

# On the AI driven geometry optimization of a stirred tank CFD model in laminar flow

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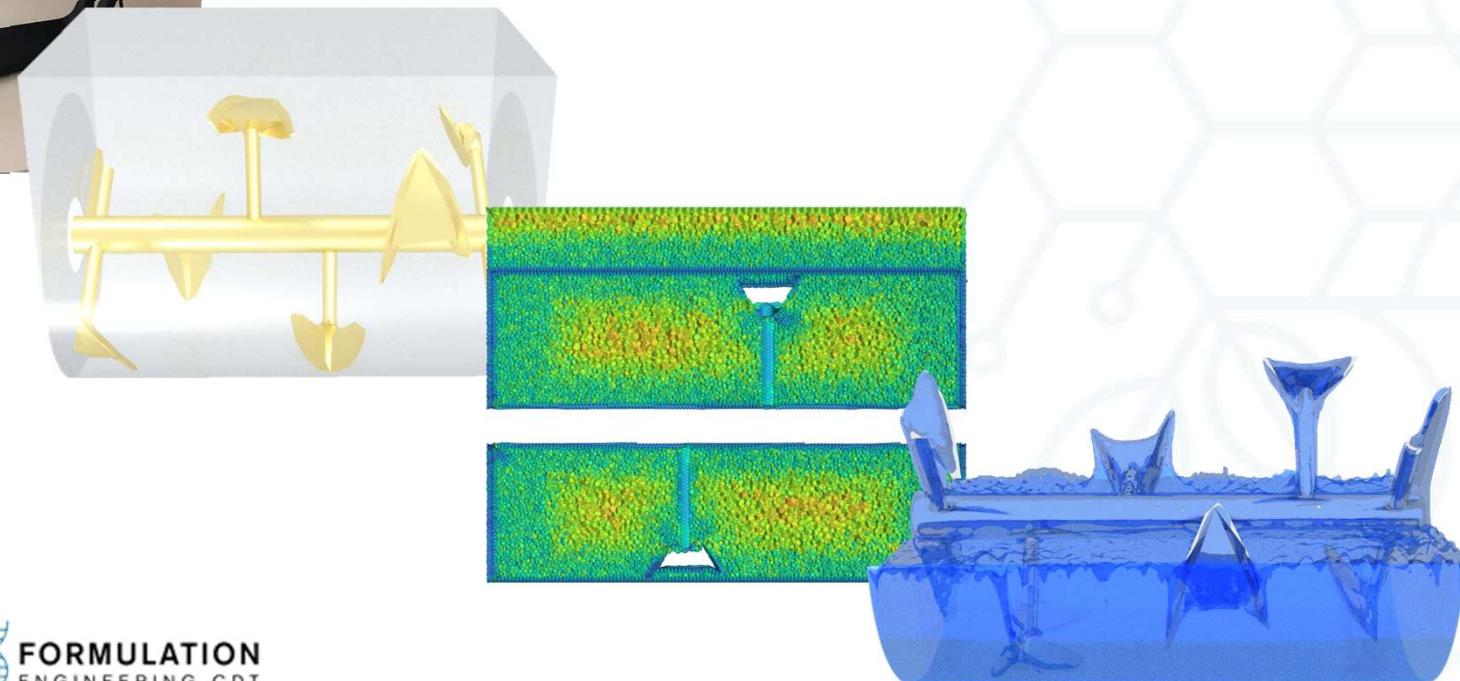
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Christopher Windows-Yule [1],  
Santoshkumar Gupta [2],  
Waldo Rosales [3],  
Adam Kowalski [3],  
Andrei Leonard Nicusan [1],

## FMP SIG, January 10th, 2024

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👉 [www.birmingham.ac.uk/formulation-cdt](http://www.birmingham.ac.uk/formulation-cdt)

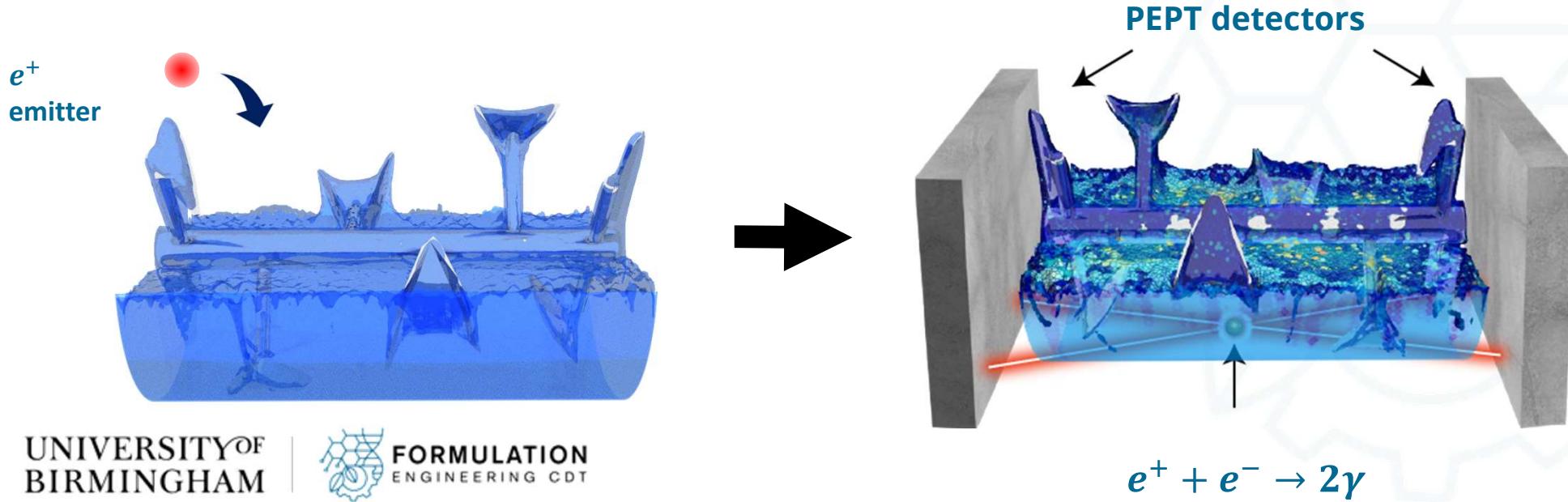
[1] School of chemical engineering, University of Birmingham.  
[2] Hindustan Unilever R&D, Bangalore.  
[3] Unilever R&D, Port Sunlight Laboratory.

# Introduction



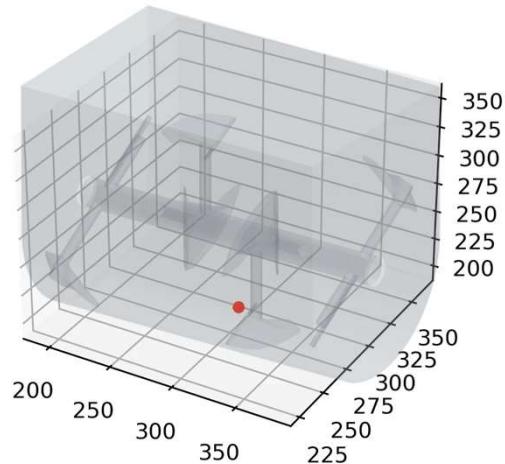
# What is Positron Emission Particle Tracking (PEPT)?

