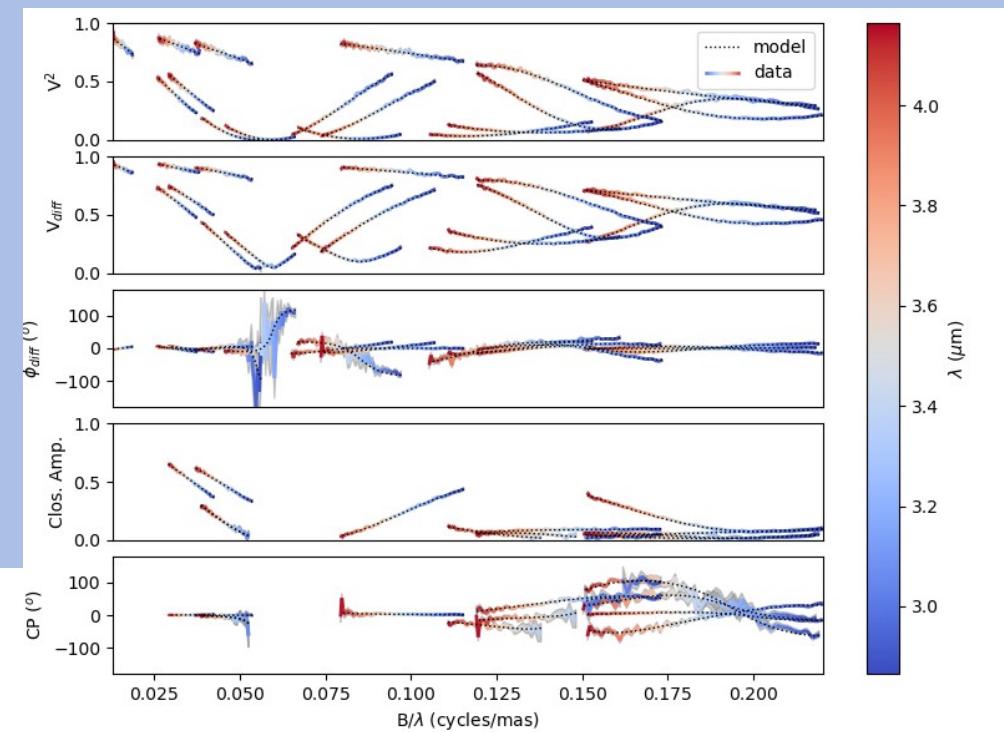
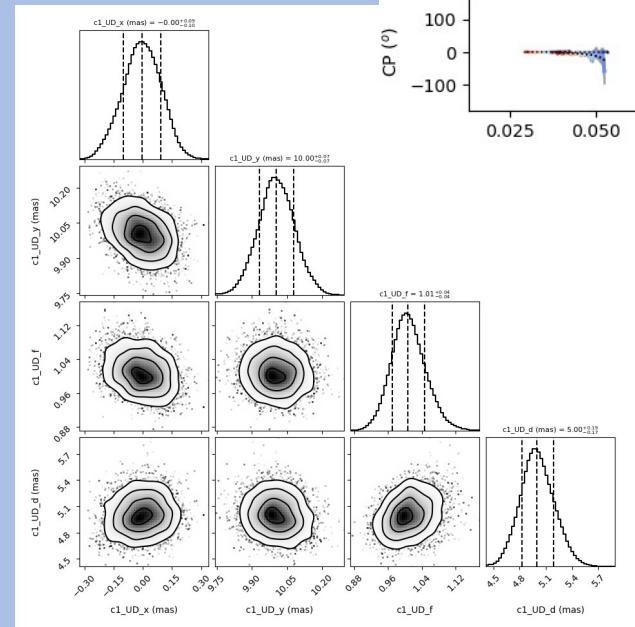
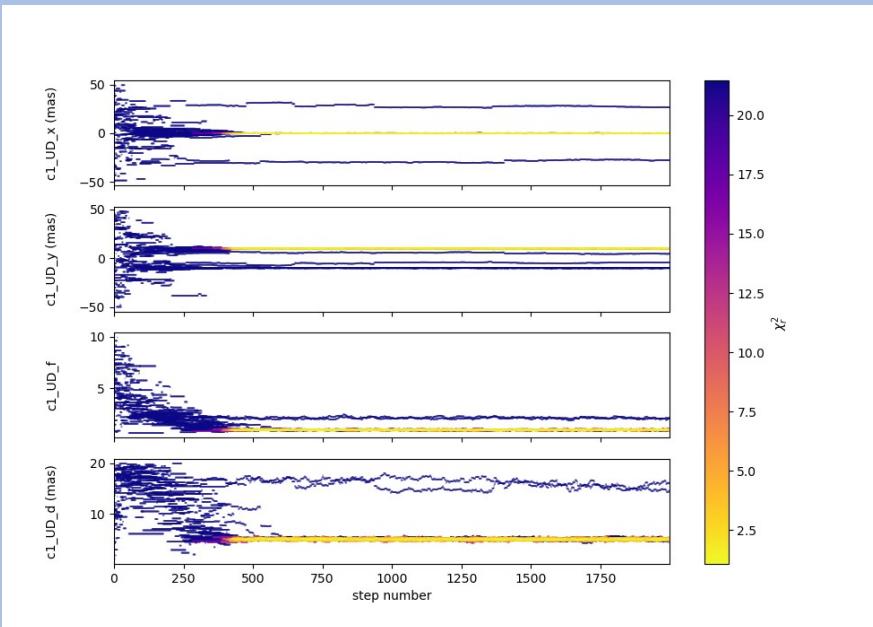
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- **March-May :**
 - Implementation of Fourier-based components
 - with chromatic parameters (using linear interpolation)
 - Link between parameters



Coding started in 2022

- January :
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- June-August:**
 - oimSimulator class (optimized data, data simulation, chi2)
 - oimFitter class and first emcee Fitter

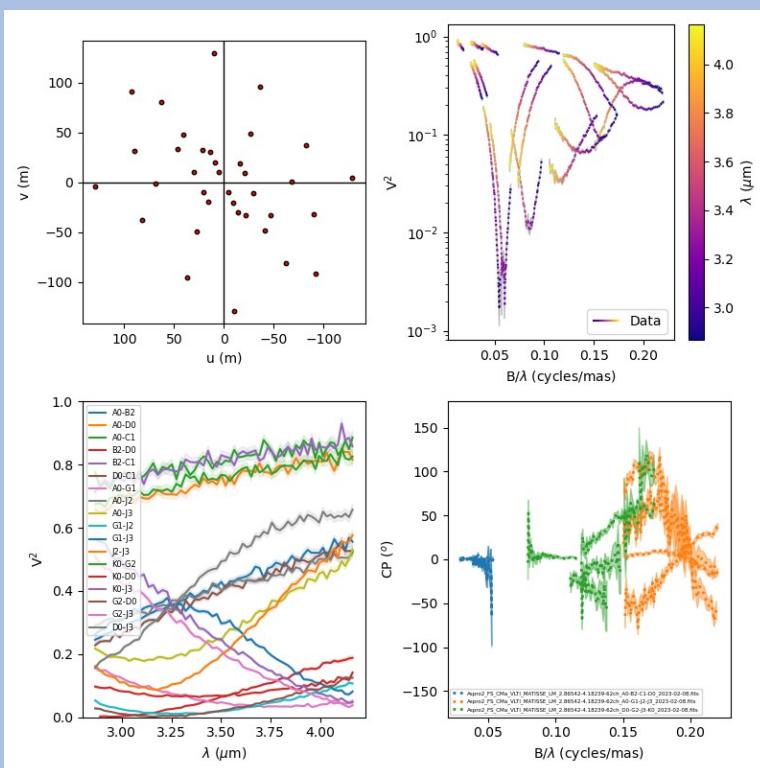
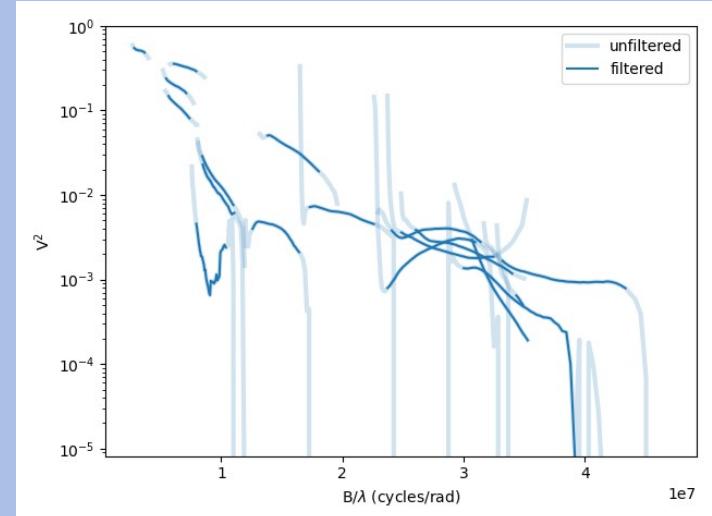




