



A Comparison of Wind Velocity Predictions from Wind-Only and Thermally Coupled Simulations in Urban Models with Complex Terrain

GEO2021 | Geomatics Graduation Studio | MSc Geomatics

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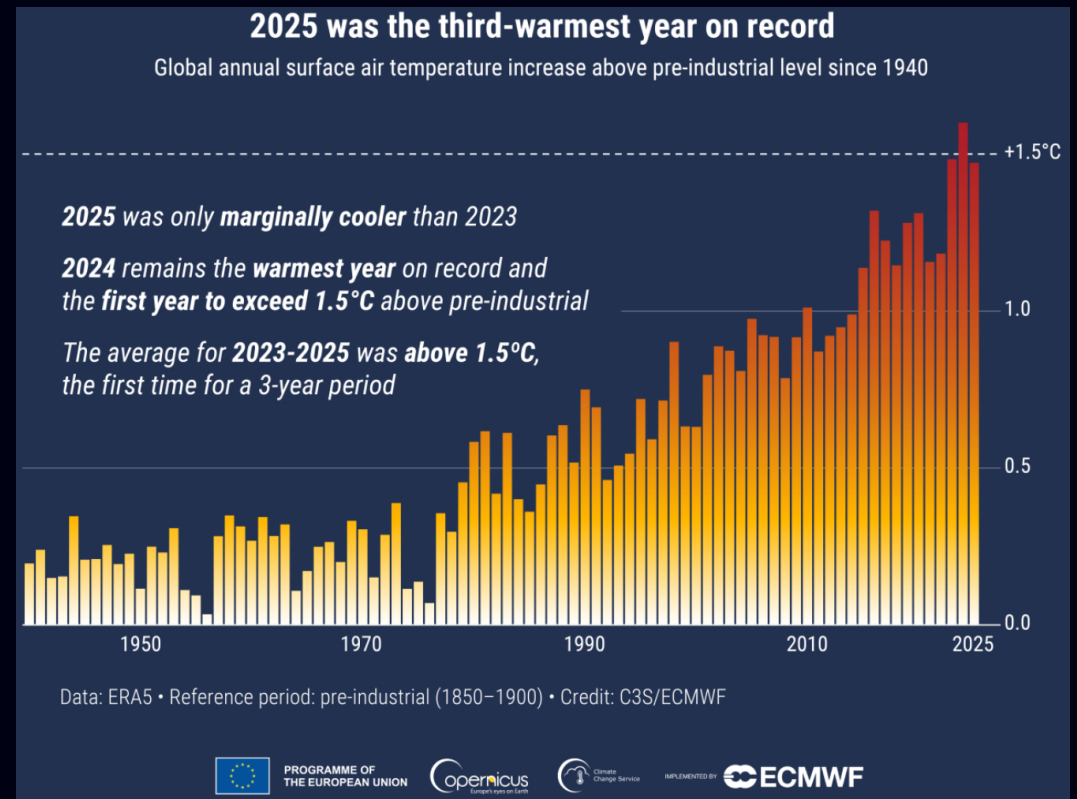
DELEGATE: Hugo Ledoux | TU Delft

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INTRODUCTION

- Frequency, duration and intensity of **heatwaves** will more and more increase (IPCC, 2023).
- Most of the global population is **living in cities**, where dense built environment tends to amplify temperatures
- So more and more people are exposed to **heat-related health risks** (WHO, 2024)



Source: Copernicus Climate Change Service (C3S)

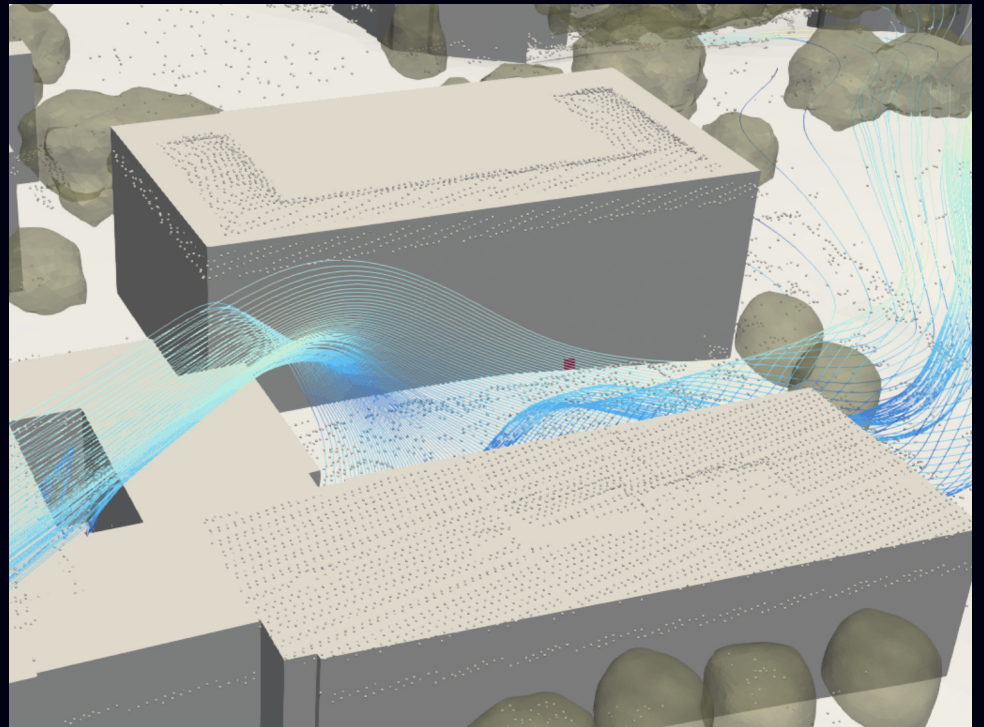
INTRODUCTION

In this context, UN-HABITAT highlights the importance of closing **urban climate data gaps** to enable evidence-based decision-making and attract investment

UN-Habitat - The United Nations Human Settlements Programme



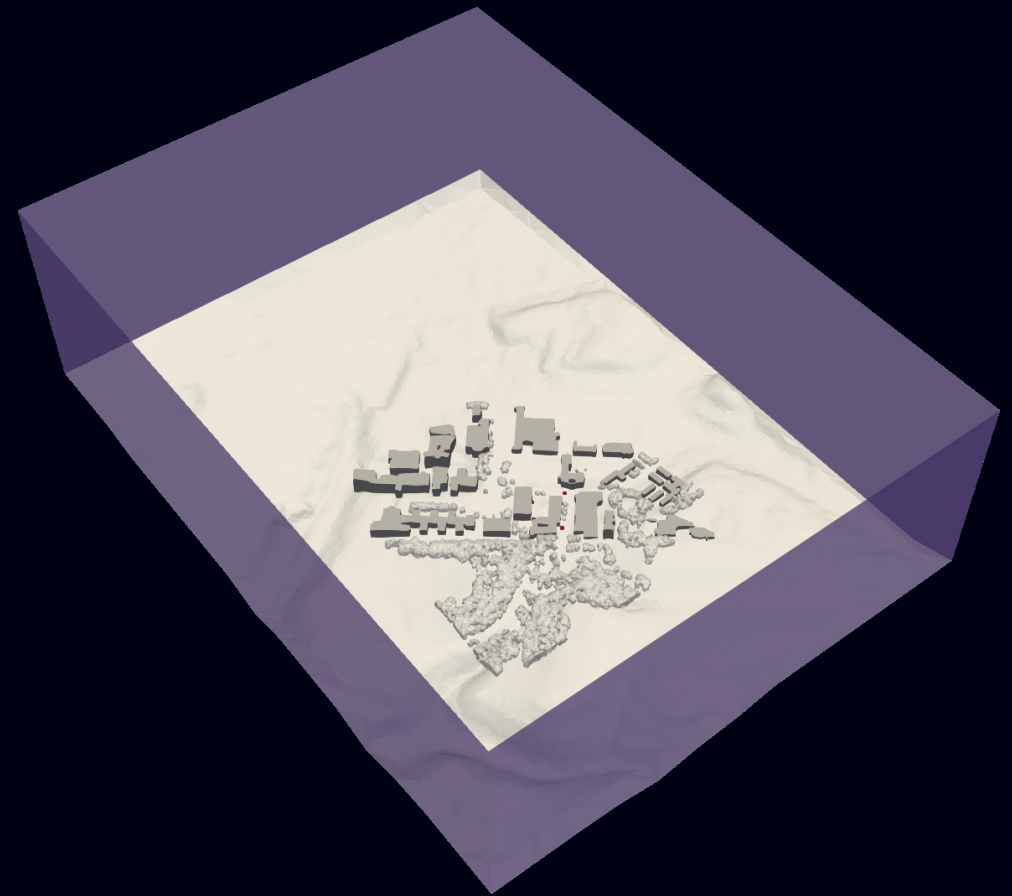
Urban Microclimate CFD studies can support closing these gaps



URBAN MICROCLIMATE CFD

Computational method to solve meteorological microclimate phenomena (e.g. turbulence, wakes, thermals).

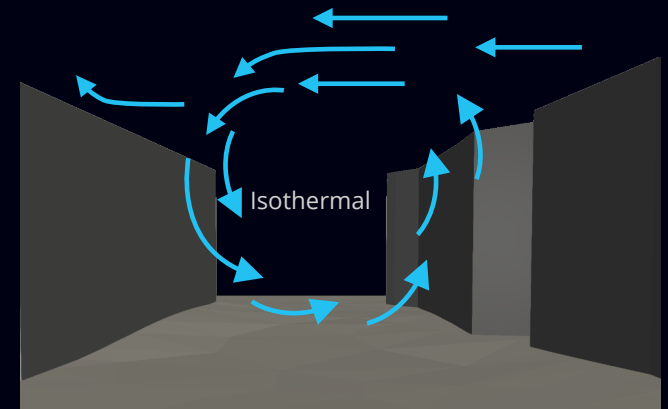
- within 2km-5km
- Using a 3D model of the air and solids



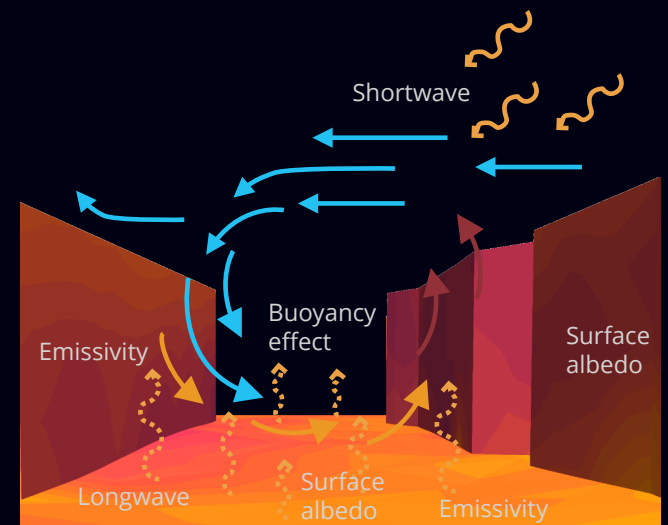
URBAN MICROCLIMATE CFD STUDIES

Two groups of studies

Treating the atmosphere as Isothermal (wind-only)



Treating the atmosphere as Non-Isothermal (Thermally coupled)

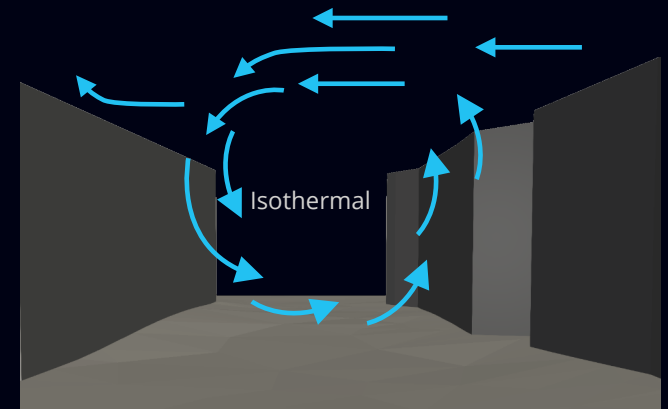


STATE OF THE ART - STUDIES

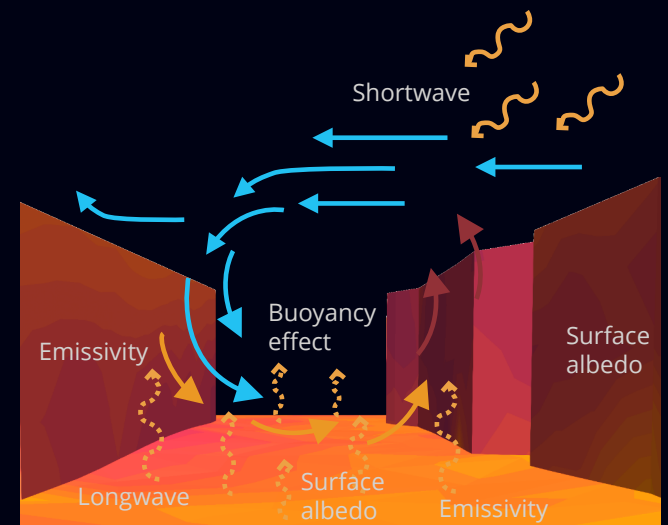
The majority of CFD studies treats the atmosphere as **isothermal**

... however, this assumption loses **validity during extreme heat events and calm summer days**

Isothermal Case
(wind-only)



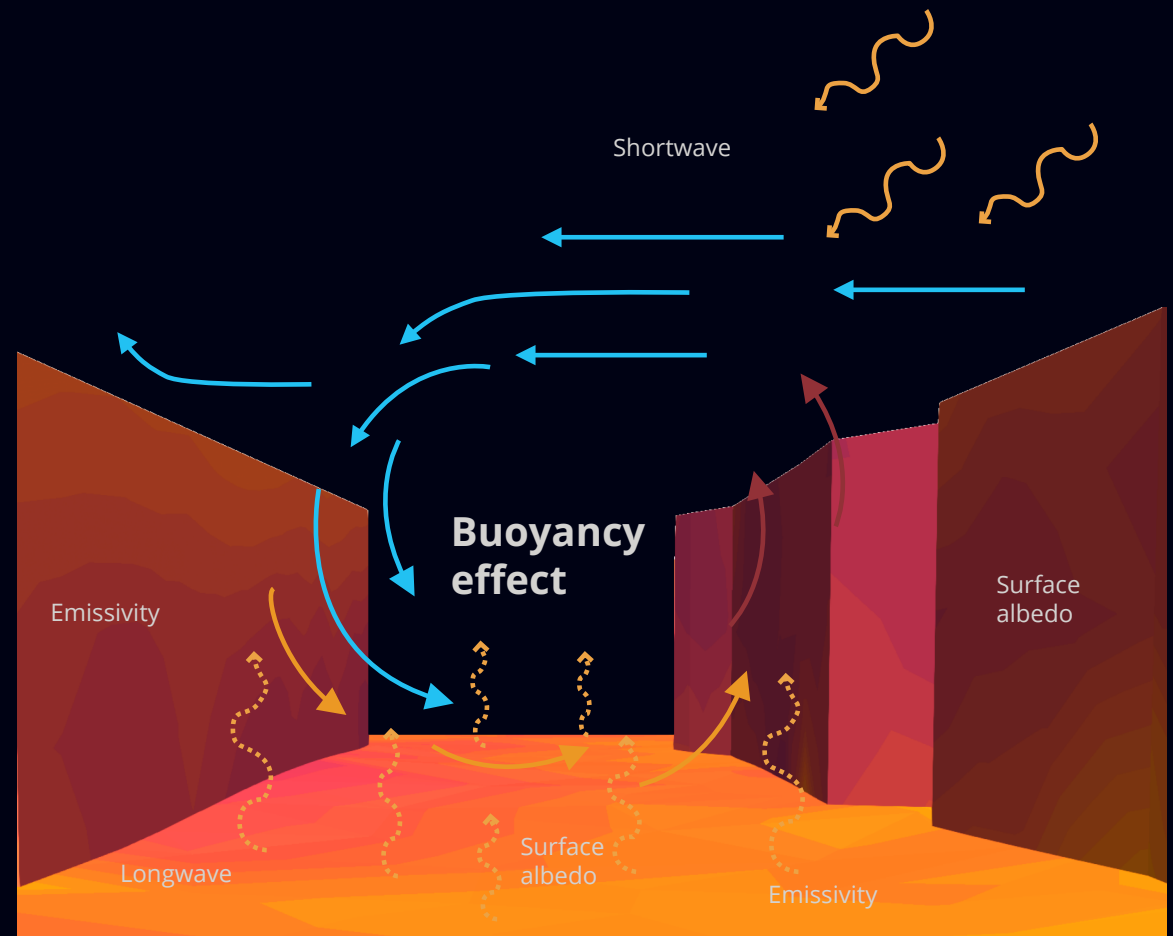
Non-Isothermal Case
(Thermally coupled)



BUOYANCY FORCING

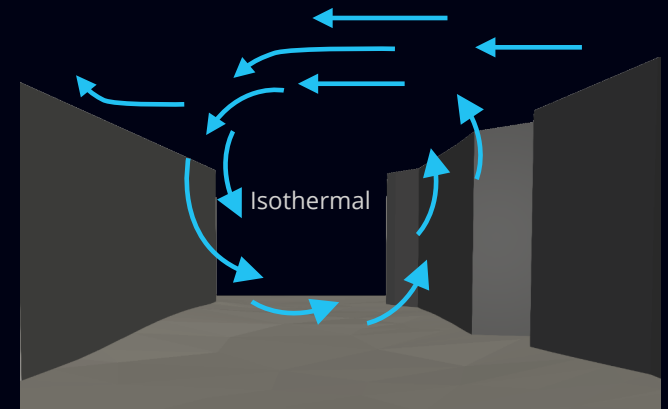
Effect generated by **hot urban surfaces (heated by solar gains or man-made heat)**

Warm air rises and cool air sinks.