- Direct tracking of **particle motion in 3D** using gamma rays.
- It allows us to '**see inside**' opaque systems.

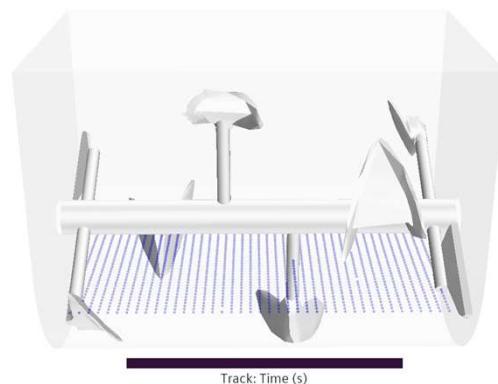


# Validation

## PEPT Experiment

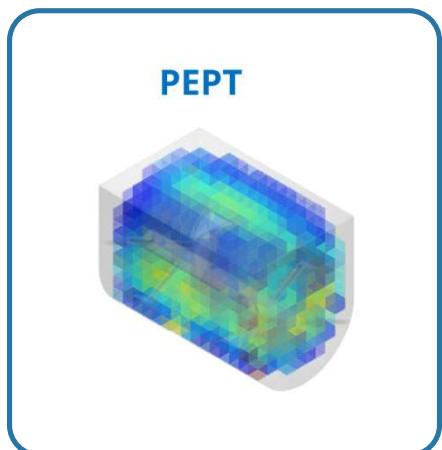


## Simulation



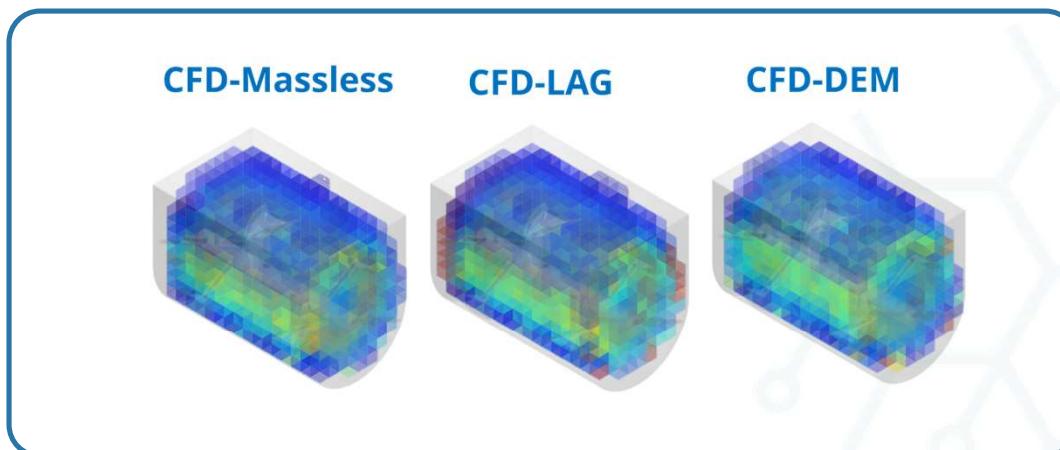
# Validation

## Experiment

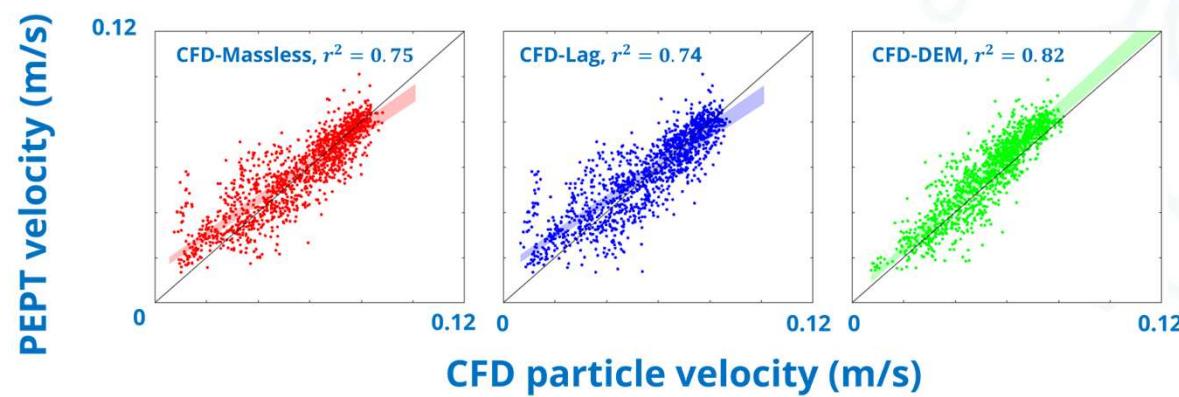


VS

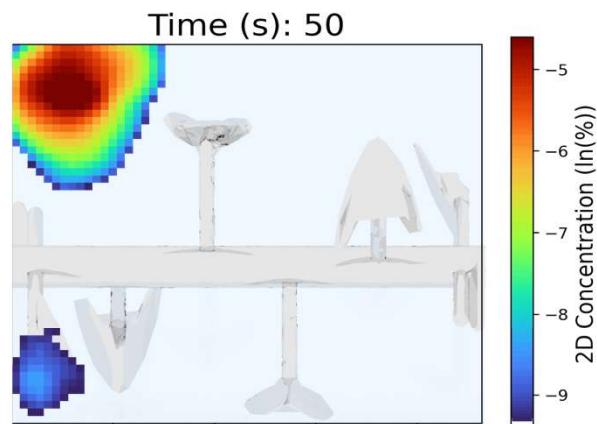
## Simulation



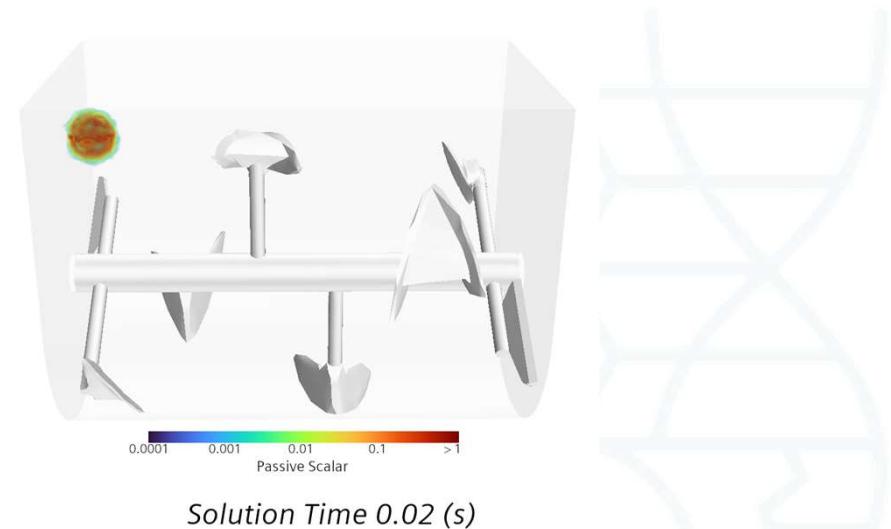
0.12  
0  
Particle Velocity (m/s)



