



# Integrating working fluid design into the thermo-economic design of ORC processes using PC-SAFT

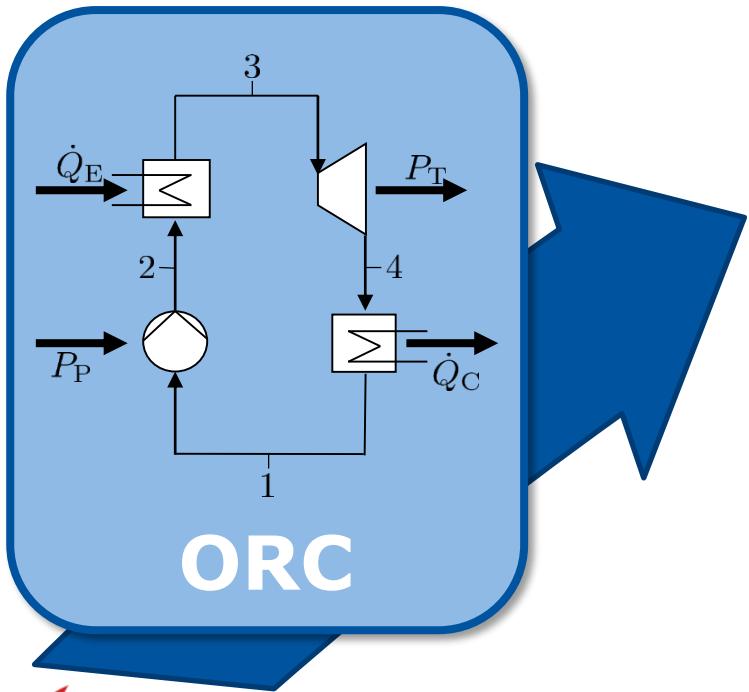
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Joachim Gross<sup>b</sup> and André Bardow<sup>a</sup>

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Germany

ORC 2017 Conference, Milano, Italy, 13<sup>th</sup>-15<sup>th</sup> September 2017

# Organic Rankine Cycle (ORC)



electrical  
power

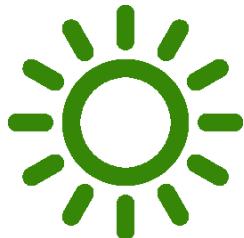


Renewable  
energy and  
waste heat

low temperatures  
low capacities



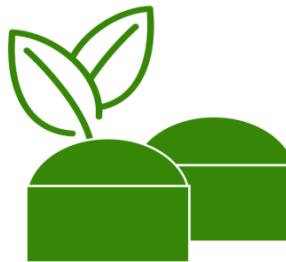
2



solar



geothermal



biogas



industrial  
waste heat



automotive  
waste heat

# Organic Rankine Cycle (ORC)

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Working  
fluid?

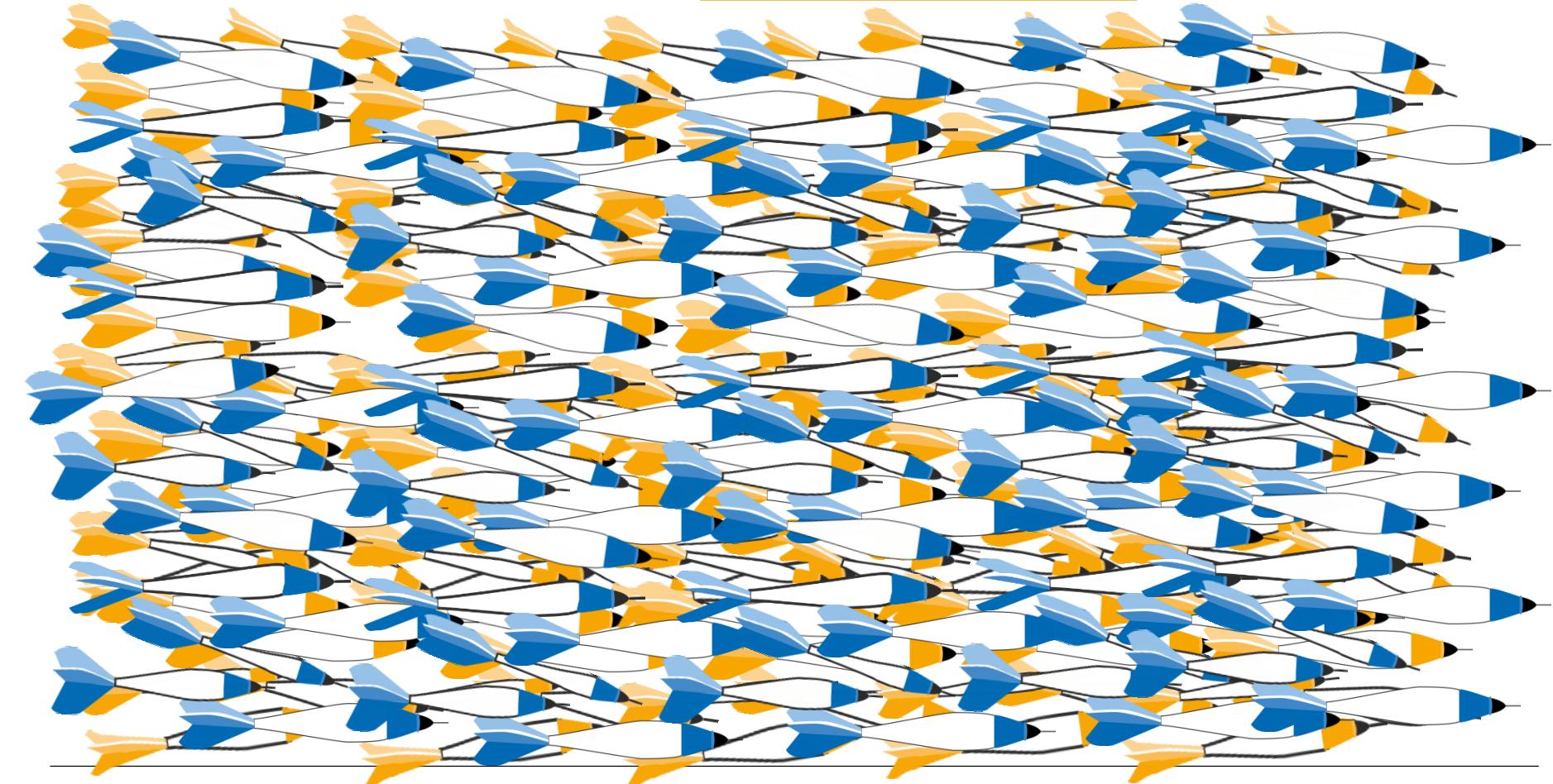
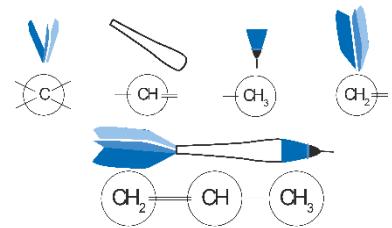
Organic!