Coding started in 2022

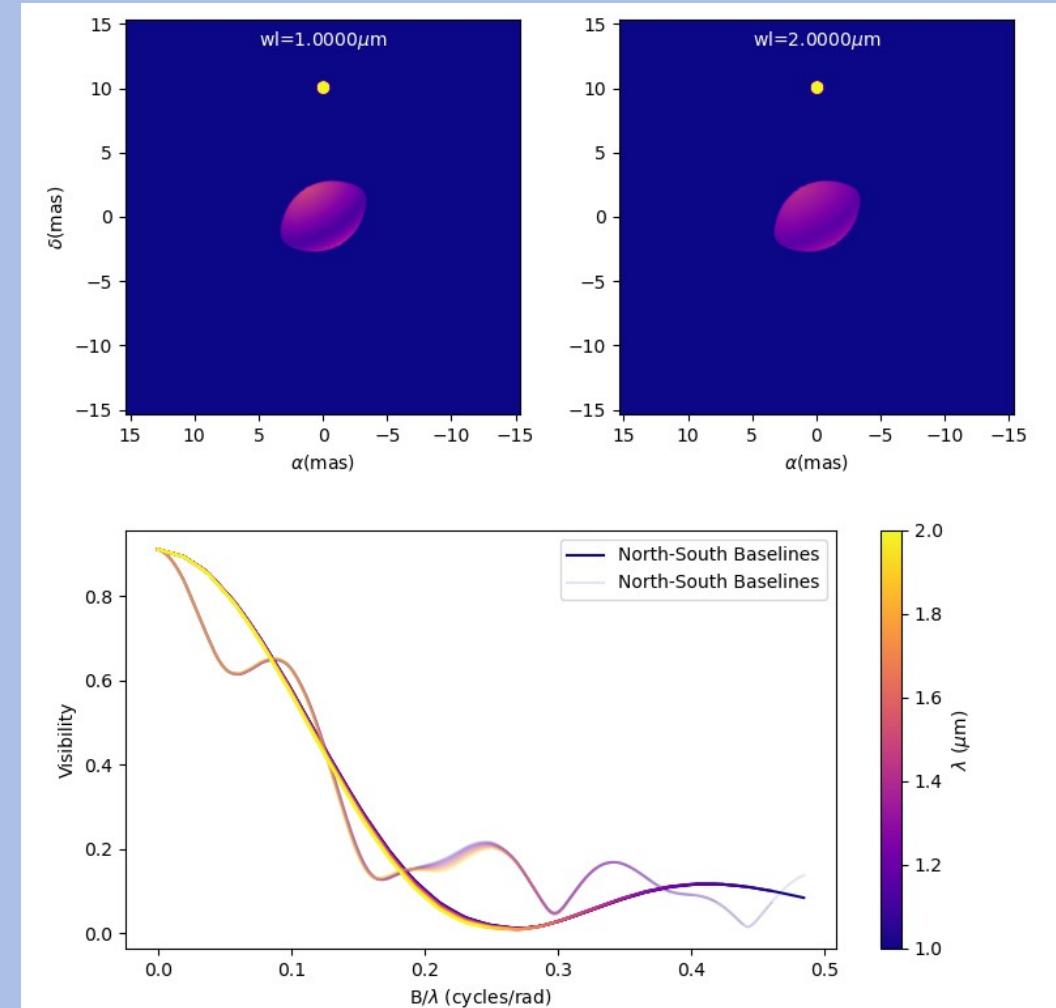
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- **September:**
 - data filtering & plots
 - documentation (on readthedoc)

The screenshot shows the OIMODELER documentation website. It includes the main navigation bar with links to Overview, Installation, Getting Started, Examples, and API. Below the navigation is a large image of the OIMODELER logo. The main content area features a section titled "oimodeler" with a brief description of the project's goals and current state. It also includes a "Warning" section about the software being in early development and a "Software Status" section indicating that no module is complete and fully verified.



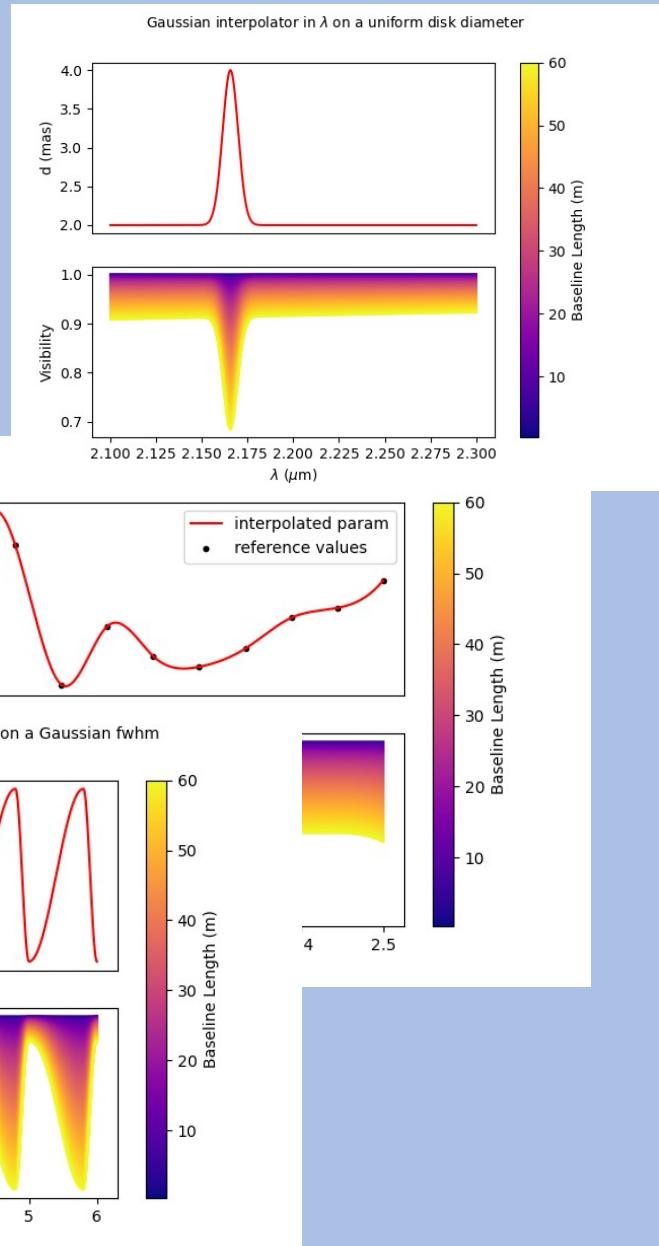
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 - image-plan components (FFT, sampling...)



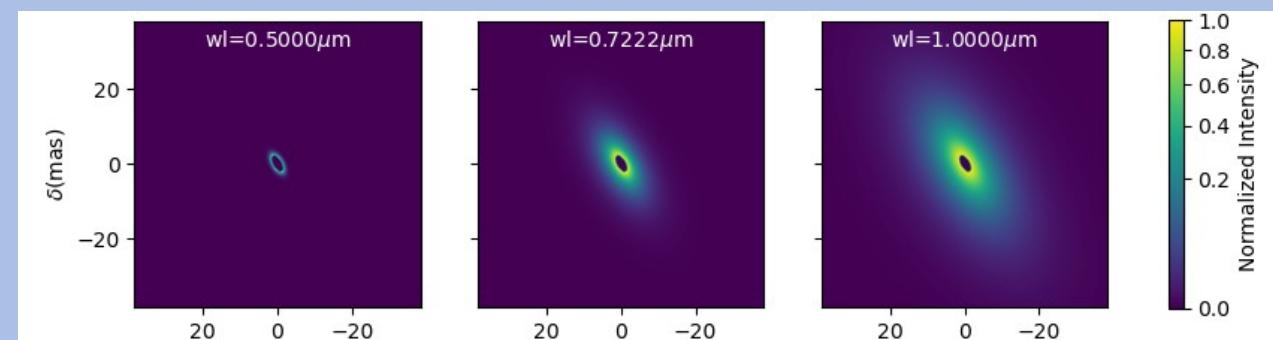
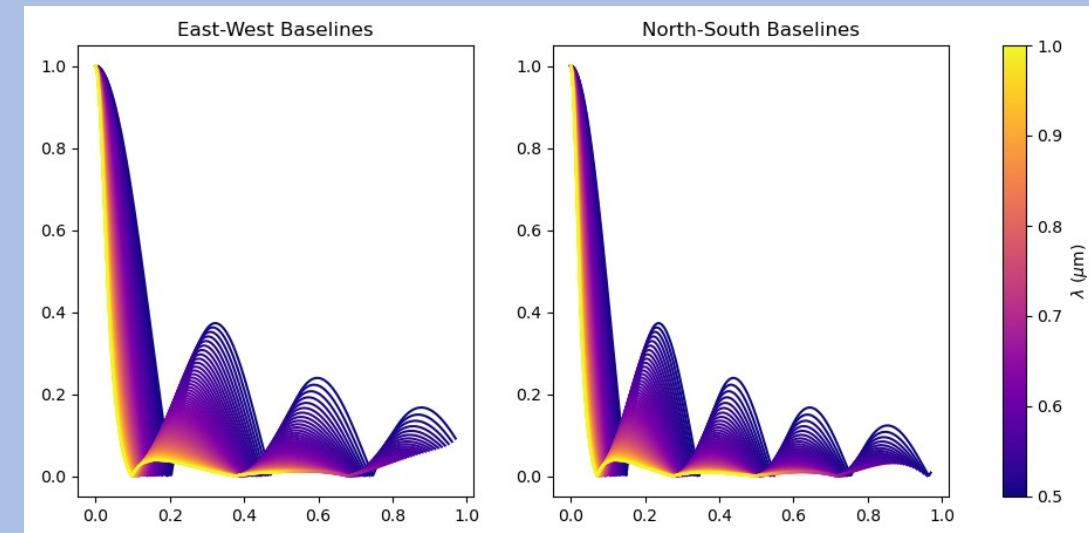
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 - parameter interpolators (time and chromaticity)