# Validation



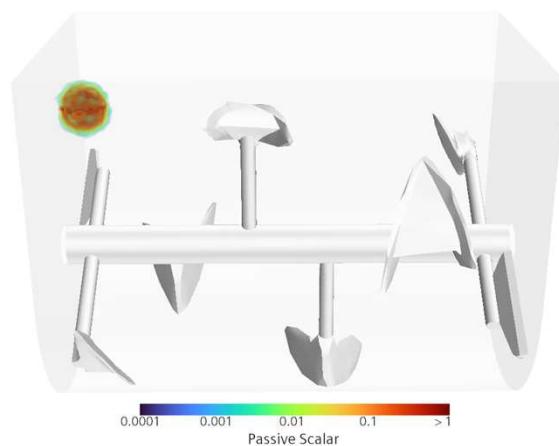
Positron Emission  
Projection Imaging



Passive scalar CFD

Free parameters

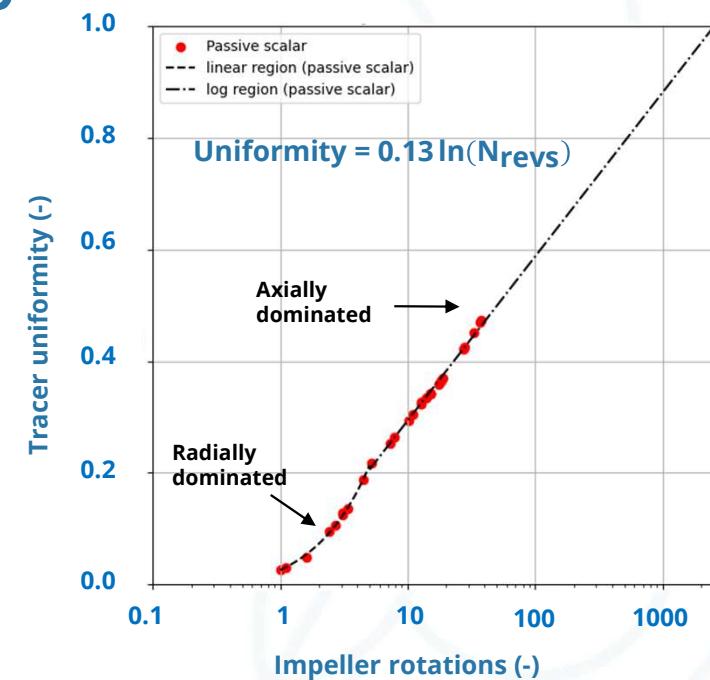
$$\text{Re} \quad \mu \quad \rho$$



Evaluate

## Rate of uniformity

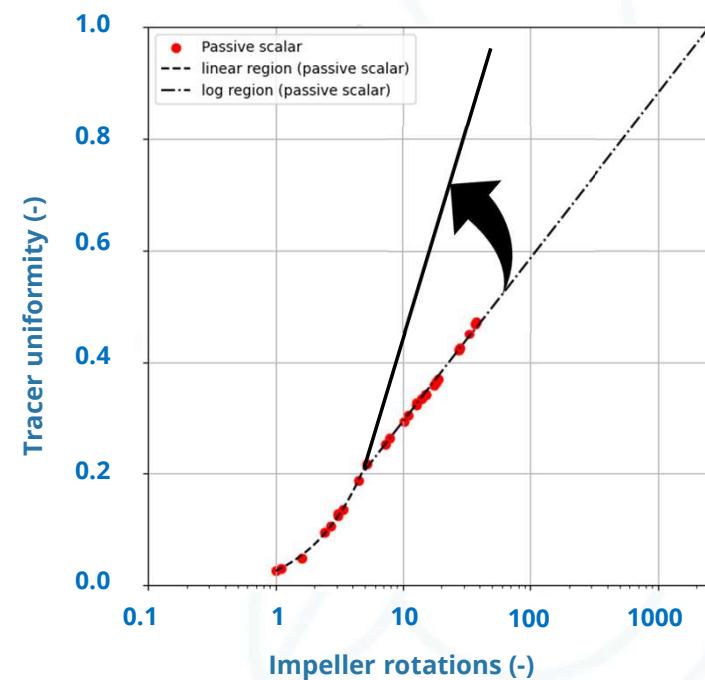
# Exploration



# Optimisation

## Objectives

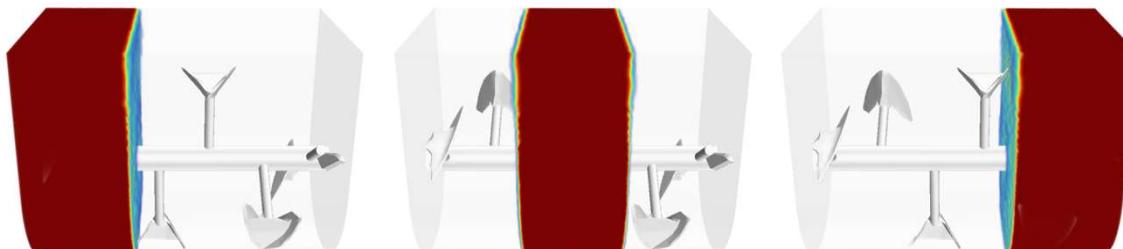
- Maximise axial mixing
- Modify geometry
- Retain plough-like features
- Constrain energy requirements



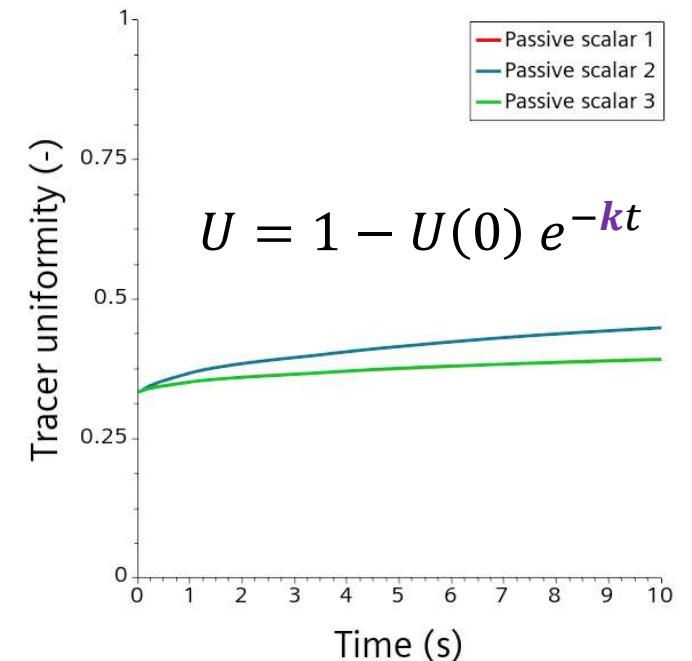
# Optimisation

## Objectives

- Maximise axial mixing



$$\text{minimise } t_{1/2} = [\ln 2 / k_1, \ln 2 / k_2, \ln 2 / k_3]$$



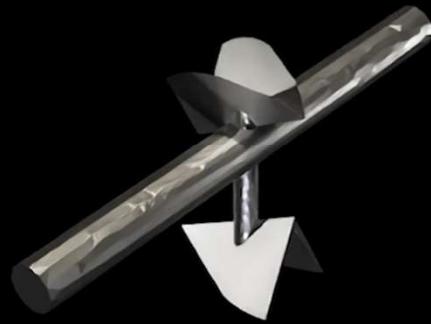
# Optimisation

## Objectives

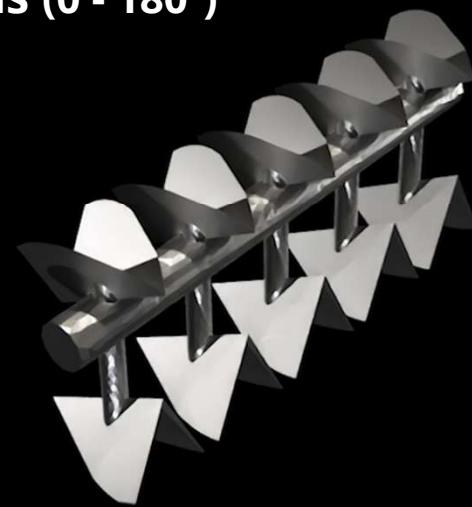
- Modify geometry (12 free shape parameters)
- Retain plough-like features