But which?

# Working fluids for ORCs

DATABASE	
ID	name
1	ethane
2	benzene
3	propane
...	

DESIGNER MOLECULES



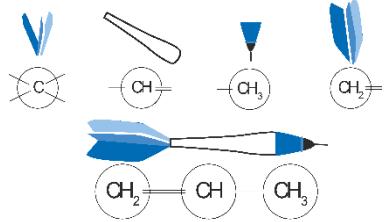
# ORC design: heuristics

e.g., normal boiling pressure, enthalpy of evaporation

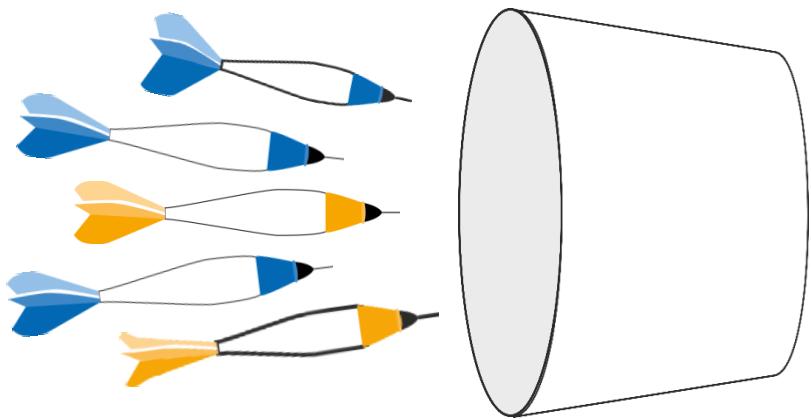
## DATABASE

ID	name
1	ethane
2	benzene
3	propane
...	

## DESIGNER MOLECULES



thermo-economic performance



molecule  
design



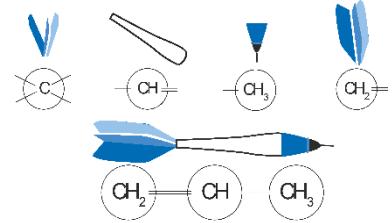
# ORC design: thermodynamics

e.g., net power output,  
thermal efficiency

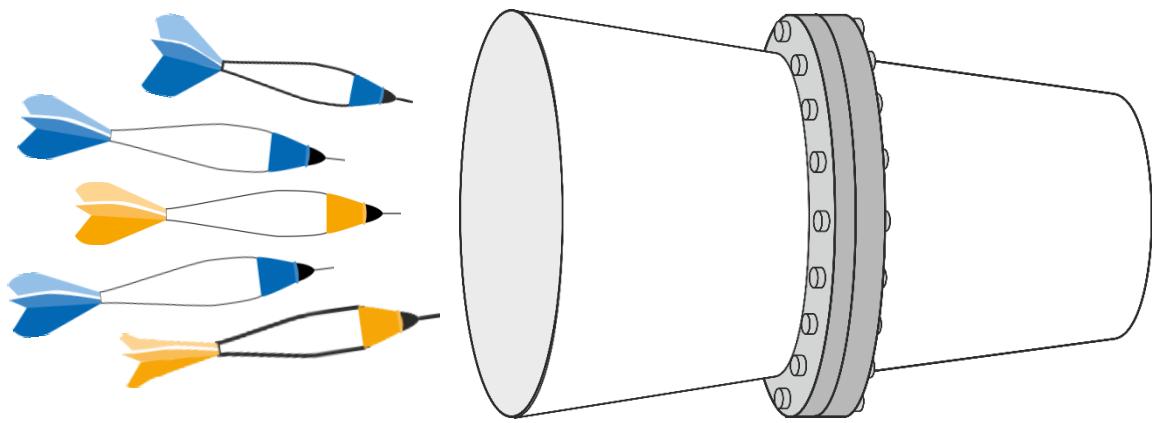
## DATABASE

ID	name
1	ethane
2	benzene
3	propane
...	

## DESIGNER MOLECULES



thermo-economic  
performance



molecule  
design

process  
design

model for  
equilibrium properties



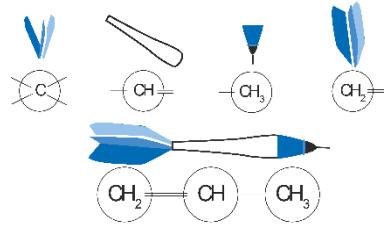
# ORC design: economics

e.g., net present value,  
specific investment cost

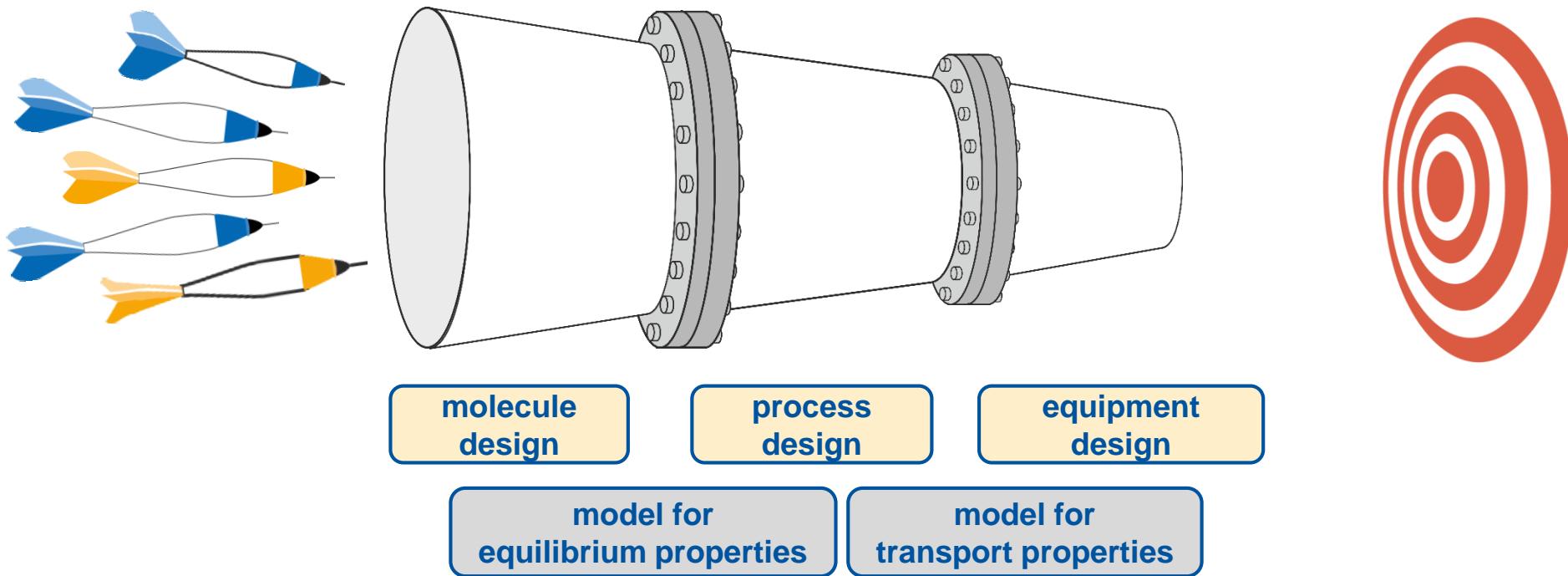
## DATABASE

ID	name
1	ethane
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3	propane
...	

