

# Heat Transfer Opportunities for Supercritical CO<sub>2</sub> Power Systems



## Pathways to Cost-Effective Heat Exchangers and Thermal Management

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NETL Support Contractor



*University Turbine System Review and Advanced  
Turbines Program Review Meeting  
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# sCO<sub>2</sub> Field Work Proposal

## sCO<sub>2</sub> Heat Transfer (Task 2)

### Objective

- Advance the understanding of sCO<sub>2</sub> heat transfer for net-zero power cycles
- Design and test novel concepts for cycle and turbomachinery components

### Benefits

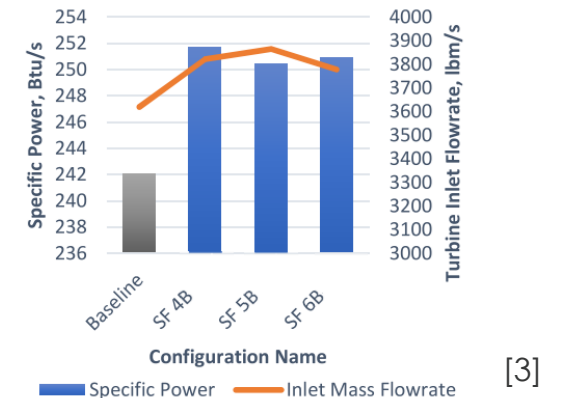
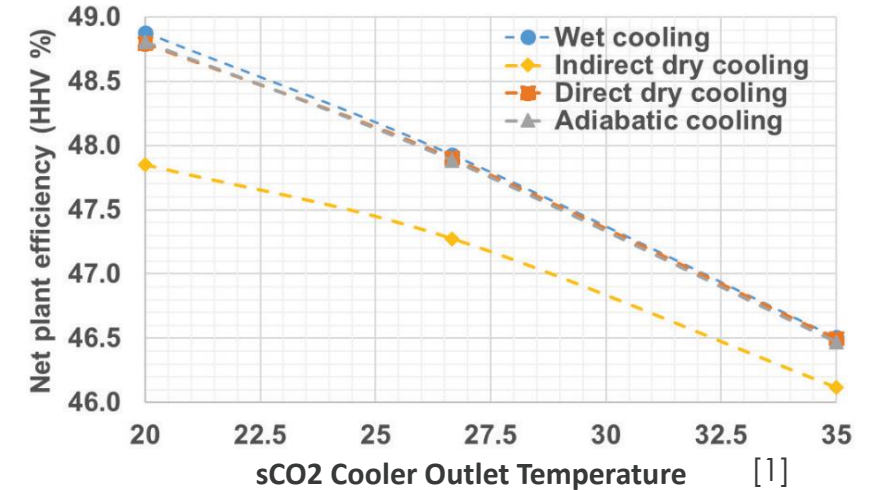
- **Increased efficiency**
  - Coolers: (2-4% pts increase) [1-2]
  - Turbine cooling (3% pt increase)\*[3]
- **Compact heat exchange equipment**
- **Reduced cost of electricity**
  - Coolers: (3-8% reduction) [1-2]

\* Advanced cooling strategies are required to optimize turbine performance

[1] Pidaparti, et al., 2020, "Cooling System Cost and Performance Models To Minimize Cost of Electricity of Direct sCO<sub>2</sub> Power Plants," 7th Int. Supercrit. CO<sub>2</sub> Power Cycles Symp

[2] Ahmed et al., 2023, Int. Commun. Heat Mass Transf., **142**(February), p. 106675.

[3] Uysal, S. C., et al. (2022). "Cooling analysis of an axial turbine for a direct fired sCO<sub>2</sub> cycle and impacts of turbine cooling on cycle performance." *Energy Conversion and Management* **263**: 115701.



Design optimization for single flow turbine

# sCO<sub>2</sub> FWP Task 2

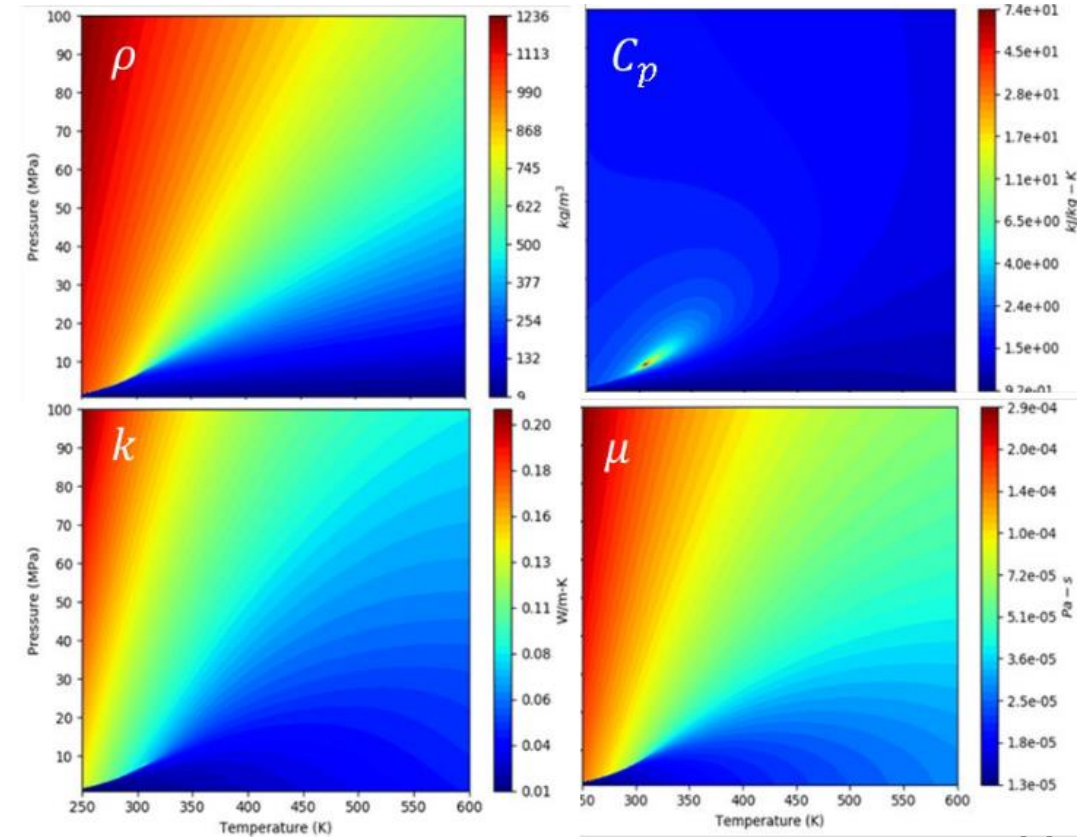
## sCO<sub>2</sub> Heat Transfer

### Challenges

- Property gradients, small approach temperatures, buoyancy and secondary flows, phase change, working fluid mixtures, non-linear rig behavior, dataset size