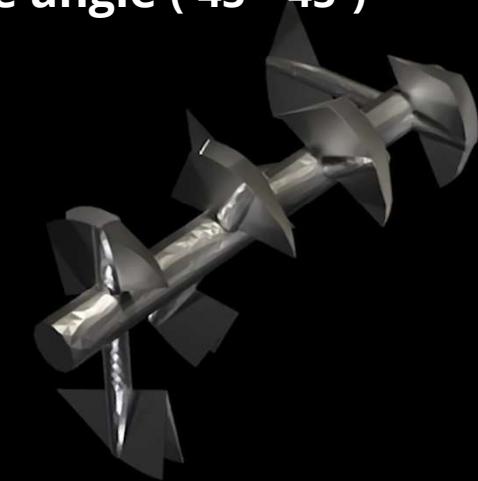
**Number of plows (1-12)**



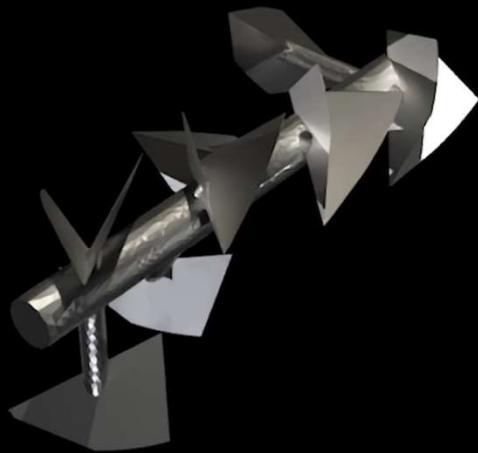
**Bias (0 - 180°)**



**Side angle (-45 - 45°)**



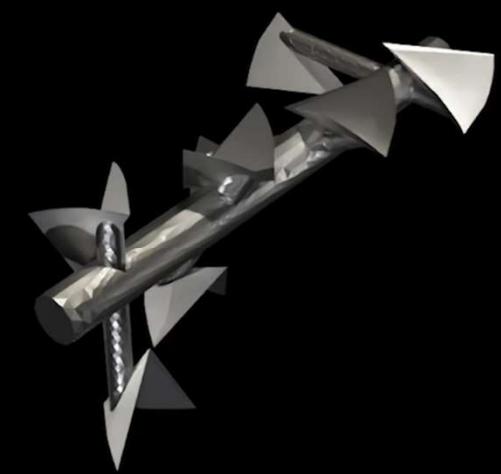
**Twist angle (-45 - 45°)**



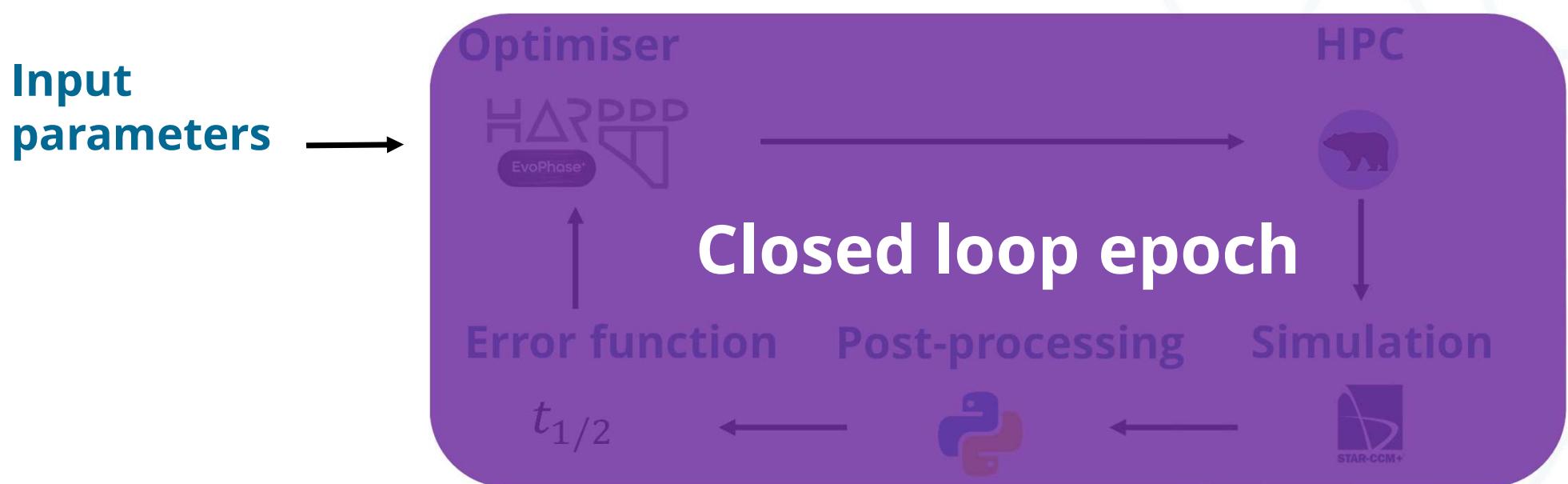