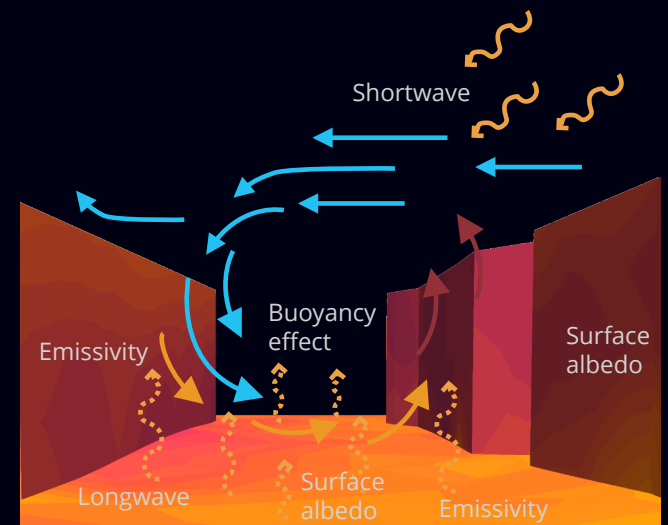
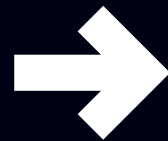


STATE OF THE ART - SOLVERS

simpleFoam (SF) wind only



urbanMicroclimateFoam (uMF) is an open-source solver offering the missing multiphysics formulations (Kubilay et al., 2017)

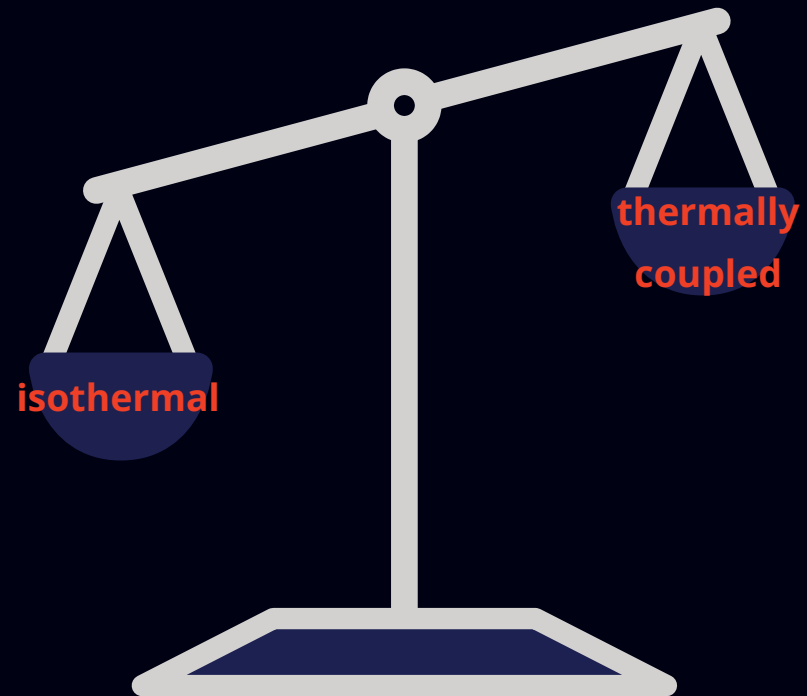


RESEARCH GAPS AND OBJECTIVES

It is unclear under which conditions **wind-only simulations would be sufficient**



Compare simulation types
when buoyancy is non-negligible

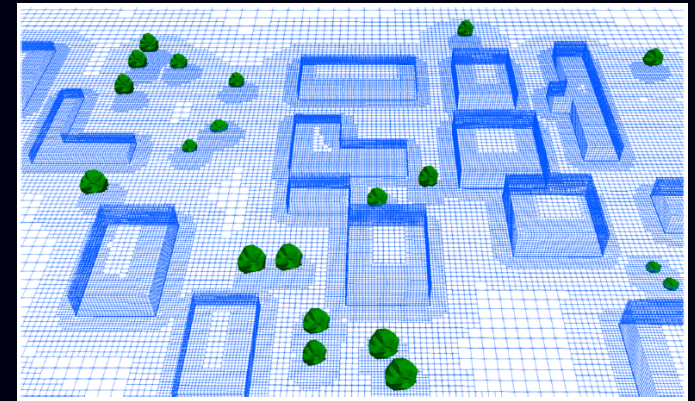


RESEARCH GAPS AND OBJECTIVES

published applications of uMF to realistic urban models including **complex geometry, especially terrain** are scarce



Evaluate the **feasibility of urbanMicroclimateFoam** when applied to a **realistic urban model with complex terrain**



Source: Rahimi et. al., 2025

RESEARCH QUESTIONS

1. How feasible is the **application of urbanMicroclimateFoam to realistic urban models** that include non-flat terrain, given current geometric reconstruction and meshing tools?
2. How do mesh requirements, solver parameters, and **computational demands differ between urbanMicroclimateFoam and** the wind-only solver **simpleFoam** when applied to the same case study?
3. How do wind-speed predictions from **simpleFoam** compare to those of **urbanMicroclimateFoam** when both are evaluated against field measurements from four stations over a one-hour window under a single inflow condition during a representative heatwave?

RESEARCH CASE-STUDY

Carnegie Mellon University campus
in Pittsburgh - US

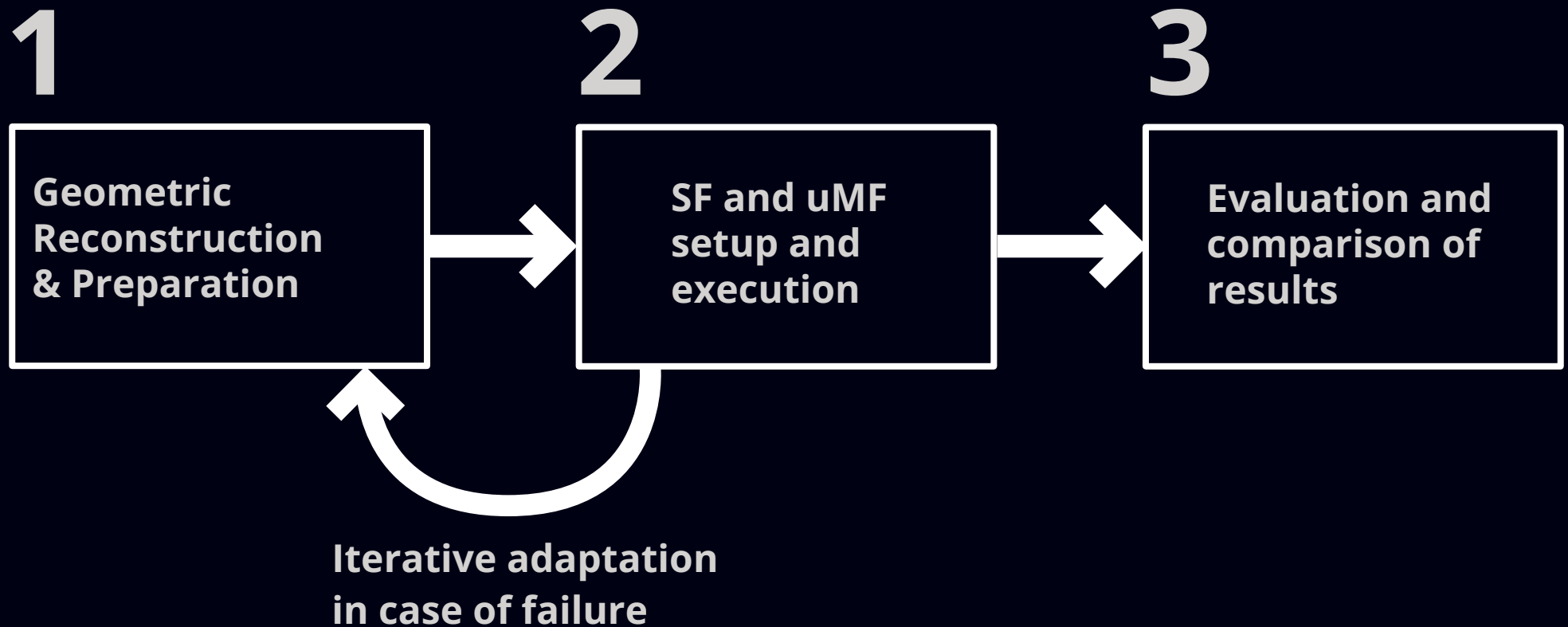
- Meteorological Observations during a heatwave in 2024 - MORICHI
- detailed geospatial data (point clouds, polygons)
- pronounced terrain variation (83m)



RESEARCH CASE-STUDY



METHODOLOGY

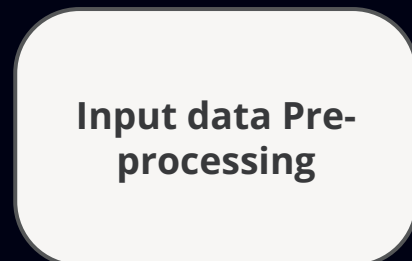


METHODOLOGY

1



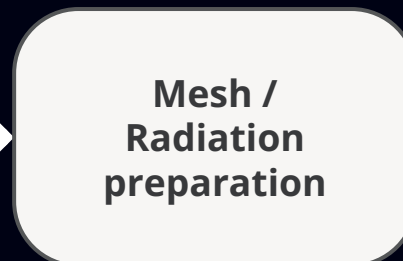
1.1



1.2



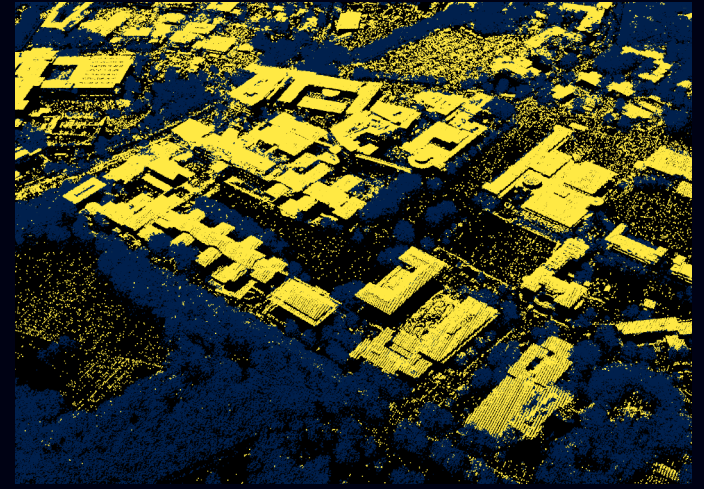
1.3



INPUT DATA PREPROCESSING

1

**Geometric
Reconstruction
& Preparation**



1.1

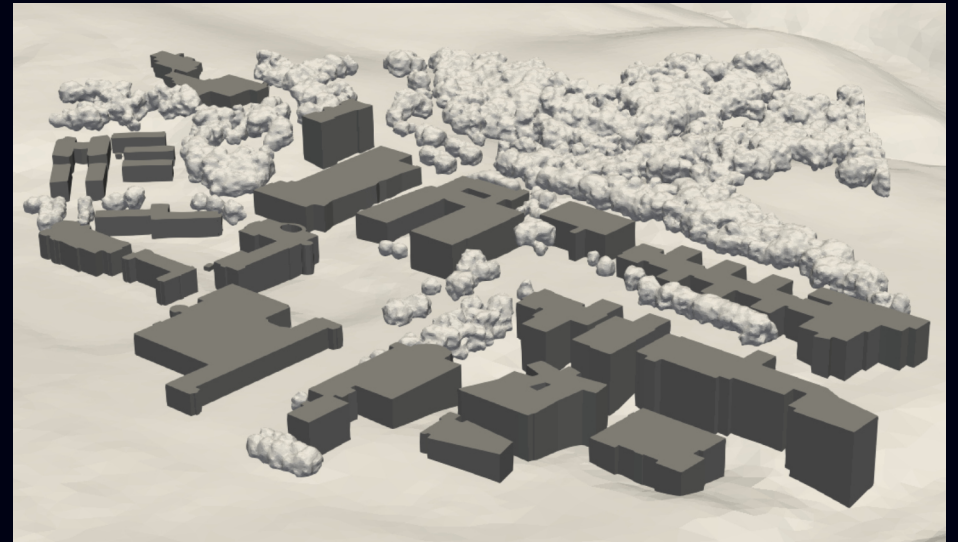
**Input data Pre-
processing**



GEOMETRIC RECONSTRUCTION

1

**Geometric
Reconstruction
& Preparation**



1.1

1.2

**Input data Pre-
processing**

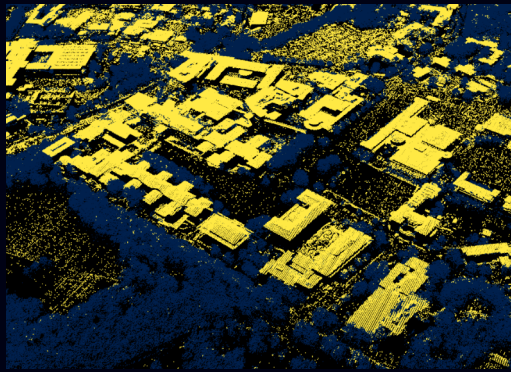


**Surface Mesh
Reconstruction**

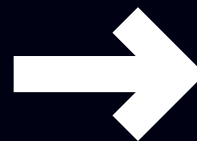
GEOMETRIC RECONSTRUCTION

Automated pipelines exist to build base models (City4CFD)

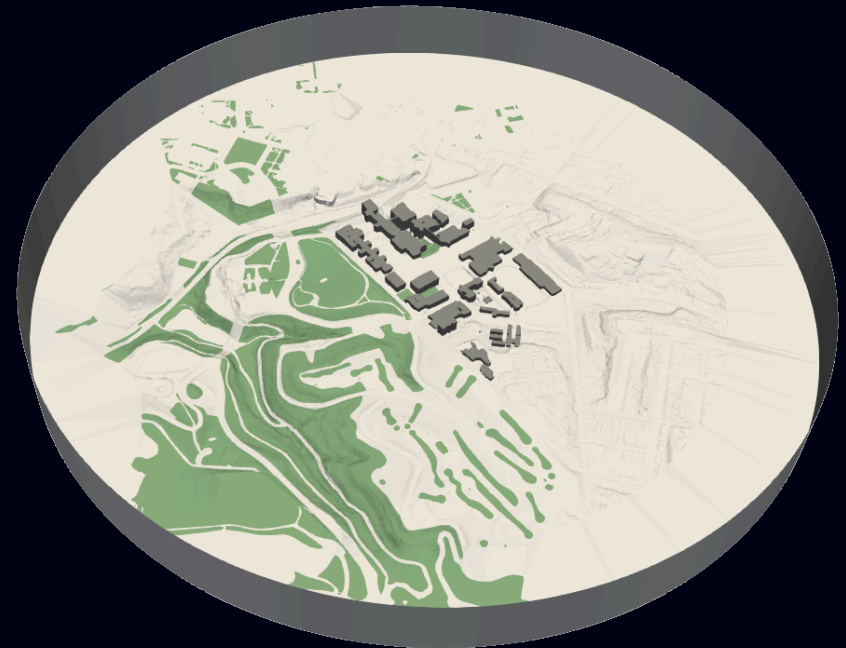
Point-clouds



2D geometry



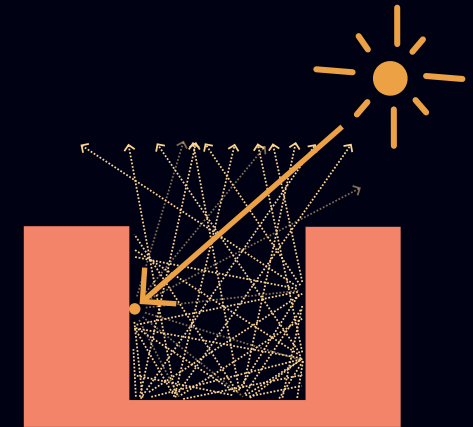
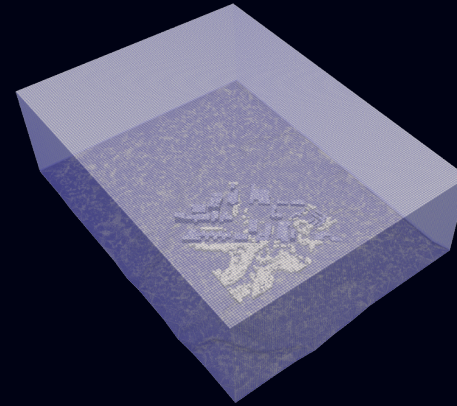
Simulation ready 3D model



PREPARATION STEPS

1

**Geometric
Reconstruction
& Preparation**



1.1

**Input data Pre-
processing**



1.2

**Surface Mesh
Reconstruction**



1.3

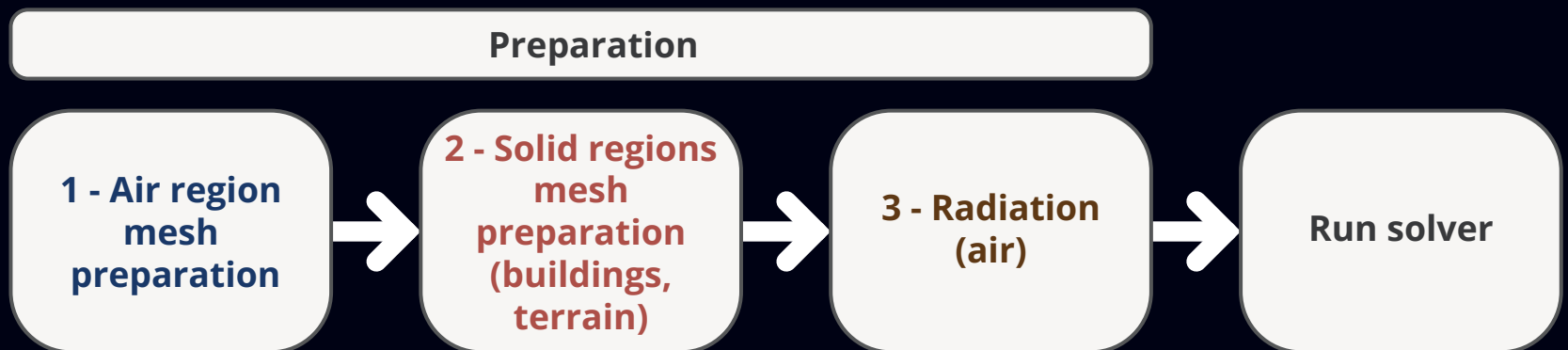
**Mesh /
Radiation
preparation**

PREPARATION STEPS

SimpleFoam - wind-only



urbanMicroclimateFoam - multiphysics

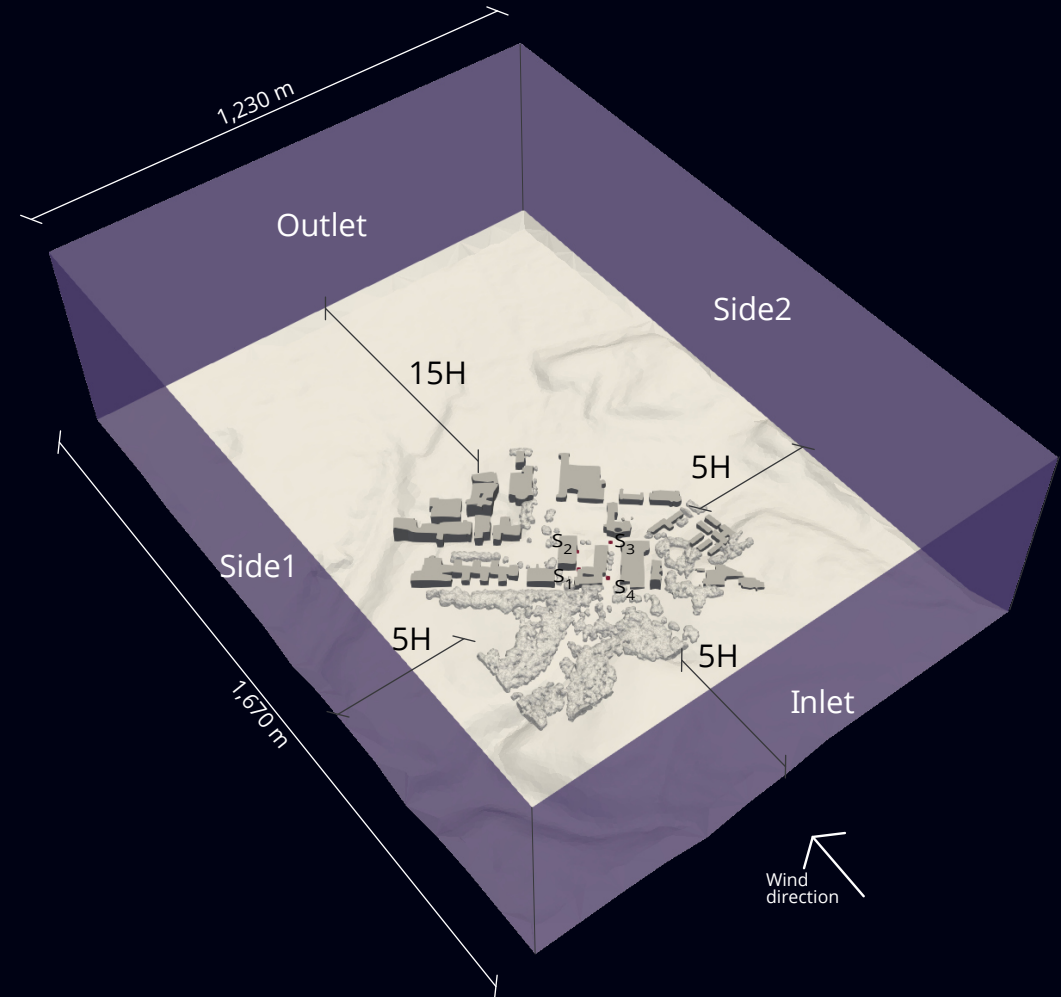
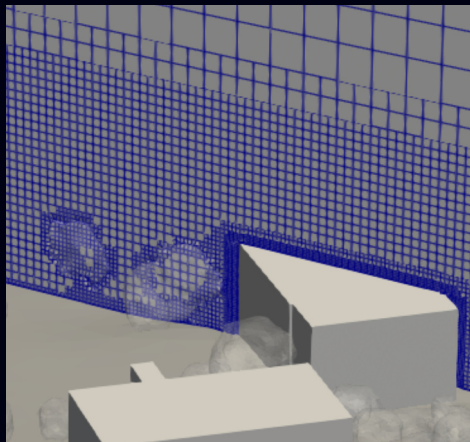


