

EXOPLANET DIRECT IMAGING:  
**DR WHO**

ON SKY

**NCPA CORRECTION**

THROUGH

THE **PYRAMID** WAVEFRONT SENSOR **REFERENCE**  
**UPDATE**

NOUR SKAF

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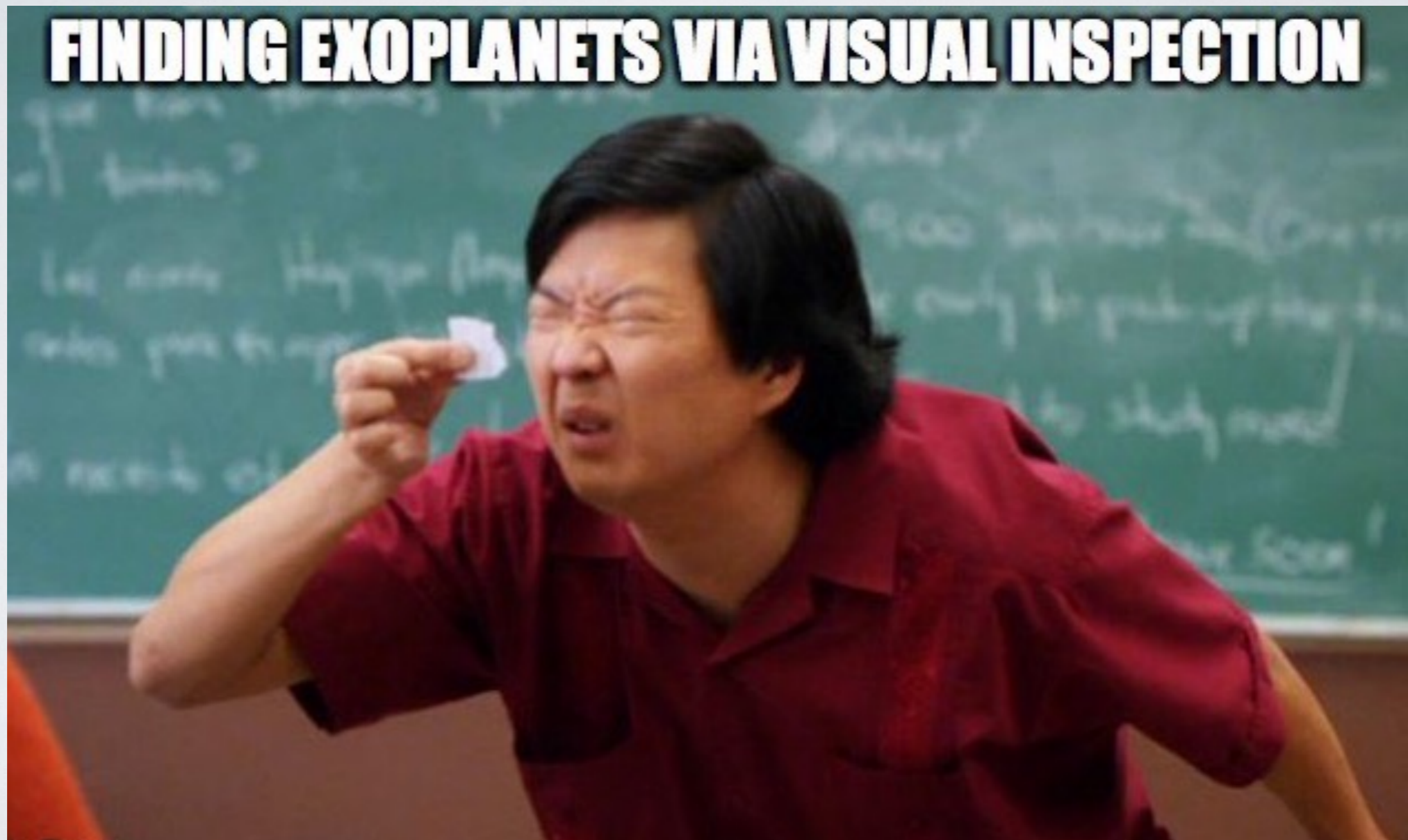
WFS 2020 - Online