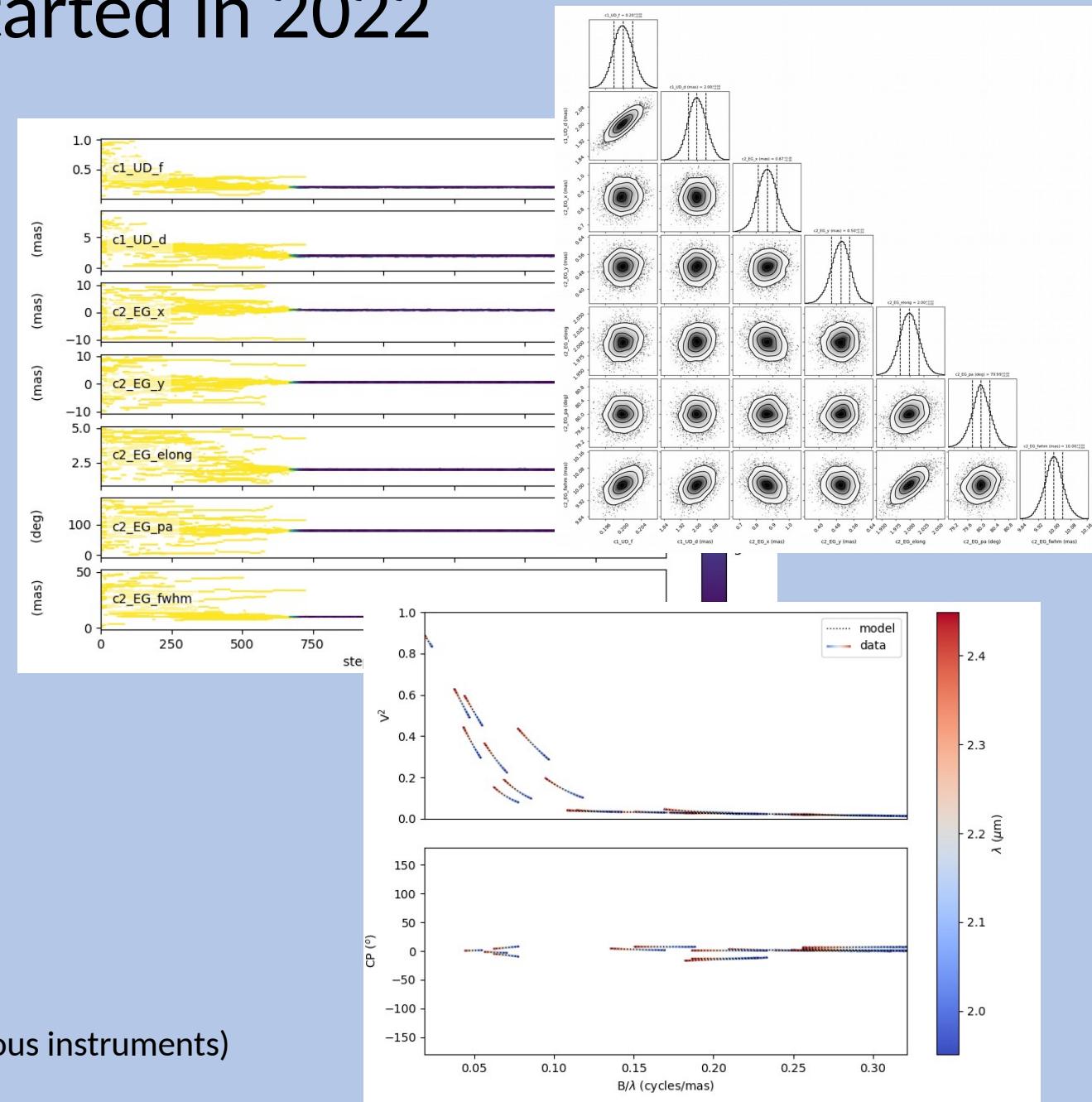
Coding started in 2022

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 - image-plan components (FFT, sampling...)
 - parameter interpolators (time and chromaticity)
- **November :**
 - radial profile components (Hankel Transform)



Coding started in 2022

- January
 - Model skeleton : oimParam, oimComponents, oimModel
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 - oimFitter class and first emcee Fitter
- September:
 - data filtering & plots
 - documentation (on readthedoc)
- October :
 - image-plan components (FFT, sampling...)
 - parameter interpolators (time and chromaticity)
- November :
 - radial profile components (Hankel Transform)
- **December :**
 - Code cleaning + examples
 - Test suite (ASPRO simulated data and real data from various instruments)





Oimodeler on the web

The screenshot shows the GitHub repository page for oimodeler. At the top, there are two tabs: "oimodeler — oimodeler documentation" and "oimodeler/oimodeler: Tools to ...". The URL in the address bar is <https://github.com/oimodeler/oimodeler>. The main content area displays the repository's code, showing a list of files and their commit history. A prominent message "Your main branch isn't protected" with a "Protect this branch" button is visible. Below the code list, there is a "README.md" section with a "License GNU", "Lifecycle EarlyDevelopment", and "version 0.0.1" badge. A brief description of the project follows.

oimodeler
A modular modelling tool for optical interferometry

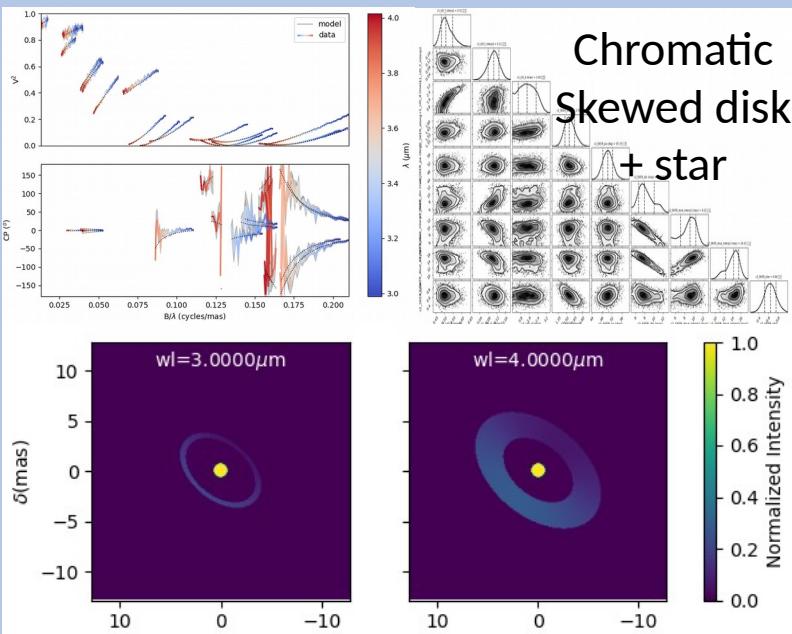
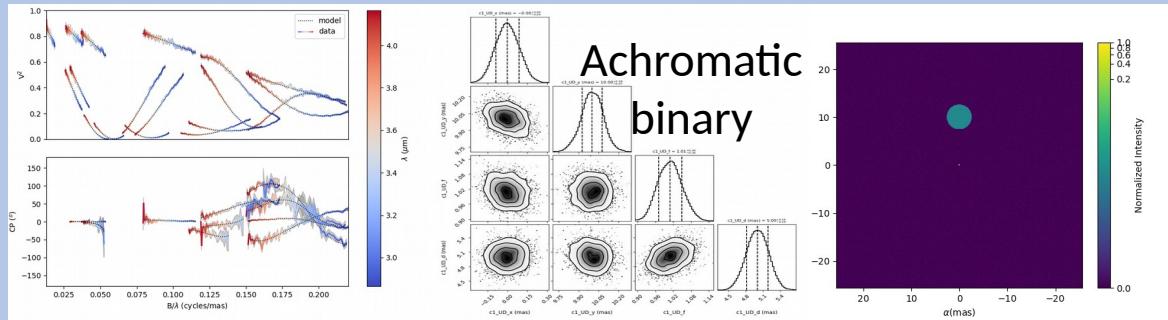
Code available on github
<https://github.com/oimodeler>

The screenshot shows the oimodeler documentation page on readthedocs. The URL in the address bar is <https://oimodeler.readthedocs.io/en/latest/index.html>. The page features the Oimodeler logo at the top. On the left, there is a sidebar with navigation links: Overview, Installation, Getting Started, Examples, and API. A digital advertisement for DigitalOcean is present in the sidebar. The main content area contains a large image of the Oimodeler logo, followed by a section titled "oimodeler" which describes the project's aim and current state. A "Warning" section at the bottom states that the software is in early development and lists several bullet points about the software's components and data types. A note at the bottom right indicates that no module is complete and has been fully verified up to now!

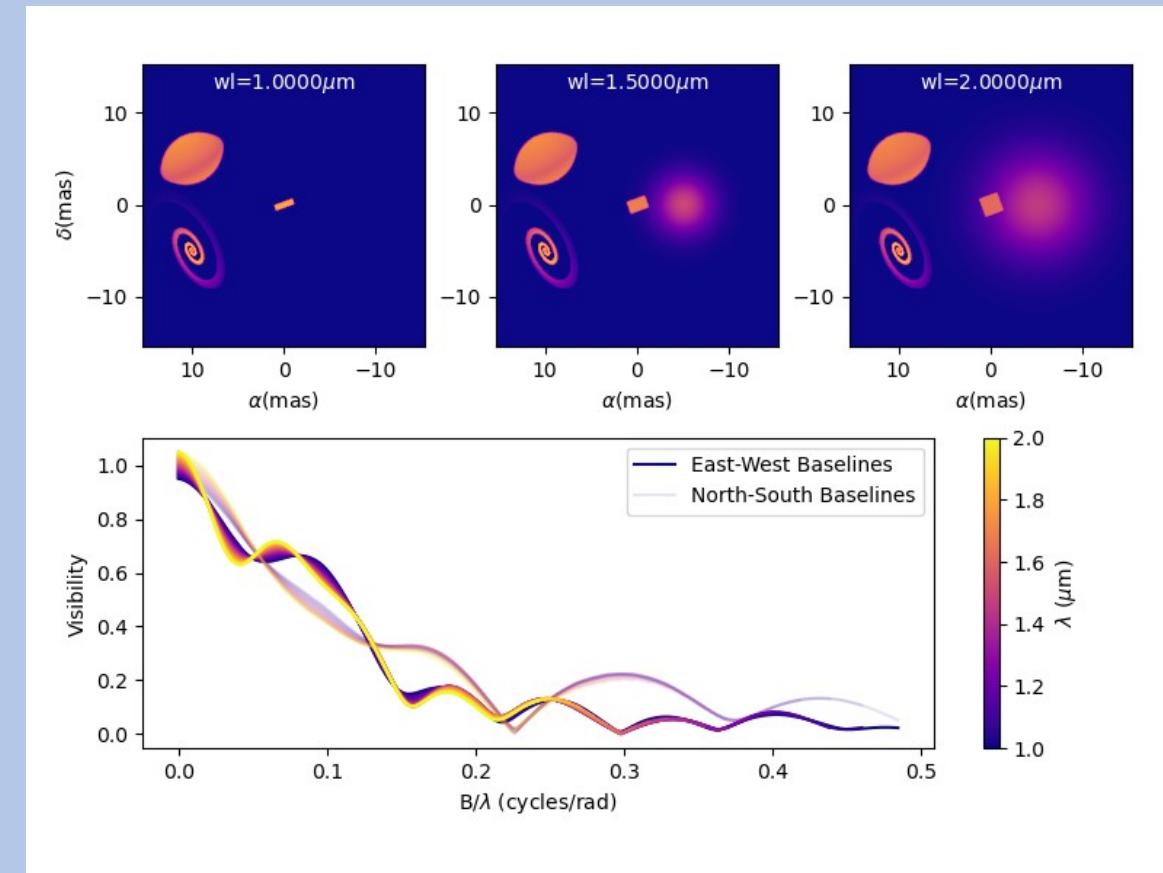
Documentation available on readthedocs
<https://oimodeler.readthedocs.io>