MESH CONSTRUCTION

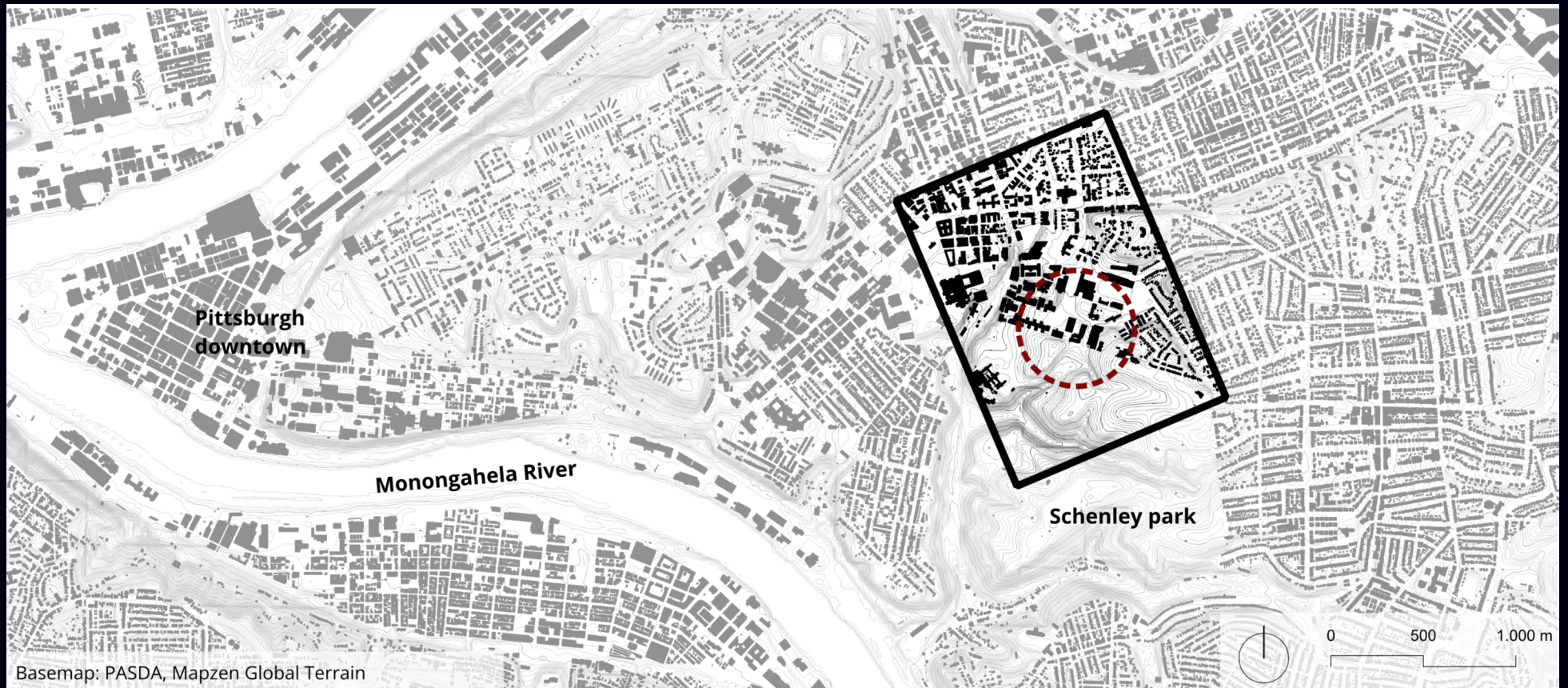
1.3

1 - Air region mesh preparation

- COST732 guidelines domain size
- 16 Million cells



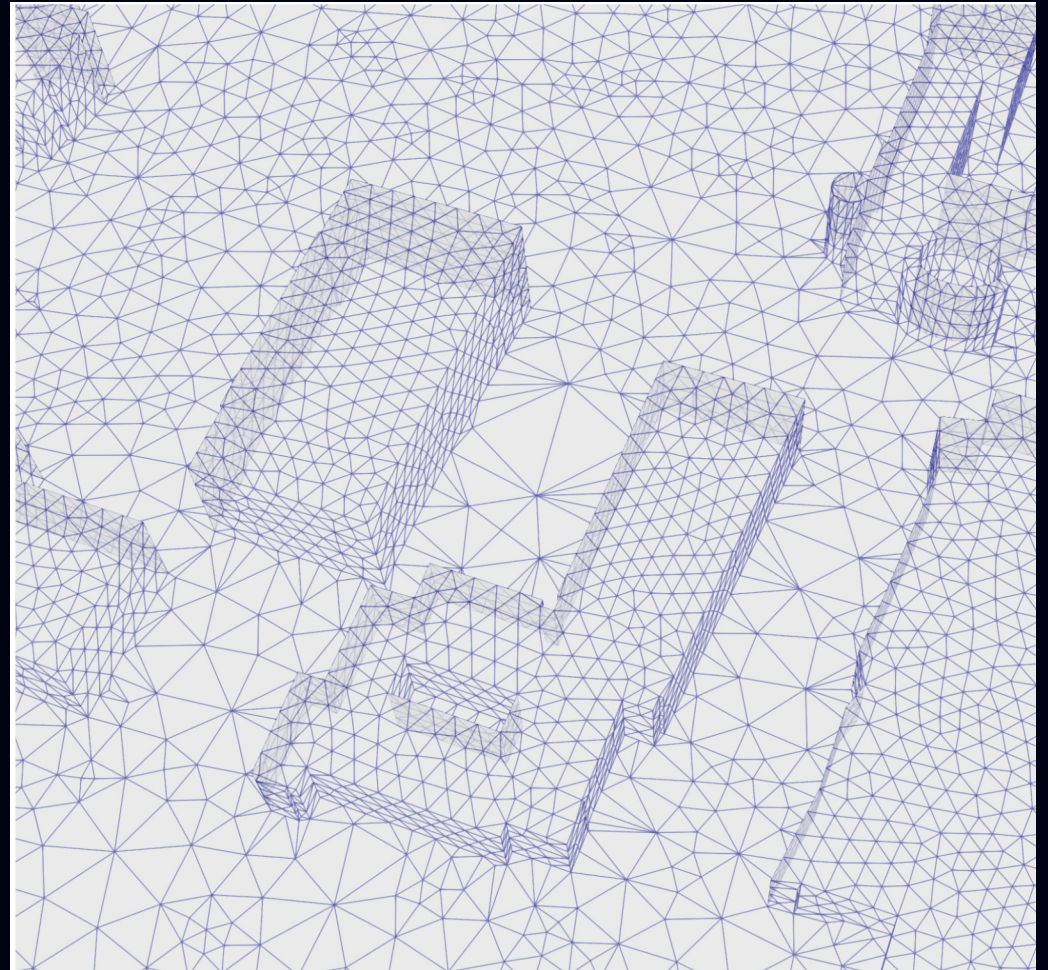
MESH CONSTRUCTION



RESULTING MESHES

1.3

2 - Solid regions
- mesh
preparation
(buildings,
terrain)



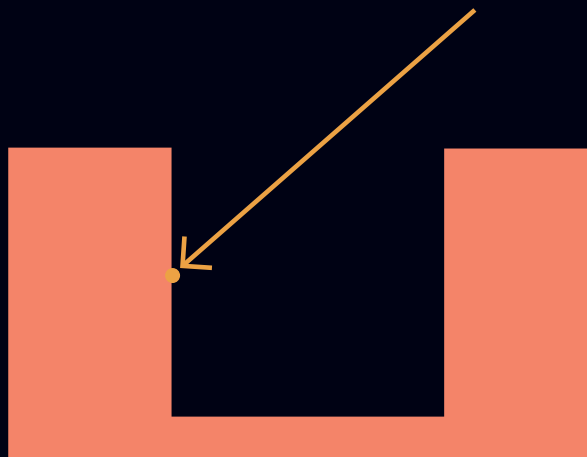
RADIATION PREPARATION

1.3

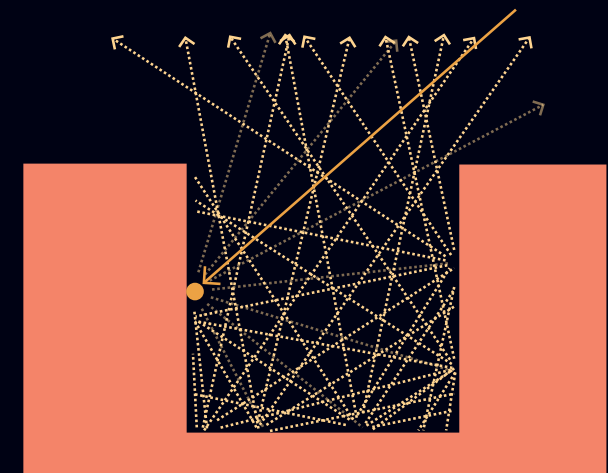
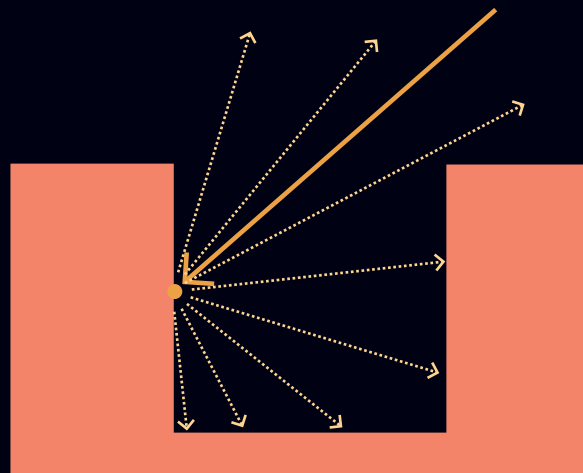
3 - Radiation preparation (air)

Ray tracing

Incoming sun light

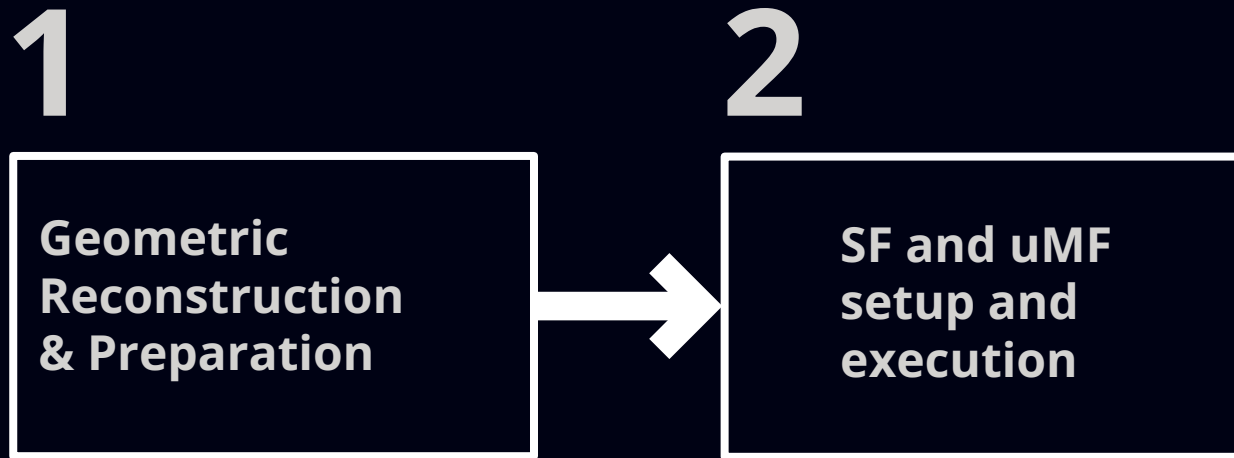


Surface thermal radiation



Source: Oke, 2017.

METHODOLOGY



MODEL SETUP CRITERIA

2

**SF and uMF
setup and
execution**

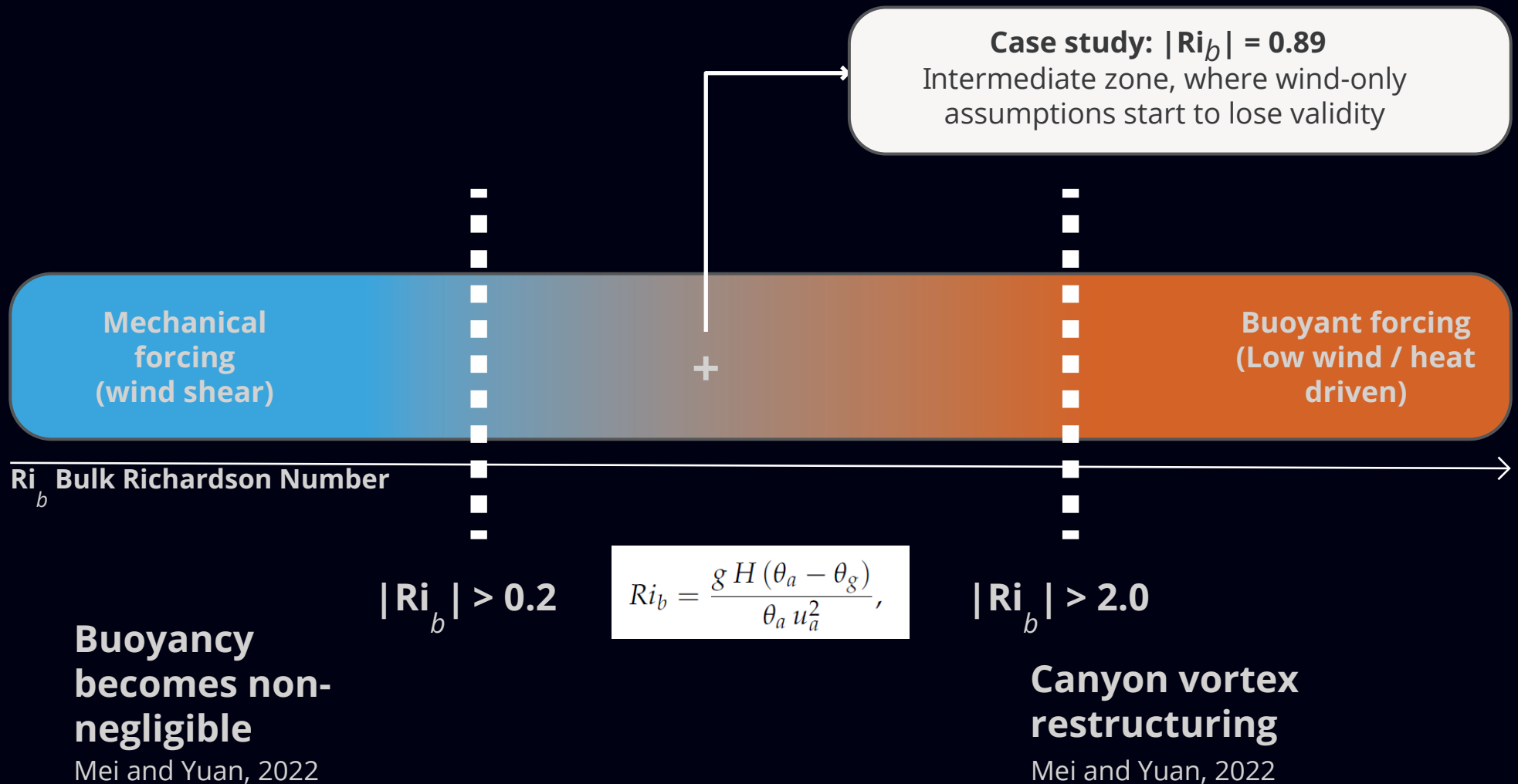
Criteria:

- Hottest day (MORICHI, 2025)
- Minimal wind-direction variability (Iowa Environmental Mesonet ASOS stations, 2026).