**Plough top height (-15 - 50 mm)**



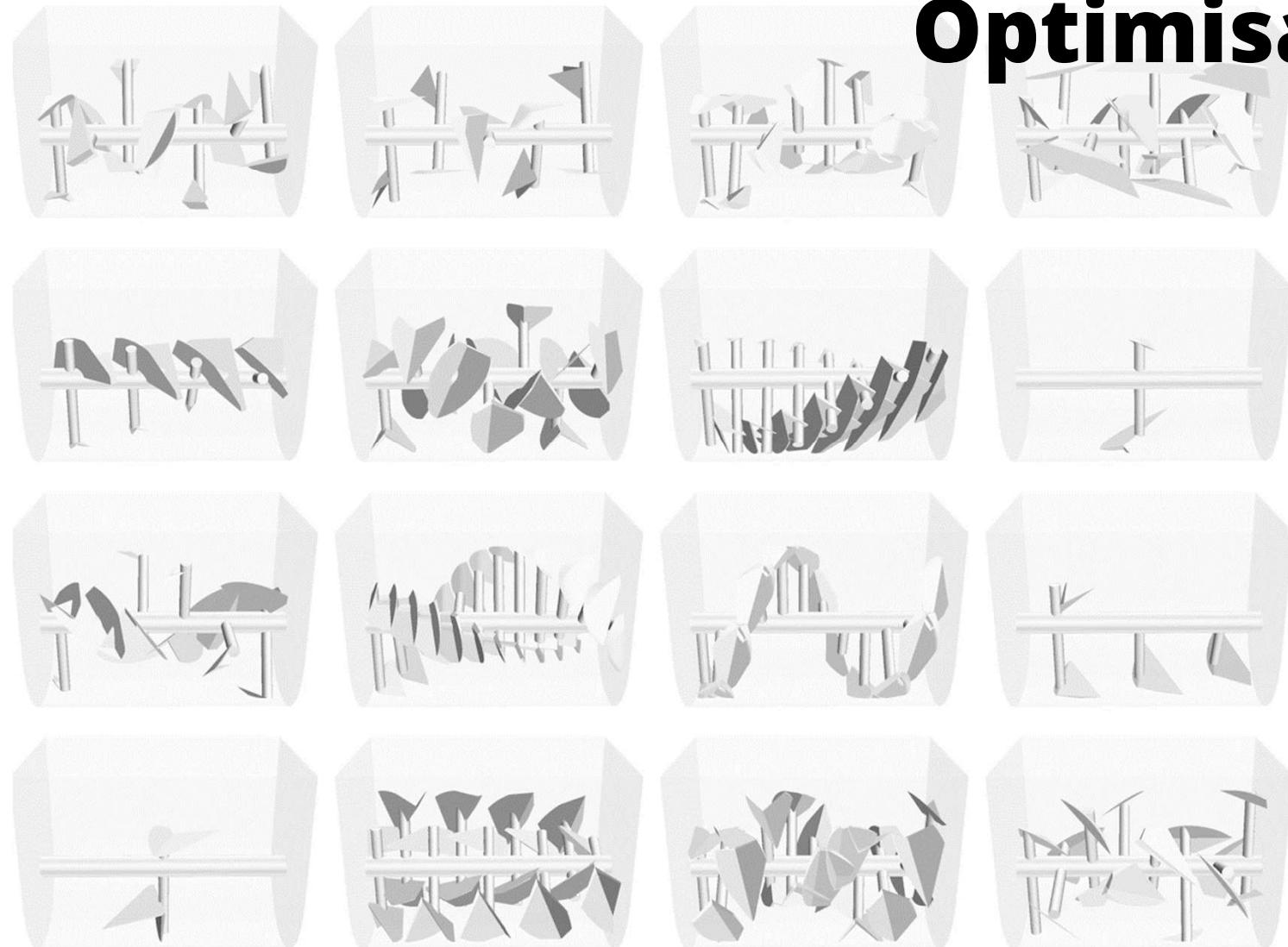
**Plough length (15 - 100 mm)**



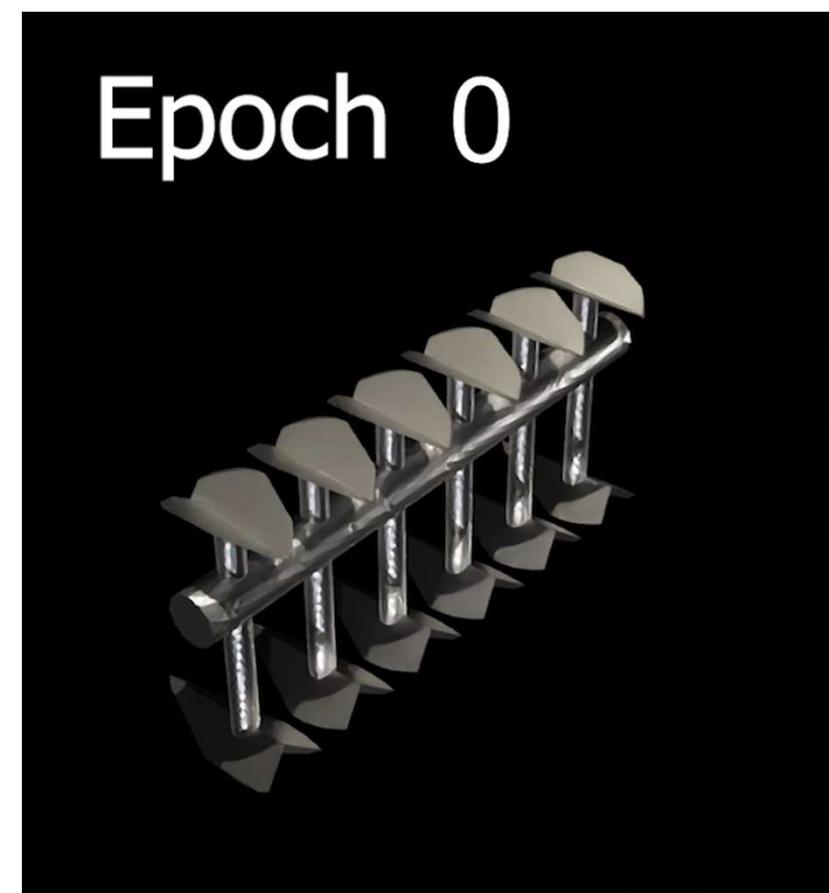
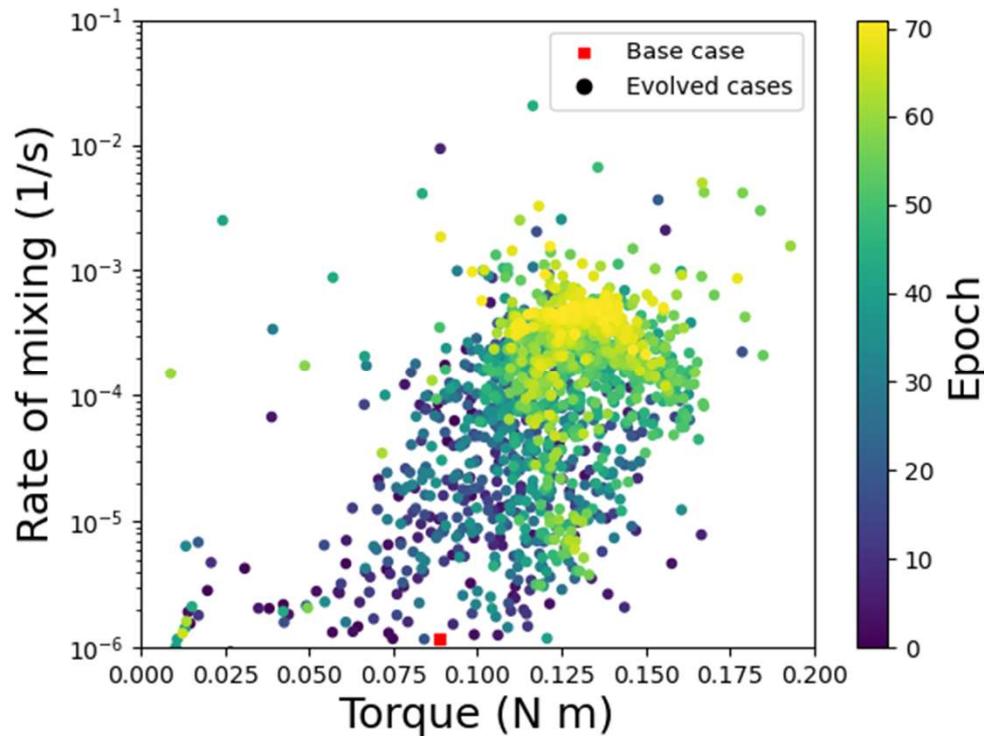
# Optimisation