14 October 2020

Special thanks to Eric Gendron



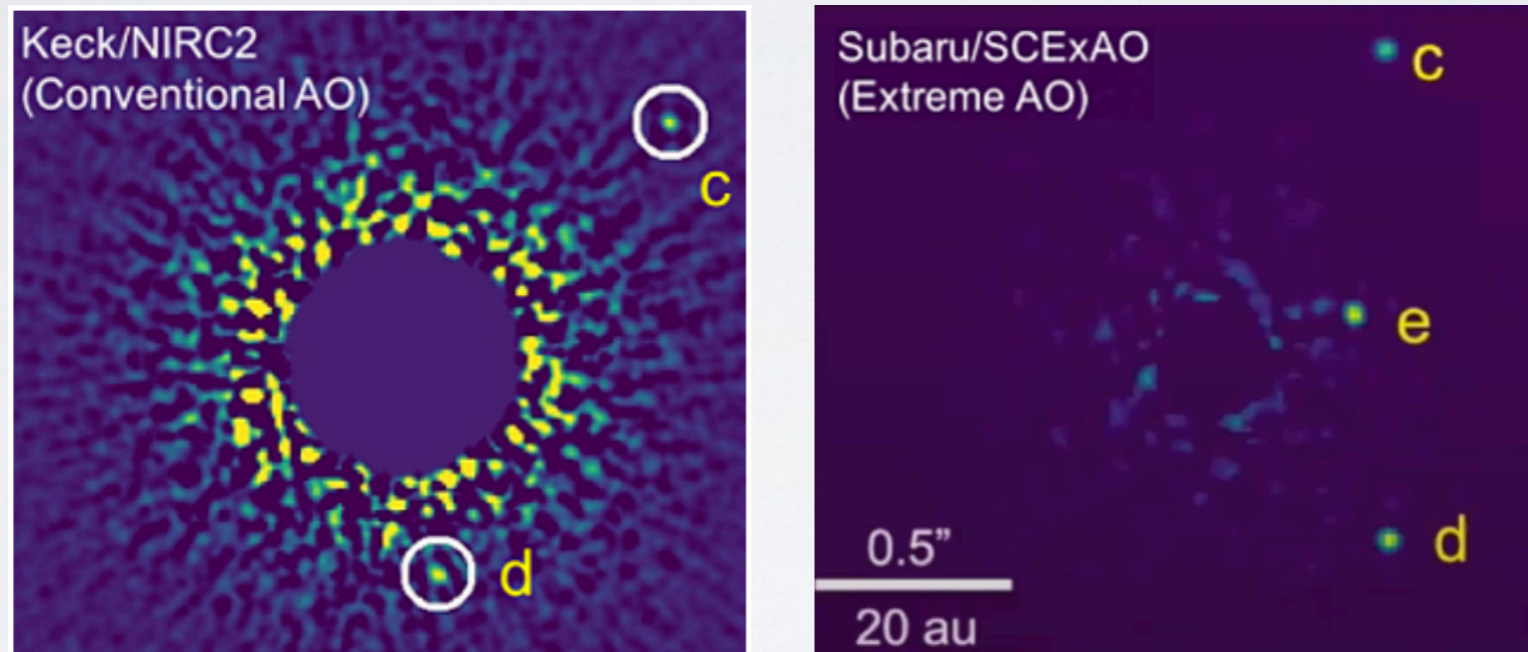
# DIRECT IMAGING ...



Credit: Billy Edwards

# TECHNICAL CHALLENGES

## Speckle subtraction



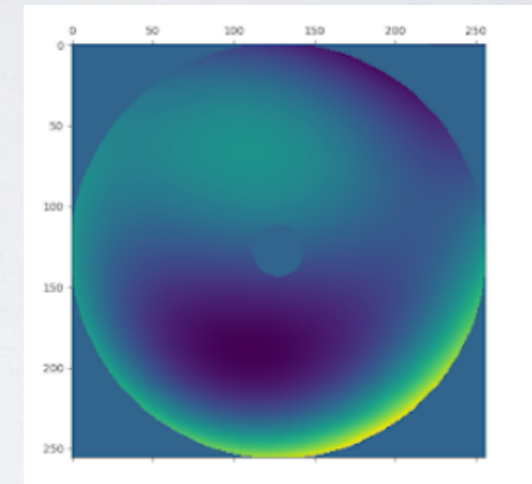
Currie et al. 2019

Speckles = atmospheric residuals + NCPA

# TECHNICAL CHALLENGES

Several kinds of NCPA...

Static  
Quasi static ( $<0.01$  Hz)  
Dynamic ( $>0.01$  Hz)



Each kind having low and high spatial frequencies

# TECHNICAL CHALLENGES

Several ways to deal with NCPA...

Can partially be solved by changing the gain

➔ in xAO, the modes are **coupled** ...

# DRWHO

## Direct Reinforcement Wavefront Heuristic Optimisation

Problematic : what is the pyramid reference ?

i.e what gives a  
"flat" wavefront

The WFS reference is measured with an internal source,  
before the observations

BUT, this reference is constantly evolving, and is different on-sky than  
with the internal source.

→ Essential need of a continuous way to measure the WFS reference

WFS reference  $\neq$  ideal reference

Goal : find what is the closest from it



special difficulty **bonus** for a PyWFS and all its  
tricky lovely annoying **non-linearities**



# DR WHO

Problematic : what is the pyramid reference ?

**While the AO loop is running : live update of the pyramid reference**

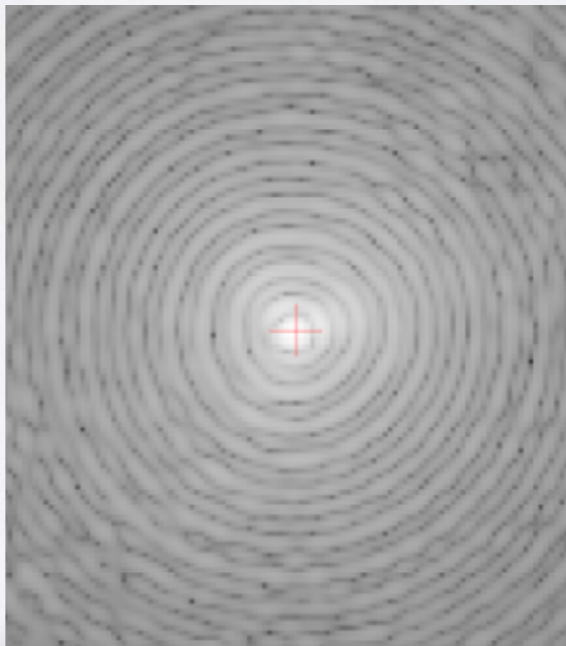
# DR WHO

Problematic : what is the pyramid reference ?