### Approach

- Develop technologies for effective recuperators, primary coolers, and blade/vane thermal management
- Leverage machine learning and advanced manufacturing technologies
- Utilize experimental and computational capabilities at NETL



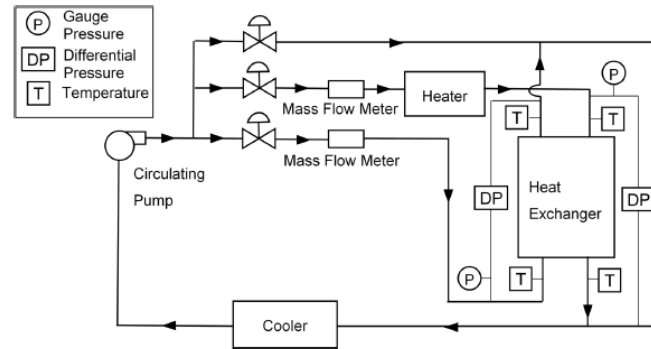
[1]

[1] S. Ramesh, and D. Straub, DOE/NETL-2021/2842

# NETL sCO<sub>2</sub> Test Capabilities

## HEET

- Heat Exchange and Experimental Testing
- *Coolers, blade/vane internal cooling, low temperature recuperators*



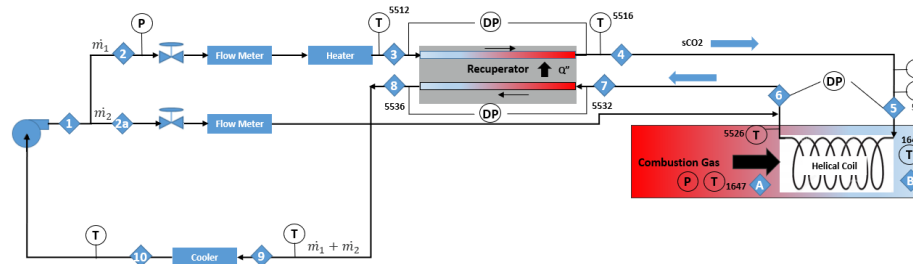
NETL HEET

## SCORPION

- Supercritical CO<sub>2</sub> at Realistic Pressure, Intensity, and OperatioNs
- *High temperature recuperators, primary heaters*

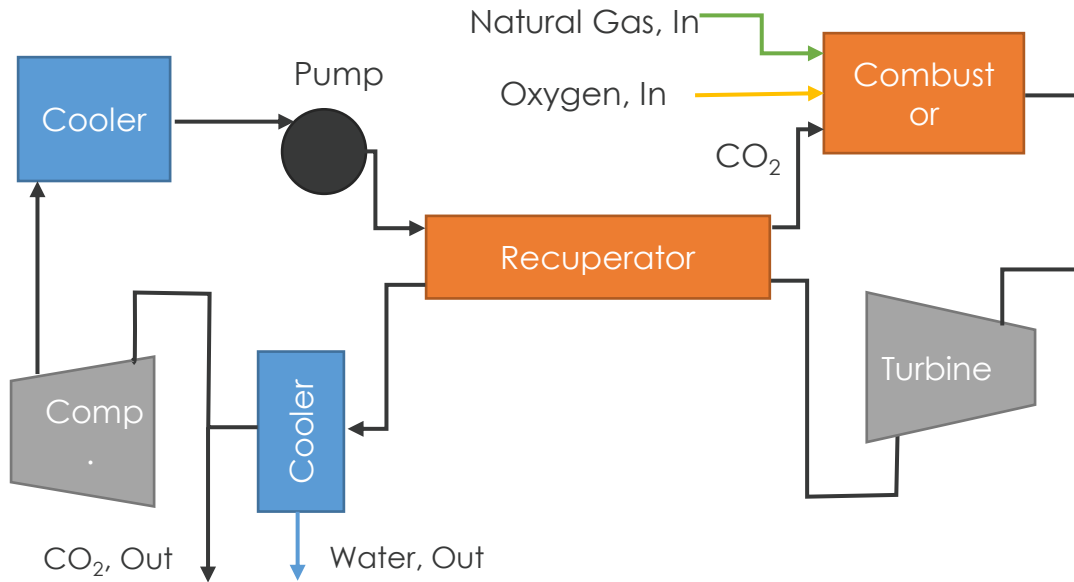
## CONDENSE

- CarbON Dioxide Energy StoragE
- *Heat exchangers for trans-critical power cycles, energy storage, and waste heat recovery*