## DESIGNER MOLECULES



thermo-economic  
performance



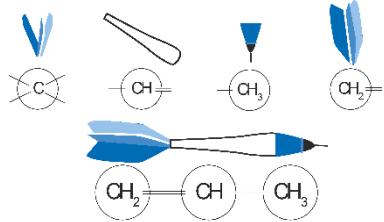
## ORC design: economics

e.g., net present value,  
specific investment cost

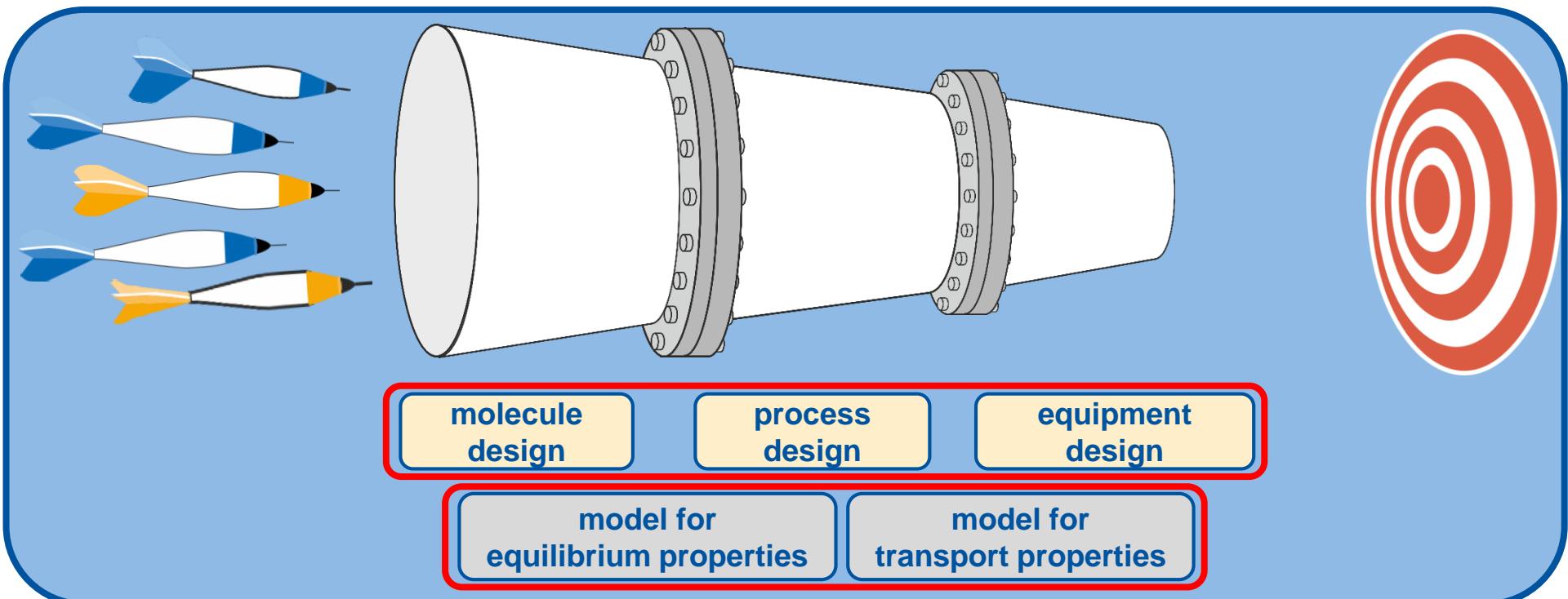
### DATABASE

ID	name
1	ethane
2	benzene
3	propane
...	

### DESIGNER MOLECULES



thermo-economic  
performance



# Integrated thermo-economic Design

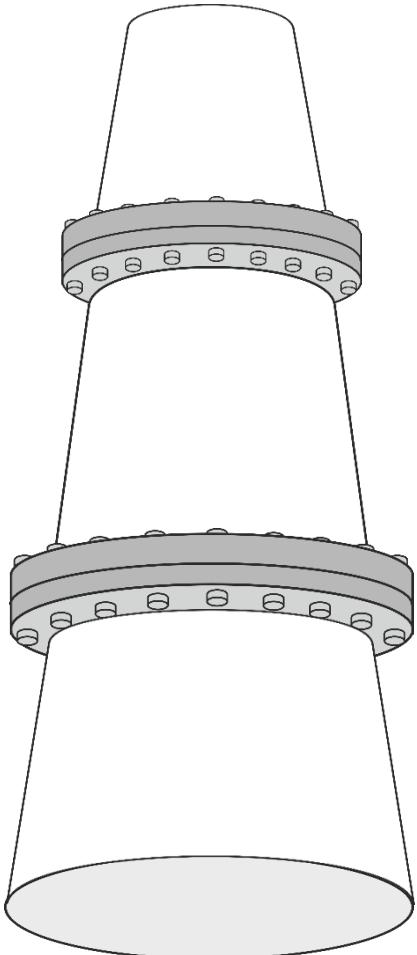
PC-SAFT

for transport

PC-SAFT for equilibrium

molecule design

equipment design



9       $x$  process degrees of freedom  
 $\theta$  equilibrium properties  
 $\kappa$  transport properties