While the AO loop is running : live update of the pyramid reference

**I - On a 30 sec timescale, the algo identifies the best  
10% Strehl Ratio**

**(SR = reward - could be contrast, sharpness, minimum  
intensity etc)**





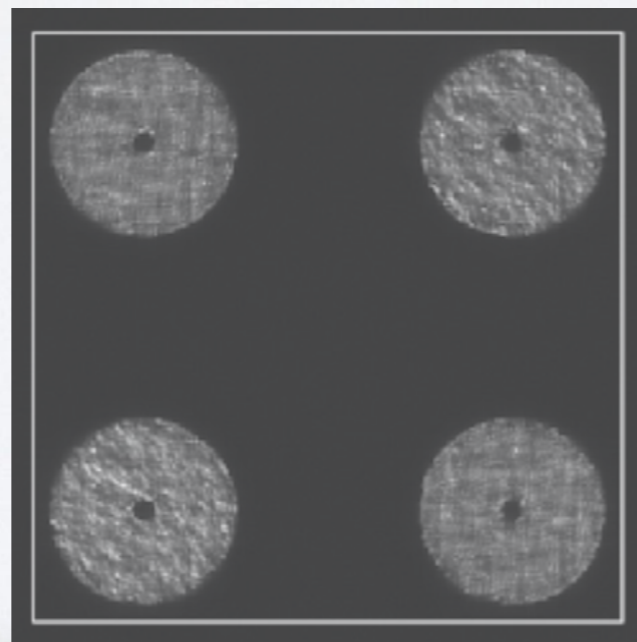
# DR WHO

Problematic : what is the pyramid reference ?

While the AO loop is running : live update of the pyramid reference

1- On a 30 sec timescale, the algo identifies the best 10% Strehl Ratio  
(SR = reward - could be contrast, sharpness, intensity etc)

**2- Take the corresponding WFS measurements**



# DR WHO

Problematic : what is the pyramid reference ?

While the AO loop is running : live update of the pyramid reference

1- On a 30 sec timescale, the algo identifies the best 10% Strehl Ratio  
(SR = reward - could be contrast, sharpness, etc)

2- Take the corresponding WFS measurements

**3- Average them - weighted on the SR value**

# DR WHO

Problematic : what is the pyramid reference ?

While the AO loop is running : live update of the pyramid reference

- 1- On a 30 sec timescale, the algo identifies the best 10% Strehl Ratio  
(SR = reward - could be contrast, sharpness, etc)
- 2- Take the corresponding WFS measurements
- 3- Average them - weighted on the SR value

**4- The resulting WFS frame replaces the WFS reference  
(with an integrator filter)**

# DR WHO

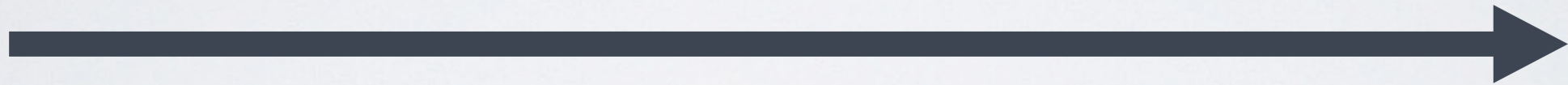
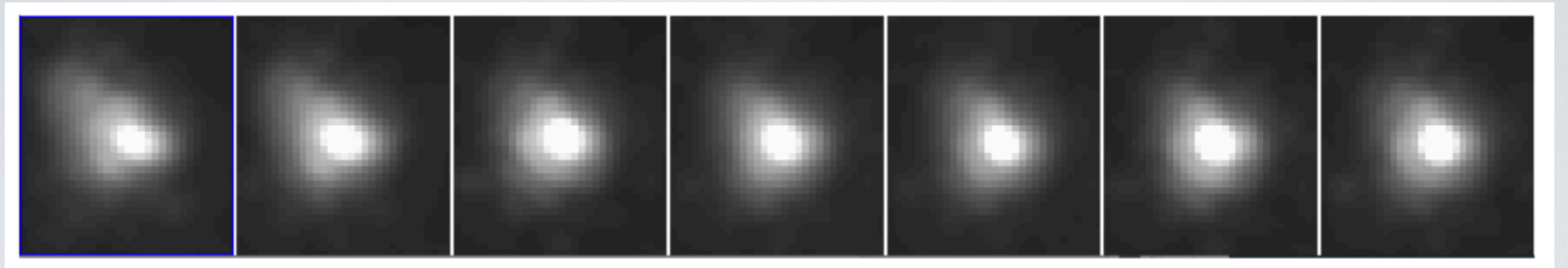
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**5- As the algo proceeds, it is continuously rewarded for high quality PSF**