Time window

- 27th August 2024
- 13:00 to 14:00
- Inflow 157° azimuth
- 1.6 m/s

MODEL SETUP



METHODOLOGY



PERFORMANCE ASSESSMENT & VALIDATION

3

**Evaluation and
comparison of
results**

- Wind speed comparison: **Dimensionless statistical indicators** recommended by Sabatino et al. (2011), Chang and Hanna (2004)

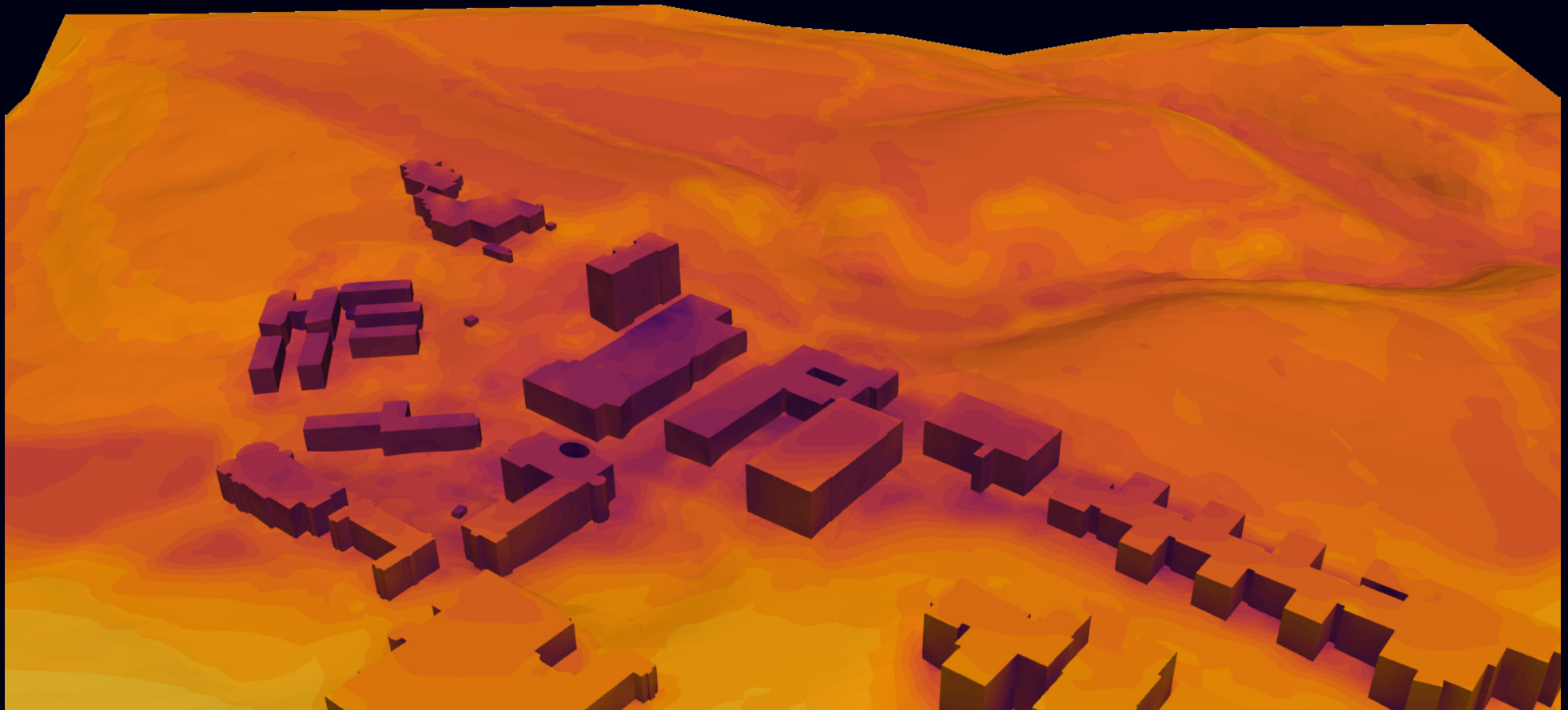
RESULTS

RESEARCH QUESTION 1

Feasibility of urbanMicroclimateFoam to realistic urban models with terrain

RESEARCH QUESTION 1

Achievable...



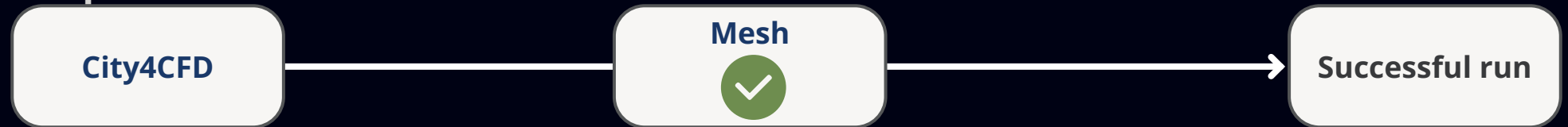
RESEARCH QUESTION 1

...however, it is subject to **several constraints**.

FEASIBILITY OF APPLICATION

The model that performed well in SF...

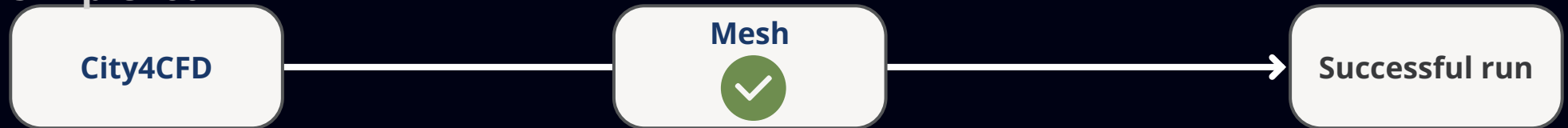
SimpleFoam



FEASIBILITY OF APPLICATION

... could not be used directly with uMF; **the transition required progressive adaptation** of the geometry to achieve numerical stability.

SimpleFoam



urbanMicroclimateFoam



Face
pyramid
errors

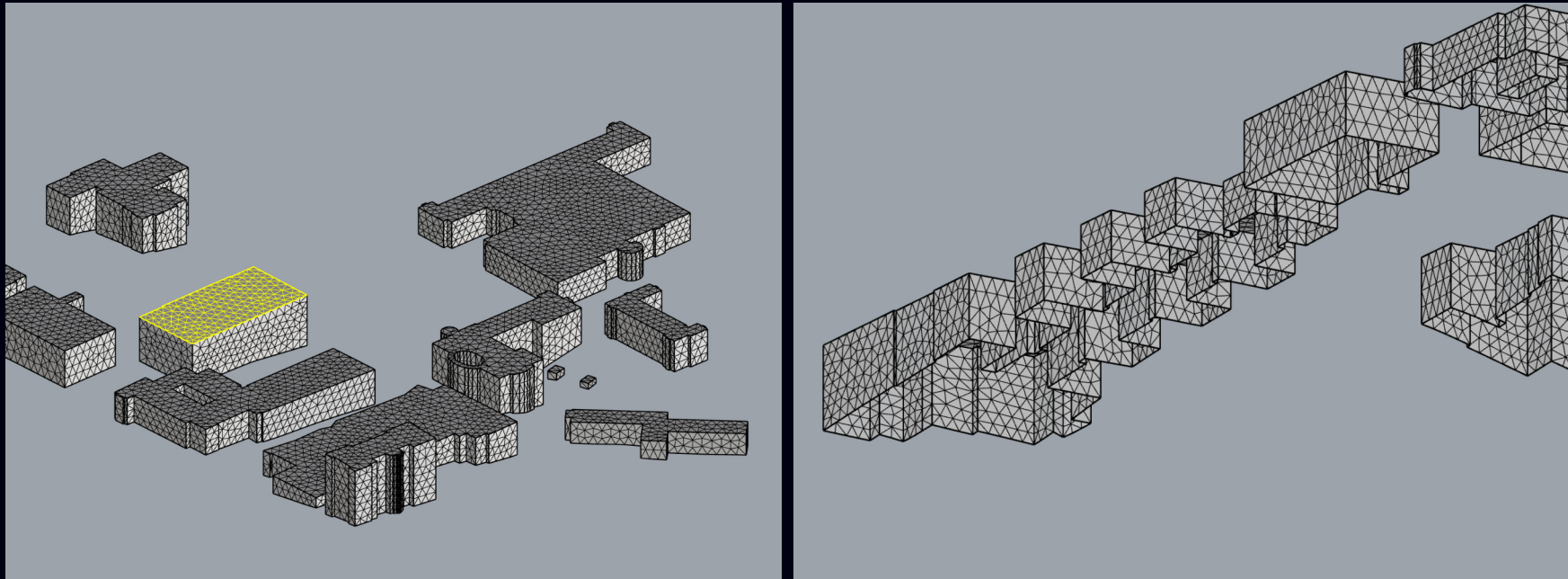
Sliver
Faces non-
orthogonal.

Topological
gaps

Non-
manifold
face Agglom

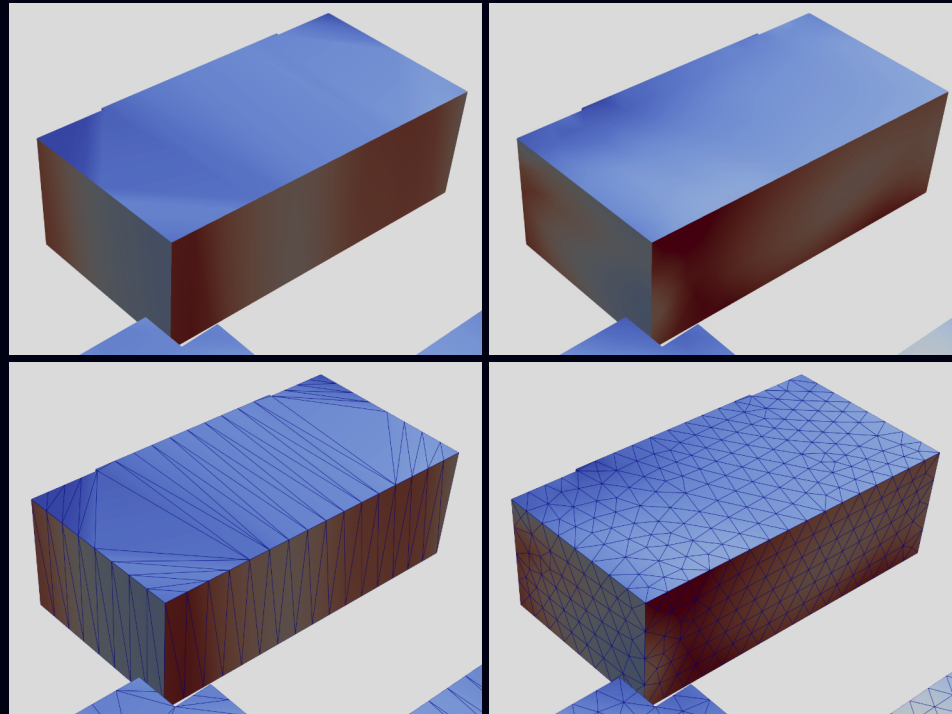
Radiation
failure

FEASIBILITY OF APPLICATION



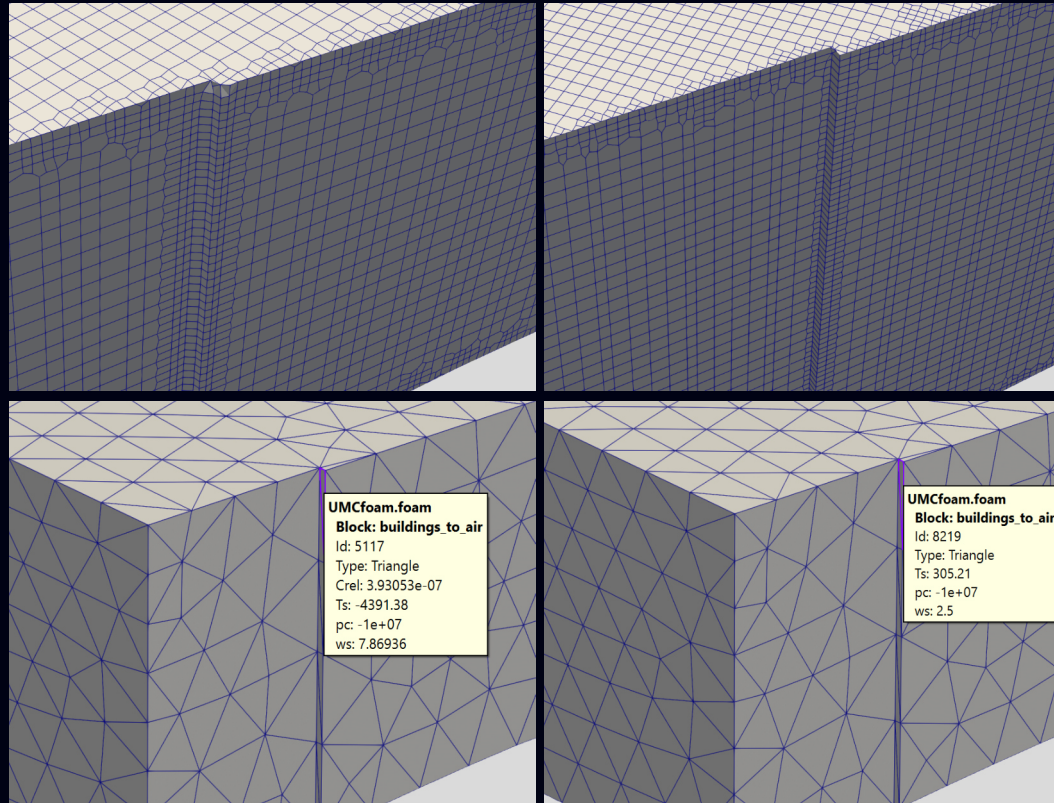
Separation of surfaces, removal of bottom faces and party walls for the radiation step

FEASIBILITY OF APPLICATION



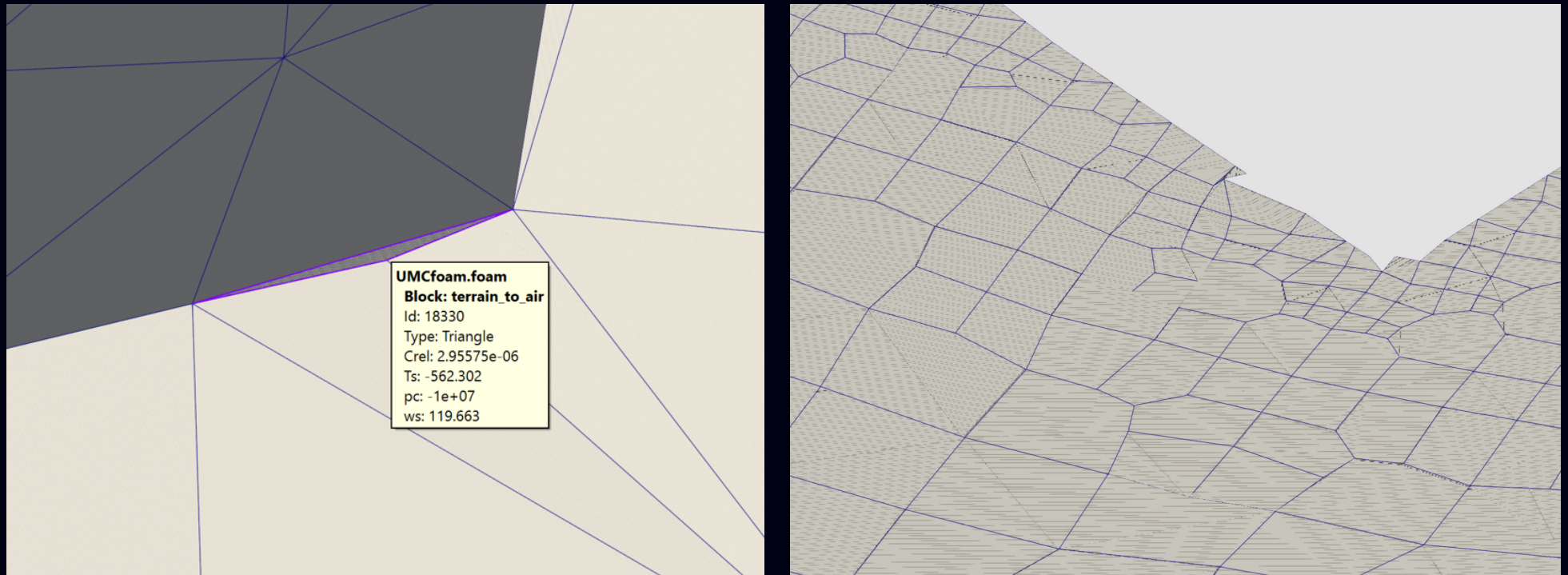
Mesh refinement to refine results and avoid instability

FEASIBILITY OF APPLICATION



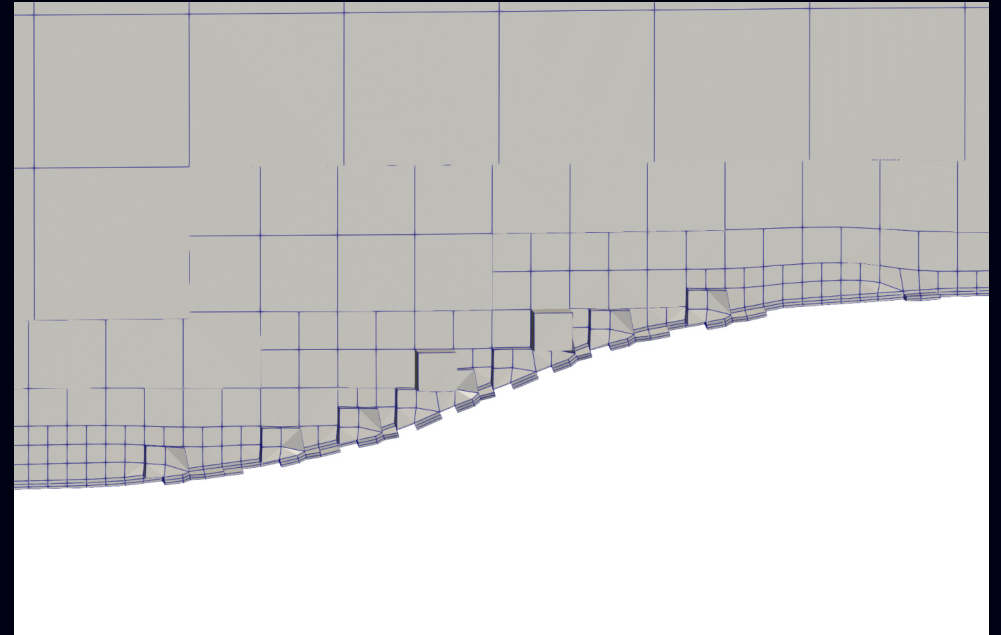
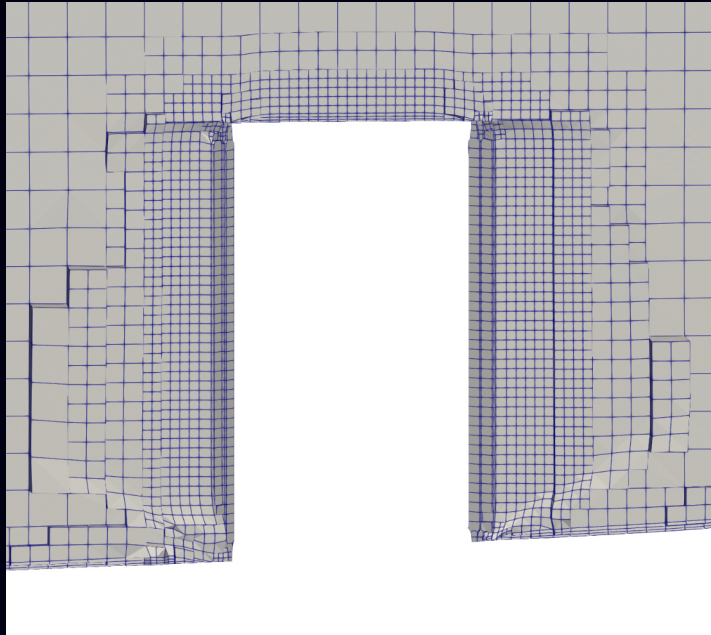
Finer cells to avoid numerical instability