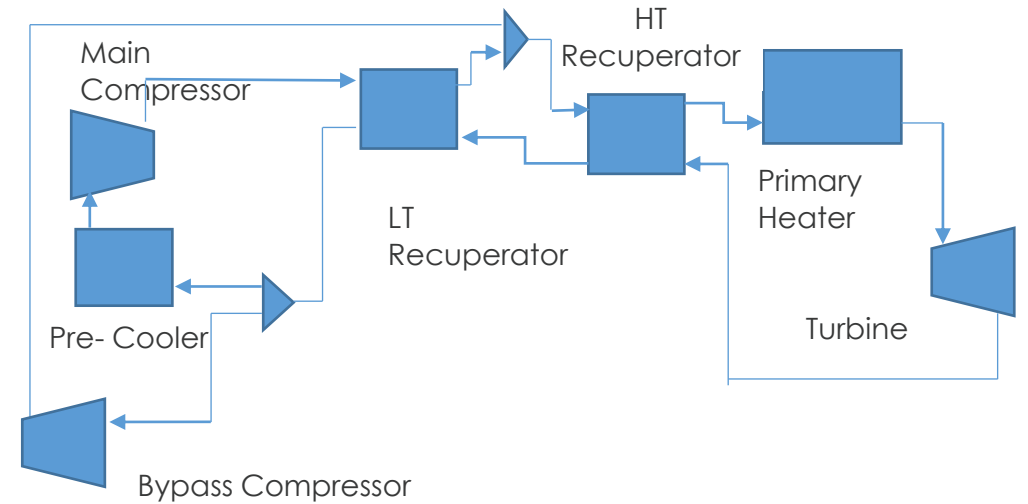


NETL SCORPION

# sCO<sub>2</sub> Power Cycles and Heat Transfer



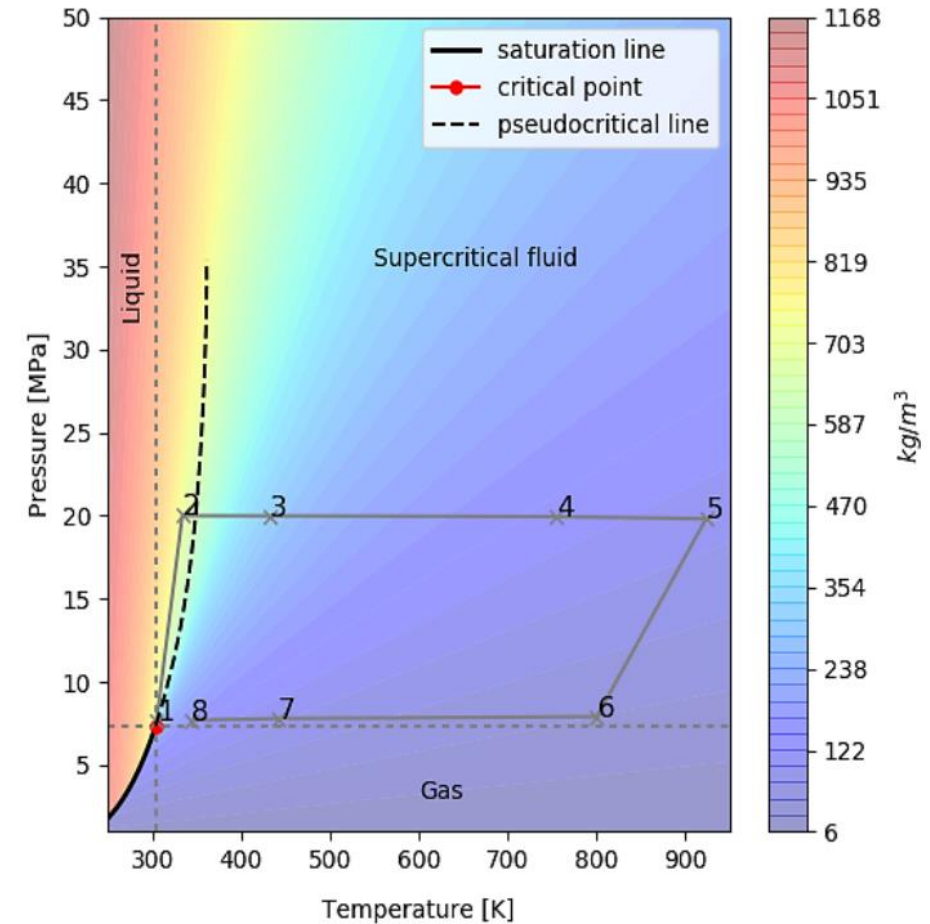
**Direct: Simple, Recuperated  
Brayton Cycle**



**Indirect: Recompression  
Brayton Cycle**

# Outline

- sCO<sub>2</sub> cycle coolers
- sCO<sub>2</sub> turbine cooling technology
- Advanced manufacturing and recuperator heat transfer
- Machine learning applications
- Two-phase heat transfer in trans-critical CO<sub>2</sub> cycles



[1]

[1] S. Ramesh, and D. Straub, DOE/NETL-2021/2842

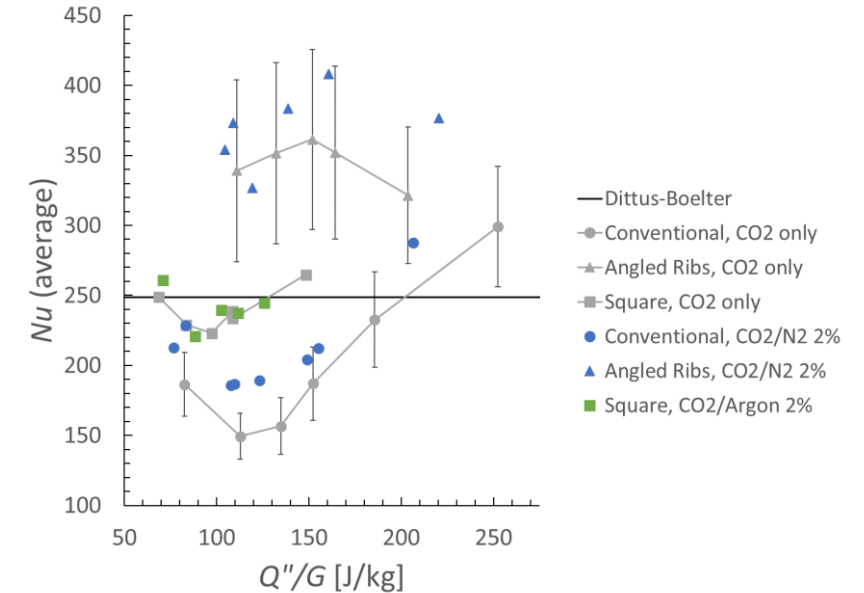
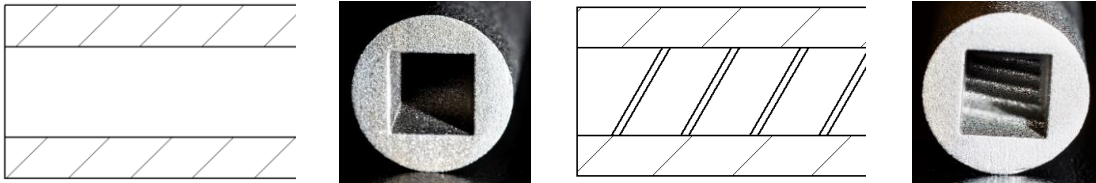


# sCO<sub>2</sub> Cycle Coolers

## Heat Transfer Enhancement and Impact of Working Fluid Impurities

### Background

- Heat transfer degradation due to buoyancy [1]
- Argon and nitrogen may be present as minor impurities in direct cycles due to inefficiencies in the air separation unit [2]
- Impact of impurities (if any) was expected to be large near the pseudo-critical line (coolers)



### Outcomes

- Impact of 2% N<sub>2</sub> and 2% Argon is small
- Additive manufacturing (AM) roughness and rib patterning are effective enhancement technologies for coolers, achieving 40% and 110% improvement, respectively

[1] Jackson, J. D. (2017). "Models of heat transfer to fluids at supercritical pressure with influences of buoyancy and acceleration." *Applied Thermal Engineering* 124: 1481-1491.

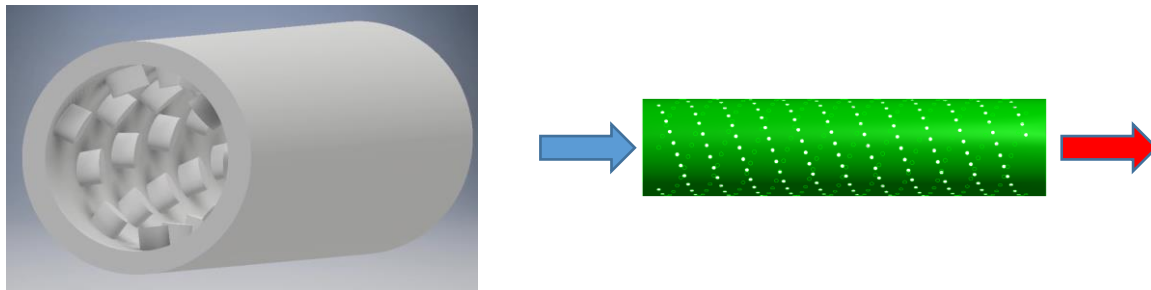
[2] White et al., 2020, *Cooling Technology Models for Indirect sCO<sub>2</sub> Cycles*, sCO<sub>2</sub> Symposium

