



# Efficient Solvers for Atmospheric Tomography

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joint work with Ronny Ramlau (JKU Linz) & Roberto Biasi (Microgate)

**Reduced Order Modelling, Simulation and  
Optimization of Coupled Systems  
(ROMSOC)**

industrial  
**mathematics**  
institute



Valencia, July 17, 2019

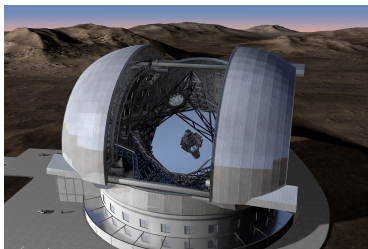


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- European Southern Observatory (ESO) located in Garching, Munich
- construction and operation of astronomical telescopes
  - built in the Atacama desert, Chile
  - primary mirror: 39 m
  - 2005: first plans for ELT
  - 2008: Austria joins ESO
  - 2014: decision to build ELT
  - 2025: first light
- Austrian scientific contribution:  
*Mathematical Algorithms and Software for ELT Adaptive Optics*

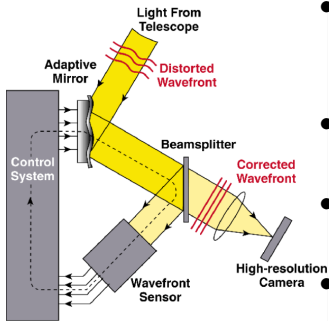


Credit: ESO



ELT vs. the Pyramids (Credit: ESO)

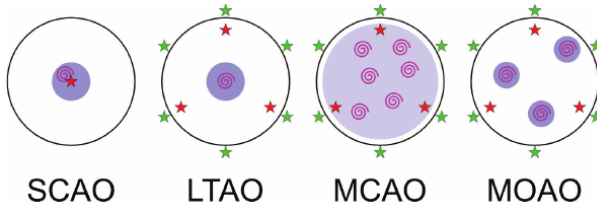
Technique that removes aberrations during the imaging process through deformable mirrors.



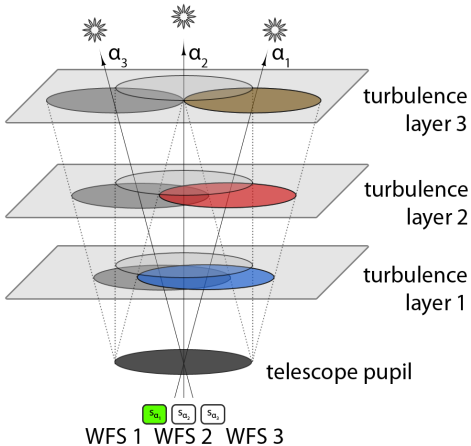
- light detected from reference sources (NGS, LGS) close to the astronomical object of interest
- WFS measure aberrations of the light caused by atmospheric perturbations
- **task of AO system:** remove distortions to allow a sharper view
- adaptive component - deformable mirror
- correction in real-time, i.e., at around 500-1000 Hertz

Credit: Claire Max, UCSC

- basic operating system: **SCAO** (Single Conjugate Adaptive Optics), 1 light source, applied if a NGS is sufficiently near to the observed object
- complex operating systems: good correction in several directions or over wide field of view, several guide stars
  - **MCAO** (Multi Conjugate AO)
  - **LTAO** (Laser Tomography AO)
  - **MOAO** (Multi Object AO)



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- assuming layered model of the atmosphere
- good correction in several directions or over a wide field
- using several guide stars
- **goal:** reconstruct turbulent layers from WFS measurements
- mathematical problem formulation:

$$s = A\phi$$

⇒ **ill-posed inverse problem,**  
requires **regularization**

$$s = A\phi + \eta$$

**Advantage:** allows to incorporate statistics of turbulence and noise

Maximum a-posteriori estimate (**MAP**)

$$(A^* C_{\eta}^{-1} A + C_{\phi}^{-1})\phi = A^* C_{\eta}^{-1} s,$$

where  $C_{\phi}$  and  $C_{\eta}$  are the covariance matrices of layers  $\phi$  and noise  $\eta$ .