FEASIBILITY OF APPLICATION



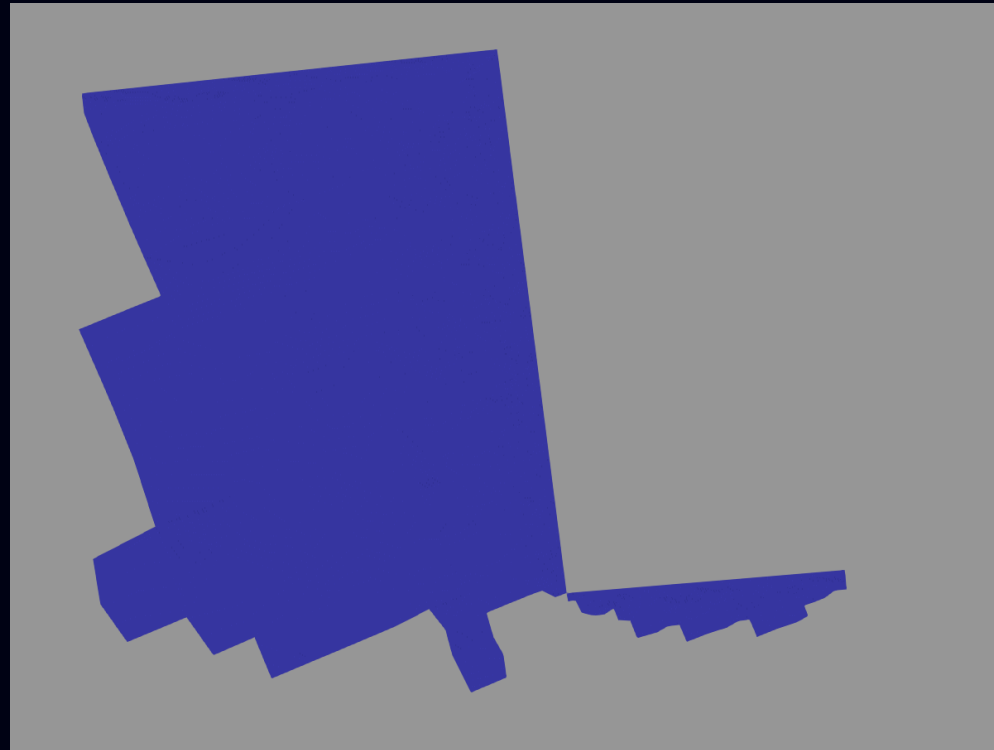
Finer cells to avoid numerical instability

FEASIBILITY OF APPLICATION



Existing imperfections (non-orthogonality) in the mesh can break the **faceAgglomerate** algorithm's capacity of finding neighbouring faces

FEASIBILITY OF APPLICATION

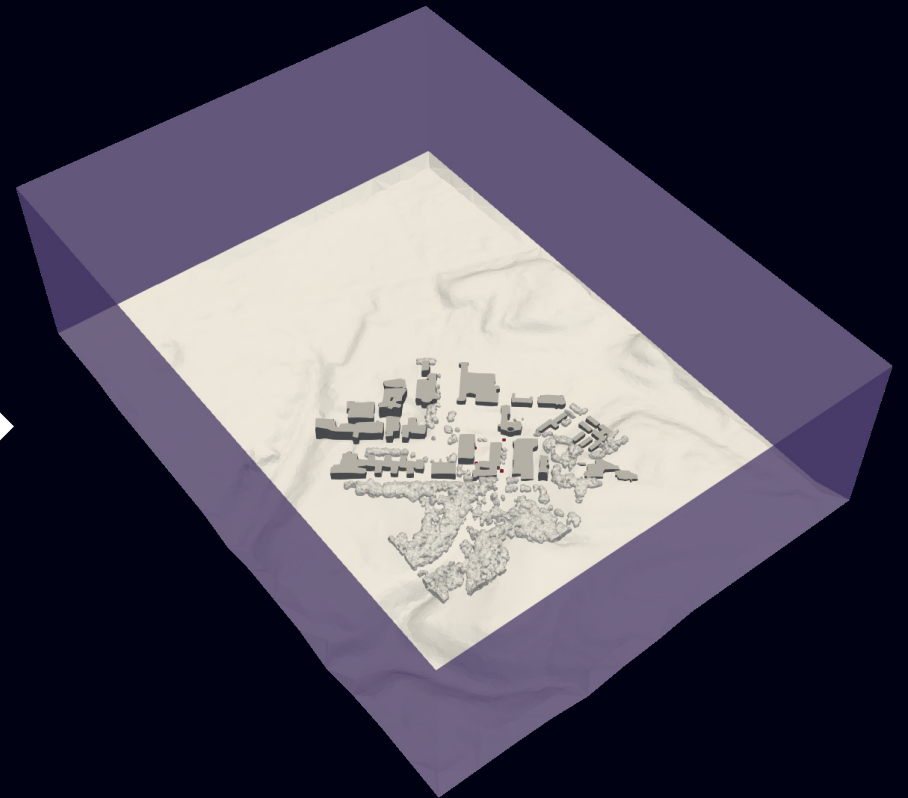
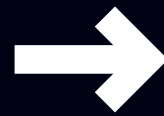


faceAgglomerate can create non-manifold agglomeration (viewFactorsGen step fail)

FEASIBILITY OF APPLICATION



Boundary conditions formulations
not adaptable to circular domains



Constrained to one direction

FEASIBILITY OF APPLICATION

Together, these preprocessing steps are very time demanding, consuming most of the preparation and setup time.

RESEARCH QUESTION 2

Time and computational demand differences

On identical geometry and 20 cores, uMF took 3.6× longer than SF (6 h 28 min versus 1 h 49 min)



SF

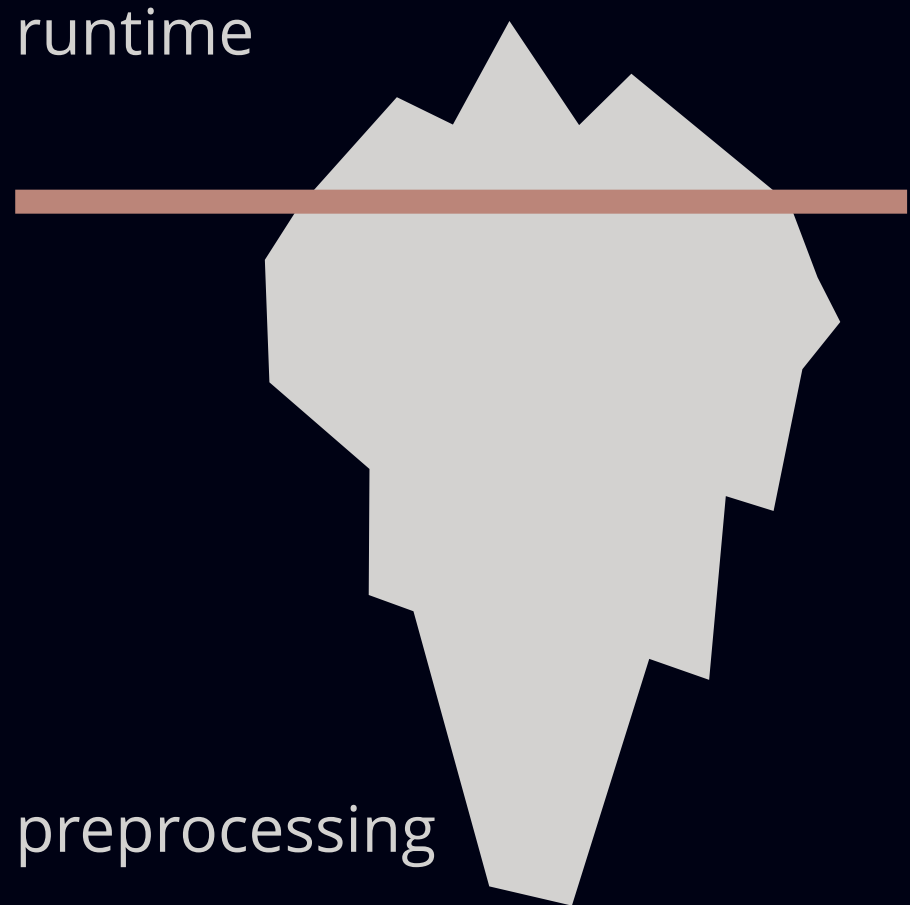


uMF

COMPUTATIONAL DEMANDS

The time cost remains within the **same order of magnitude as SF**. It does not represent a barrier to the usage of the solver.

The barriers identified in RQ1, manual geometric correction, trial-and-error pre-processing, **consume far more time in the study**



RESEARCH QUESTION 3

Wind-speed predictions comparison

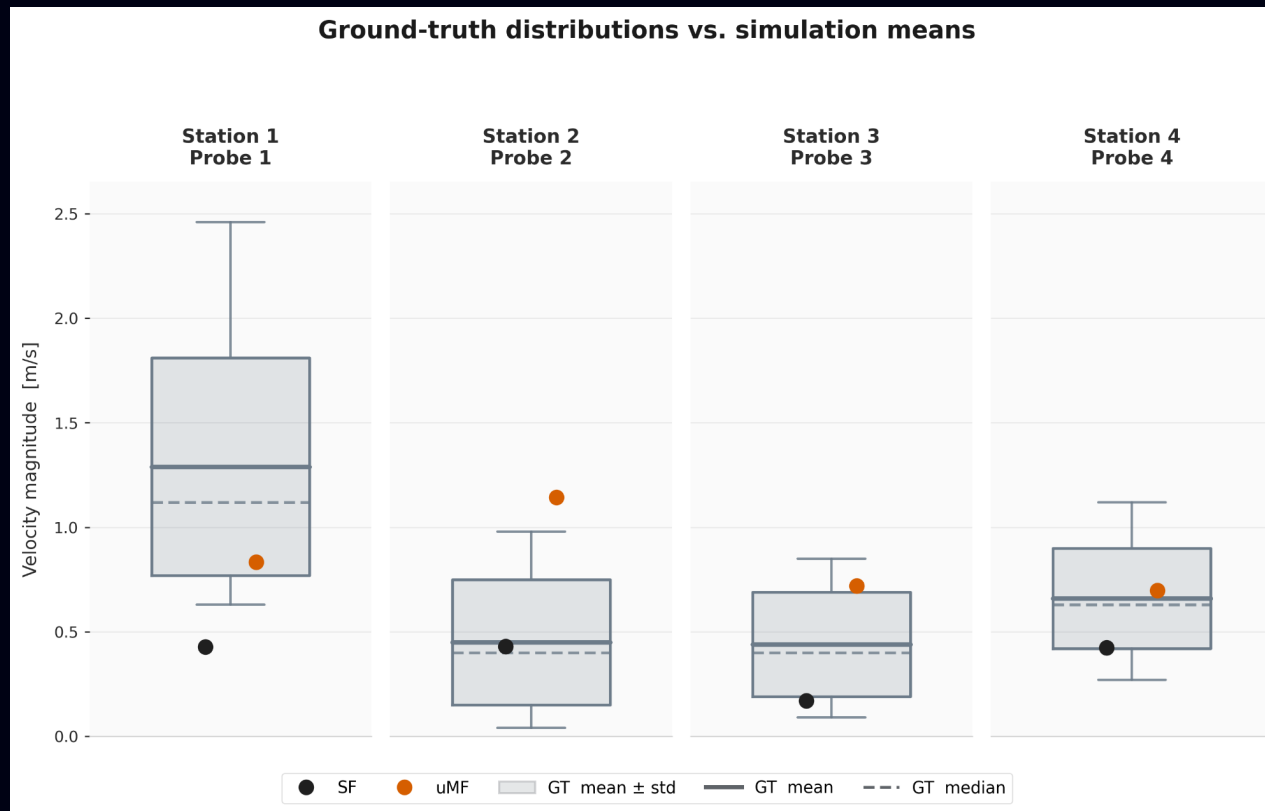
RESEARCH QUESTION 3

Wind-speed predictions comparison

In the regime studied here, uMF improved wind-speed predictions over SF.

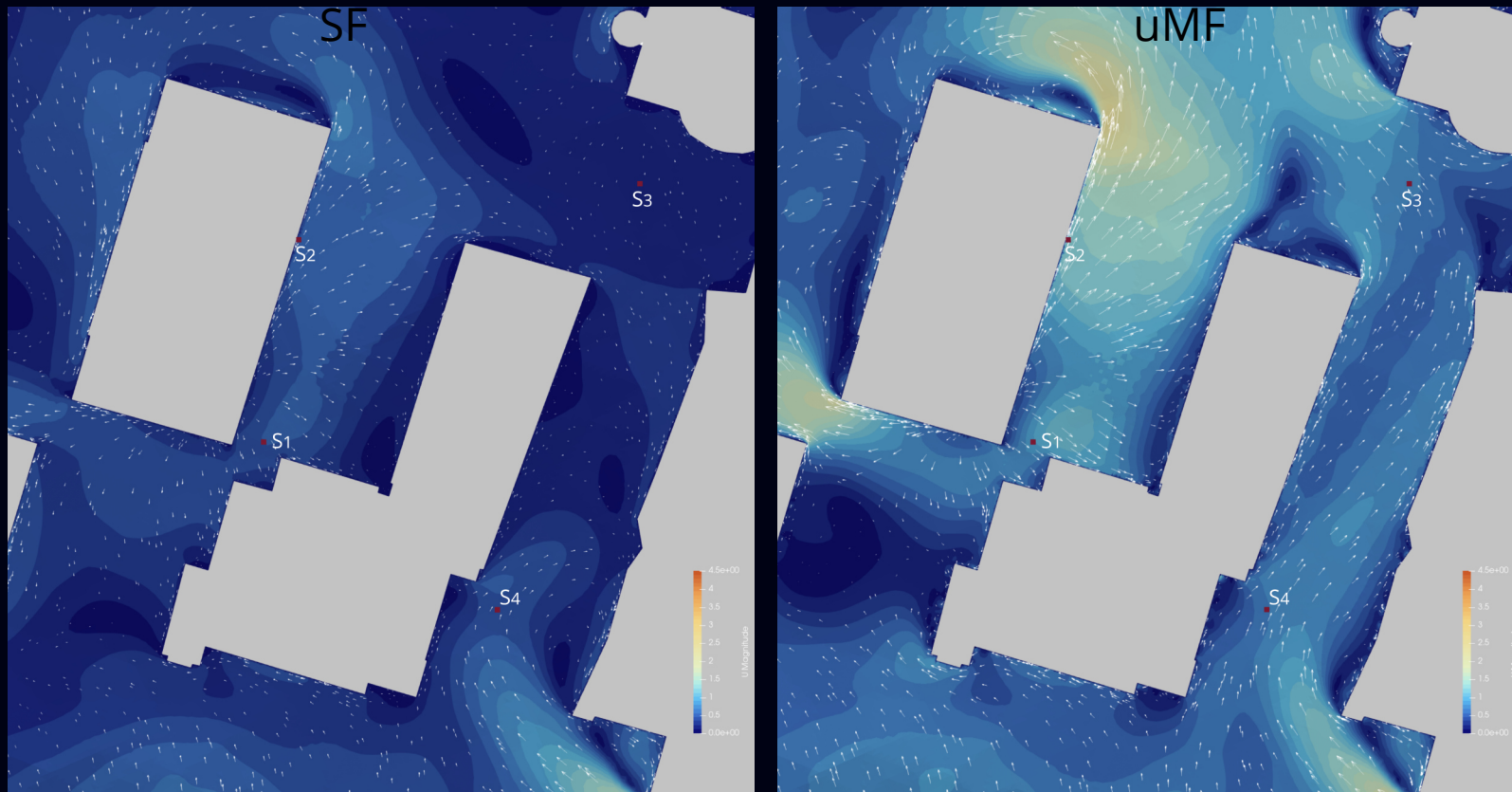
WIND-SPEED PREDICTION COMPARISON

Average improvement of 71% from SF to uMF .



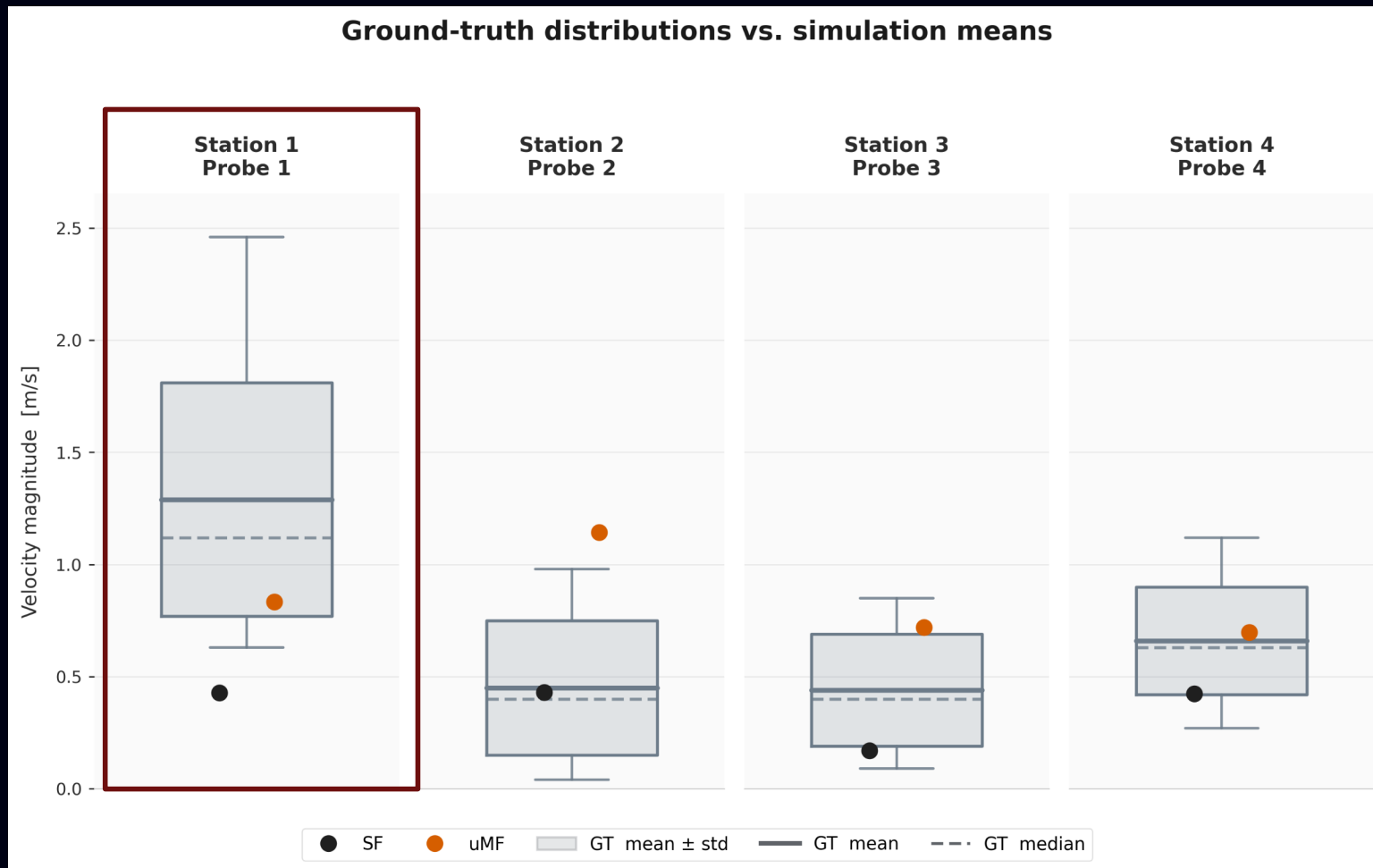
Distributions of the 5-minute measurements for the simulated hour (minimum, maximum, mean, median, standard deviation). Simulation predictions are overlaid as markers.