A Few examples

Model-fitting (on simulated data)



Adding new components



Example of simple model-fitting

```
import oimodeler as oim
```

Import oimodeler

```
ud = oim.oimUD(d=3,f=0.5,x=5,y=-5)
pt = oim.oimPt(f=1)
model = oim.oimModel(ud,pt)
```

Create a binary model

```
ud.params['d'].set(min=0.01,max=20)
ud.params['x'].set(min=-50,max=50,free=True)
ud.params['y'].set(min=-50,max=50,free=True)
ud.params['f'].set(min=0.,max=10.)
```

Set the parameters space

```
pt.params['f']=oim.oimParamNorm(ud.params['f'])
```

Normalizing flux to 1 (remove one free parameter)

```
fit = oim.oimFitterEmcee(files,model,nwalkers=20)
fit.prepare(init="random")
fit.run(nsteps=2000, progress=True)
```

Create, prepare and run the MCMC fitter

```
median,err_l,err_u,err=fit.getResults(discard=1000)
```

Get the results and plots

```
fit.walkersPlot()
fit.cornerPlot()
fit.simulator.plot(["VIS2DATA","T3PHI"])
model.showModel(512,0.1)
```

Make nice plots

Example of simple model-fitting

```
import oimodeler as oim

ud = oim.oimUD(d=3,f=0.5,x=5,y=-5)
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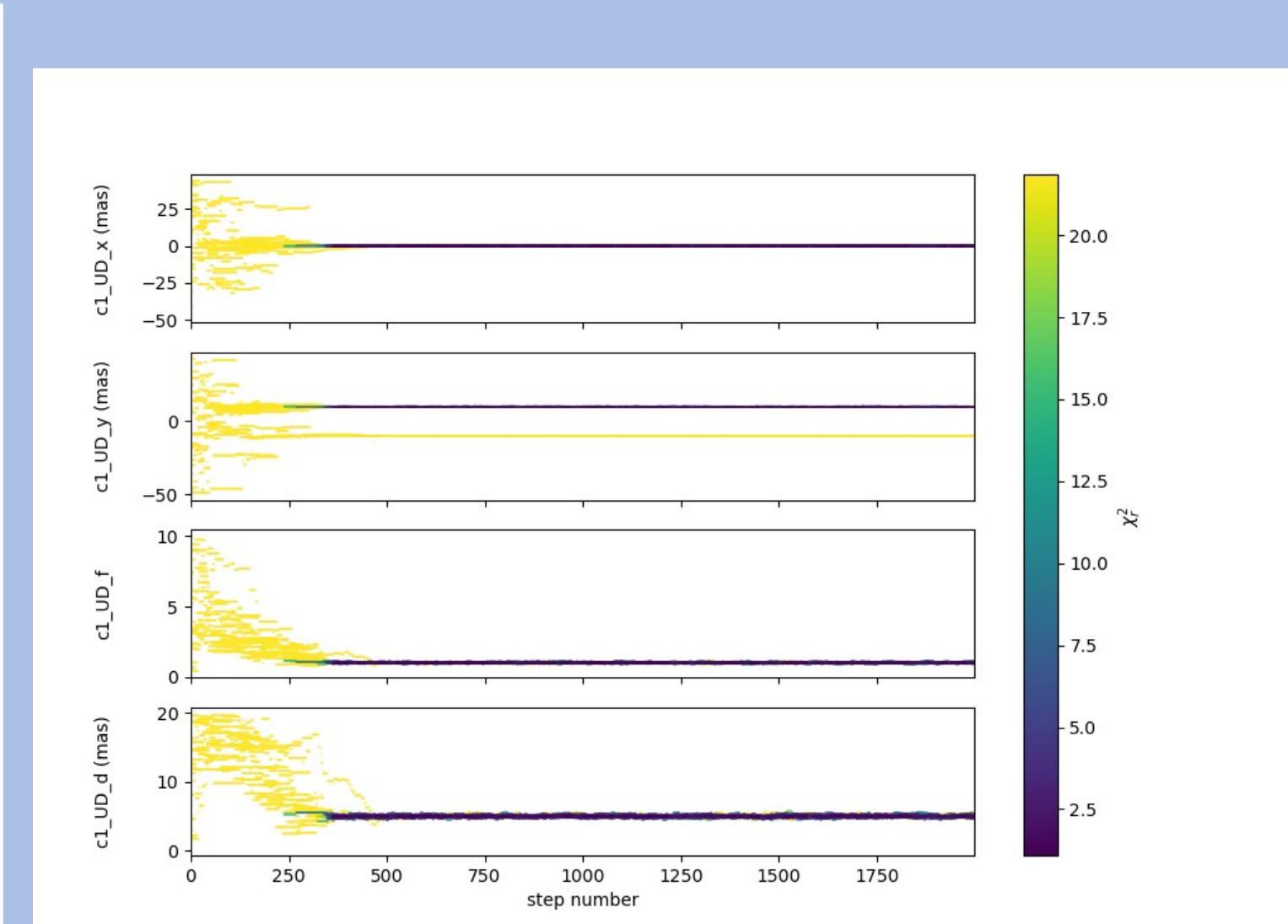
ud.params['d'].set(min=0.01,max=20)
ud.params['x'].set(min=-50,max=50,free=True)
ud.params['y'].set(min=-50,max=50,free=True)
ud.params['f'].set(min=0.,max=10.)

pt.params['f']=oim.oimParamNorm(ud.params['f'])

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ud.params['y'].set(min=-50,max=50,free=True)
ud.params['f'].set(min=0.,max=10.)

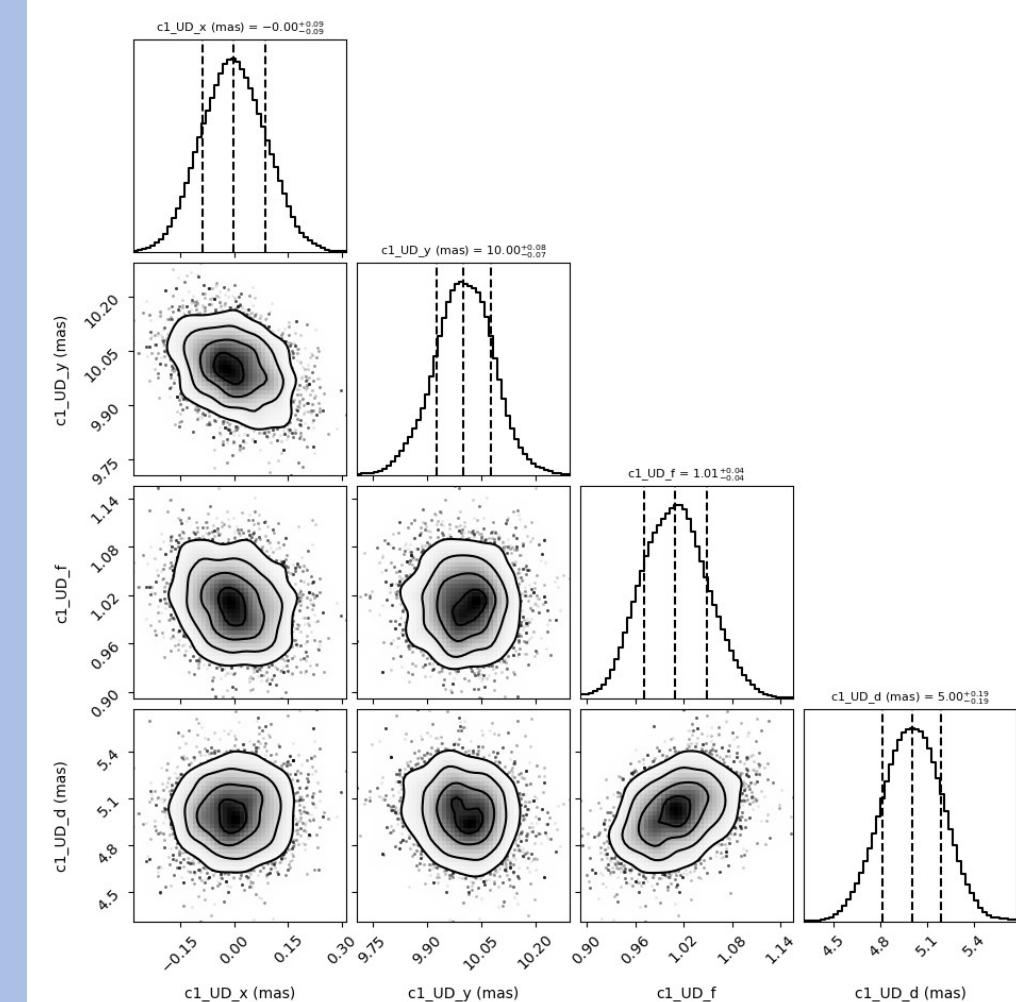
pt.params['f']=oim.oimParamNorm(ud.params['f'])

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fit.cornerPlot()
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Example of simple model-fitting

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ud.params['y'].set(min=-50,max=50,free=True)
ud.params['f'].set(min=0.,max=10.)

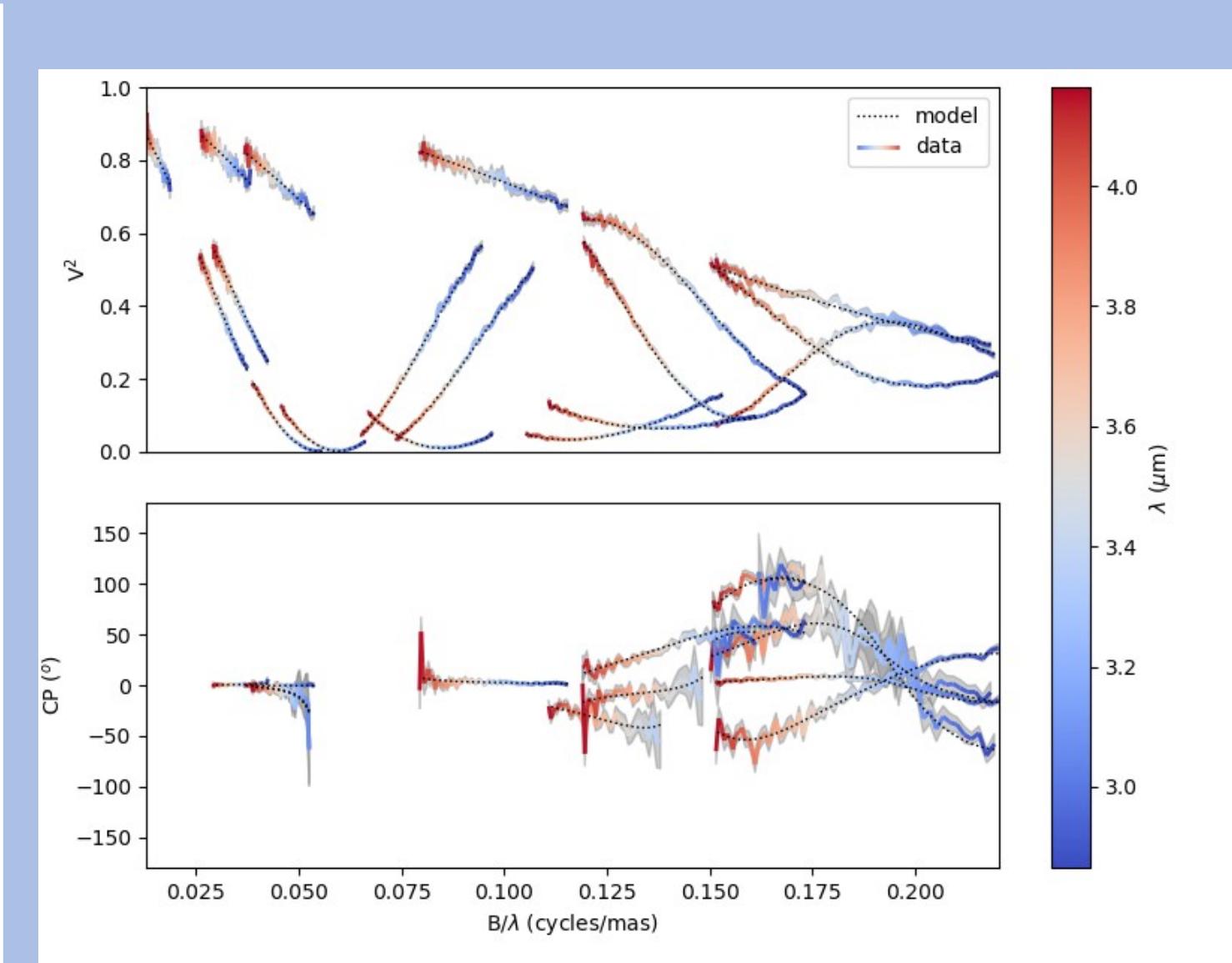
pt.params['f']=oim.oimParamNorm(ud.params['f'])

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Example of simple model-fitting

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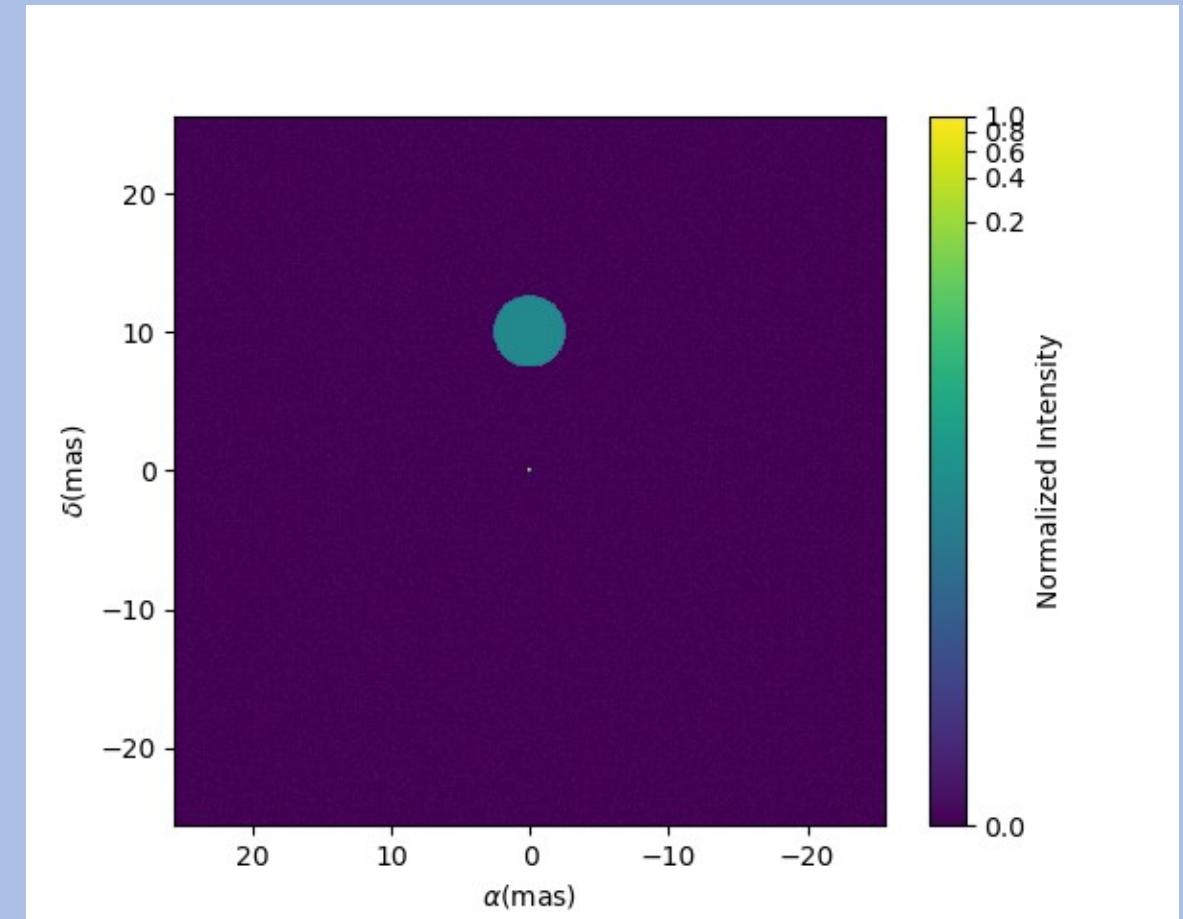
ud.params['d'].set(min=0.01,max=20)
ud.params['x'].set(min=-50,max=50,free=True)
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fit.walkersPlot()
fit.cornerPlot()
fit.simulator.plot(["VIS2DATA","T3PHI"])
model.showModel(512,0.1)
```