# Parametric Optimization

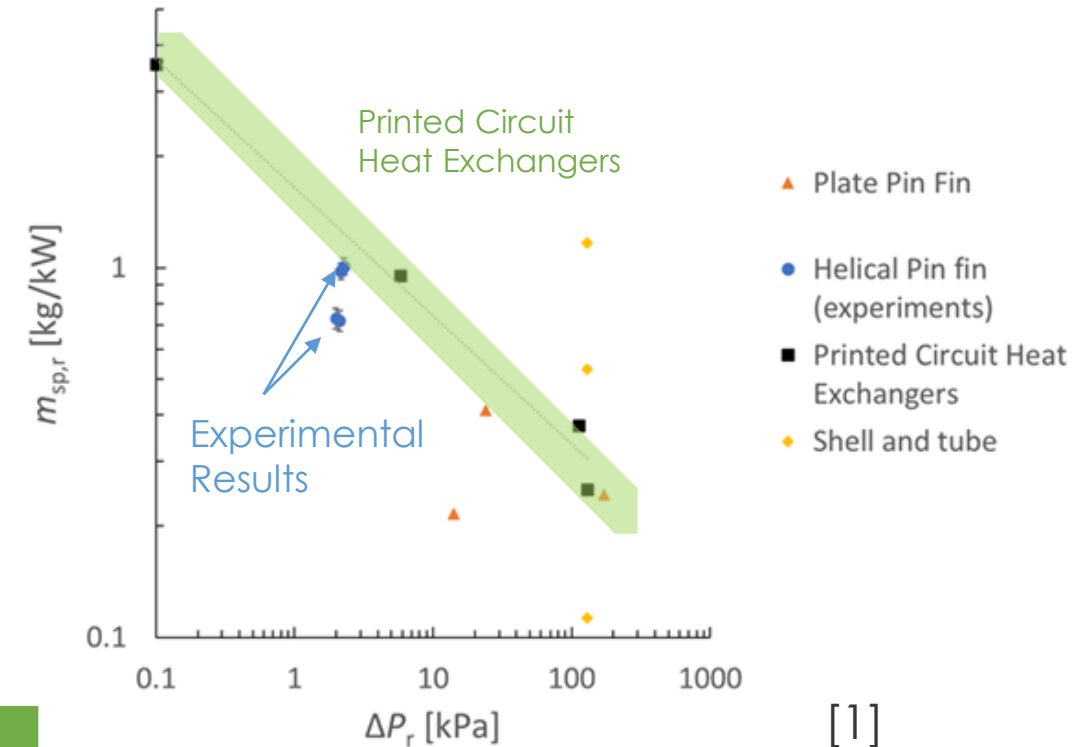
## AM Enabled Geometry Optimized using Computational Fluid Dynamics (CFD)

### Internal Tube Helical Pin Arrays

- CO<sub>2</sub> @ 155 bar, 400 K
- Reynold's Number: 120,000
  - Based on smooth tube dia.
- Prandtl Number: 1.1
- Concept: Elliptical pins on helical paths angled with respect to the flow



Major Pin-fin Diameter	Minor Pin-fin Diameter	Pin-fin Length	Pin-fin Helical Spacing	Wall Angle	Flow Angle	No. Helix Paths	Helix Pitch
0.25-0.75 mm	0.25-0.75 mm	1.0-3.0 mm	$2d_{pin}-6d_{pin}$	20-45 deg	15-75 deg	3-7	1D-5D mm



[1] Robey, E. H., Ramesh, S., Sabau, A. S., Abdoli, A., Black, J. B., Straub, D. L., & Yip, M. J. (2022). Design Optimization of an Additively Manufactured Prototype Recuperator for Supercritical CO<sub>2</sub> Power Cycles. *Energy*, 251, 12.

# Parametric 3D-CFD Optimization

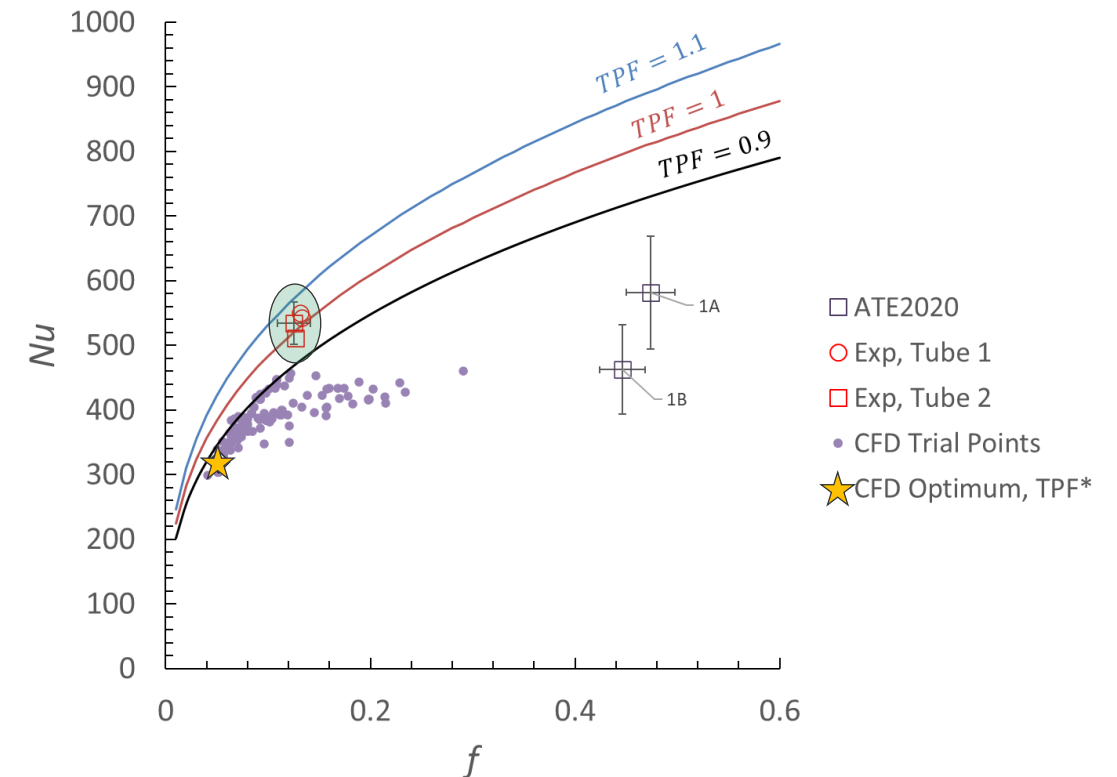
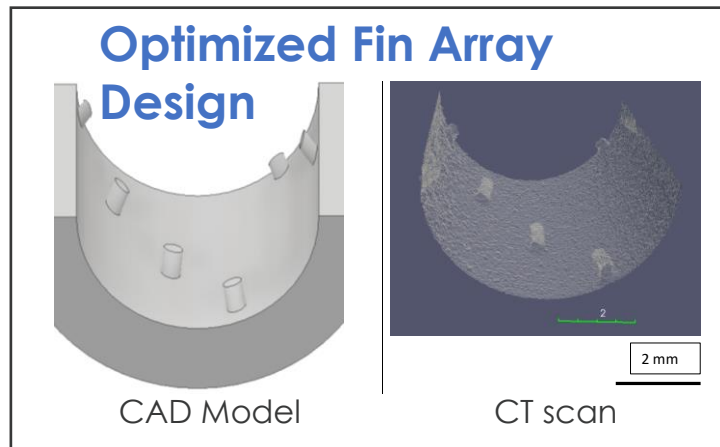
## Heat Transfer Performance Details