# Results

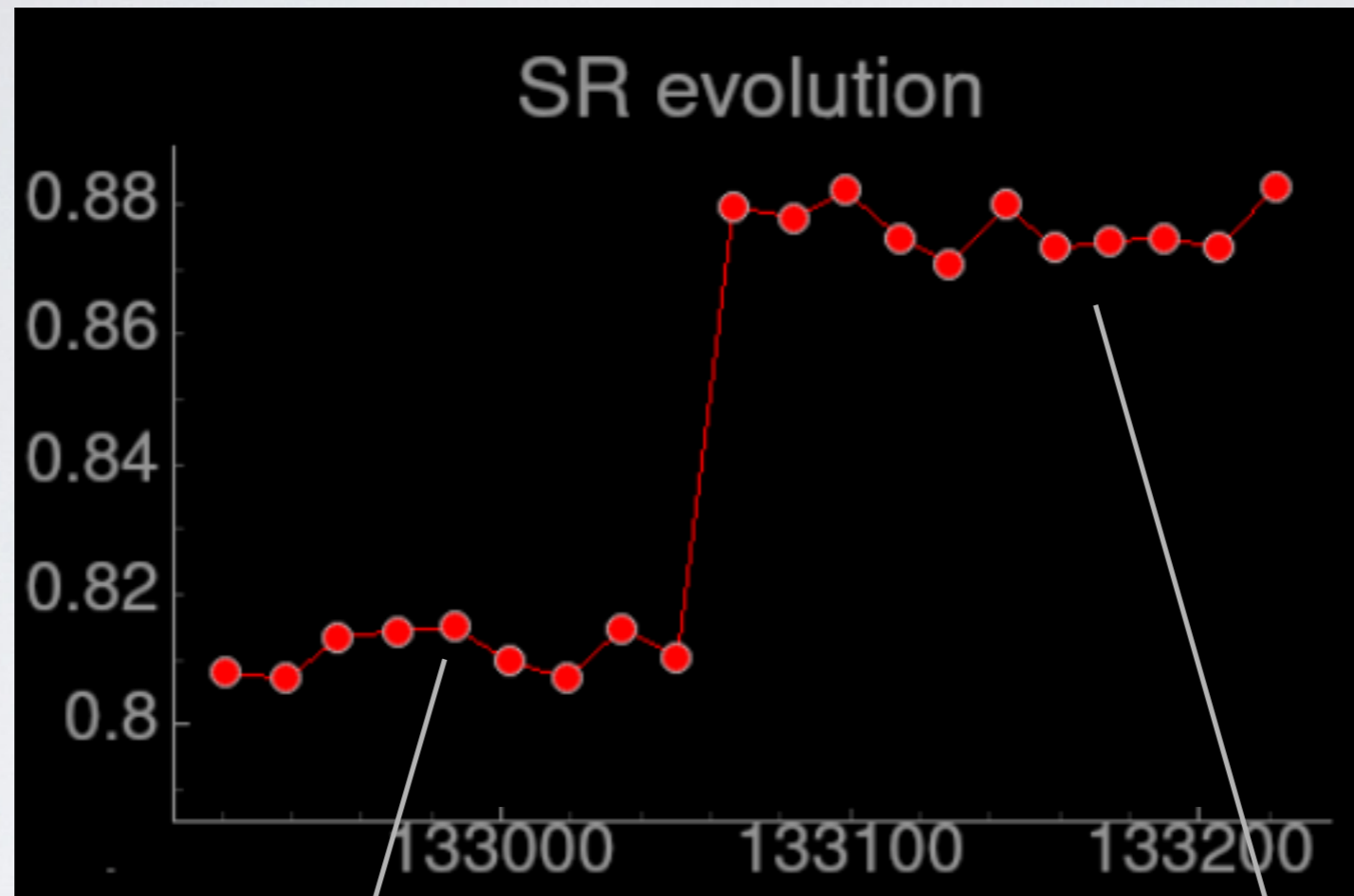


Evolution of the PSF quality, on sky (SCEExAO), over a 21 min period

750 nm on Vampire

Results

Compass simulation



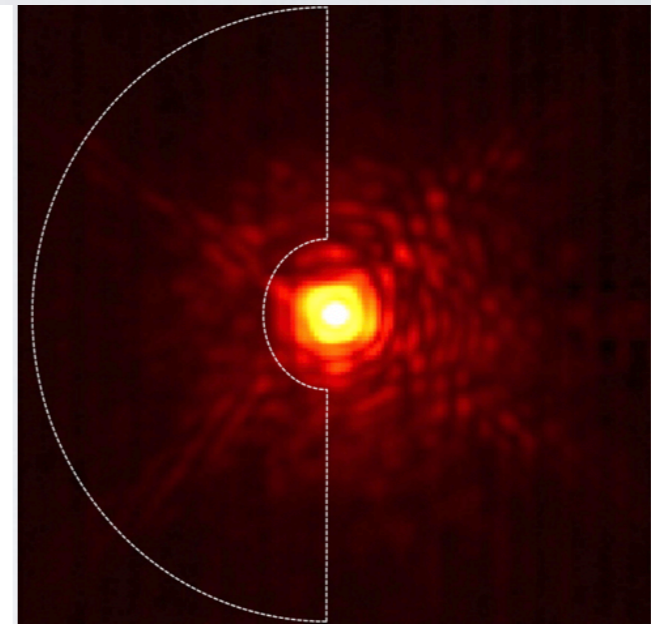
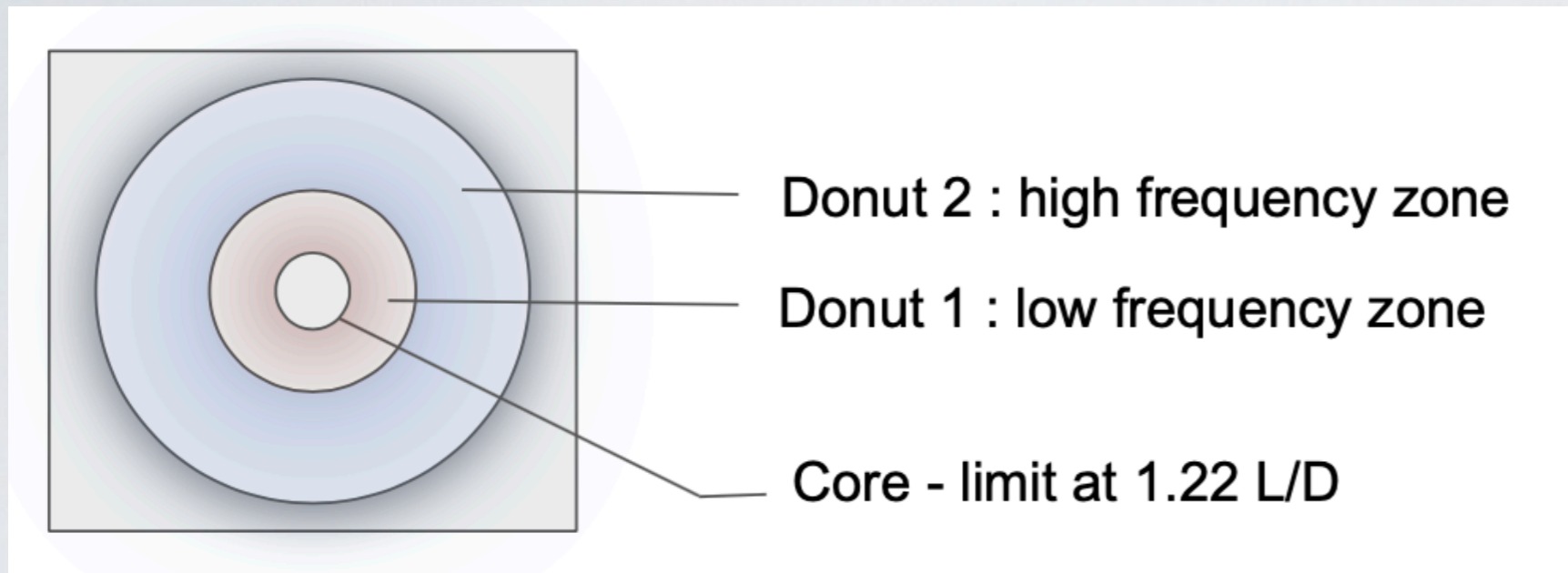
Loop with Initial Reference

Loop with update reference after Dr WHO

Without NCPA = 93%

# Dr WHO 2.0

Take advantage of the difference in spatial frequency in the PSF