Chromatic model-fitting

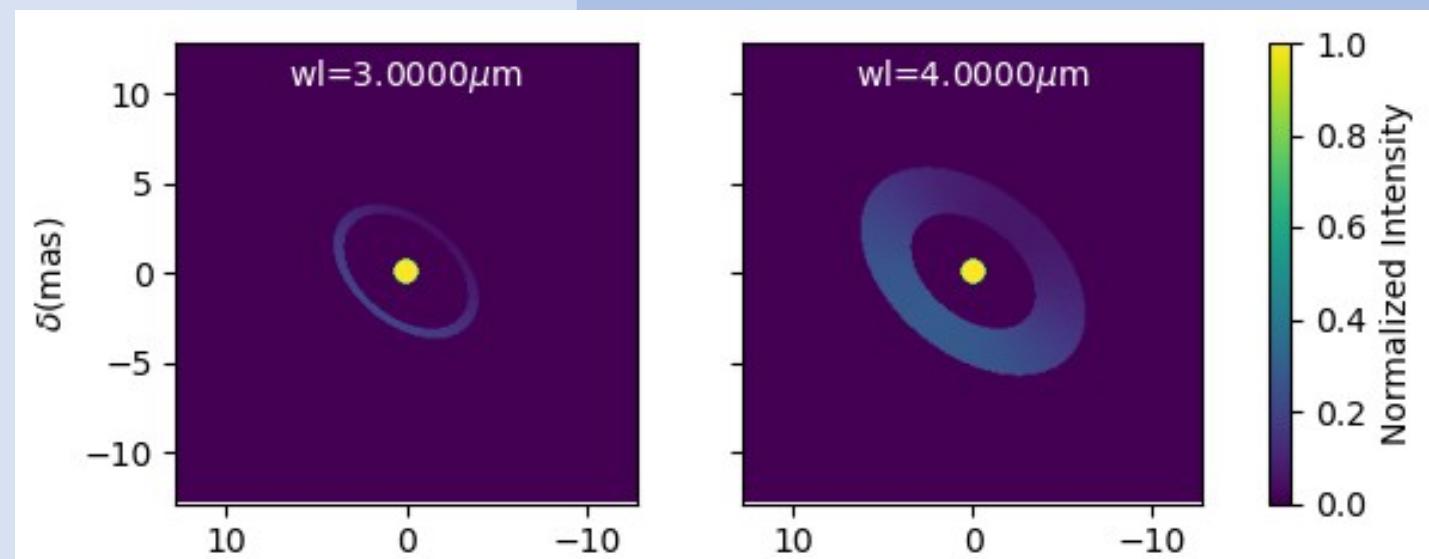
```
import oimodeler as oim
```

```
star=oim.oimUD(d=1,f=oim.oimInterp("wl",wl=[3e-6,4e-6],values=[0.5,0.1]))
disk=oim.oimESKRing(din=8,dout=oim.oimInterp("wl",wl=[3e-6,4e-6],values=[9,14]),elong=1.5,skw=0.8,pa=50)
disk.params["skwPa"]=oim.oimParamLinker(disk.params["pa"],"add",90)
disk.params['f']=oim.oimParamNorm(star.params['f'])
model=oim.oimModel(star,disk)
```

```
params=model.getFreeParameters()
params['c1_UD_f_interp1'].set(min=0.0,max=1)
params['c1_UD_f_interp2'].set(min=0.0,max=1)
params['c1_UD_d'].set(min=0,max=5,free=True)
params['c2_SKER_pa'].set(min=0.,max=180)
params['c2_SKER_elong'].set(min=1,max=3)
params['c2_SKER_din'].set(min=5,max=20.)
params['c2_SKER_skw'].set(min=0,max=1.)
params['c2_SKER_dout_interp1'].set(min=5.,max=30.)
params['c2_SKER_dout_interp2'].set(min=5.,max=30.)
```

```
fit=oim.oimFitterEmcee(files,model,nwalkers=30)
fit.prepare(init="random")
fit.run(nsteps=2000,progress=True)
```

```
figWalkers,axeWalkers=fit.walkersPlot()
figCorner,axeCorner=fit.cornerPlot(discard=1000)
median,err_l,err_u,err=fit.getResults(mode='median',discard=1000)
figSim,axSim=fit.simulator.plot(["VIS2DATA","T3PHI"])
figImg,axImg,im=model.showModel(256,0.1,wl=[wl[0],wl[-1]])
```