$z$  pure component parameters  
 $y^s$  molecular structure

e.g., specific investment cost

$$\min f(x, \theta, \kappa)$$

$$\text{s.t. } g_1(x, \theta, \kappa) = 0 \quad \text{e.g., heat transfer correlations}$$

$$g_2(x, \theta, \kappa) \leq 0 \quad \text{e.g., turbine constraints}$$

$$\kappa = k(x, \theta, z, y^s)$$

PC-SAFT  
transport properties

$$p_1(x, \theta) = 0$$

e.g., energy balances

$$p_2(x, \theta) \leq 0$$

e.g., min./max. pressure levels

$$\theta = h(x, z, y^s)$$

PC-SAFT  
equilibrium properties

$$z = GC \cdot y^s$$

CAMD – feasibility of the  
molecular structure

$$F_1 \cdot y^s = 0$$

$$F_2 \cdot y^s \leq 0$$

$$x_{lb} \leq x \leq x_{ub} \in \mathbb{R}^n$$

$$y_{lb}^s \leq y^s \leq y_{ub}^s \in \mathbb{Z}^l$$

# Model for equilibrium properties: PC-SAFT<sup>1-2</sup>

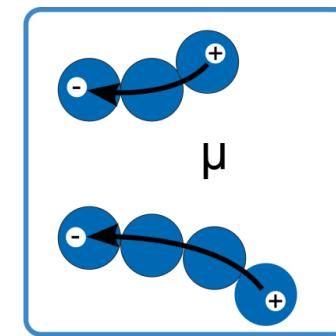
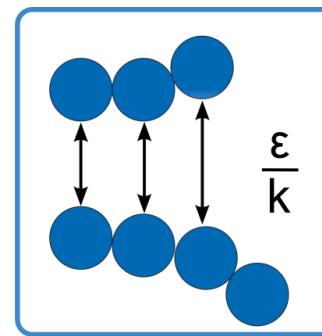
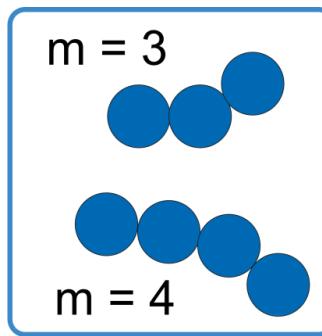
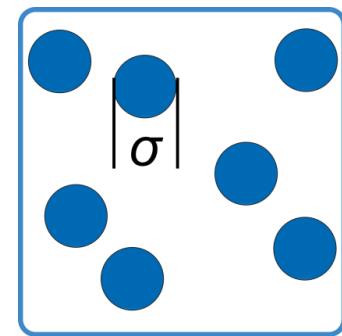
PC-SAFT for transport

equipment design

process design

PC-SAFT for equilibrium

molecule design



$$A^{res} = A^{hs} + A^{chain} + A^{disp} + A^{pol}$$

## Pure component parameters:

segment diameter

$\sigma$  / Å

segment number

$m$  / -

segment dispersion energy

$\varepsilon/k$  / K

dipole moment

$\mu$  / D

$$z = \begin{pmatrix} \sigma \\ m \\ \varepsilon/k \\ \mu \end{pmatrix} \xrightarrow{+ p, T} \theta = \begin{pmatrix} h \\ s \\ v \\ \dots \end{pmatrix}$$

10 [1] Gross and Sadowski Ind. Eng. Chem. Res. 2001;40(4):1244–60.  
 [2] Gross J and Vrabec AIChE J. 2006;52(3):1194–204.

# Model for transport properties: PC-SAFT<sup>1-3</sup>

PC-SAFT for  
transport

✓ PC-SAFT for  
equilibrium

molecule  
design

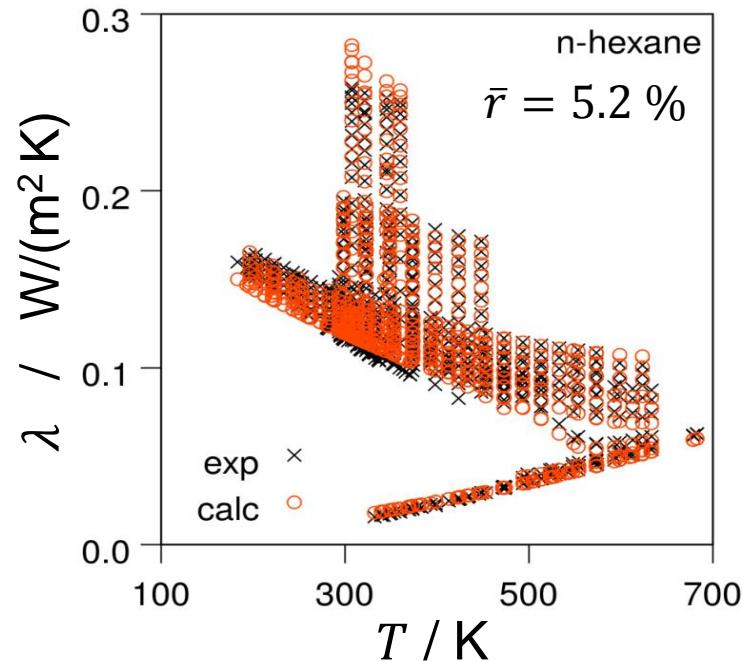
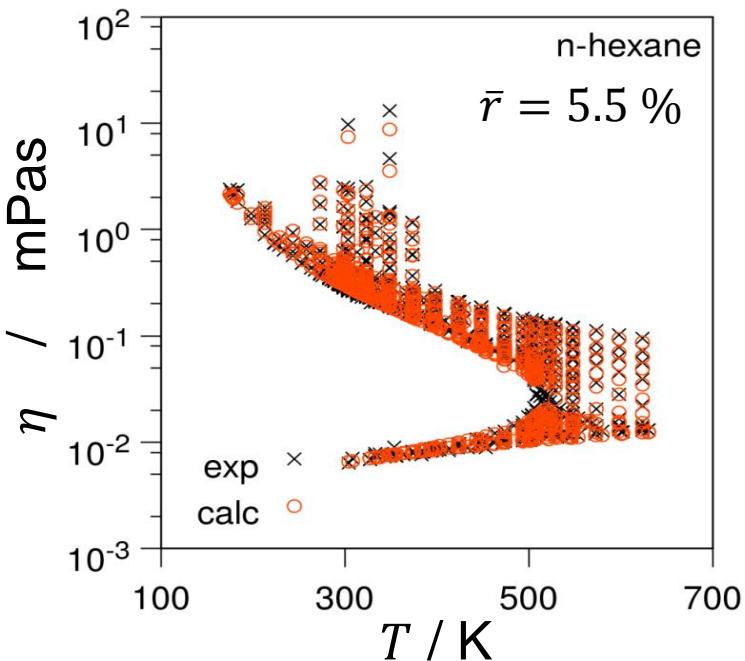
equipment  
design

