



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

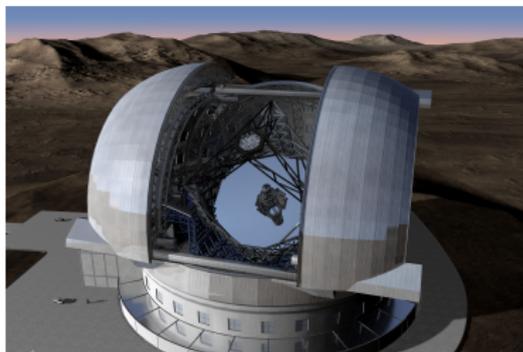


Funded by the European Union's Horizon 2020 research and innovation programme under the Marie Skłodowska-Curie Grant Agreement No. 765374.

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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



Credit: ESO

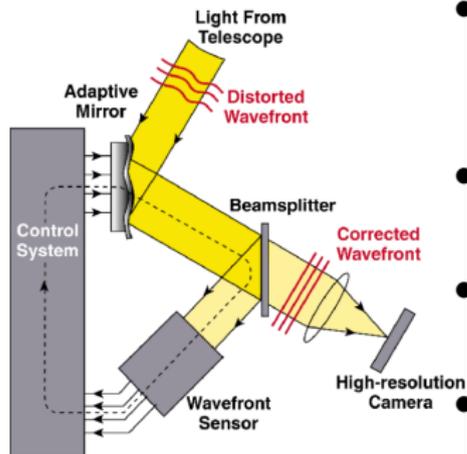
- Austrian scientific contribution:

Mathematical Algorithms and Software for ELT Adaptive Optics



ELT vs. the Pyramids (Credit: ESO)

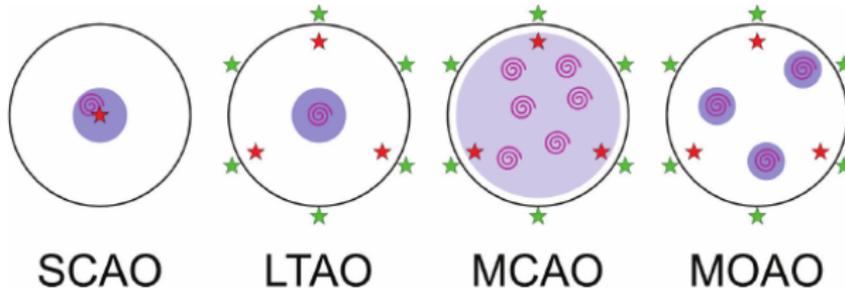
Technique that removes aberrations during the imaging process through deformable mirrors.



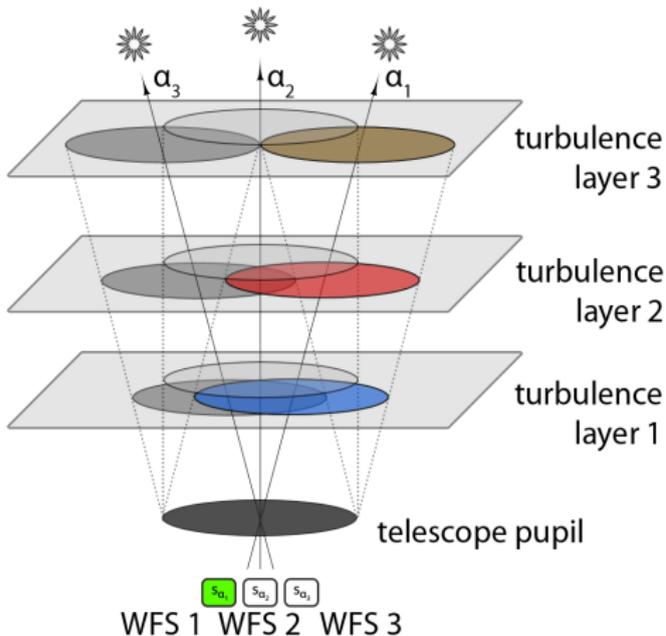
- light detected from reference sources (NGS, LGS) close to the astronomical object of interest
- WFS measure aberrations of the light caused by atmospheric perturbations
- **task of AO system:** remove distortions to allow a sharper view
- adaptive component - deformable mirror
- correction in real-time, 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_ϕ and C_η are the covariance matrices of layers ϕ and noise η .