Chromatic model-fitting

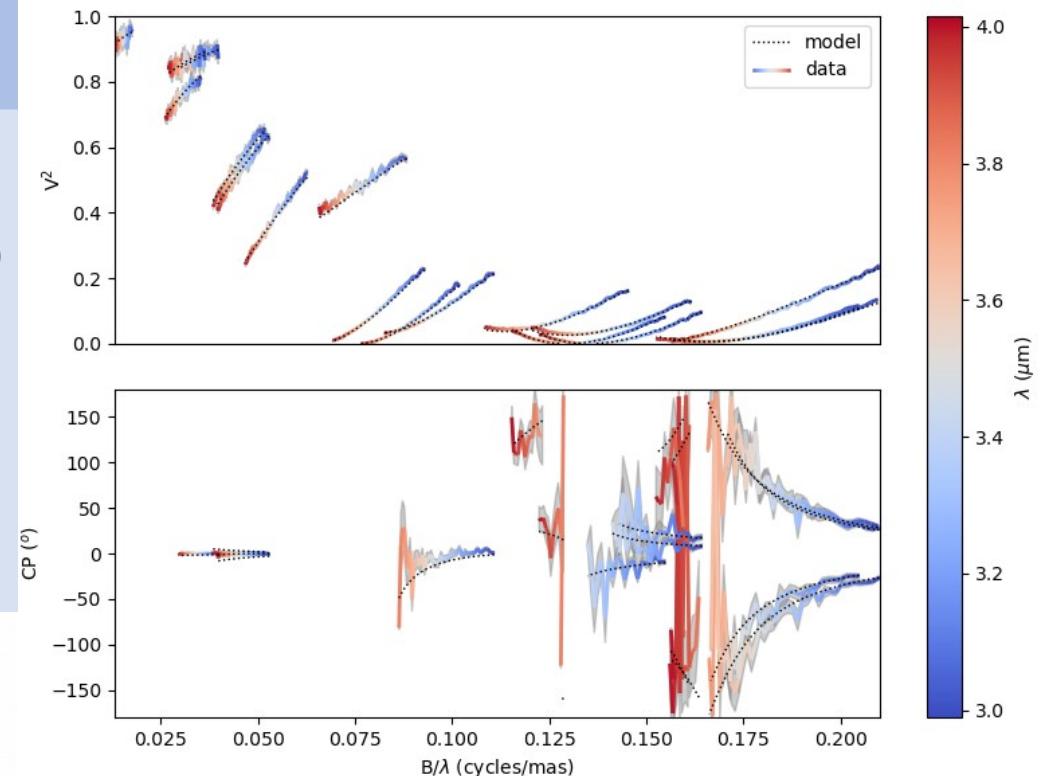
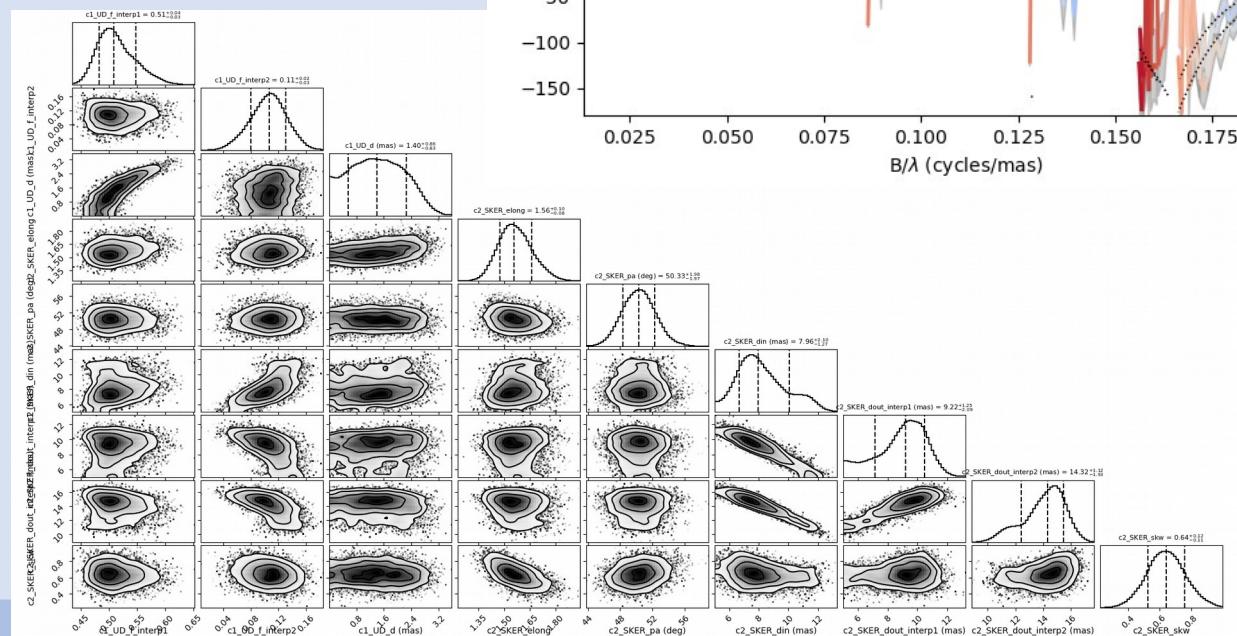
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```
star=oim.oimUD(d=1,f=oim.oimInterp("wl",wl=[3e-6,4e-6],values=[0.5,0.1]))
disk=oim.oimESKRing(din=8,dout=oim.oimInterp("wl",wl=[3e-6,4e-6],values=[9,14]),elong=1.5,skw=0.8,pa=50)
disk.params["skwPa"]=oim.oimParamLinker(disk.params["pa"],"add",90)
disk.params['f']=oim.oimParamNorm(star.params['f'])
model=oim.oimModel(star,disk)
```

```
params=model.getFreeParameters()
params['c1_UD_f_interp1'].set(min=0.0,max=1)
params['c1_UD_f_interp2'].set(min=0.0,max=1)
params['c1_UD_d'].set(min=0,max=5,free=True)
params['c2_SKER_pa'].set(min=0.,max=180)
params['c2_SKER_elong'].set(min=1,max=3)
params['c2_SKER_din'].set(min=5,max=20.)
params['c2_SKER_skw'].set(min=0,max=1.)
params['c2_SKER_dout_interp1'].set(min=5.,max=30.)
params['c2_SKER_dout_interp2'].set(min=5.,max=30.)
```

```
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```

```
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figSim,axSim=fit.simulator.plot(["VIS2DATA","T3PHI"])
figImg,axImg,im=model.showModel(256,0.1 wl=[wl[0],wl[-1]])
```



Creating new Fourier components

```
class oimBox(oim.oimComponentFourier):  
    name="2D Box"  
    shortname = "BOX"
```

```
def __init__(self,**kwargs):  
    super().__init__(**kwargs)  
    self.params["dx"]=oim.oimParam(name="dx", value=1,description="Size in x",unit=u.mas)  
    self.params["dy"]=oim.oimParam(name="dy", value=1,description="Size in y",unit=u.mas)  
    self._eval(**kwargs)
```

```
def _visFunction(self,ucoord,vcoord,rho,wl,t):  
    x=self.params["dx"]*(wl,t)*self.params["dx"].unit.to(u.rad)*ucoord  
    y=self.params["dy"]*(wl,t)*self.params["dy"].unit.to(u.rad)*vcoord  
  
    return np.sinc(x)*np.sinc(y)
```

```
def _imageFunction(self,xx,yy,wl,t):  
    return ((np.abs(xx)<=self.params["dx"]*(wl,t)/2) &  
           (np.abs(yy)<=self.params["dy"]*(wl,t)/2)).astype(float)
```

Initialization function

- Call parent `__init__`
- Define parameters (`oimParam`)
- Call eval function

visibility function

- formula as function of u and v or p (and optionally λ and t)

Image function

- formula as function of x and y (and optionally λ and t)

Creating new Fourier components

```

class oimBox(oim.oimComponentFourier):
    name="2D Box"
    shortname = "BOX"

    def __init__(self,**kwargs):
        super().__init__(**kwargs)
        self.params["dx"]=oim.oimParam(name="dx", value=1,description="Size in x",unit=u.mas)
        self.params["dy"]=oim.oimParam(name="dy", value=1,description="Size in y",unit=u.mas)
        self._eval(**kwargs)

    def _visFunction(self,ucoord,vcoord,rho,wl,t):
        x=self.params["dx"]*(wl,t)*self.params["dx"].unit.to(u.rad)*ucoord
        y=self.params["dy"]*(wl,t)*self.params["dy"].unit.to(u.rad)*vcoord

        return np.sinc(x)*np.sinc(y)

    def _imageFunction(self,xx,yy,wl,t):
        return ((np.abs(xx)<=self.params["dx"]*(wl,t)/2) &
               (np.abs(yy)<=self.params["dy"]*(wl,t)/2)).astype(float)