PSF SE

- the inner donut has a lower spatial frequency than the outer donut
- > we can **select** part of the image corresponds to some spatial frequency
- > 2 (N) loops Dr WHO for each donut and **separate lower and higher frequencies** to correct each **independently**.
- then, sum up the 2 references found on the WFS

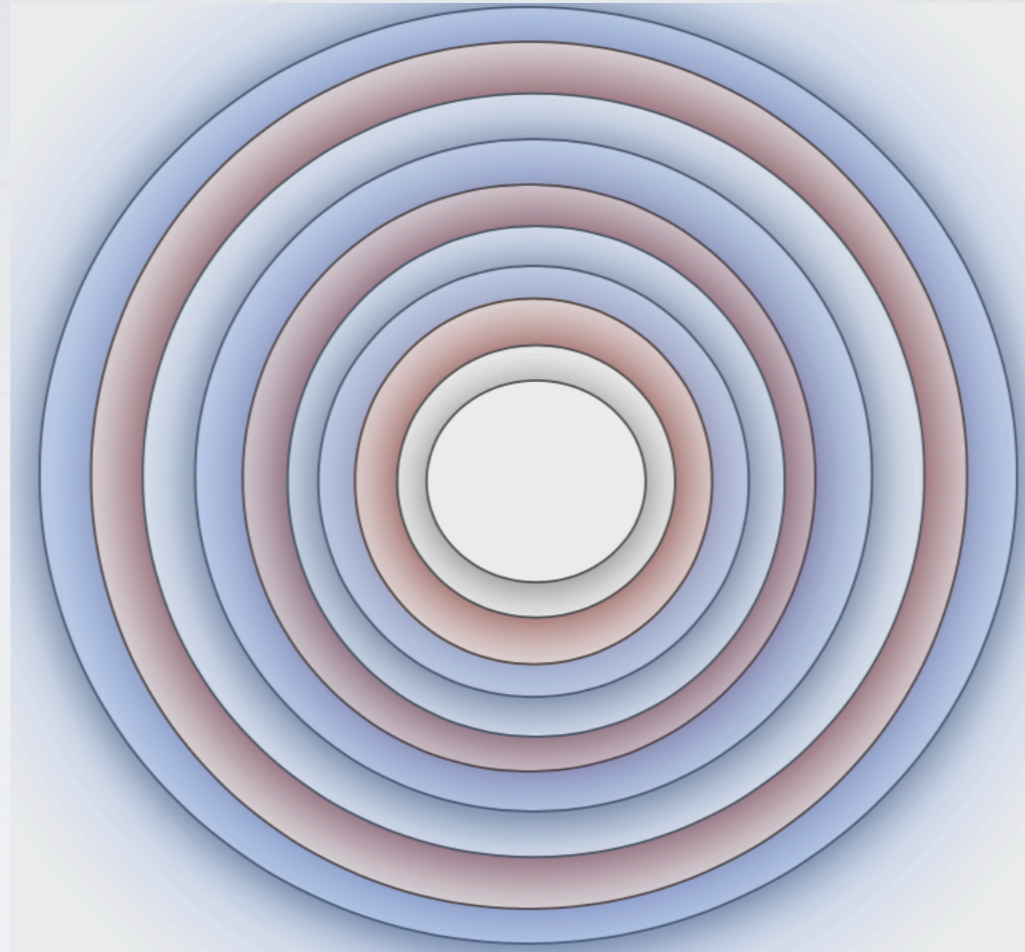
LET'S MAKE MORE DONUTS!