Based on Rosenfeld's entropy scaling:

$$\kappa = \binom{\eta}{\lambda} = \kappa_{\text{ref}} \cdot \kappa^*$$

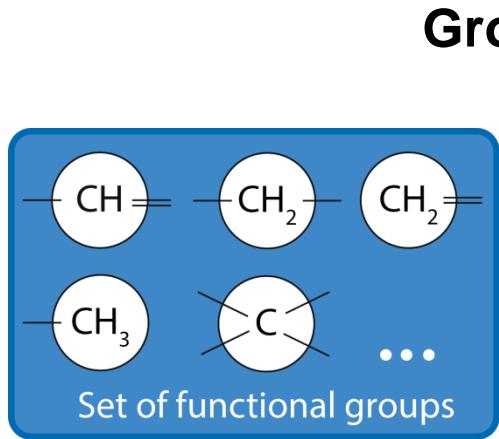
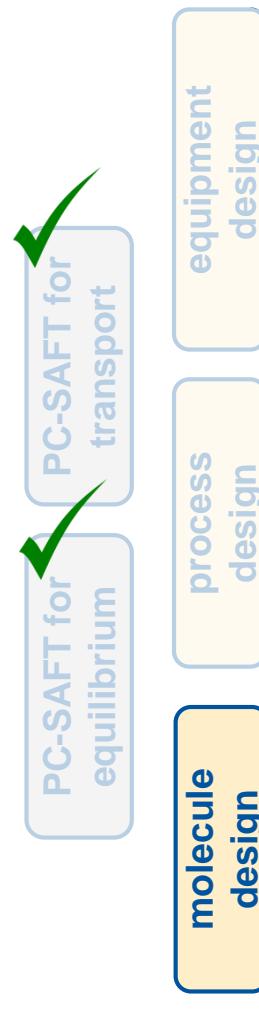
$$\kappa_{\text{ref}} = f(CE)$$

$$\ln(\kappa^*) = A_\kappa + B_\kappa \hat{s} + C_\kappa \hat{s}^2 + D_\kappa \hat{s}^3$$



- 11 [1] Lötgering-Lin and Gross, *Ind. Eng. Chem. Res.*, 2015, 54 (32), 7942-7952  
[2] Hopp and Gross, *Ind. Eng. Chem. Res.*, 2017, 56 (15), 4527–4538  
[3] Hopp and Gross, PPEPPD, 22-26 May 2016, Granja – Portugal

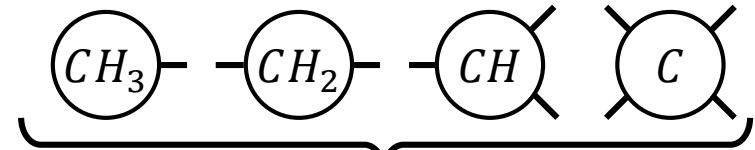
# Computer-aided Molecular Design



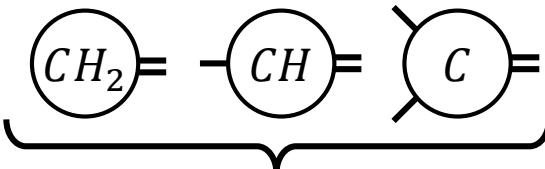
$$y^S = \begin{pmatrix} n_{\text{CH}_3} \\ n_{\text{CH}_2} \\ n_{\text{CH}} \\ \dots \end{pmatrix}$$

Constraints  
to ensure structural  
feasibility

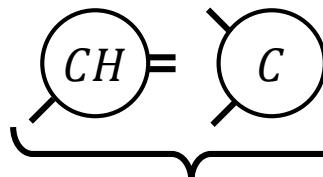
Groups for:



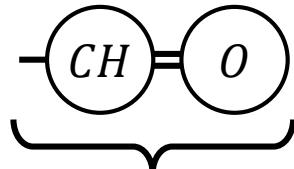
Alkanes



Alkenes

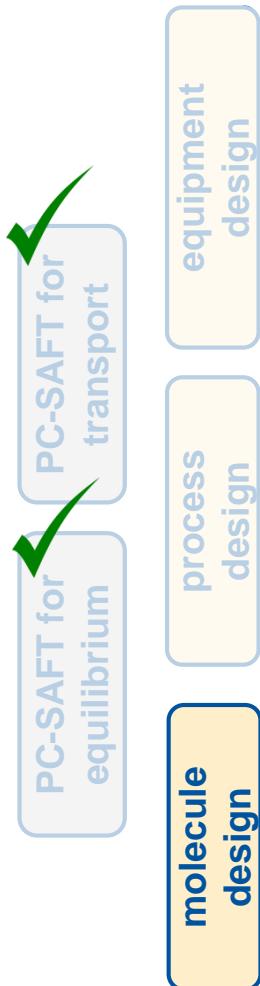


Aromates



Aldehydes

# Computer-aided Molecular Design



Group contribution methods for:

$$y^S = \begin{pmatrix} n_{\text{CH}_3} \\ n_{\text{CH}_2} \\ n_{\text{CH}} \\ \dots \end{pmatrix}$$
$$z = \begin{pmatrix} \sigma \\ m \\ \varepsilon/k \\ \mu \end{pmatrix}$$
$$t = \begin{pmatrix} A_\kappa \\ B_\kappa \\ C_\kappa \\ D_\kappa \end{pmatrix}$$
$$c_p^{ig}$$

A large blue cross-shaped arrow points from the vector  $y^S$  down to the vector  $z$ , then right to the vector  $t$ , and finally down to the scalar  $c_p^{ig}$ .

Pure component parameters of PC-SAFT<sup>1</sup>

Factors for the reduced transport properties<sup>2,3</sup>

Heat capacity of the ideal gas<sup>4</sup>

[1] Sauer, Stavrou and Gross Ind. Eng. Chem. Res. 2014;53(38):14854-64.

[2] Lötgering-Lin and Gross Ind. Eng. Chem. Res. 2015, 54 (32), 7942-7952

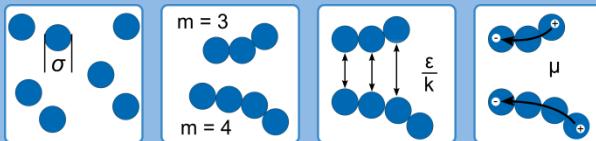
[3] Hopp and Gross, PPEPPD, 22-26 May 2016, Granja – Portugal

[4] Joback and Reid, Chem. Eng. Commun., 1987, 57, 233–243.