# Optimisation

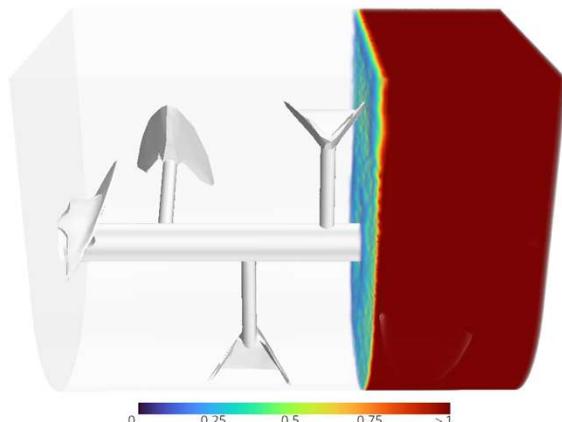


# Optimisation



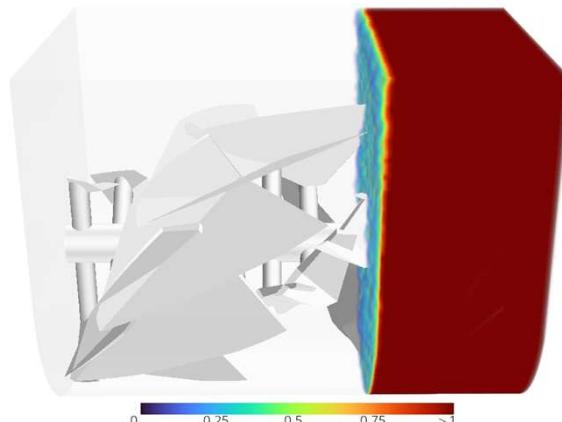
# Optimisation

Base case

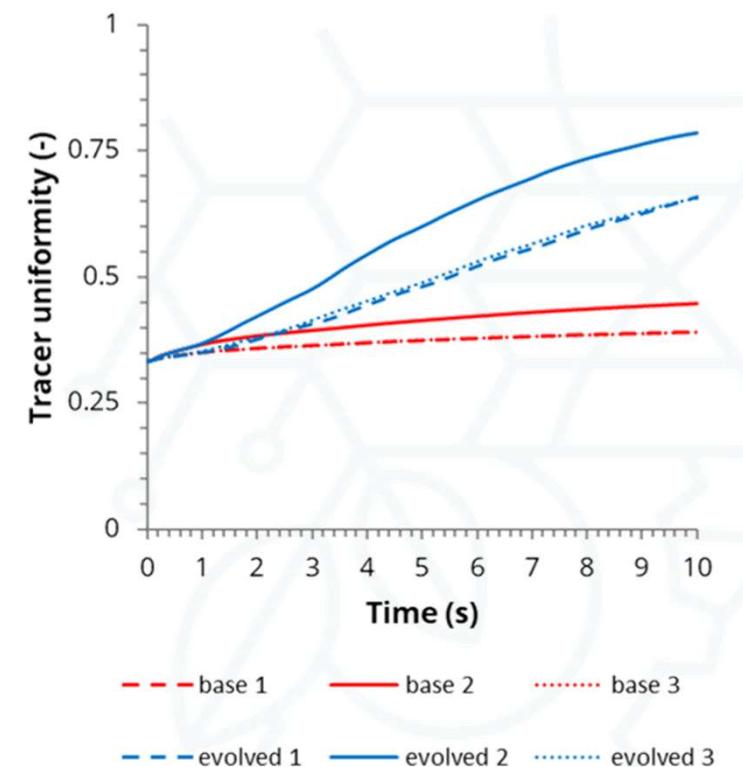


Solution Time 0.04 (s)

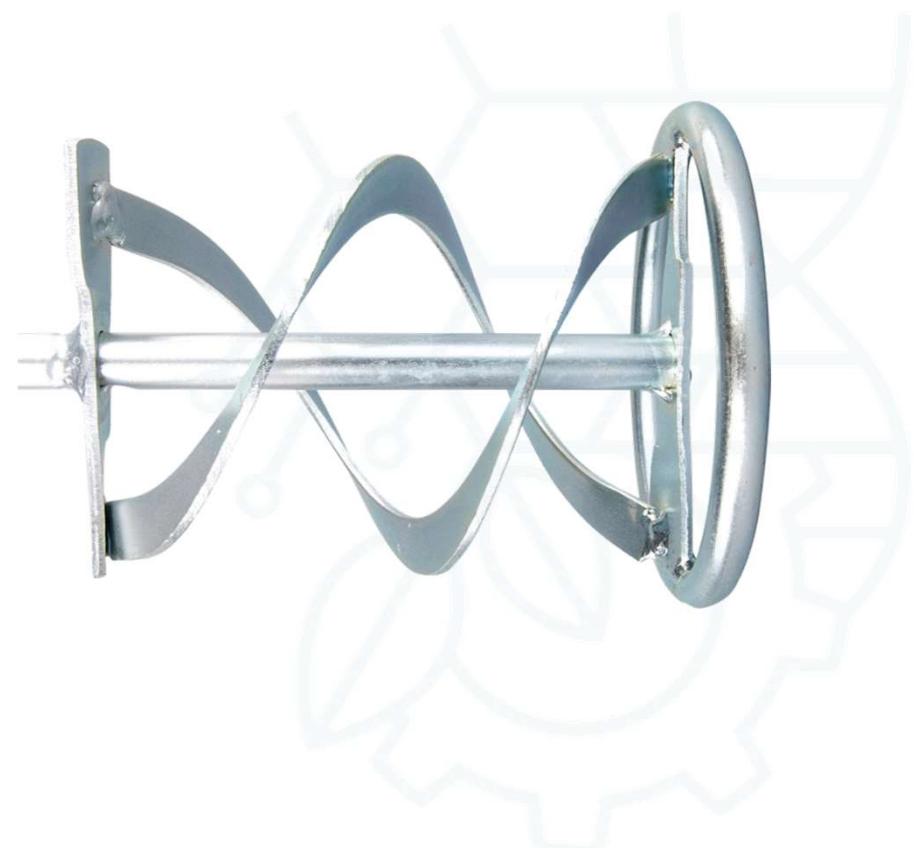
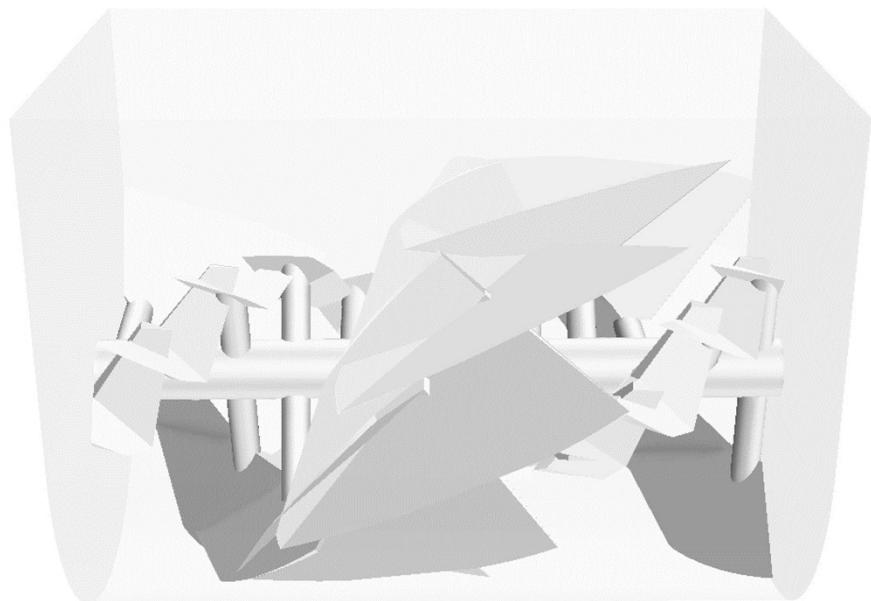
Evolved design



Solution Time 0.04 (s)



# Optimisation



# Summary

- **~1000x** improved rate of axial mixing at similar torque.
- Blindly “*rediscovered*” existing optimal designs.
- **General** approach for autonomous geometry optimisation.
- Data driven evolutionary strategy hugely applicable to industrial mixing.