LET'S MAKE MORE DONUTS!



Nour post-lockdown



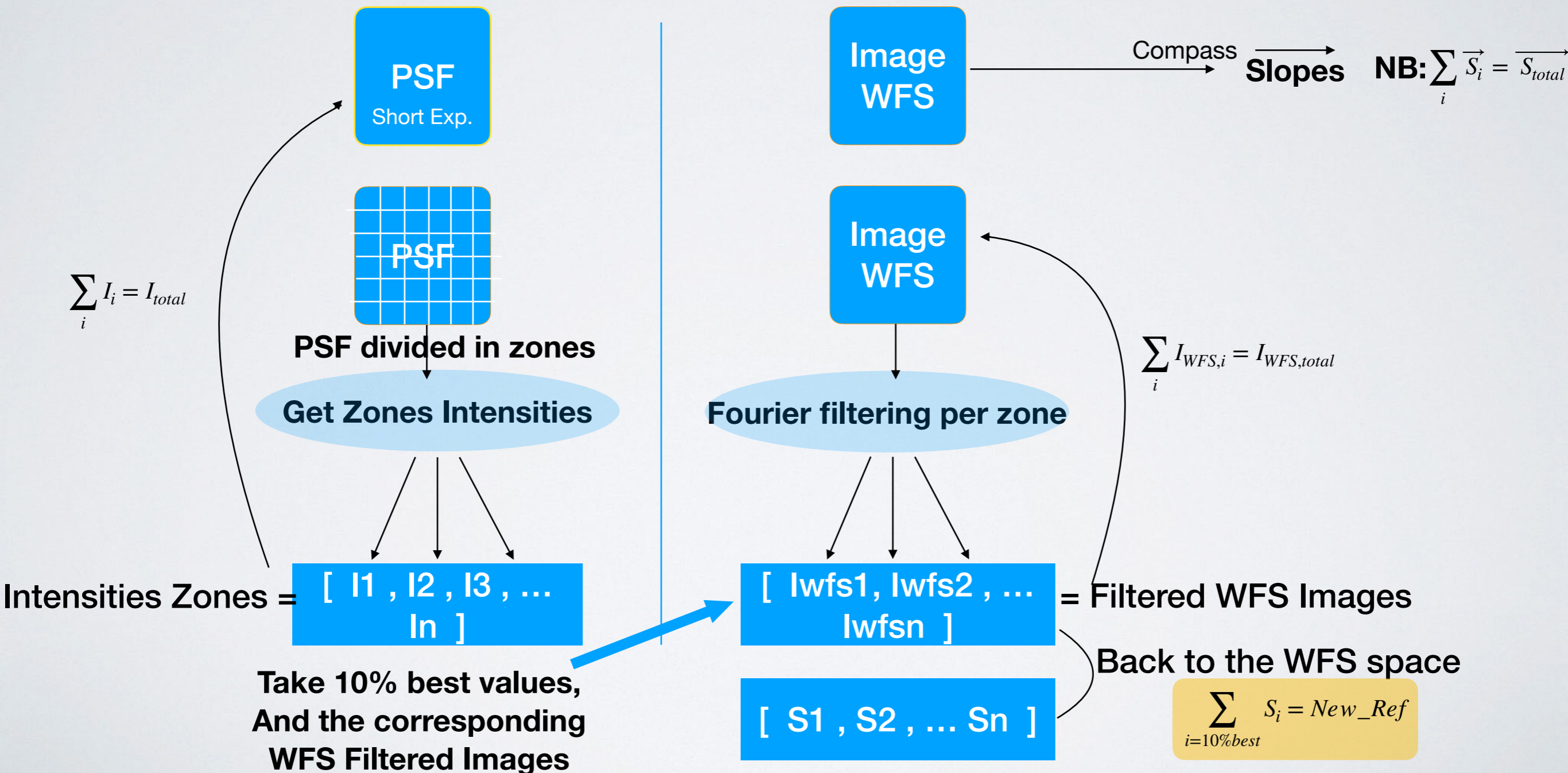
As many donuts as we want to separate in  
spatial frequencies