AM “optimization-inspired” design tested at condition

- 14% improvement in  $Nu$  relative to CFD
- Friction factor decreased 4x relative to baseline

$$TPF = (Nu/Nu_0)/(f/f_0)^{1/3}$$

$$TPF^* = \frac{TPF}{\frac{\text{fin volume}}{\text{length}}}$$



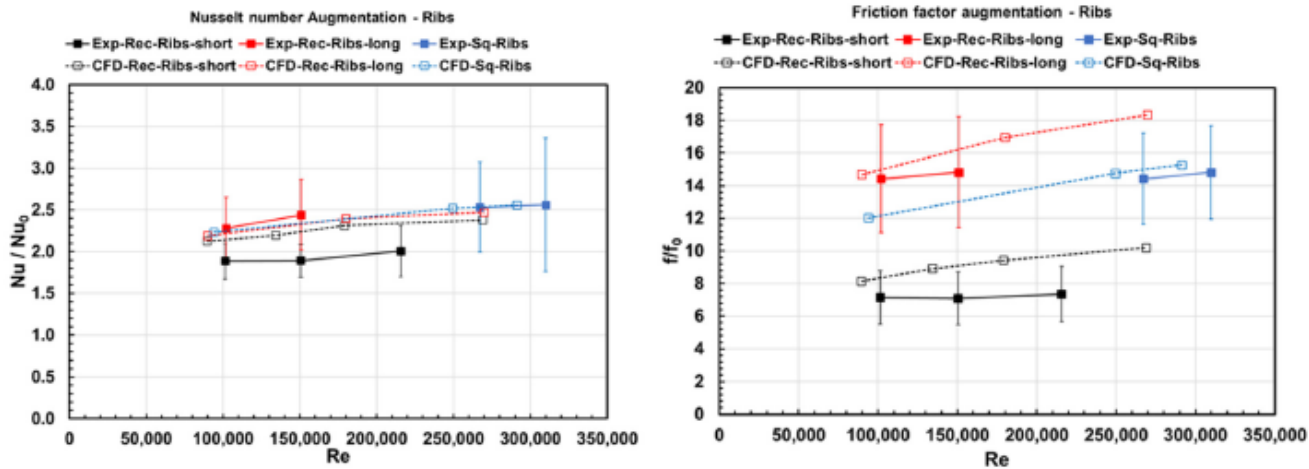
# Machine Learning Application

## sCO<sub>2</sub> Turbine Cooling

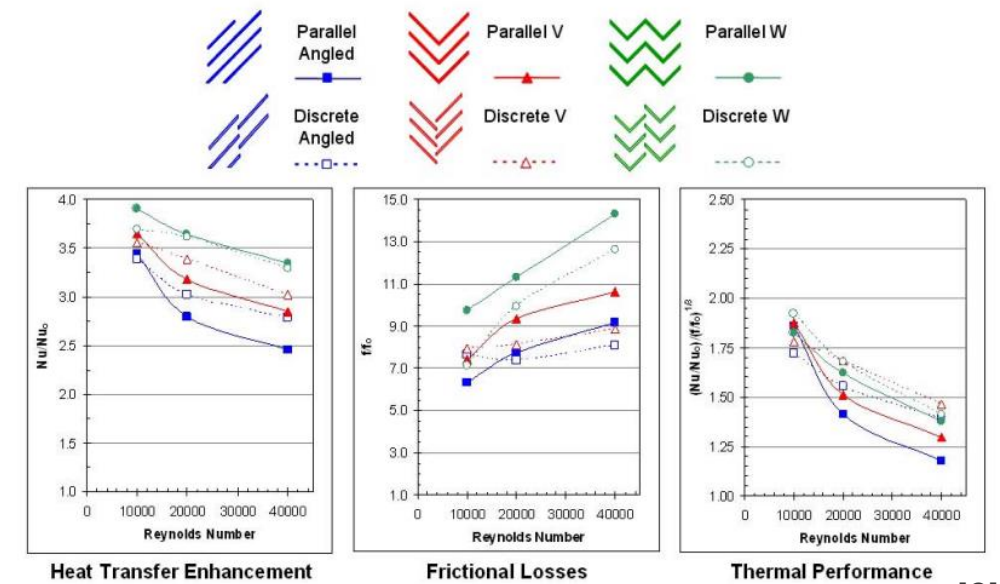
### Background

- Blade/vane cooling is required in direct-fired cycle [1]
- Classic rib cooling technologies perform better in CO<sub>2</sub> than in air\*[2]
- New datasets and correlations are needed
- ML models can guide and supplement the experimental approach<sup>1-</sup>

\* at matched conditions



[3]



[2]

[1] Uysal, S. C., et al. (2022). "Cooling analysis of an axial turbine for a direct fired sCO<sub>2</sub> cycle and impacts of turbine cooling on cycle performance." *Energy Conversion and Management* **263**: 115701.  
 [2] A. Roy, M. Searle, S. Ramesh, D. Straub. "Investigation of Gas Turbine Internal Cooling Using Supercritical CO<sub>2</sub>—Effect of Surface Roughness and Channel Aspect Ratio," *Journal of Engineering for Gas Turbines and Power*, 144(November 2022) 111019.  
 [3] J-C Han, L. M. Wright, 4.2.2.2 "Enhanced Internal Cooling of Turbine Blades and Vanes," *Gas Turbine Handbook*. NETL. 2006

# Machine Learning Applications

## *sCO<sub>2</sub> Turbine Cooling*

### HEET ML heat exchanger model

- Large dataset: 4,000+ operational hours

### Screened

- Gaussian process regressor
- Gradient boosting regressor
- **Multi-layer perceptron regressor (selected)**