# Computer-aided Molecular Design

Heat capacity of the ideal gas  
 $c_p^{\text{ig}}(y^S, T)$   
Joback

PC-SAFT equation of state



Model of Helmholtz energy  $A$

⇒ **consistent thermodynamic model for equilibrium and transport properties**

feasibility

$c_p^{\text{tg}}$

Heat capacity of the ideal gas<sup>4</sup>

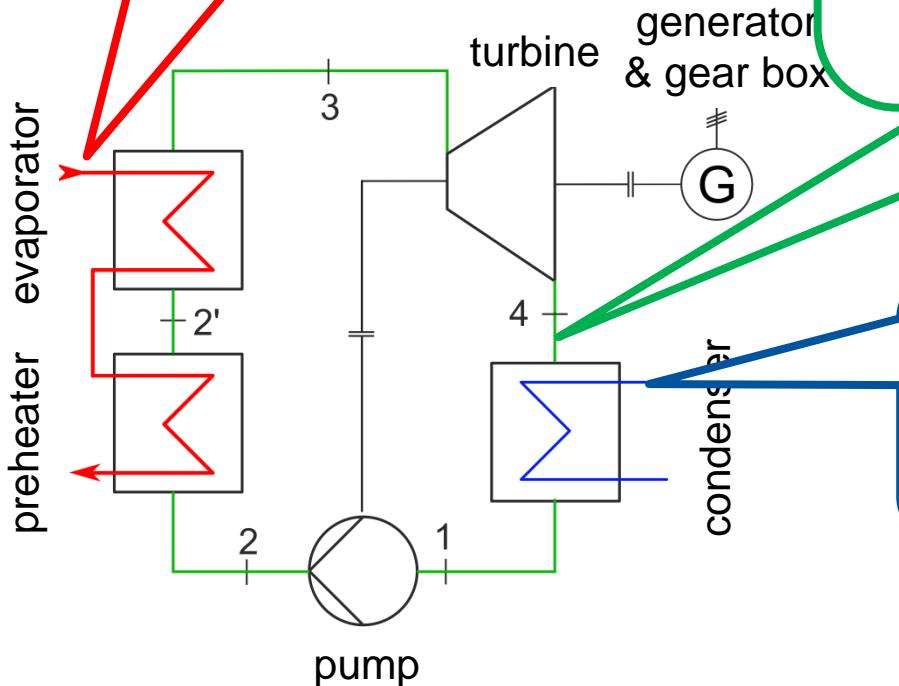
# ORC for waste heat recovery as case study

✓ PC-SAFT for transport

equipment design

process design

molecule design



Heat source: waste heat

$$T_{in} = 120^\circ\text{C}$$

$$\dot{m} = 20 \text{ kg/s}$$

Degrees of freedom:

$$0.1 \frac{\text{kg}}{\text{s}} \leq \dot{m}_{wf} \leq 500 \frac{\text{kg}}{\text{s}}$$

$$1 \text{ bar} \leq p_{cond} \leq p_{evap}$$

$$p_{cond} \leq p_{evap} \leq 50 \text{ bar}$$

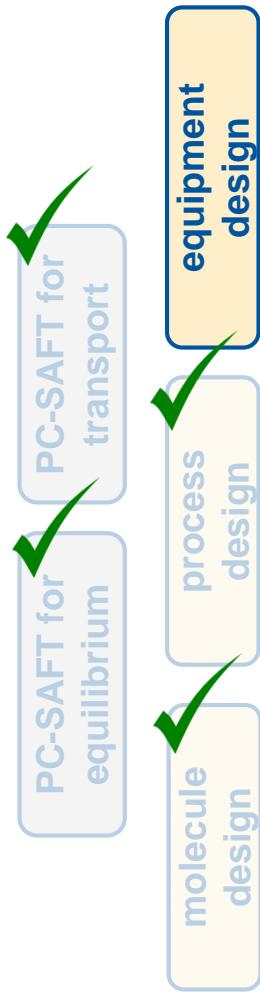
$$0 \text{ K} \leq \Delta T_{sh} \leq 200 \text{ K}$$