- ➔ To have an accurate quantification of NCPAs  
And project the NCPA on the modal basis

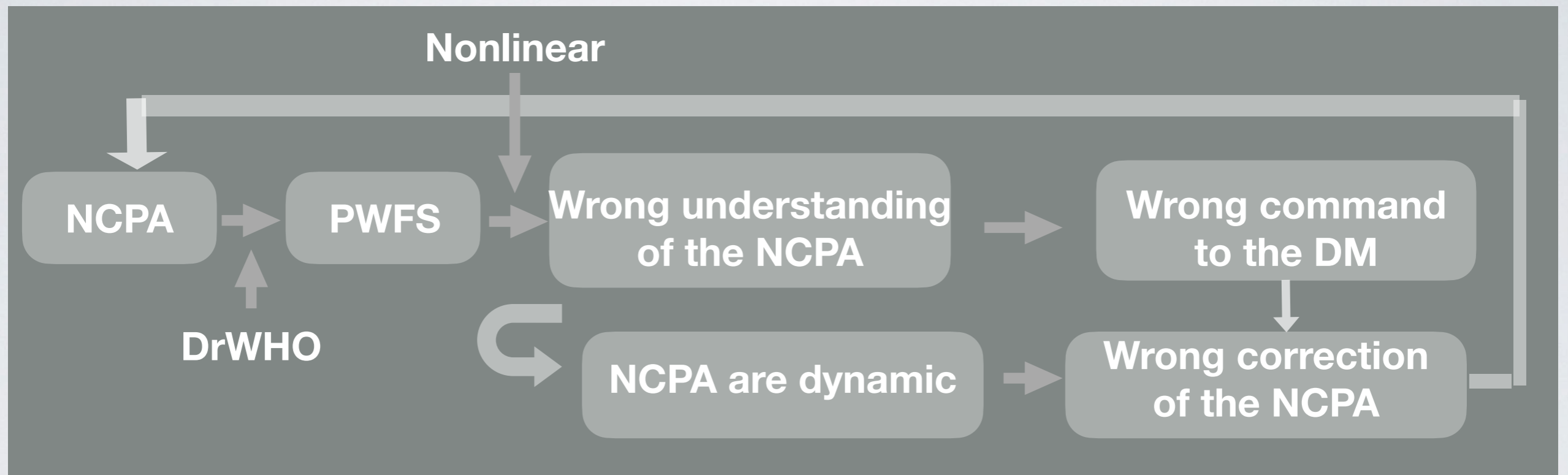
(Gendrinou modal basis - Gendron et al 202x)

# Dr WHO 3.0 : through Fourier spatial filtering of the WFS images via zones in the PSF

## Schematic view



# Summer - y - l



# Summer-y - II

- **Parallelisation** of the optimisation:  
Each **area / donut / squares** runs optimally in //,  
Each working on separate modes / spatial frequencies
- **Flexible** in the choice of optimisation :
  - kind of **zones** and their sizes
  - **frequency filtering** (modal basis / Fourier ...)
  - **quantity** to optimise : local contrast, Strehl, etc.
  - Dr WHO algo time setting, lucky imaging setting, etc
  - SH, PyWFS...
- Possible extension to use DL as an **empirical** approach through the telemetry to learn the multiple **non-linear relationships** would be powerful.