### Implementation

- Scikit-learn in Python
- Five layers with 100 neurons

### Applications

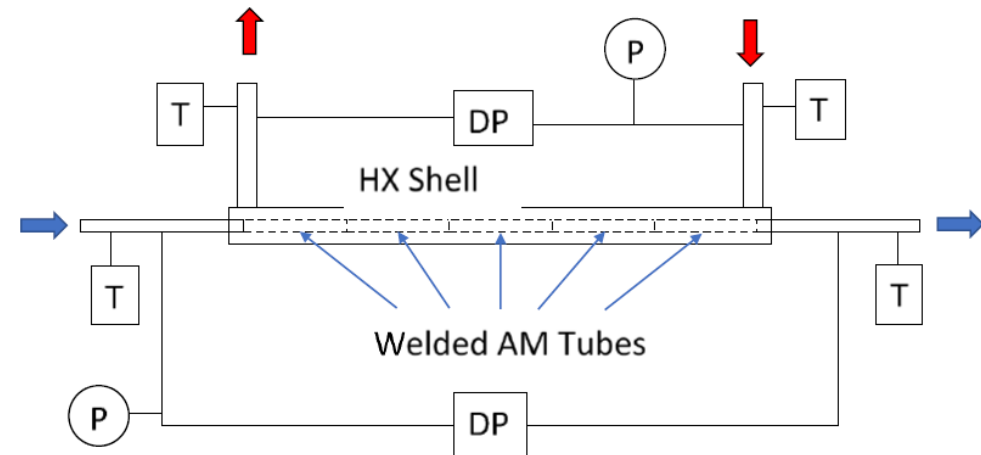
- Test plan development
- Virtual experiments
- Surrogate model for optimization

### Inputs

- Tube and shell inlet temperature and pressure
- Tube and shell mass flow rates
- Tube feature parameters

### Outputs

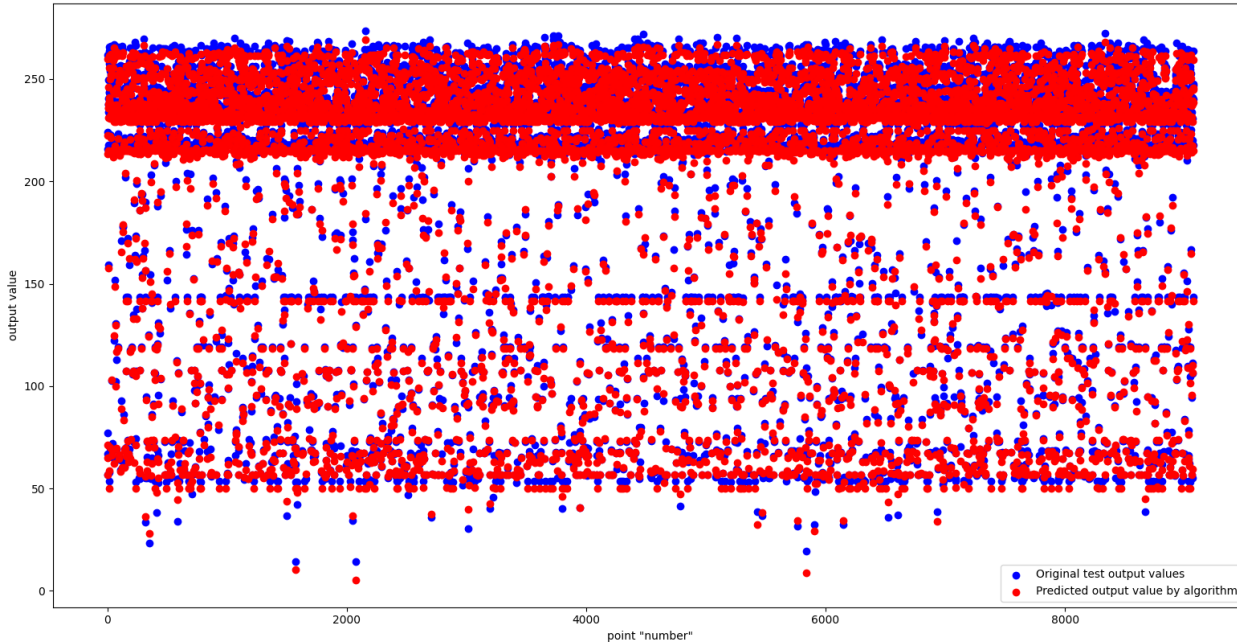
- Tube and shell outlet temperature
- Tube pressure drop