Heat sink: cooling water

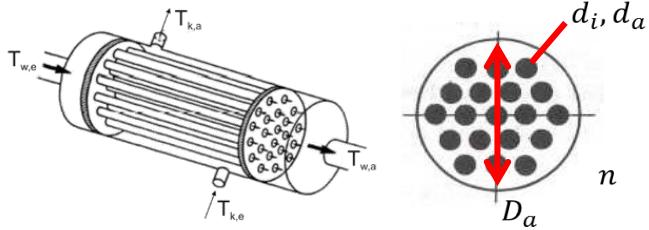
$$T_{in} = 15^\circ\text{C}$$

$$\Delta T = 10 \text{ K}$$

# Equipment 1: Heat exchanger

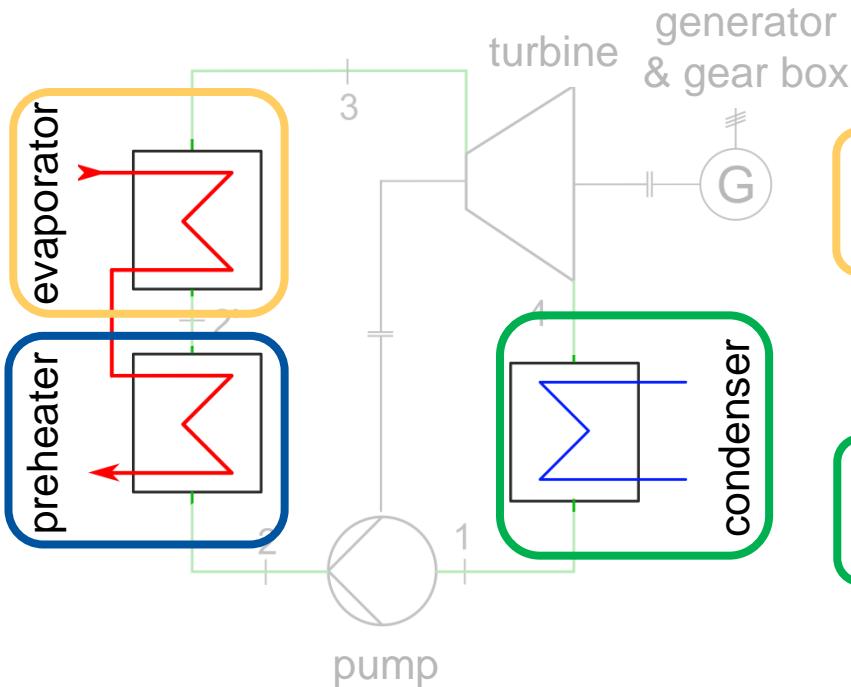


## Shell and tube heat exchanger



## Detailed design correlations:

Single phase,  
forced convection<sup>1</sup>



Superposition of forced  
convection and bulk boiling<sup>2</sup>

Filmwise condensation  
of pure vapors<sup>3</sup>

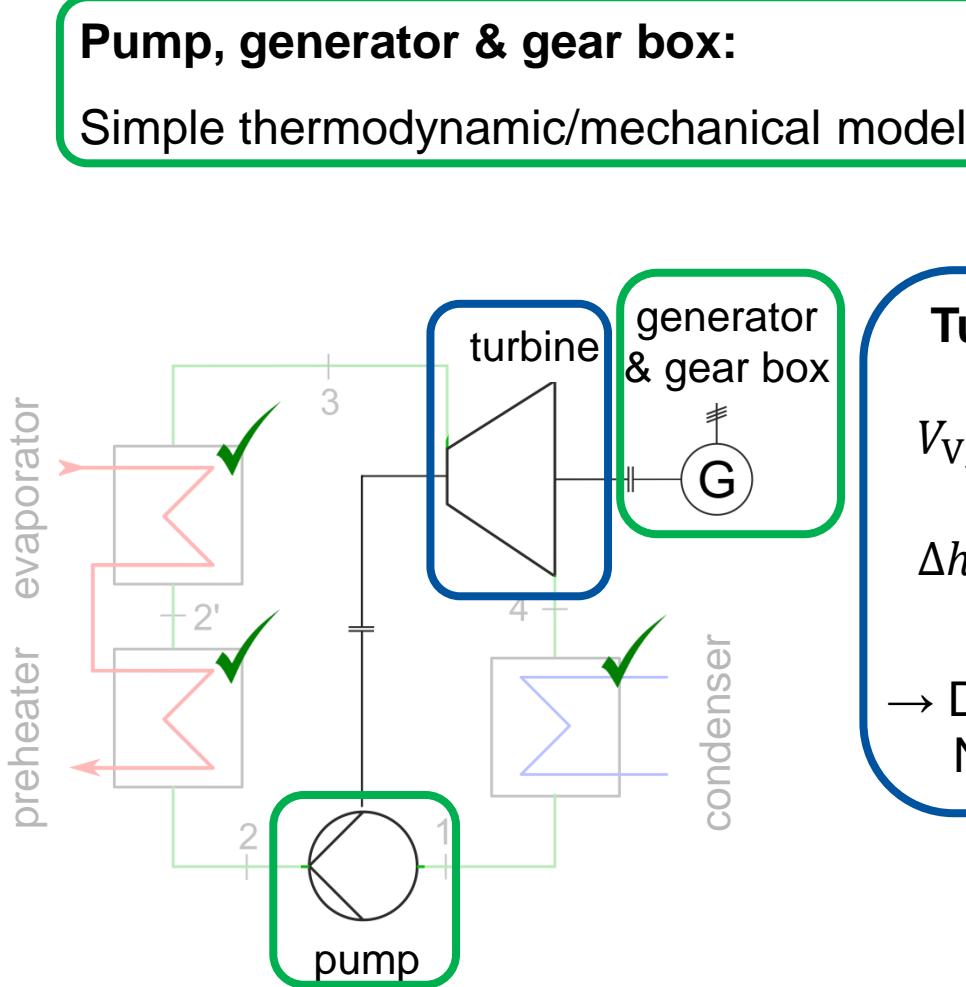
[1] Gnielinski, NASA STI/Recon Technical Report A, 1975, 8–16

16 [2] Gungor and Winterton, Int. J. Heat Mass Transfer, 1986, **29**, 351–358.

[3] VDI-Wärmeatlas, Springer Vieweg, Berlin, 11th edn., 2013.

# Equipment 2: Rotating equipment

- ✓ PC-SAFT for transport
- ✓ process design
- ✓ molecule design
- ✓ equipment design



**Turbine: axial turbine<sup>1</sup>:**

$$V_{V,\text{Stages}} = (V_{V,T})^{\frac{1}{n_{\text{Stages}}}} \leq 4$$

$$\Delta h_{is,\text{Stages}} = \frac{\Delta h_{is,T}}{n_{\text{Stages}}} \leq 65 \frac{kJ}{kg}$$

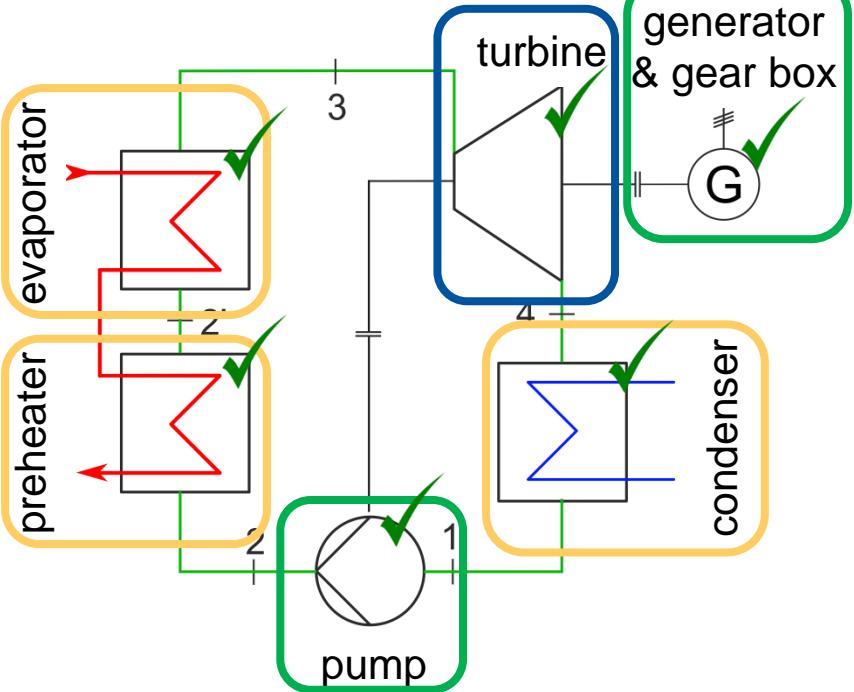
→ Degree of freedom:  
Number of stages  $n_{\text{Stages}}$

# Thermo-economic objective function

- ✓ PC-SAFT for transport
- ✓ process design
- ✓ moleculer design
- ✓ equipment design

Objective function:  
specific investment cost

$$f = SIC = \frac{TCI}{P_{\text{net}}}$$



**Heat exchanger<sup>1</sup>**

$$\text{Invest} = f(A_i)$$

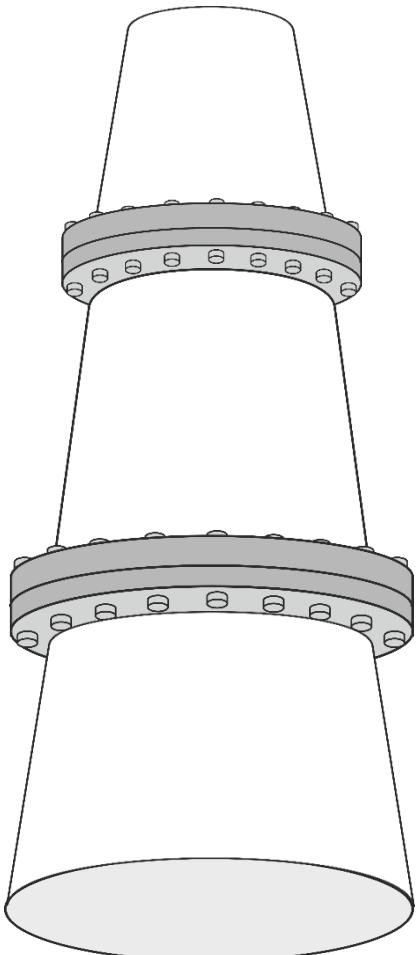
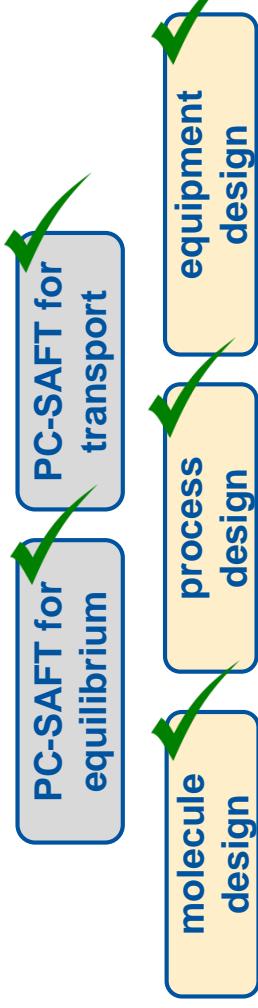
**Pump, generator & gear box<sup>2</sup>**