## Challenges:

- inverse problem
- computationally very expensive operations
- to be solved in real-time

⇒ **need an efficient solver**

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We want to solve:

$$(A^T C_\eta^{-1} A + C_\phi^{-1}) \phi = A^T C_\eta^{-1} s$$

## Soft Real Time (SRT):

1. Compute the inverse of the tomography operator:

$$R := (A^T C_\eta^{-1} A + C_\phi^{-1})^{-1} A^T C_\eta^{-1}$$

2. Multiply  $R$  by projection matrix  $P$  to obtain DM commands  $u$  from layers  $\phi$

## Hard Real Time (HRT):

Apply matrix vector multiplication to get DM commands:

$$u = PR \cdot s$$

We want to solve:

$$(A^T C_\eta^{-1} A + C_\phi^{-1}) \phi = A^T C_\eta^{-1} s$$

Use clever transformations - dual domain discretization:

$$(\mathbf{W}^{-T} \hat{A}^T C_\eta^{-1} \hat{A} \mathbf{W}^{-1} + \alpha D) c = \mathbf{W}^{-T} \hat{A}^T C_\eta^{-1} s$$

**Hard Real Time:**

1. Compute right hand side:  $b^n = \mathbf{W}^{-T} \hat{A}^T C_\eta^{-1} s$
2. Update residual:  $r^n = (b^n - b^{n-1}) + r^{n-1}$
3. Perform atmospheric tomography with an iterative approach:  
Preconditioned Conjugate Gradient Method  $(c^n, r^n) = PCG(c^{n-1}, r^{n-1})$
4. Projection:  $u = Q \mathbf{W}^{-1} c^n$

[1] M. Yudytskiy, T. Helin, R. Ramlau, *A finite element - wavelet hybrid algorithm for atmospheric tomography*

## Turbulence statistics in the wavelet domain:

- lead to a diagonal approximation of  $C_\phi$
- Daubechies 3 wavelets
- sparse but no numerical efficient representation  $\tilde{A}$  of  $A$

## Atmospheric tomography operator in finite element basis:

- continuous piecewise bilinear functions for wavefronts and layers
- obtain a sparse representation  $\hat{A}$  of  $A$

Mapping between finite element and wavelet domains:

$$\mathbf{W} := \text{diag}(\delta_1 W, \dots, \delta_L W)$$

We want to solve:

$$(A^T C_\eta^{-1} A + C_\phi^{-1}) \phi = A^T C_\eta^{-1} s$$

Use clever transformations - dual domain discretization:

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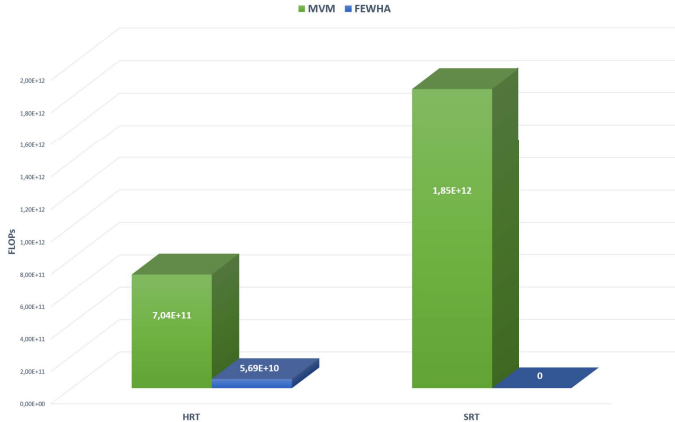
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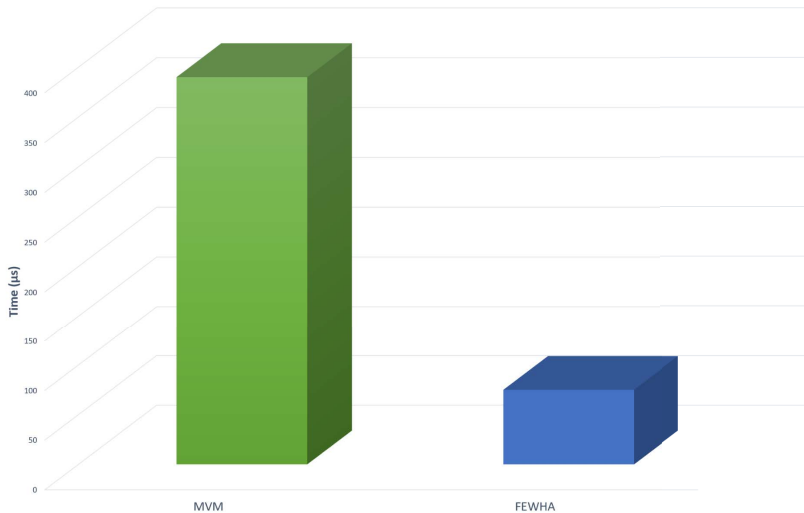
- first light instruments for the ELT
- designed to compensate for distortions caused by atmospheric turbulences
- using atmospheric tomography with MCAO
- collaboration with Microgate (responsible for RTC design)

<b>Mirrors:</b>	M4, M5 and DM1, DM2
<b>Guide Stars:</b>	6 LGS, 3 NGS
<b>WFS:</b>	12 WFS
<b>Number of WFS-HO slopes:</b>	9600
<b>Number of DOFs:</b>	6462
<b>Max frequency WFS-HO:</b>	500 Hz
<b>PR matrix update:</b>	360 s
<b>Size of PR matrix:</b>	6462 x 9600



- ⇒ FEWHA **12 times faster** than the MVM for hard real time
- ⇒ FEWHA has **no additional soft real time** computational load

**HRT Estimates**  
without Pipelining and Parallelization



**Assumption:** single precision (32 bit) floating point numbers

	MVM	FEWHA
Hard Real Time Memory Usage	3GB	15MB
Soft Real Time Memory Usage	50GB	-
	53GB	15MB

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## MVM:

- very slow for ELT-sized problems
- good parallelizable and pipelinable
- easy to implement on GPUs (common libraries available)

## FEWHA:

- really fast algorithm for ELT-sized problems
- based on iterative method
- not pipelinable
- high level of data exchange
- hard to parallelize and implement on GPU

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### Compare algorithms on RTC hardware:

- ⇒ parallel implementation of FEWHA on a Tesla V100
- ⇒ comparison of the two algorithms with parallelization and pipelining

### Challenge - bring FEWHA onto the GPU:

- **maximize bandwidth**  
use as much fast memory and as little slow-access memory as possible
- **minimize thread divergence**  
threads follow different execution paths
- **maximize hardware utilization**  
optimize number of used threads and blocks

# Thank you!

- [1] *M. Yudytskiy, T. Helin, R. Ramlau, A finite element - wavelet hybrid algorithm for atmospheric tomography.*
- [2] *C. Patauner, R. Biasi, M. Andrighettoni, G. Angerer, D. Pescoller, F. Porta, D. Gratadour, FPGA based microserver for high performance real-time computing in Adaptive Optics, AO4ELT5, 2017.*
- [3] *I. Foppiano, E. Diolaiti, P. Ciliegi, MAORY Adaptive Optics Real-Time Computer User Requirements.*
- [4] *Doucet N. , Gratadour D., Ltaief H., Efficient Supervision Strategy for Tomographic AO Systems on E-ELT.*
- [5] *CUDA C best practice guide.*



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