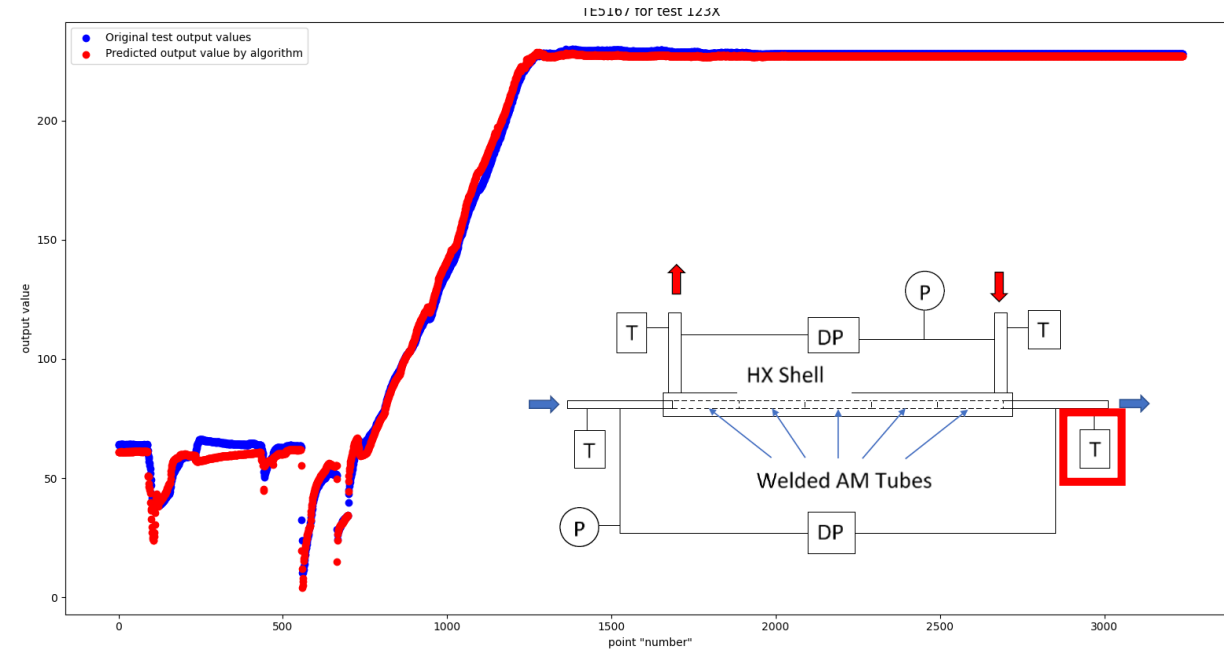
# Machine Learning Applications

## Tube Outlet Temperature

### Training Data



### Test Data

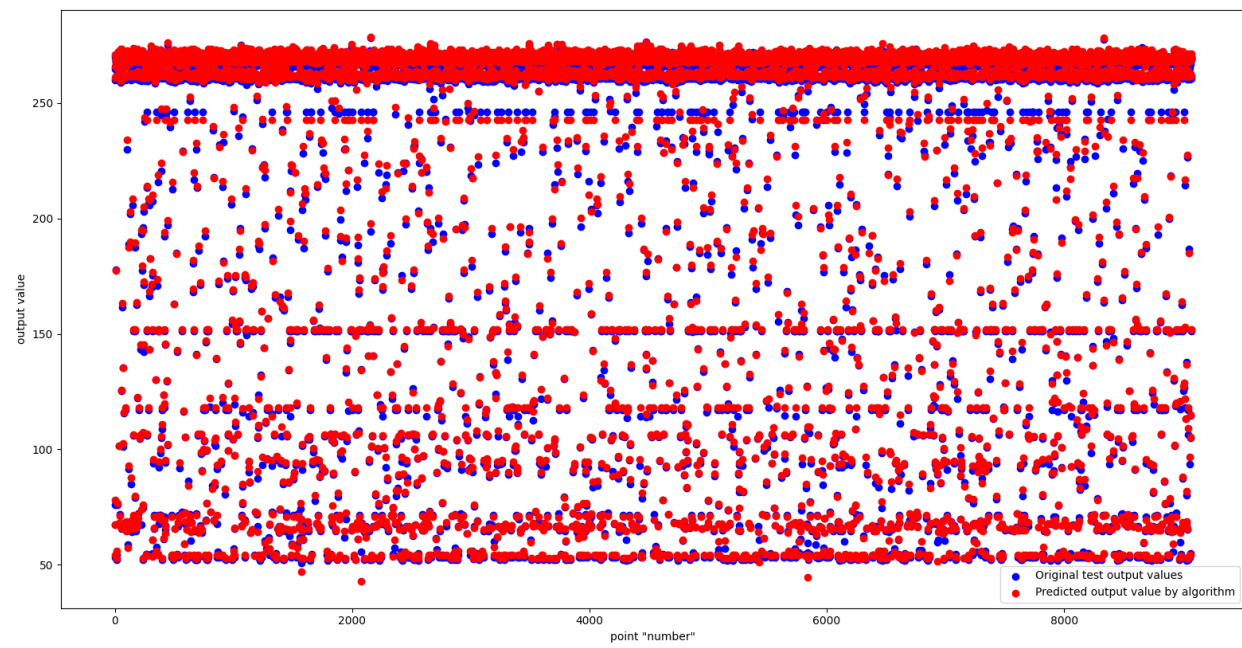


	Training	Test
$R^2$	0.998	
Mean absolute error	2.2 °F	2.2 °F
Max absolute error	12.9 °F	17.5 °F

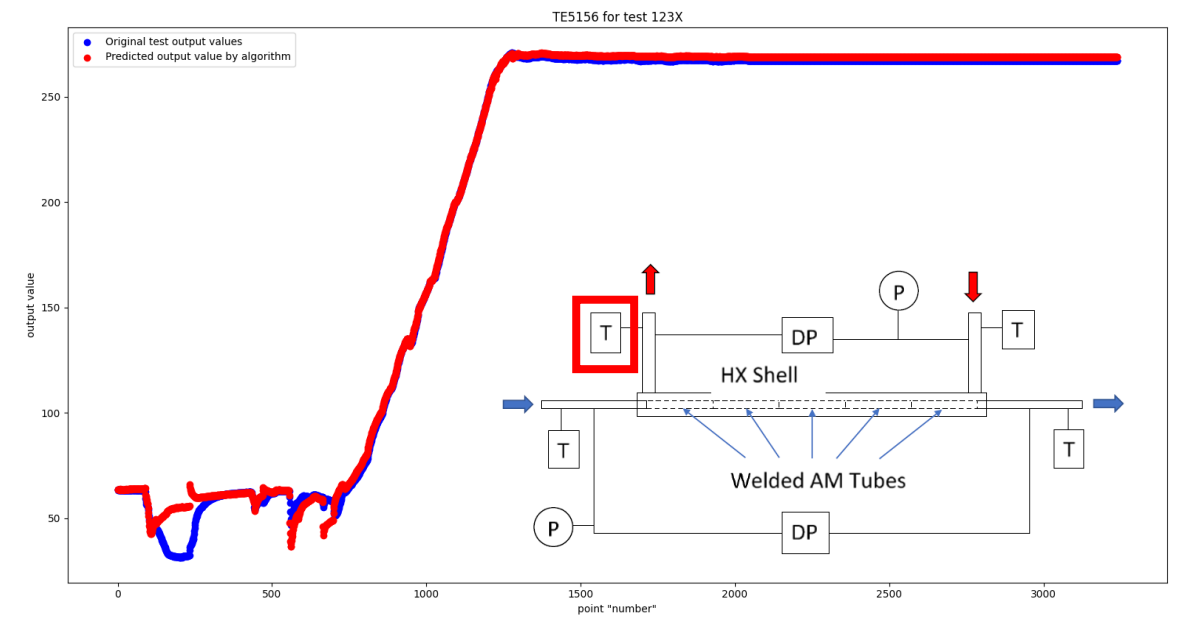
# Machine Learning Applications

## Shell Outlet Temperature

### Training Data



### Test Data



	Training	Test
$R^2$	0.9995	
Mean absolute error	1.38 °F	2.5 °F
Max absolute error	14.9 °F	31.3 °F

# Trans-critical CO<sub>2</sub> Cycles

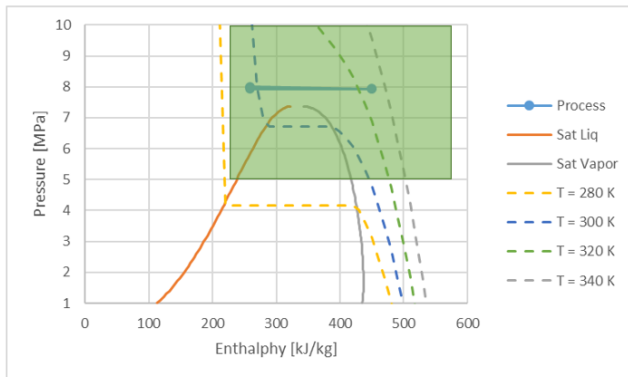
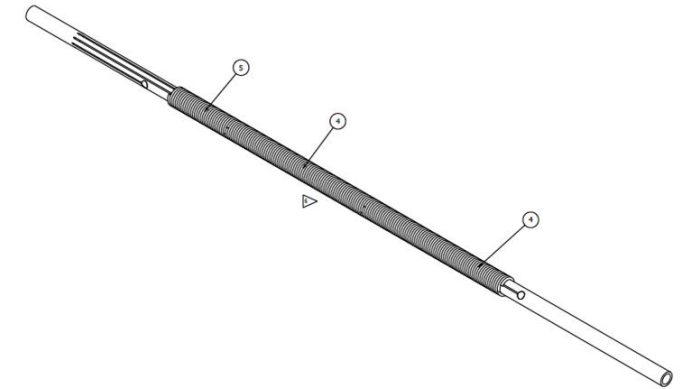
## Enabling Higher Efficiency, Flexible Heat Source Power Cycles