```

```

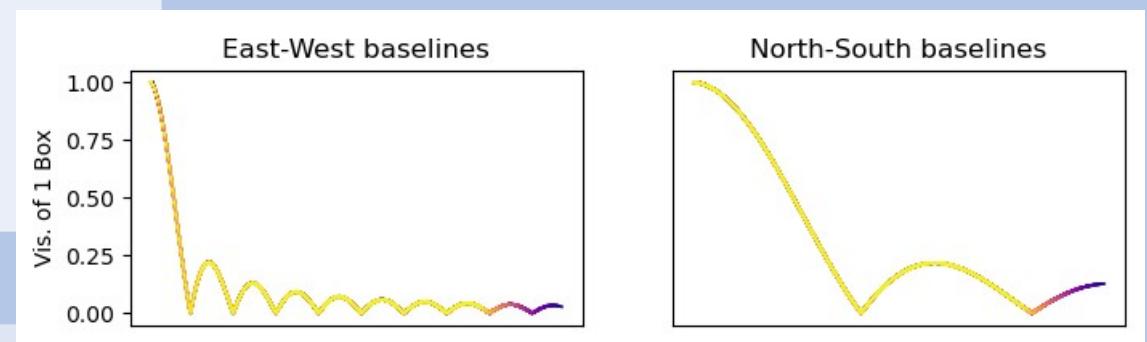
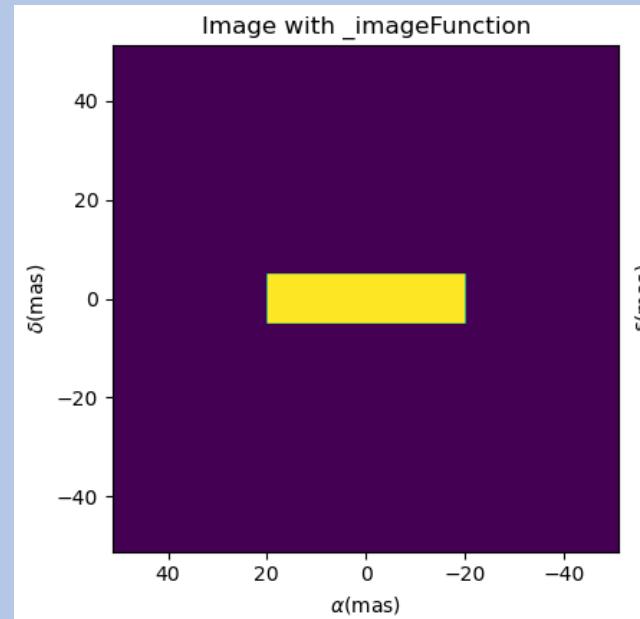
b1=oimBox(dx=40,dy=10)
m1=oim.oimModel(b1)

```

```

m1.showModel(512,0.2,axe=ax[0],colorbar=False)
vis=np.abs(m.getComplexCoherentFlux(spfx,spfy))

```



Creating new Image components (external code)

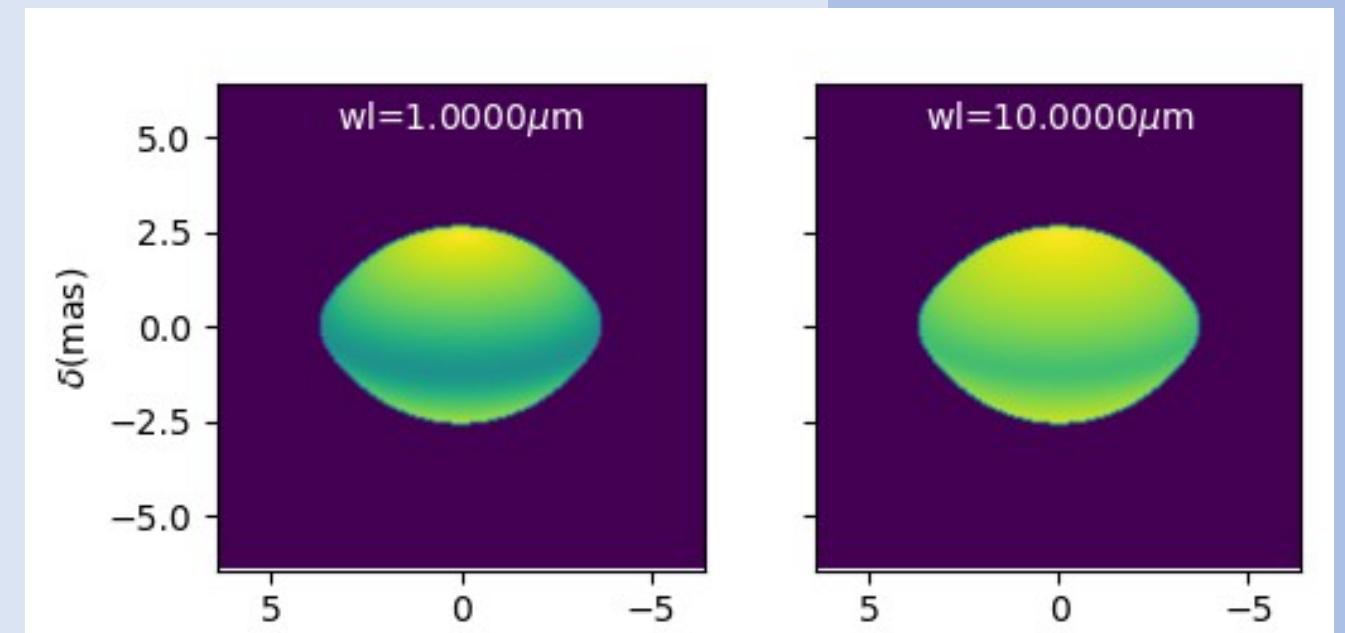
```

class oimFastRotator(oim.oimComponentImage):
    name="Fast Rotator"
    shortname="FRot"
    def __init__(self,**kwargs):
        super().__init__(**kwargs)
        self.params["incl"]=oim.oimParam(name="incl",value=0,description="Inclination angle",unit=units.deg)
        self.params["rot"]=oim.oimParam(name="rot",value=0,description="Rotation Rate",unit=units.one)
        self.params["Tpole"]=oim.oimParam(name="Tpole",value=20000,description="Polar Temperature",unit=units.K)
        self.params["dpole"]=oim.oimParam(name="dpole",value=1,description="Polar diameter",unit=units.mas)
        self.params["beta"]=oim.oimParam(name="beta", value=0.25,description="Gravity Darkening Exponent",unit=units.one)
        self._t = np.array([0])
        self._wl = np.linspace(0.5e-6,15e-6,num=10)
        self._eval(**kwargs)

    def _internalImage(self):
        dim=self.params["dim"].value
        incl=self.params["incl"].value
        rot=self.params["rot"].value
        Tpole=self.params["Tpole"].value
        dpole=self.params["dpole"].value
        beta=self.params["beta"].value

        im=fastRotator(dim,1.5,incl,rot,Tpole,self._wl,beta=beta)
        im=np.tile(np.moveaxis(im,-1,0)[None,:,:,:],(1,1,1,1))
        self._pixSize=1.5*dpole/dim*units.mas.to(units.rad)
        return im

```



Creating new Radial Profile components (analytical)

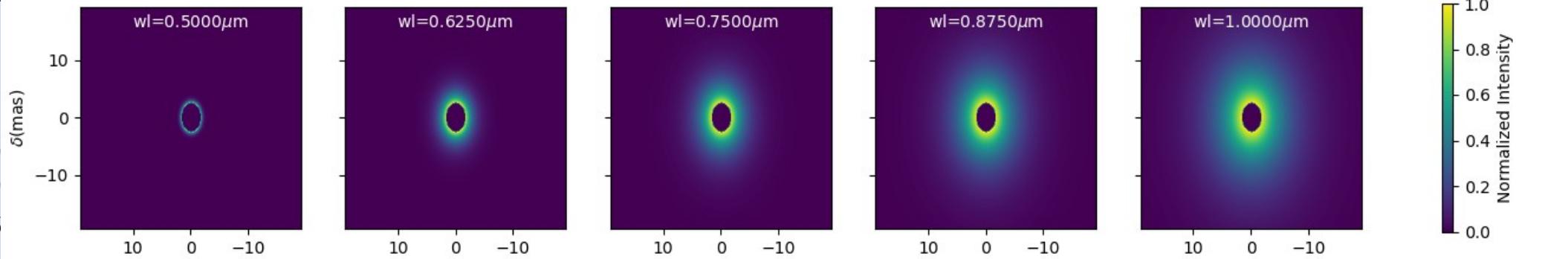
```
class oimExpRing(oim.oimComponentRadialProfile):
```

```
    name="A ring with a descreasing exponential profil"
```

```
    shortname = "E"
```

```
    elliptic=True
```

```
    def __init__(self, *args, **kwargs):
        super().__init__(*args, **kwargs)
        self.params['d'] = 1.0
        self.params['fwhm'] = 0.25
        self._dim=25
```



```
        self._t = np.array([0])
```

```
        self._wl = np.array([0.5e-6,1e-6])
```

```
        self._r = np.arange(0, self._dim)*0.05 #in mas
```

```
        self._eval(**kwargs)
```

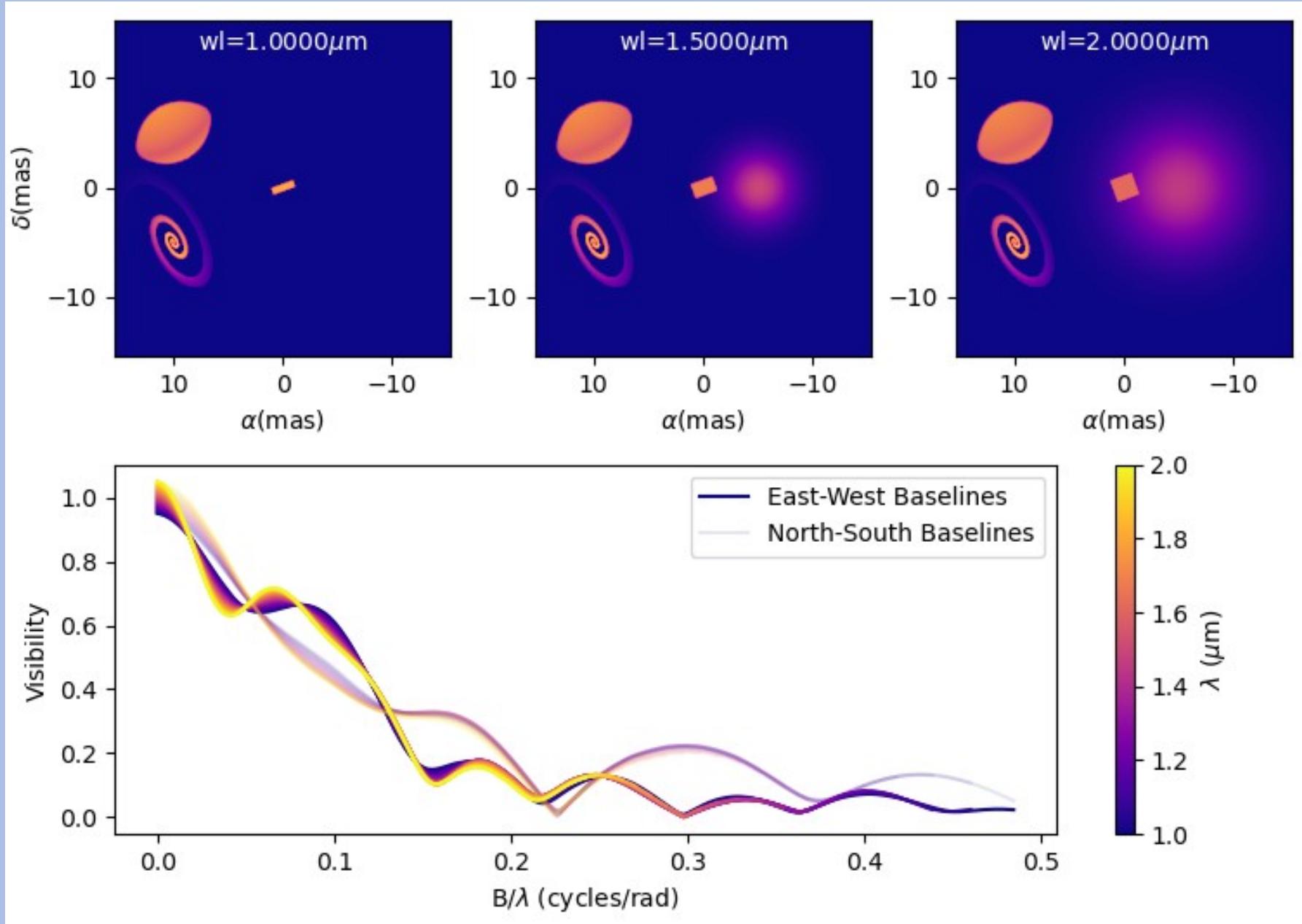
```
    def _radialProfileFunction(self,r,wl,t):
```

```
        r0=self.params["d"](wl,t)/2
```

```
        fwhm=self.params["fwhm"](wl,t)
```

```
        return np.nan_to_num((r>r0)*np.exp(-0.692*np.divide(r-r0,fwhm))),nan=0
```