WIND-SPEED PREDICTION COMPARISON



SF tends to under-predict wind speed, while uMF tends to over-predict (height 1.8m)

STATION 1

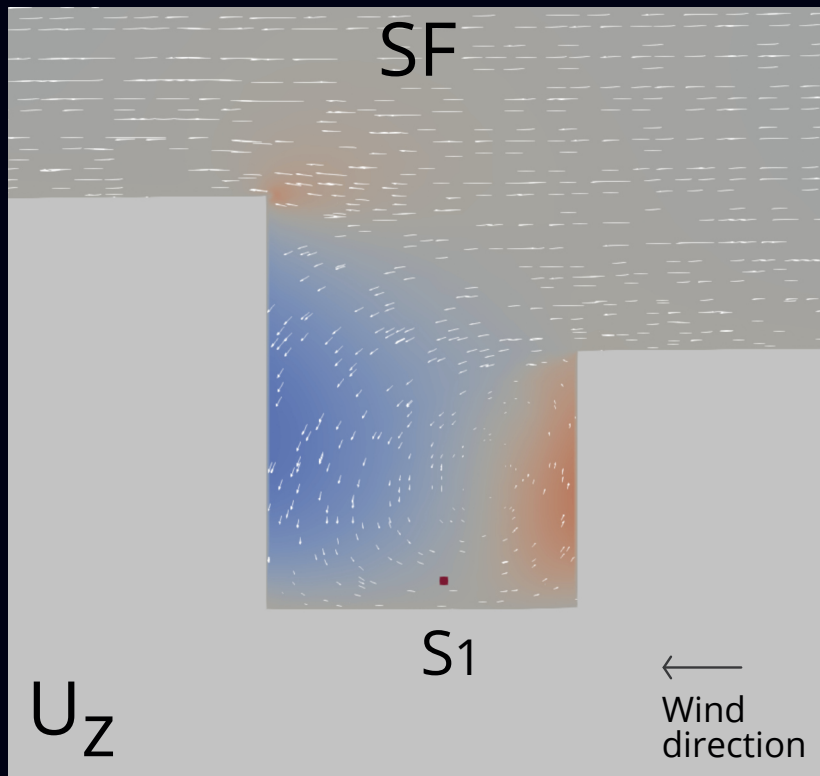


STATION 1

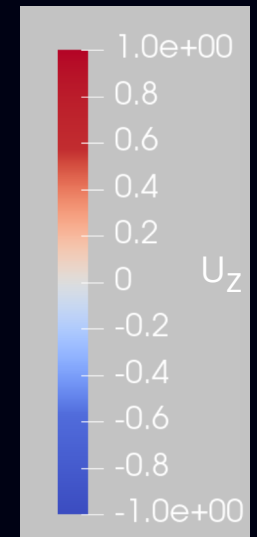
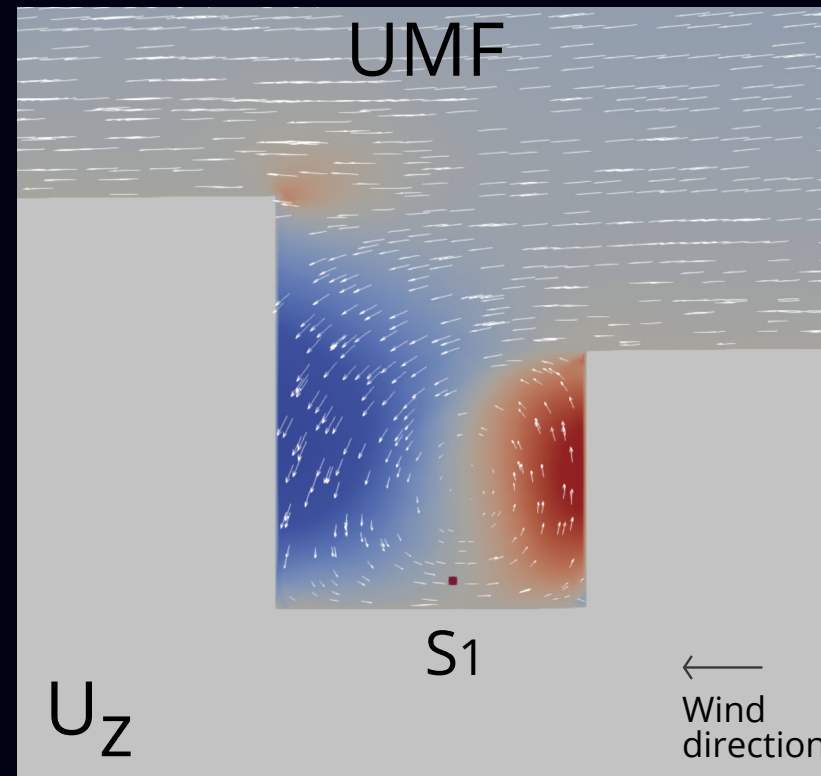
Strong vertical motion is evidence of buoyancy contributing non-negligibly to the flow at this location



Vertical velocity component U_z

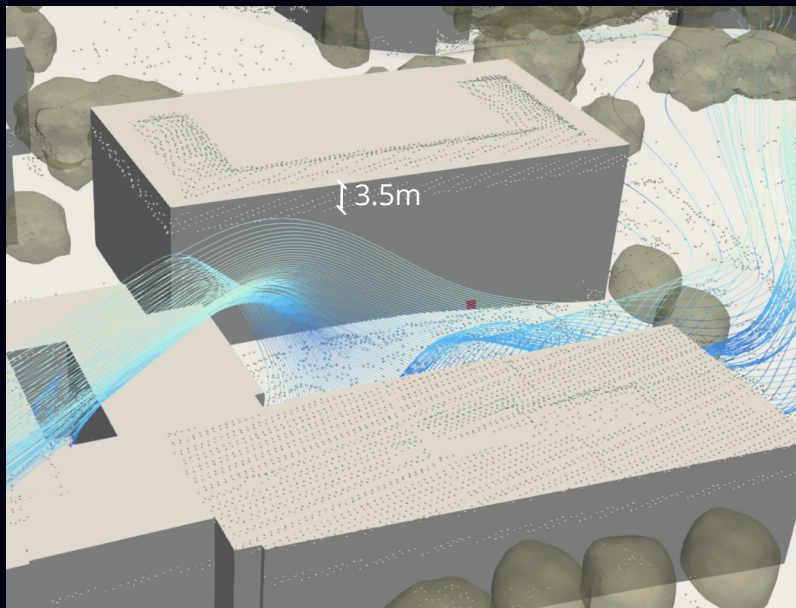


Vertical velocity component U_z



WIND-SPEED PREDICTION COMPARISON

Discrepancies can be explained by geometric simplification, among other simplifications



LIMITATIONS

Single one-hour window
under one inflow direction

Anemometer accuracy (± 0.89
m/s) and range starting at
0.89m/s

Simplified building
reconstruction LoD 1.2

Simplified Vegetation
representation (e.g. missing
evapotranspiration)

Simplified Material
and Solid thickness

RECOMMENDATIONS

Single one-hour window
under one inflow direction

**Simulate longer time
windows**

Anemometer accuracy (± 0.89
m/s) and range starting at
0.89m/s

**Simulate time windows with
higher wind forcing**

Simplified building
reconstruction LoD 1.2

**Development of robust
preparation utilities for
realistic geometry**

Simplified Vegetation
representation (e.g. missing
evapotranspiration)

Use VEG module

Simplified Material
and Solid thickness

CONCLUSION: WHEN IS UMF WITH COMPLEX GEOMETRY WORTH THE COST?

Is the regime one in which buoyancy matters?
Can the analyst absorb the case-setup overhead?

However...

a robust conclusion would **require mitigating the limitations of this study**

THANK YOU, QUESTIONS?

MODEL SETUP DECISIONS

2

**SF and uMF
setup and
execution**

RAD - Radiation

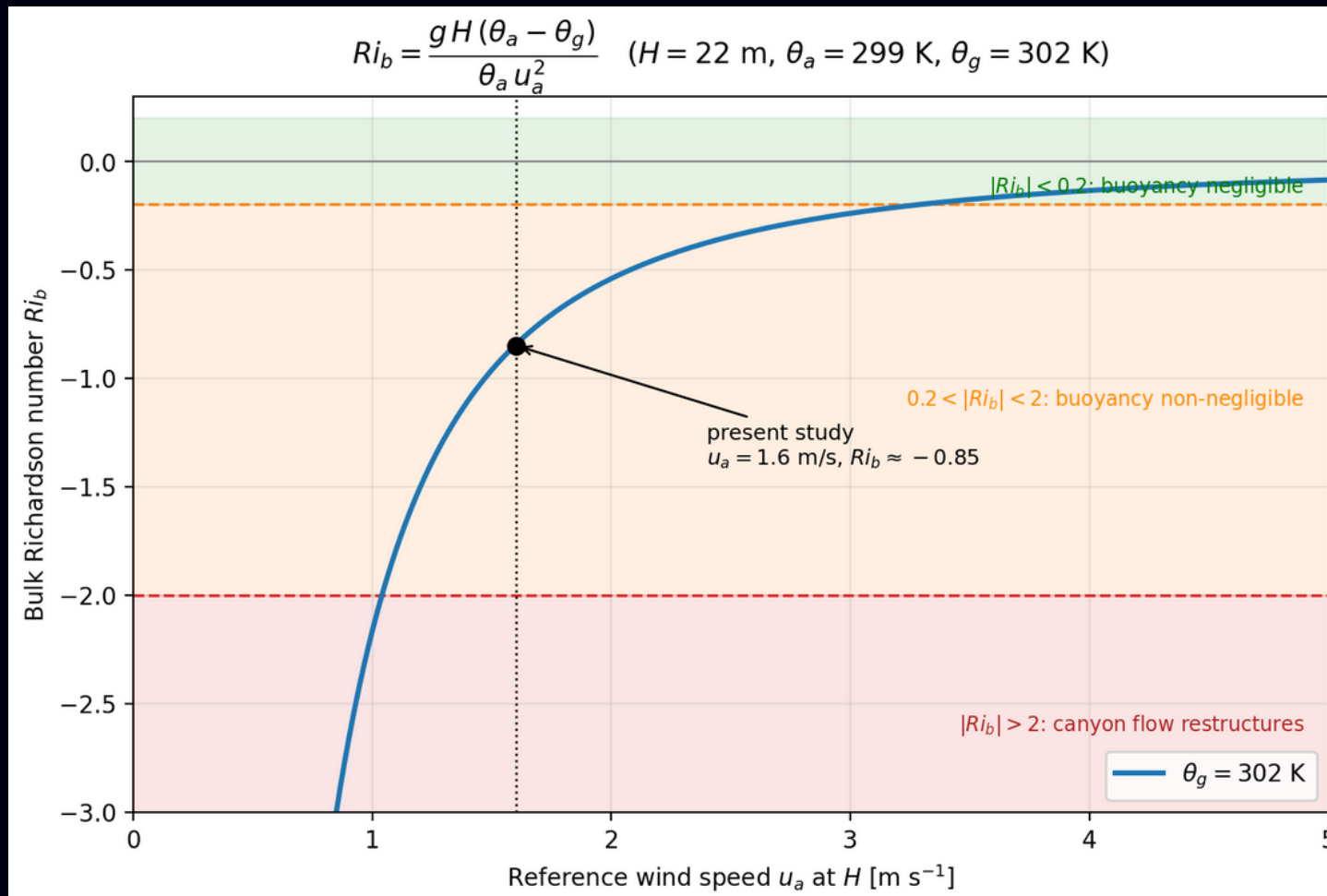
Short-wave q_s = solarLoadRadiationViewFactor (Ray-cast diffuse and reflected radiation weighted by the surface albedo)

Albedo is a measure of the amount of sunlight that a surface reflects. It is calculated as a ratio between 0 (total absorption) and 1 (total reflection).

long-wave flux q_r = greyDiffusiveRadiationViewFactor (each surface emits and absorbs long-wave radiation as a gray, diffuse body with a prescribed emissivity)

Emissivity how well an object is able to **emit energy as thermal radiation** compared to a perfect emitter (blackbody).

MODEL SETUP



GRID INDEPENDENCE TEST

Mesh	Cell count N	Δh_r (m)	Refinement ratio
Fine	35 524 066	3.18	–
Nominal	16 214 605	4.13	1.30
Coarse	7 859 572	5.26	1.30

Convergence parameter	U	p	k	ε
Apparent order of convergence (median)	3.6	3.9	4.2	4.4
Relative error (% , median)	0.9	1.7	1.7	3.5
Extrapolation error (% , median)	0.7	0.9	0.9	1.7
GCI (% , median)	0.9	1.2	1.2	2.1

Result: solutions don't change significantly if a finer mesh is used

Apparent order of convergence: how fast the error shrinks as the mesh refines

Relative error: direct difference between the fine and nominal solutions.

Extrapolated error: distance from the Richardson-extrapolated "zero-cell-size" estimate.

GCI: percentage uncertainty band on the nominal solution attributable to mesh resolution.

LIMITATIONS

Anemometer accuracy
(± 0.89 m/s) and range
starting at 0.89m/s

Single one-hour window
under one inflow direction

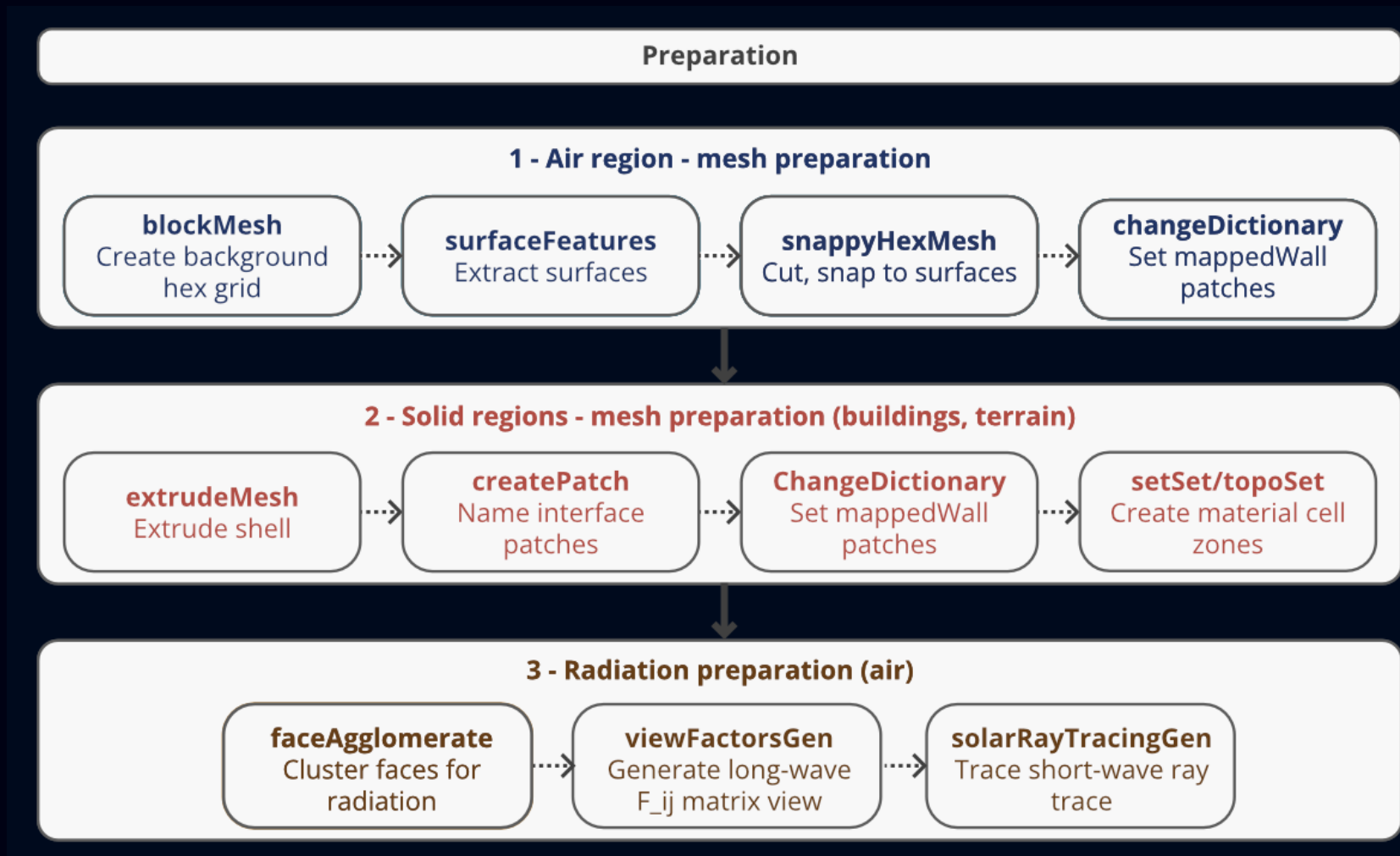
- **Below that wind speed, the sensor reads an unreliably low value.**
- Intrinsic **limitation of this type of study** because of **calm winds** happening most of the time.
- Simulation of **many more time windows** would help to **minimize** this
- Include windows with **stronger wind forcing** above the Anemometer's accuracy range, but **limit the study to only a few hour windows**

FEASIBILITY OF APPLICATION

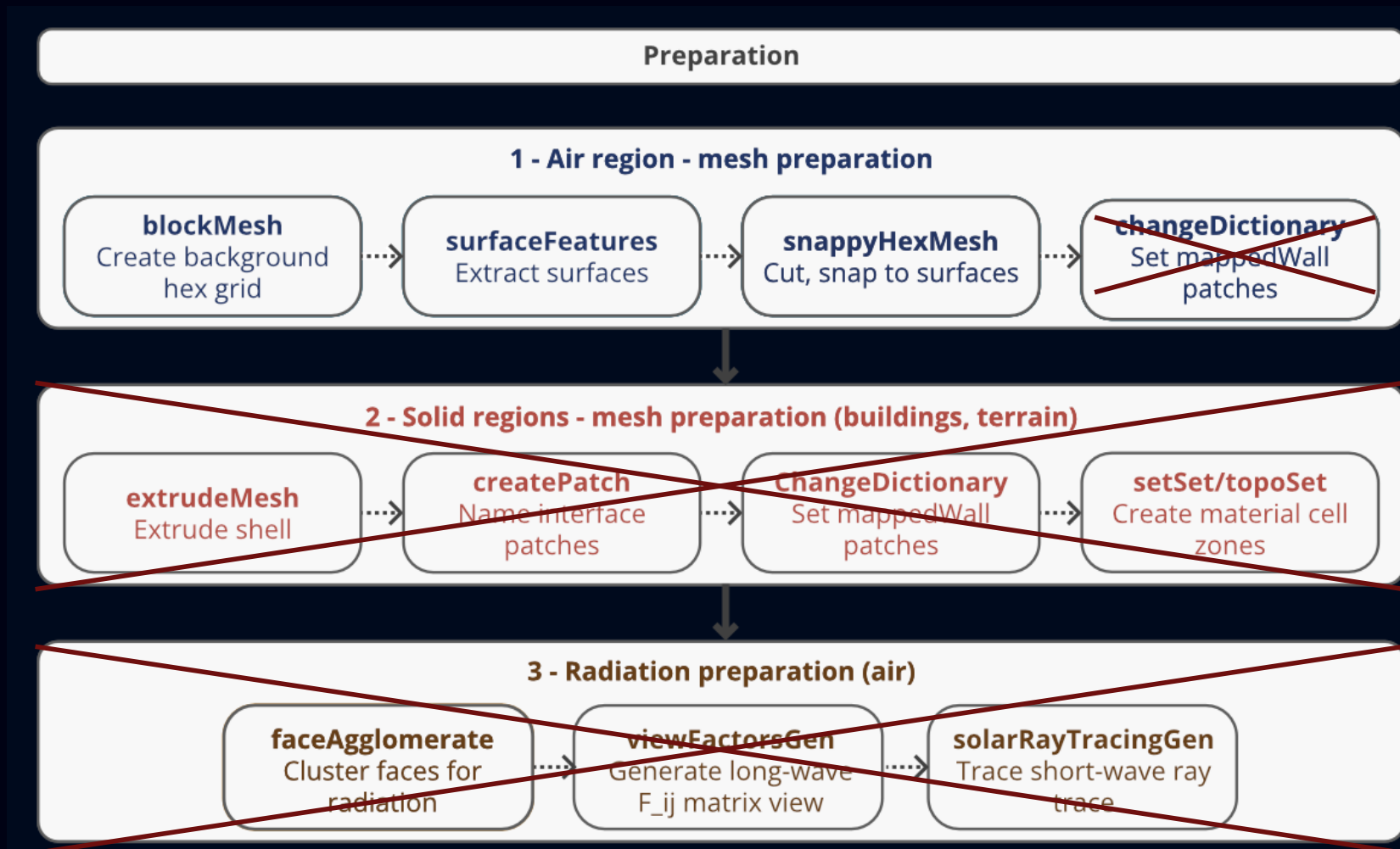


Isotropic re-meshing altering surface edges

URBAN MICROCLIMATE FOAM



SIMPLE FOAM



DISCUSSION 2: WHY UMF OVER-PREDICTS ON AVERAGE?