## Thanks for your time



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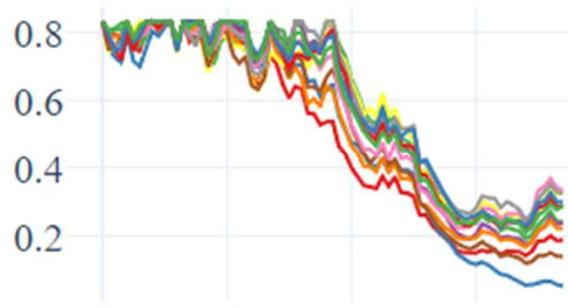
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# Convergence

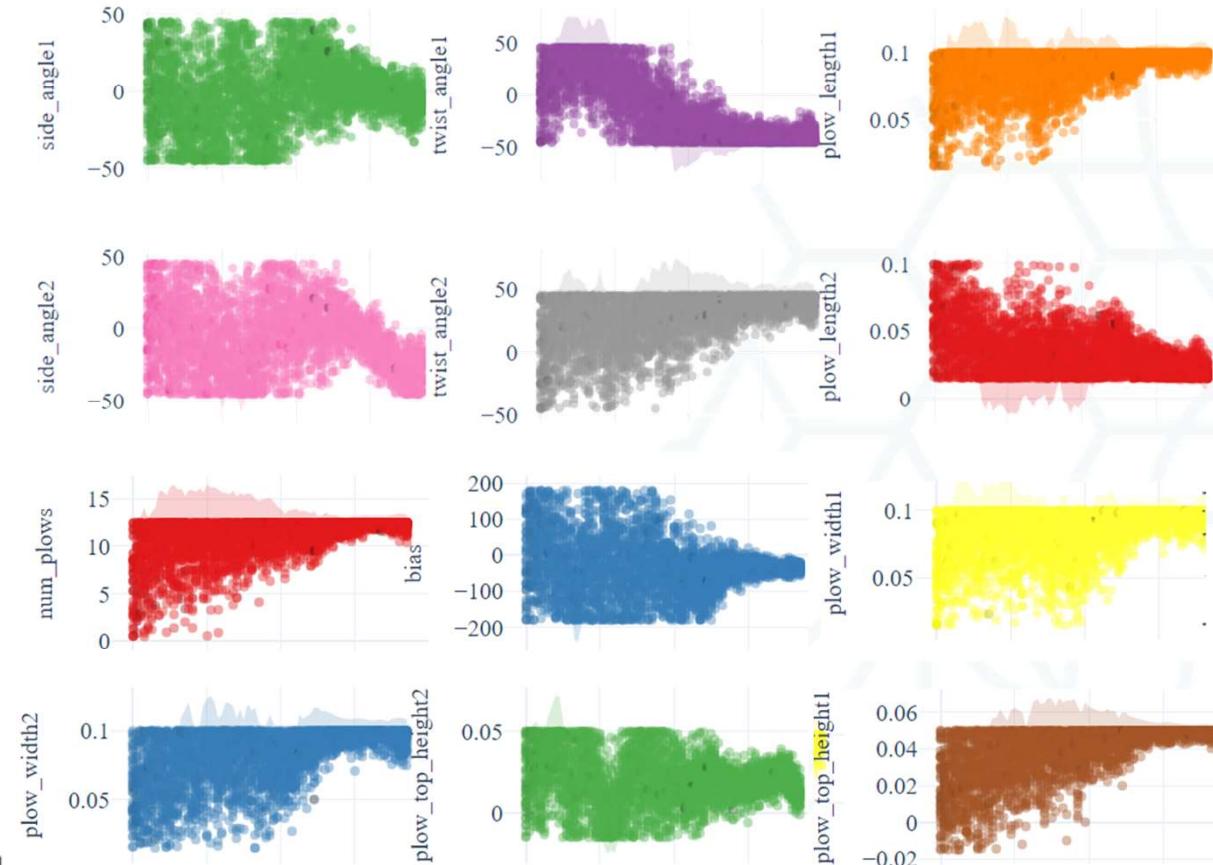
Standard Deviation



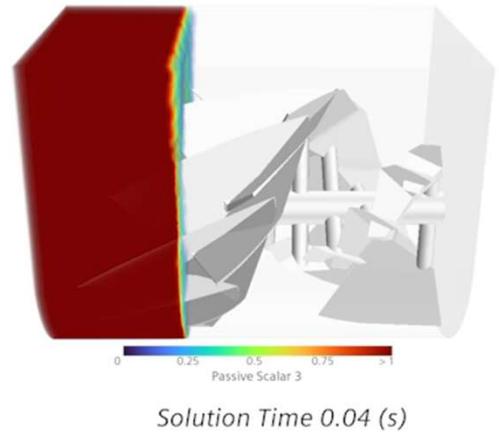
UNIVERSITY OF  
BIRMINGHAM



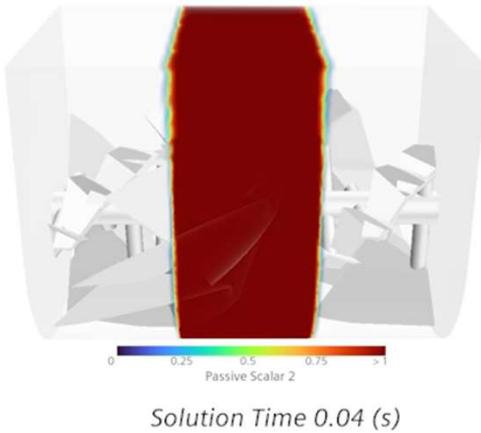
FORMULATION  
ENGINEERING CDT



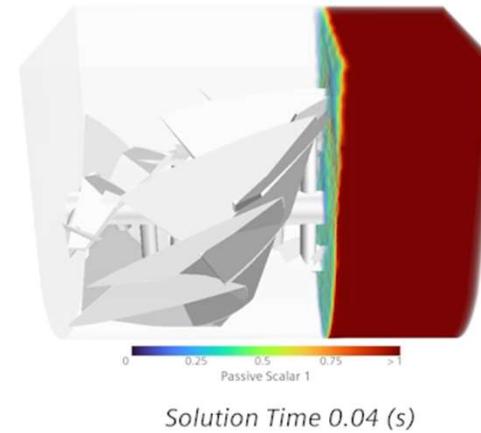
# Passive scalar vs Particles



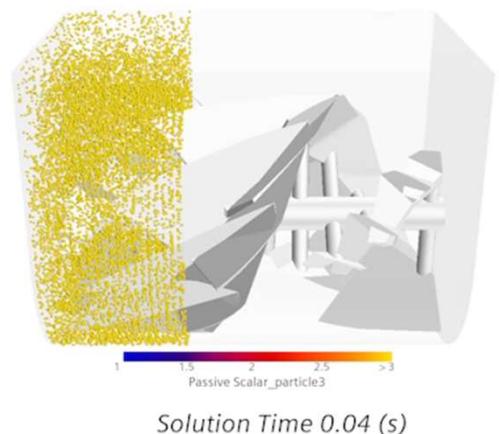
Solution Time 0.04 (s)