Combining components



TODO in 2023 ...

0 Implement missing basic features:

- Create components from fits files and grid
- Saving (model, fit)
- Flux normalization (from 1 or ad-hoc to Jy)
- Photometric and spectroscopic data

0 Add a few advanced features

- models (rot. disk, DISCO+, AMHRA, grids?)
- “intelligent” sampling for image based models
- fitters (options, λ -by- λ , lmfit, chain, external constraints...)
- filters (wl shift, smoothing, binning...)

0 Extensive test of the code

- Unitary tests for all models and features
- Tests Simulated data (chromatic + time-dependent)
- Real data from all known instruments

0 Start working on optimization

- Parallelization (model & fitter)
- FFT & Hankel algorithms
- Data optimization

0 Documentation & project management (GIT...)



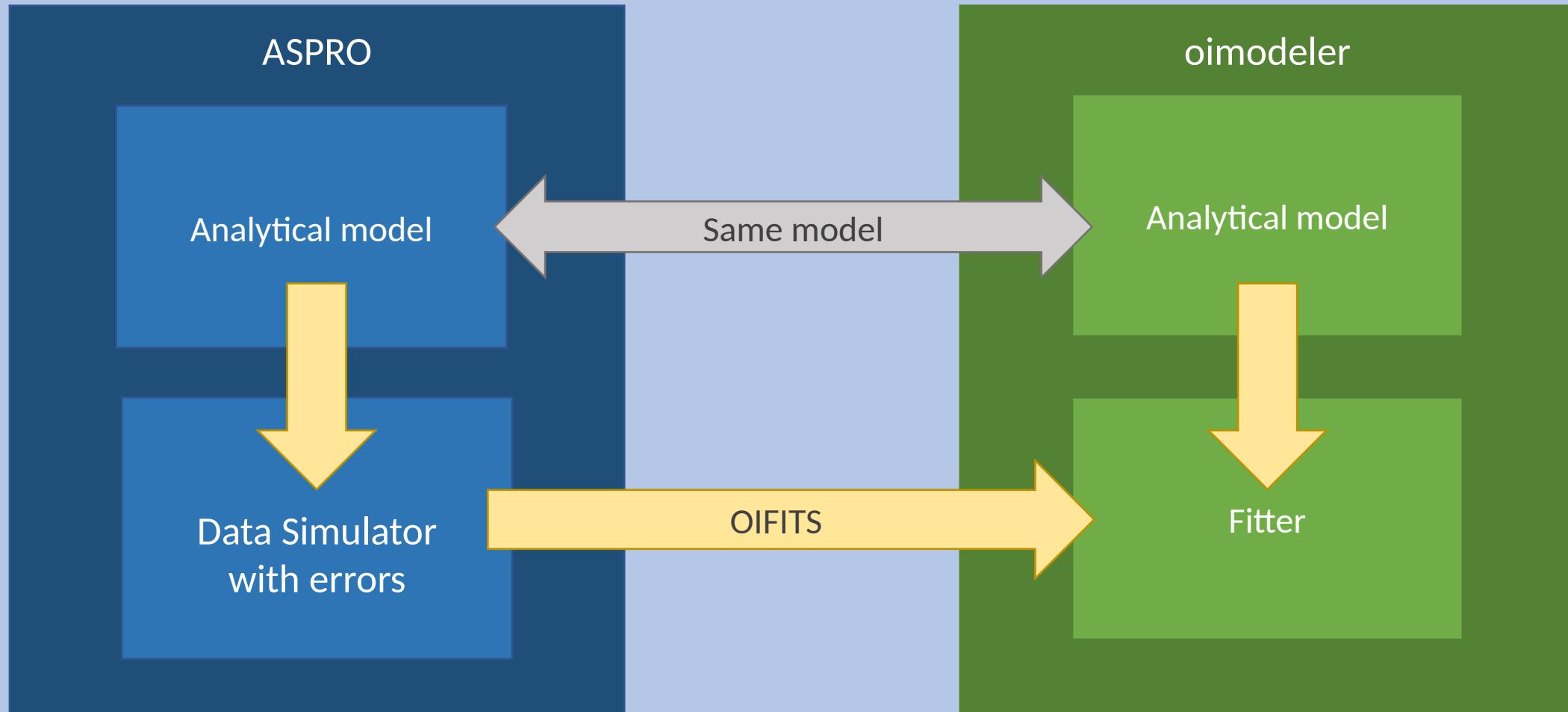
Oimodeler Team is building up...

Anthony Meilland, Jozsef Varga, Alexis Matter, Marten Scheuck, Armando Domiciano de Souza ...

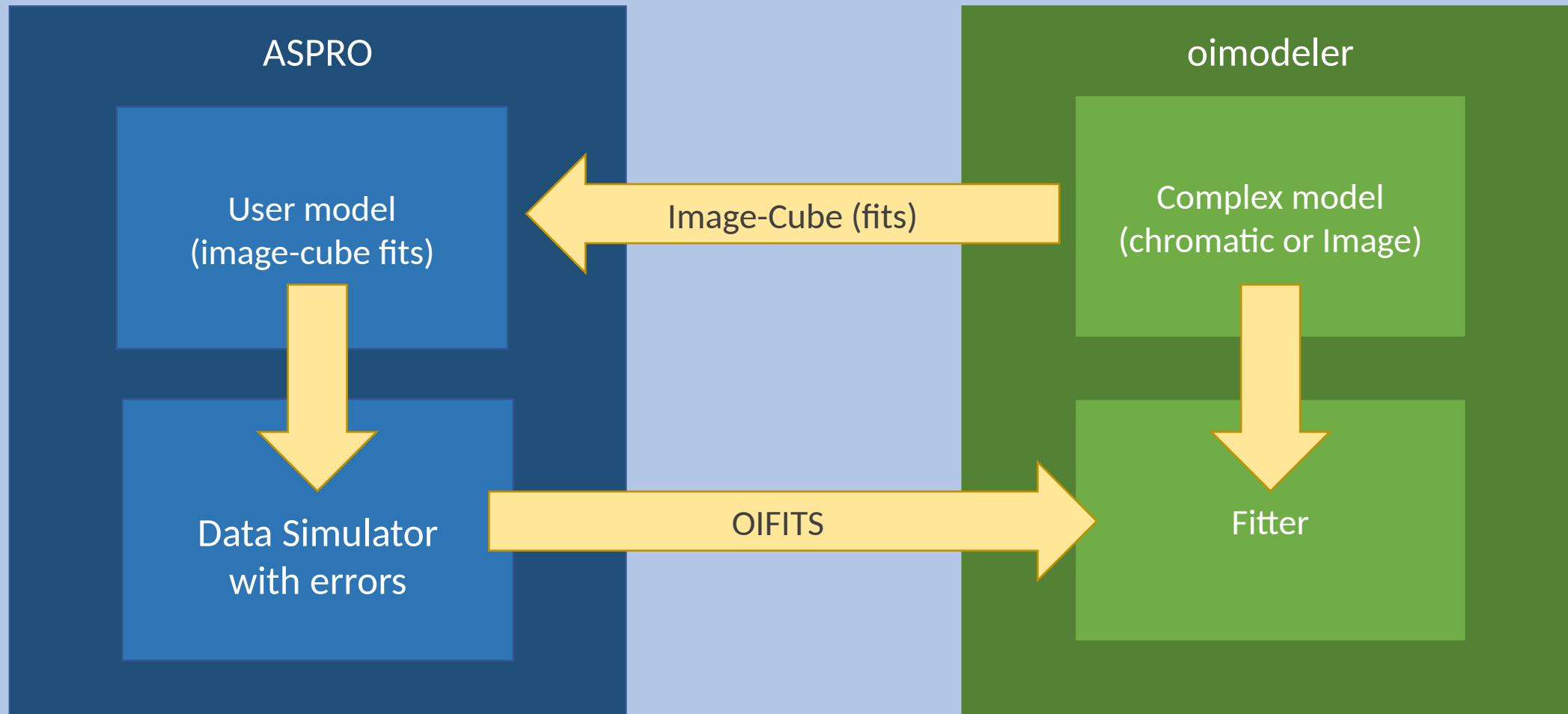
master and PhD students in Nice, Leiden and Heidelberg ...

+ ANR MASSIF

How did I produce simulated data for comparison?



How did I produce simulated data for comparison?



Model-fitting with a image-plan model