Hypothesis:

The CMU campus borders Schenley Park to the southeast and sits in a well-vegetated residential surrounding; the **omitted vegetation cooling and humidity flux is probably significant.**

RECOMMENDATIONS

Simplified building
reconstruction LoD 1.2

Simplified Material
and Solid thickness

Robust preparation utilities for realistic geometry

- more robust **faceAgglomerate**
- building-**footprint simplification**
- **terrain-mesh refinement**,
- more **robust refinement of building** meshes
- diagnostic tools that **flag problematic faces** before a run.

Geometric-reconstruction

- Automated pipelines with utilities tailored to uMF

RECOMMENDATIONS

Single one-hour window
under one inflow direction

Anemometer accuracy (± 0.89
m/s) and range starting at
0.89m/s

Validation and Methodology

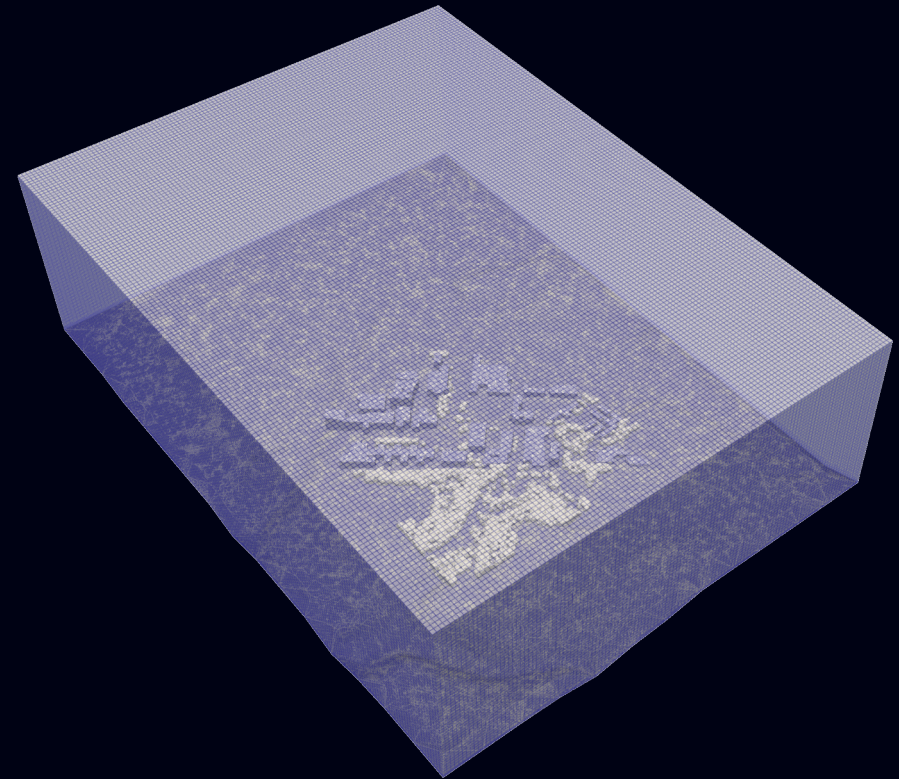
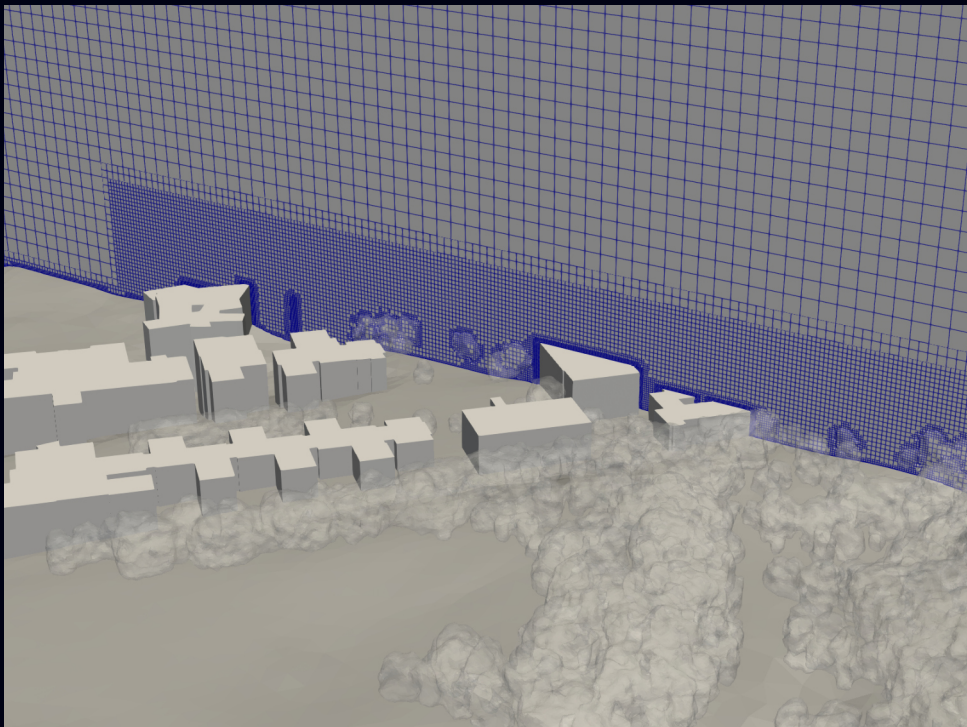
- Extend the validation to **longer time windows**
- Include windows with **stronger wind forcing** above the Anemometer's accuracy range
- **Various inflow** directions
- **Incorporate** uMF VEG module

Solver

- Boundary-condition formulations adaptable to circular domains .

URBAN MICROCLIMATE CFD

Model of the air and solids



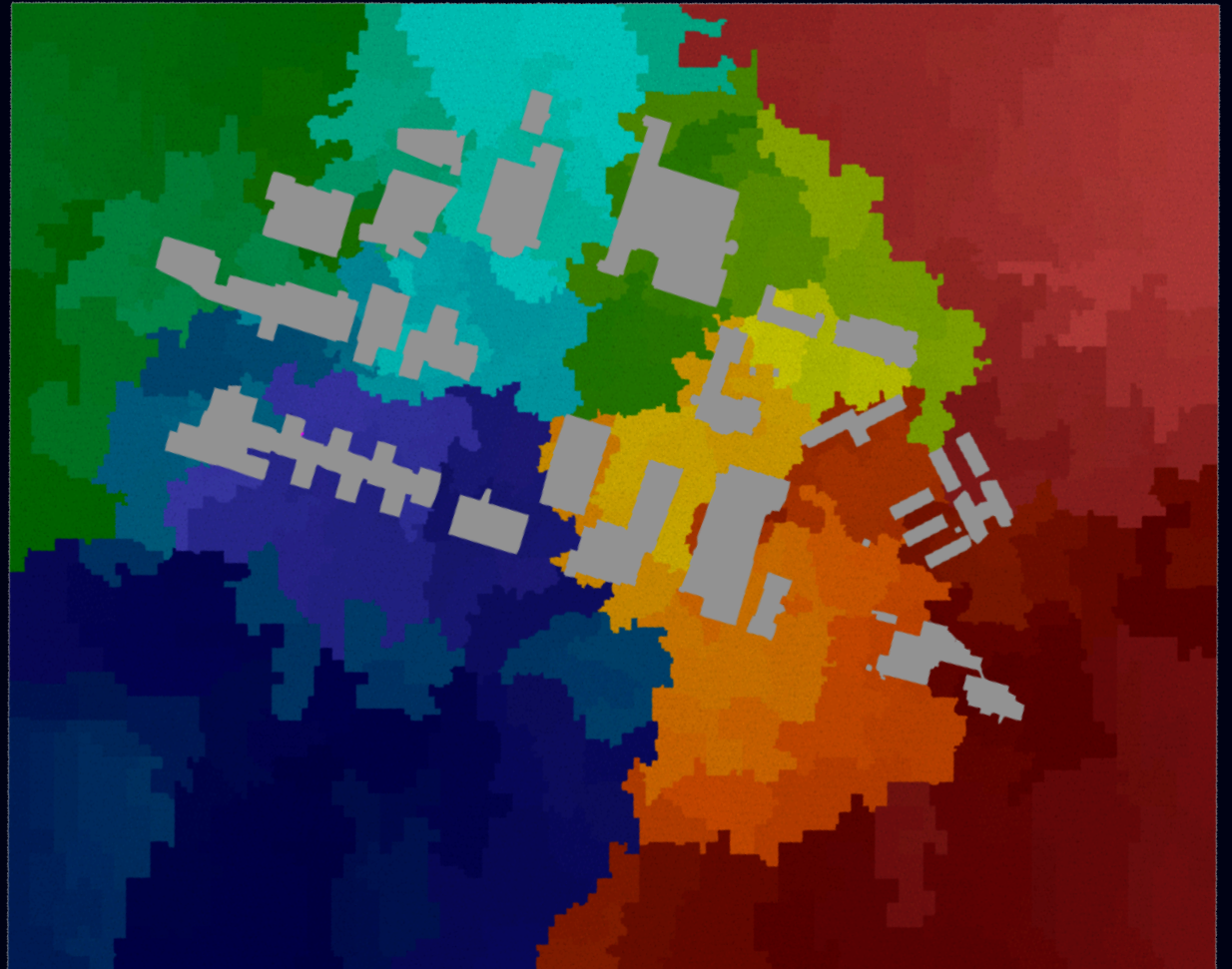
RADIATION PREPARATION

1.3

3 - Radiation preparation (air)

faceAgglomerate

Grouping faces is fundamental to make the calculation of rays more efficient in a complex geometry



MODEL SETUP ASSUMPTIONS

2

SF and uMF
setup and
execution

simpleFOAM

urbanMicroclimateFoam

AIR (CDF)

Coupled (AIR HAM RAD)

Neutral; temperature
neglected

Solve Air temperature &
humidity (299K, 0.014 kg/kg
Mesonet ASOS)

Vegetation as porosity zone

Turbulence Realisable k-
epsilon

Roughness $z_0 = 0.5$ m

ATM boundary layer inlet
profiles

Second order schemes

$$U(z) = \frac{u^*}{\kappa} \ln\left(\frac{z+z_0}{z_0}\right)$$

$$k(z) = \frac{u^{*2}}{\sqrt{C_\mu}}$$

$$\epsilon(z) = \frac{u^{*3}}{\kappa(z+z_0)}$$

MODEL SETUP ASSUMPTIONS

2

**SF and uMF
setup and
execution**

urbanMicroclimateFoam

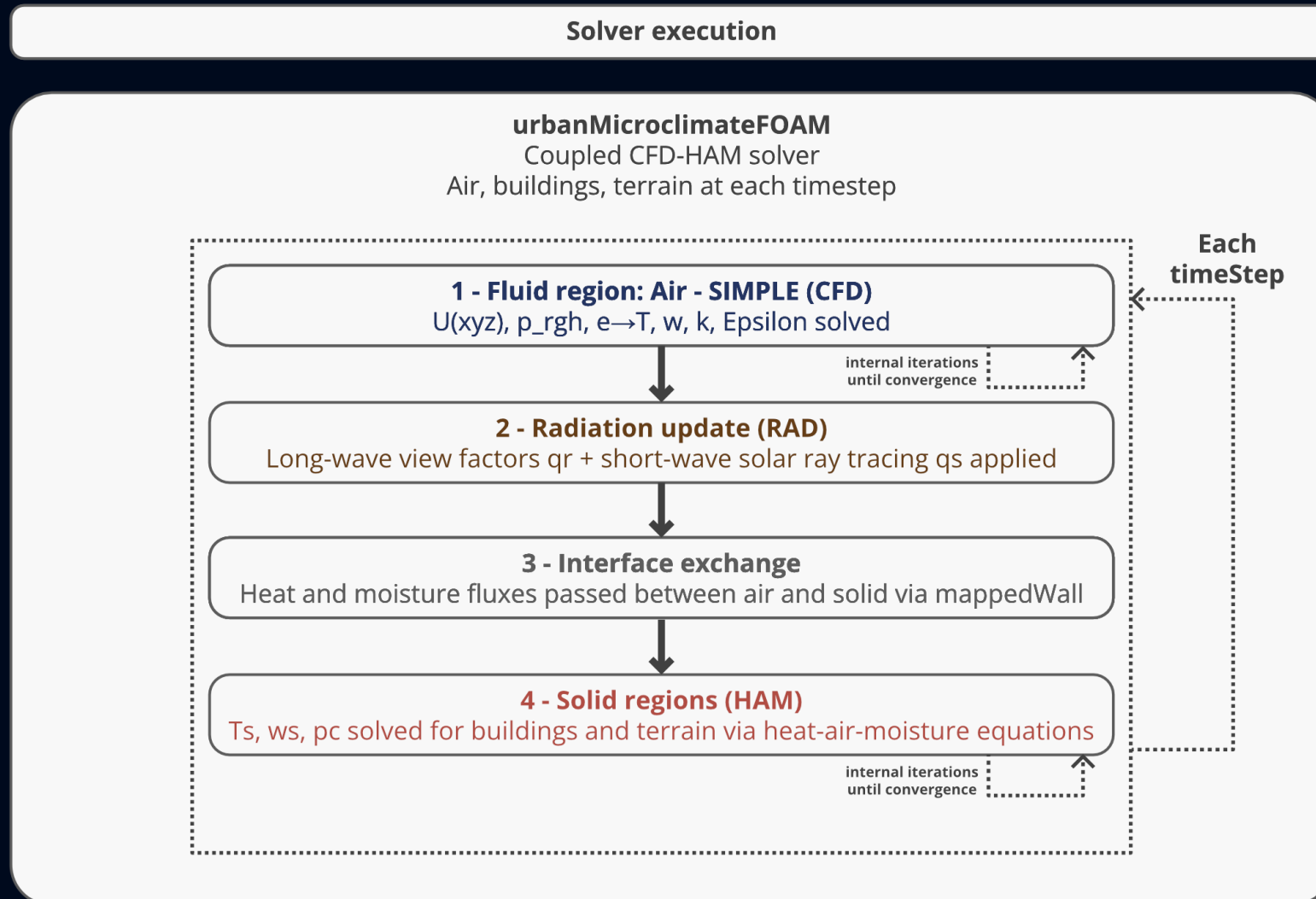
Surface T (Brick 305K,
Asphalt 302K) (MORICHI)

Buildings + Terrain
0.1m width, Tutorial
materials

Shortwave
solarLoadRadiationViewFactor
(direct + diffuse + rejected),
open sky

Longwave
greyDiffusiveRadiationViewFactor
(grey, diffuse), Emissivity 0.9,
Albedo 0.4

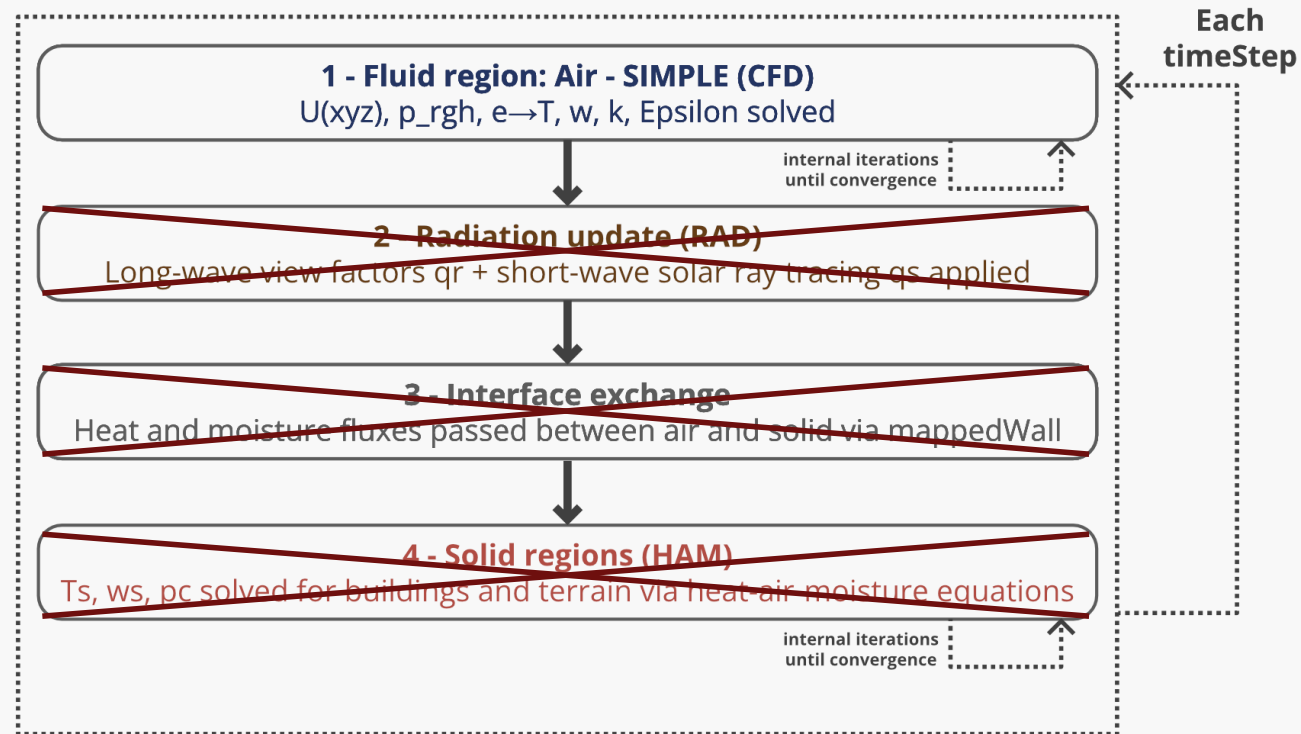
URBAN MICROCLIMATE FOAM



SIMPLE FOAM

Solver execution

urbanMicroclimateFOAM
Coupled CFD-HAM solver
Air, buildings, terrain at each timestep