### Background

- Condensing operation is an option to minimize cost of electricity (COE) and maximize power generation in sCO<sub>2</sub> cycles [1]
- Heat exchange enhancement technologies may be applied via AM in evaporators/boilers, condensers, and intercoolers

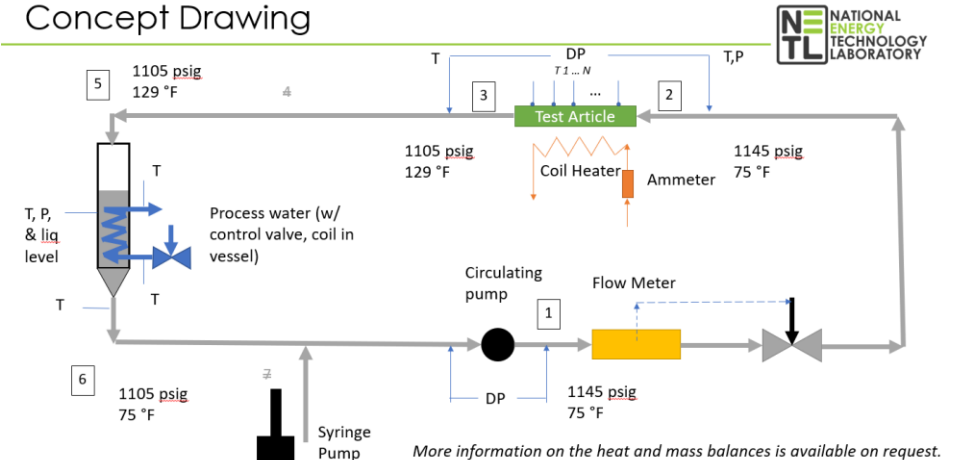
### Design Status

- Rig design underway with contractor
- Phase-change test article design complete



Operational envelope

### Concept Drawing



[1] Liese, E. and S. Pidaparti (2023). Modeling a water-cooled printed circuit heat exchanger condensing CO<sub>2</sub> for use in sCo<sub>2</sub> cycle system optimization studies. Proceedings of Turbo Expo 2023, Boston, Massachusetts, ASME, 102269.



# Task 2 : EY23 Milestones/Deliverables

## sCO<sub>2</sub> Heat Transfer

Expected Completion Date	Description	Status
12/30/2023	2.1.1. Improve design models and correlations for direct cycle main cooler, including gas composition effects	In progress
1/31/2024	2.1.2. Utilize machine learning (CFD and experimental data for training) to design at least one heat transfer enhancement feature for primary cooler application at direct sCO <sub>2</sub> cycle conditions	In progress
3/31/2024	2.1.3. Evaluate liquid CO <sub>2</sub> heat transfer and pressure drop behavior	Rig design and commissioning started

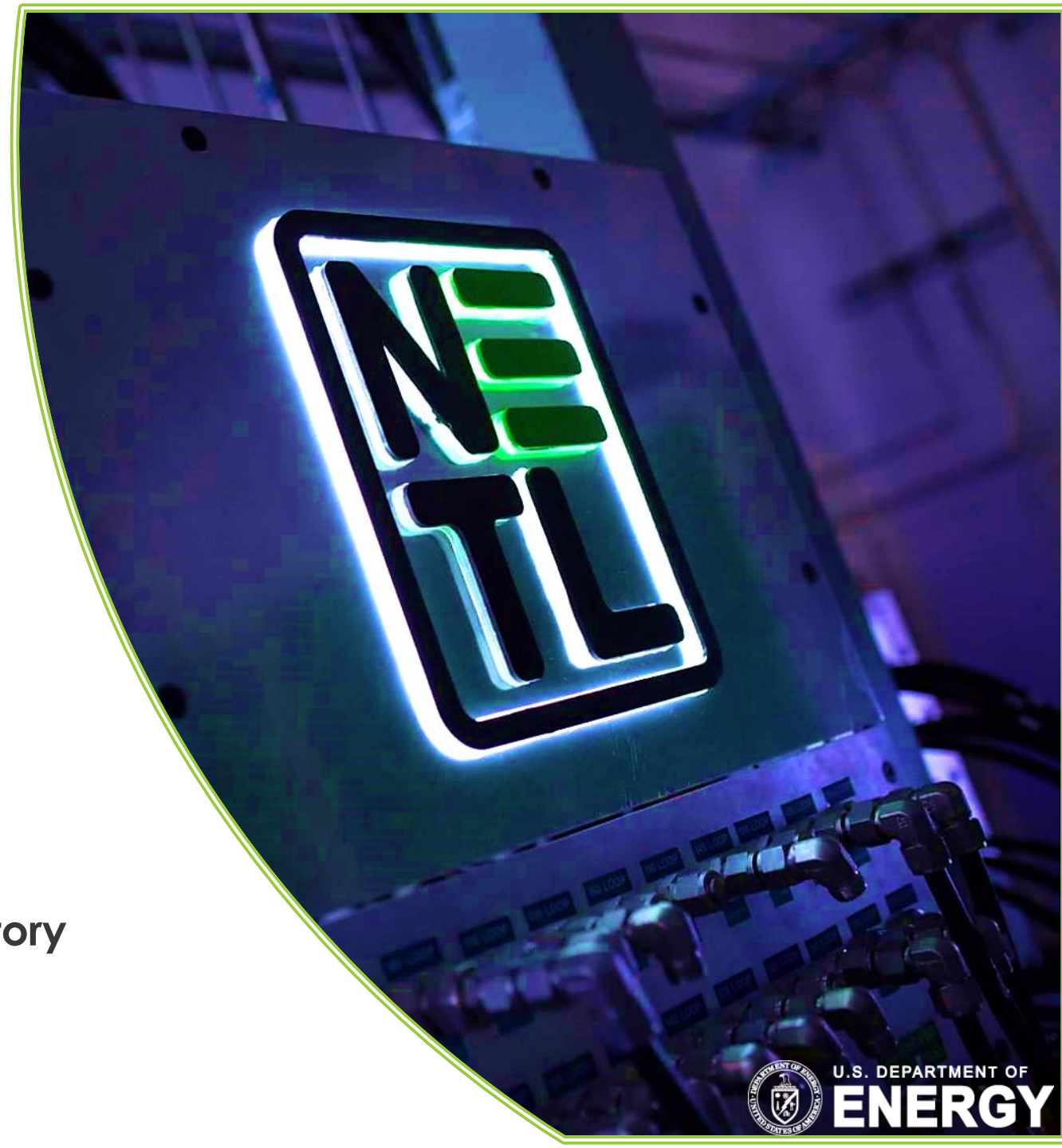
- AM roughness and rib turbulators enable more effective sCO<sub>2</sub> coolers
- Trace argon and nitrogen negligibly impact heat exchanger performance
- Deviation from design intent and surface roughness resulted in a recuperator tube design with 14% increase in  $Nu$  relative to CFD.  $f$  decreased by a factor of 4.
- A multilayer perceptron regressor has been trained to guide heat exchanger experiments

# NETL

# RESOURCES

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