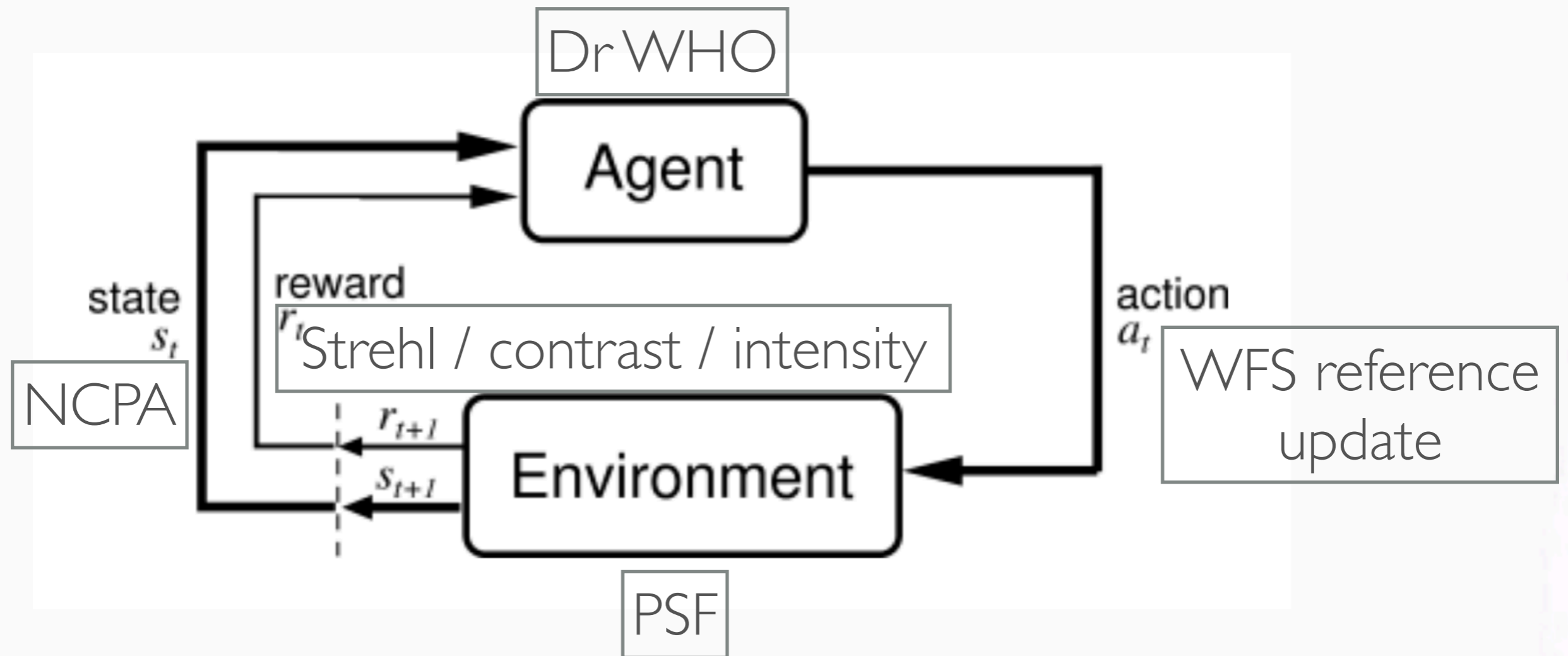
**Next step: on SCExAO !**

Thank you :)

Back up slides

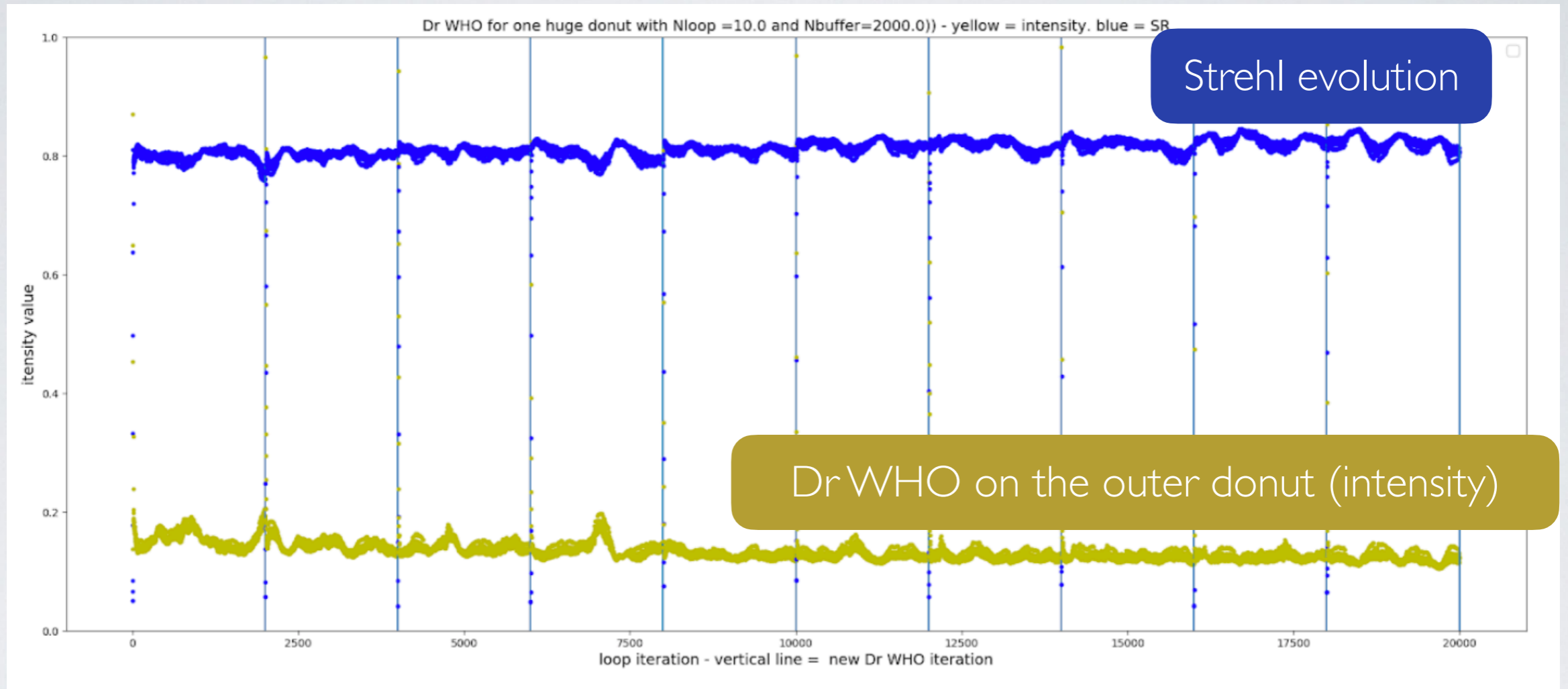
# DR WHO

Model-based Reinforcement Learning approach



Policy: binary selection of the PSF - "lucky imaging"

# Compass simulation...



10 seconds of loop iterations  
➔ SR improvement ~ 4%