WIND-SPEED PREDICTION COMPARISON

Station 1 provides the most robust answer when looking at a single station

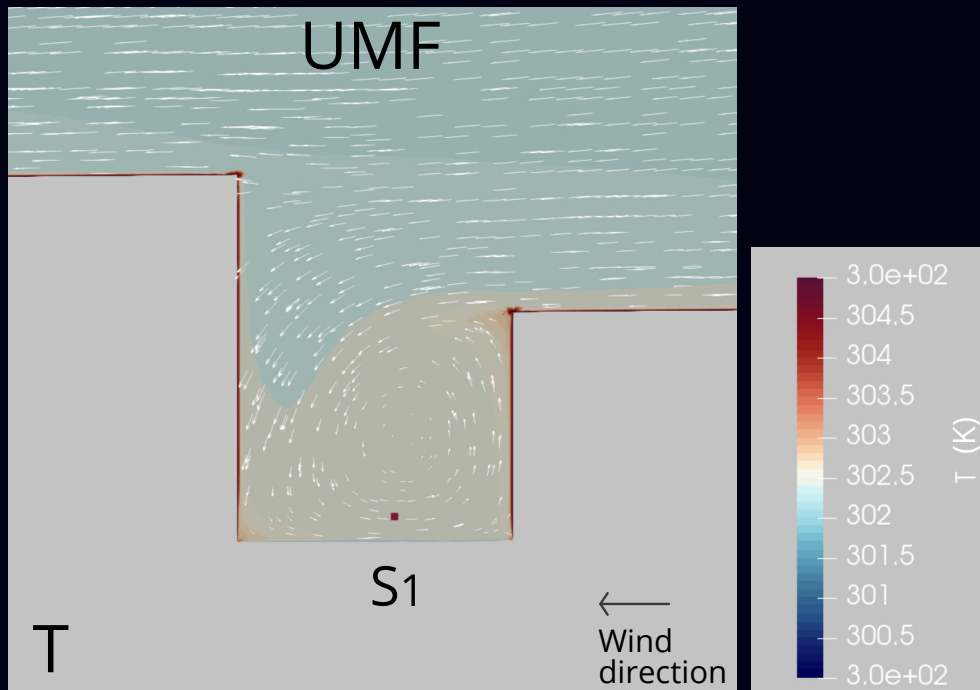
- **above anemometer accuracy range, that starts at 0.89 m/s**
- **29 percentage point reduction in relative error.**

The remaining stations are consistent with this picture but cannot be drawn independently of instrument uncertainty

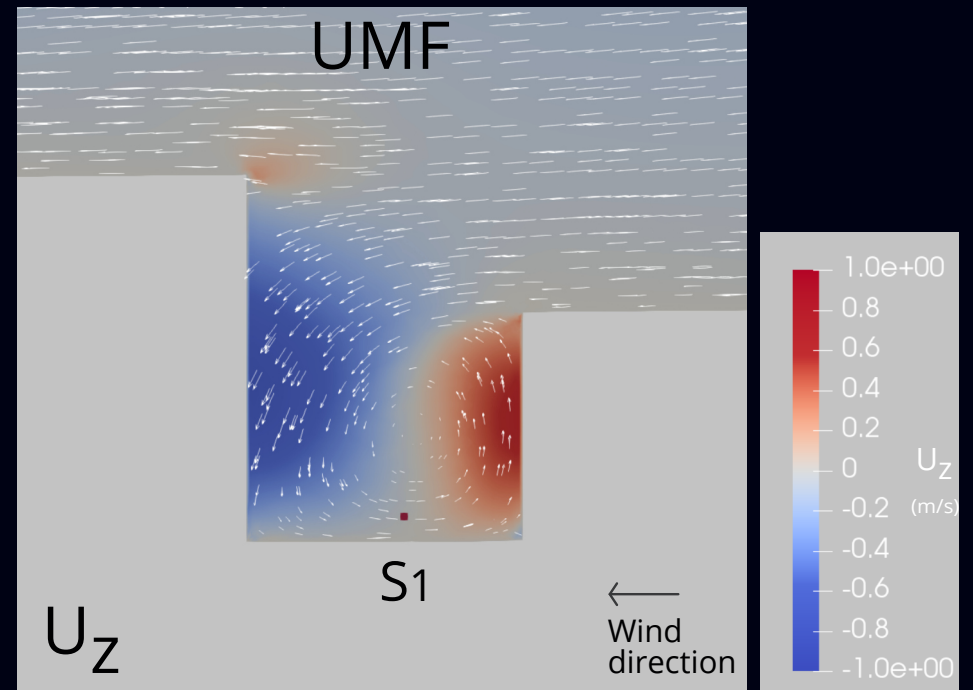
Station	U_o [m/s]	σ_o [m/s]	U_{SF} [m/s]	$\epsilon_{rel,SF}$ [%]	U_{uMF} [m/s]	$\epsilon_{rel,uMF}$ [%]	Difference (SF→uMF)
Station 1	1.29	0.52	0.43	67	0.80	38	-29 pp
Station 2	0.45	0.30	0.43	4	1.07	139	+135 pp
Station 3	0.44	0.25	0.17	61	0.64	46	-15 pp
Station 4	0.66	0.24	0.42	36	0.66	1	-35 pp

STATION 1

Temperature



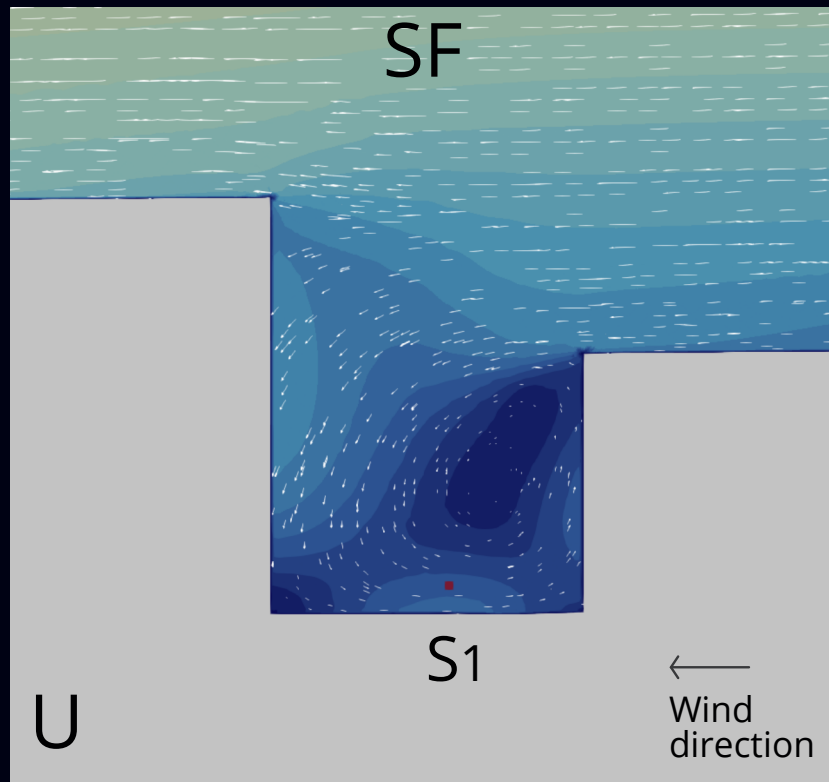
Vertical velocity component U_z



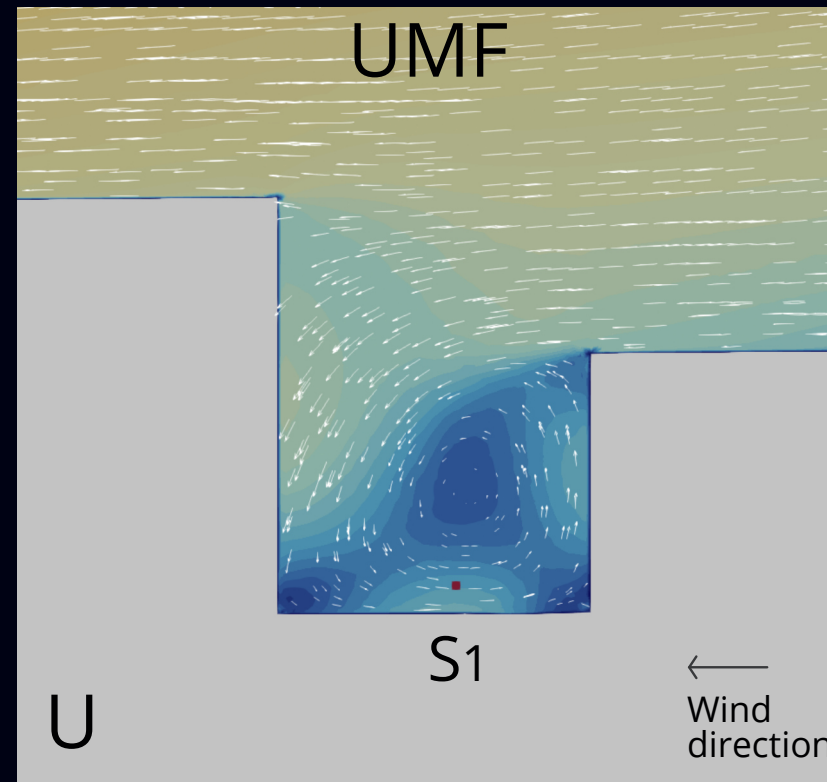
STATION 1



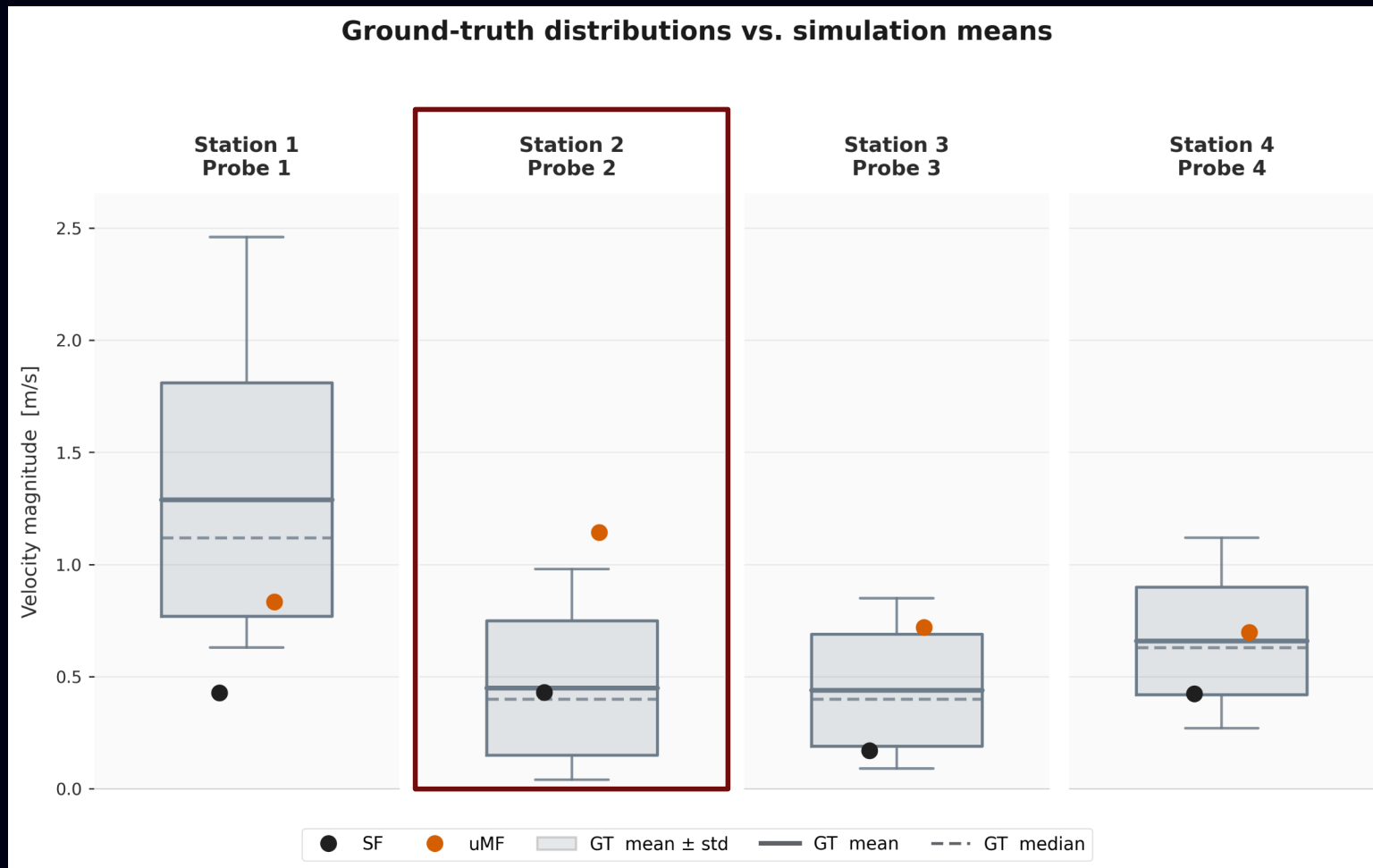
Velocity U



Velocity U



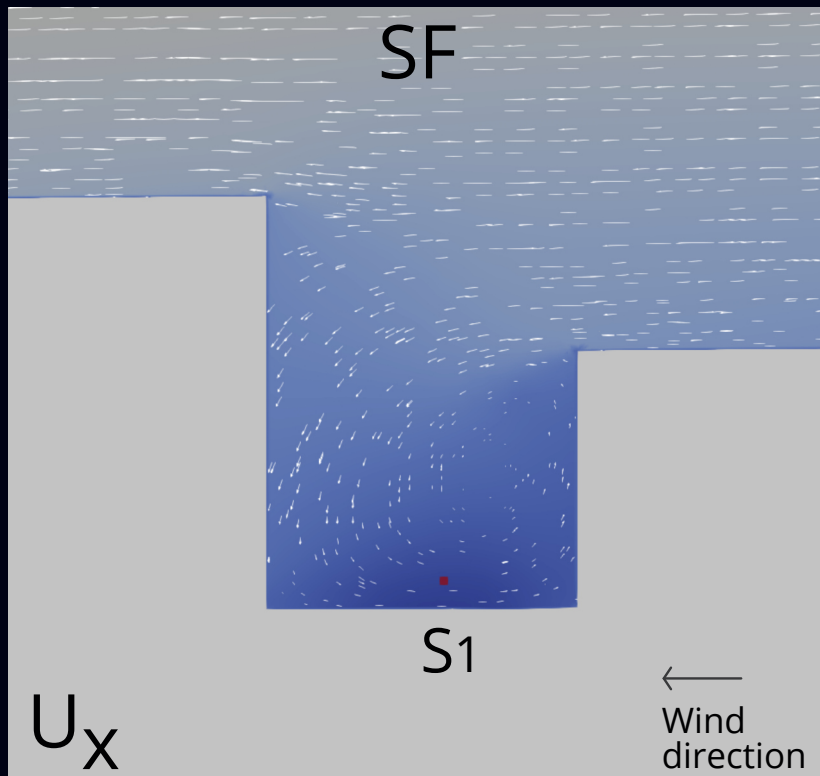
STATION 2



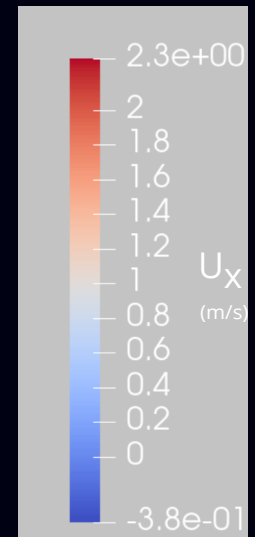
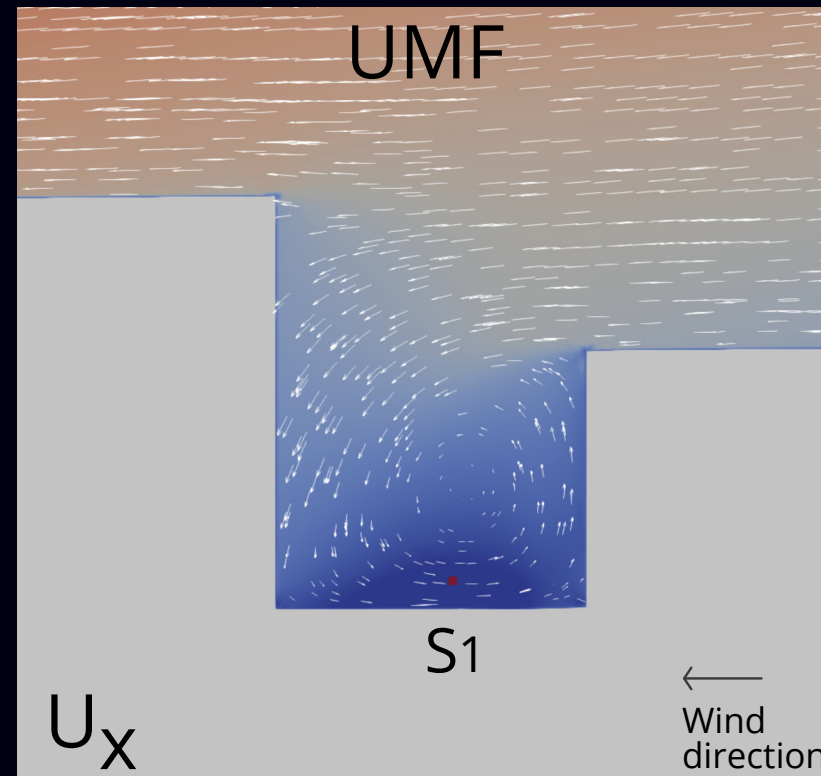
STATION 1



Horizontal velocity component U_x



Horizontal velocity component U_x



WIND-SPEED PREDICTION COMPARISON

The indicators evidence these tendencies

Metric	Acceptance	SF		uMF		Reduction (SF→uMF)
		Value	Pass	Value	Pass	
FB	$ \text{FB} < 0.3$	+0.65	No	-0.11	Yes	-83%
NMSE	$\text{NMSE} < 4$	0.85	Yes	0.30	Yes	-65%
MG	$\text{MG} < 1$	1.89	No	0.83	Yes	-80%
VG	$\text{VG} < 1.5$	1.79	No	1.32	Yes	-59%

Sabatino et al. (2011)
Chang and Hanna (2004)

Average improvement SF to uMF of 71%.

$$\text{FB} = \frac{\overline{C_o} - \overline{C_p}}{0.5(\overline{C_o} + \overline{C_p})},$$

Fractional bias

$$\text{NMSE} = \frac{(\overline{C_o} - \overline{C_p})^2}{\overline{C_o} \overline{C_p}},$$

Normalised mean square error

$$\text{MG} = \exp(\overline{\ln C_o} - \overline{\ln C_p}),$$

Geometric mean bias

$$\text{VG} = \exp(\overline{(\ln C_o - \ln C_p)^2}),$$

Geometric variance

FAC2 = fraction of data that satisfy $0.5 \leq \frac{C_p}{C_o} \leq 2.0$,

$$\varepsilon_{\text{rel}} = \frac{|C_p - C_o|}{C_o}.$$

where:

C_p : model predictions;

C_o : observations;

$\overline{}$: average over the dataset;

ε_{rel} : relative error at each station reported as a percentage.