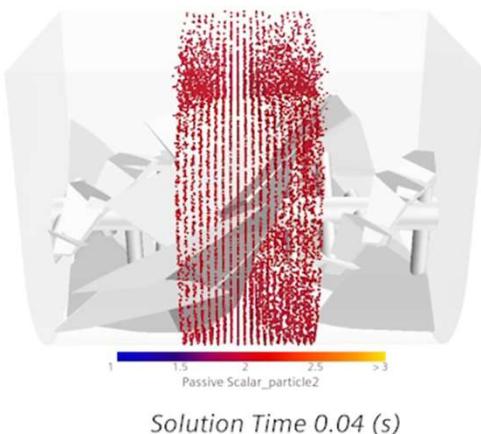
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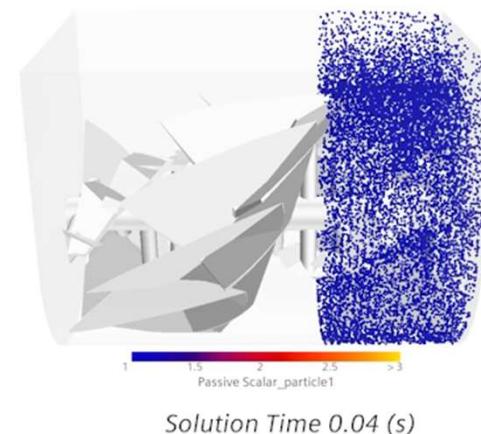
Solution Time 0.04 (s)



Solution Time 0.04 (s)



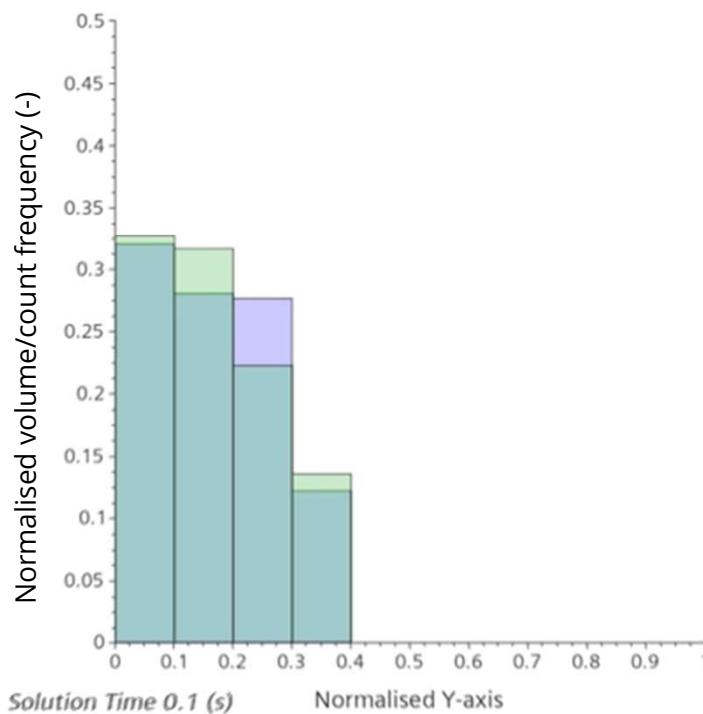
Solution Time 0.04 (s)



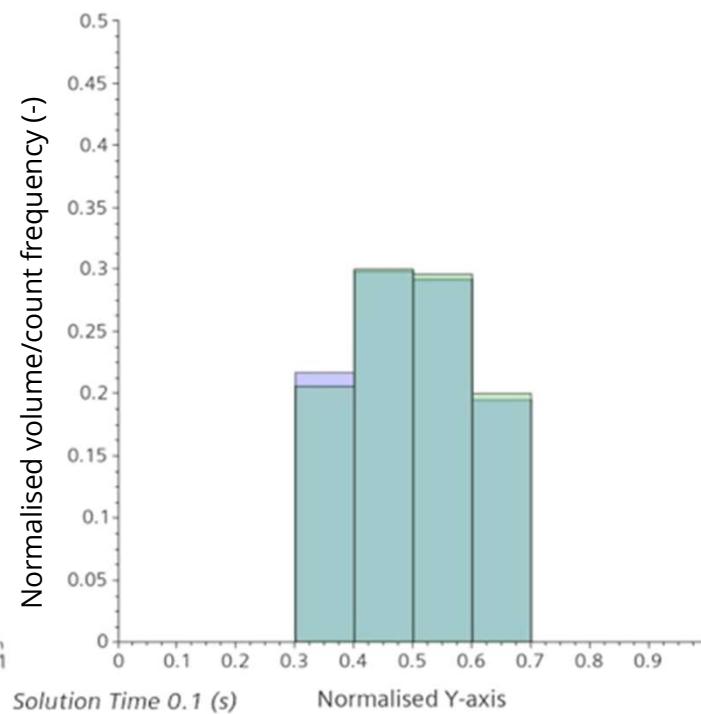
Solution Time 0.04 (s)

# Passive scalar vs Particles

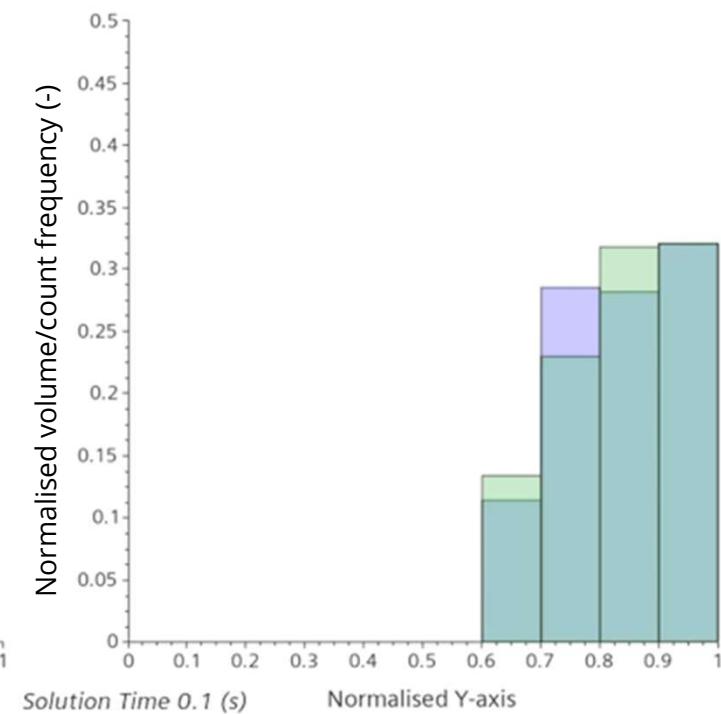
█ Passive scalar  
█ Massless particles



**Left**



**Center**



**Right**