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 ϕ

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_ϕ
- 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:

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

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:

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

Hard Real Time:

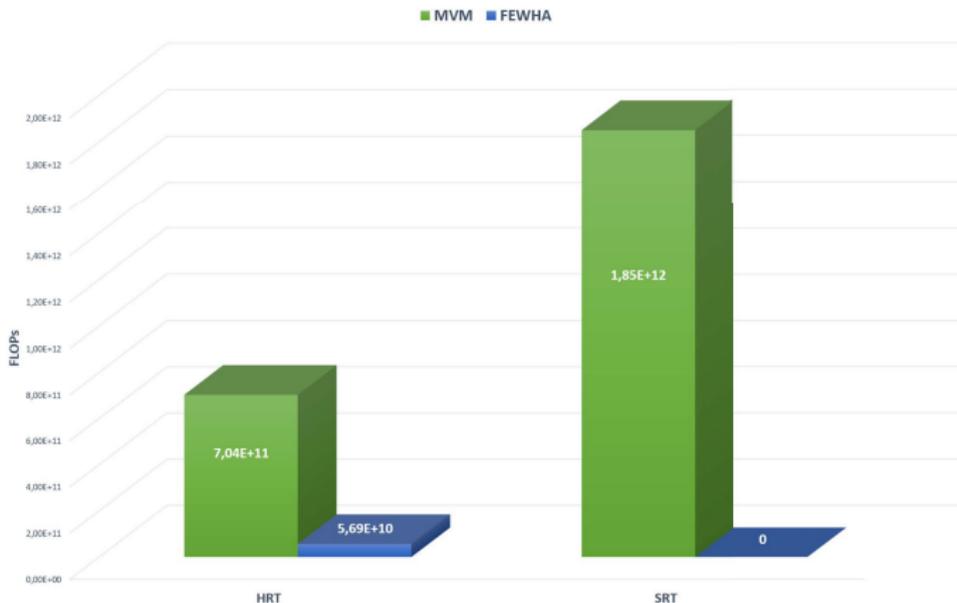
1. Compute right hand side: $b^n = \mathbf{W}^{-T} \hat{A}^T C_\eta^{-1} s$
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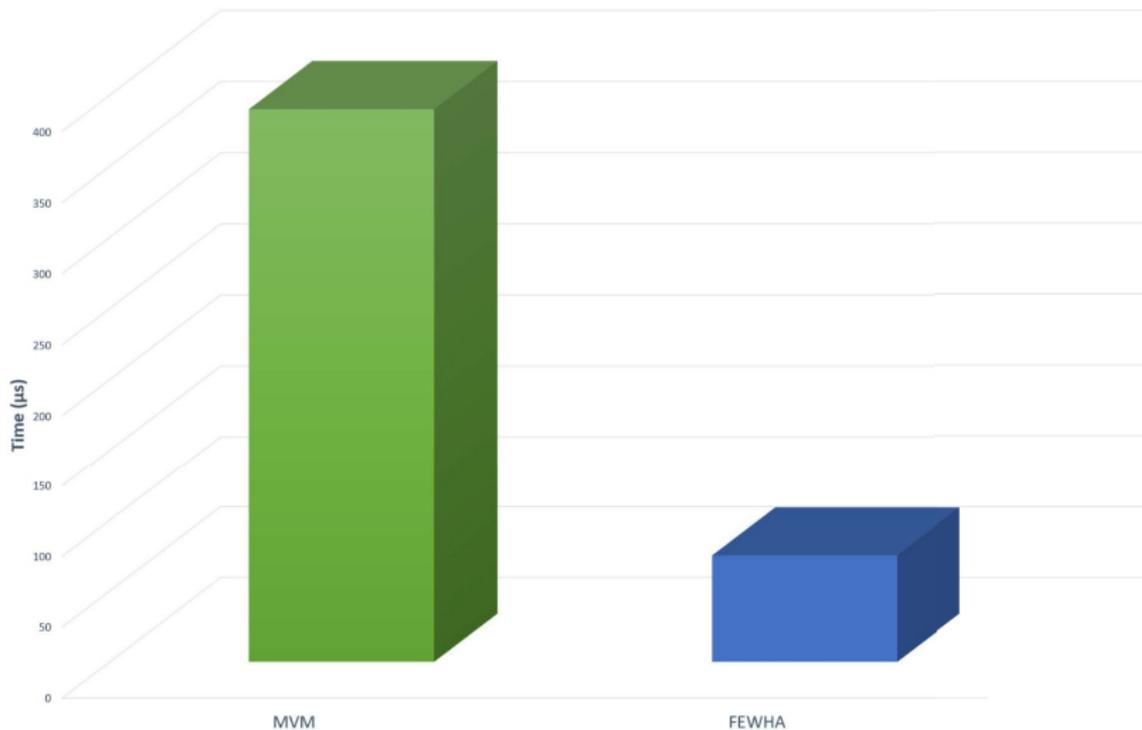
- first light instruments for the ELT
- designed to compensate for distortions caused by atmospheric turbulences
- using atmospheric tomography with MCAO
- collaboration with Microgate (responsible for RTC design)

Mirrors:	M4, M5 and DM1, DM2
Guide Stars:	6 LGS, 3 NGS
WFS:	12 WFS
Number of WFS-HO slopes:	9600
Number of DOFs:	6462
Max frequency WFS-HO:	500 Hz
PR matrix update:	360 s
Size of PR matrix:	6462 × 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.*
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- [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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