$$\text{Invest} = f(P_i)$$

**Turbine<sup>2</sup>**

$$\text{Invest} = f(n_{\text{Stages}}, \dot{V}, \Delta h_{\text{is,Stage}})$$

# Summary: optimization problem



$$\min_{x, y^s} f(x, \theta, \kappa)$$

$$\text{s.t. } g_1(x, \theta, \kappa) = 0$$

$$g_2(x, \theta, \kappa) \leq 0$$

$$\kappa = k(x, z, \theta, y^s)$$

$$p_1(x, \theta) = 0$$

$$p_2(x, \theta) \leq 0$$

$$\theta = h(x, z, y^s)$$

$$z = GC \cdot y^s$$

$$F_1 \cdot y^s = 0$$

$$F_2 \cdot y^s \leq 0$$

$$n(y^s) \leq 0$$

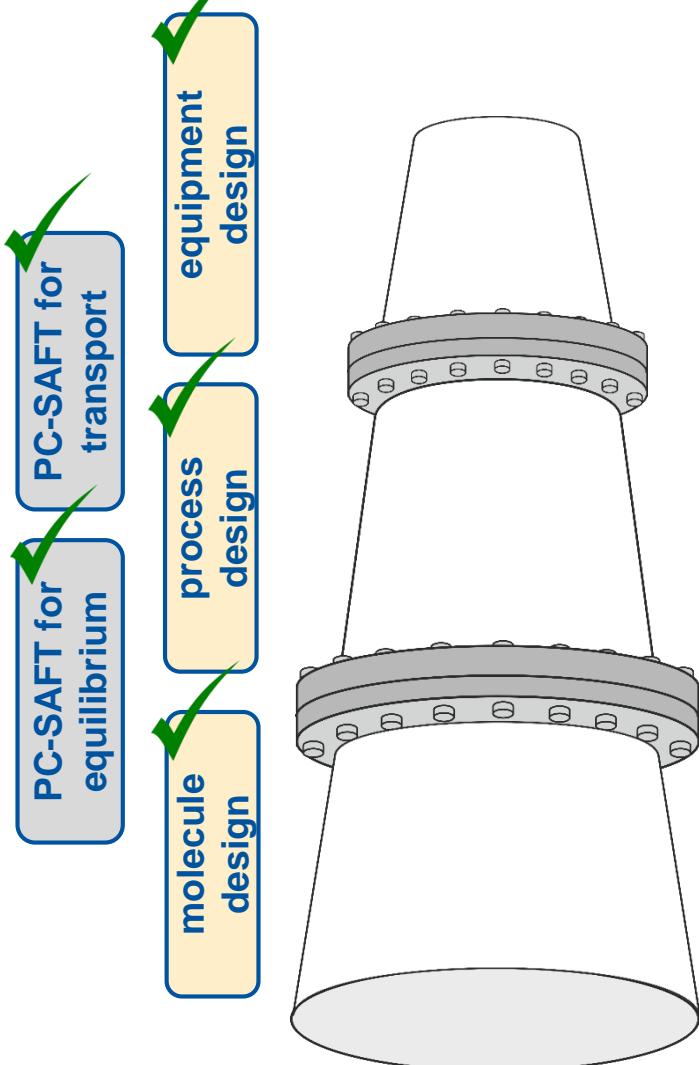
$$x_{lb} \leq x \leq x_{ub} \in \mathbb{R}^n$$

$$y_{lb}^s \leq y^s \leq y_{ub}^s \in \mathbb{Z}^l$$

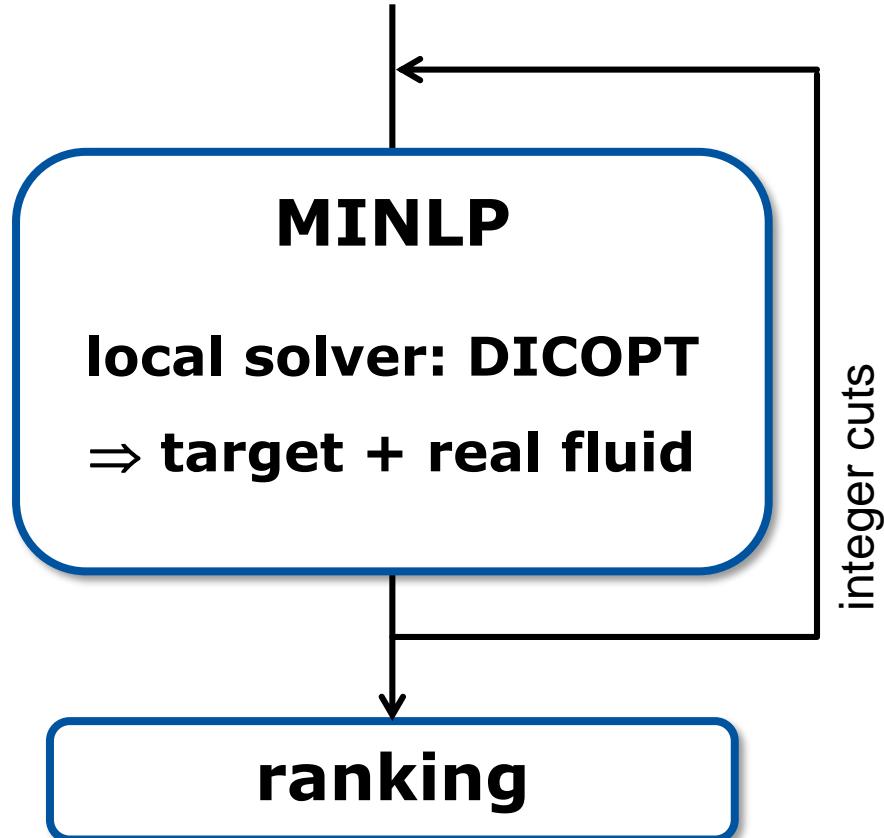
external  
functions

stable  
optimization

# 1-stage Continuous-Molecular Targeting – Computer-Aided Molecular Design<sup>1,2</sup>



## 1-stage CoMT-CAMD<sup>1,2</sup>



## Case study: resulting ranking and validation

Heat source: waste heat

$$T_{in} = 120^\circ\text{C}$$

$$\dot{m} = 20 \text{ kg/s}$$

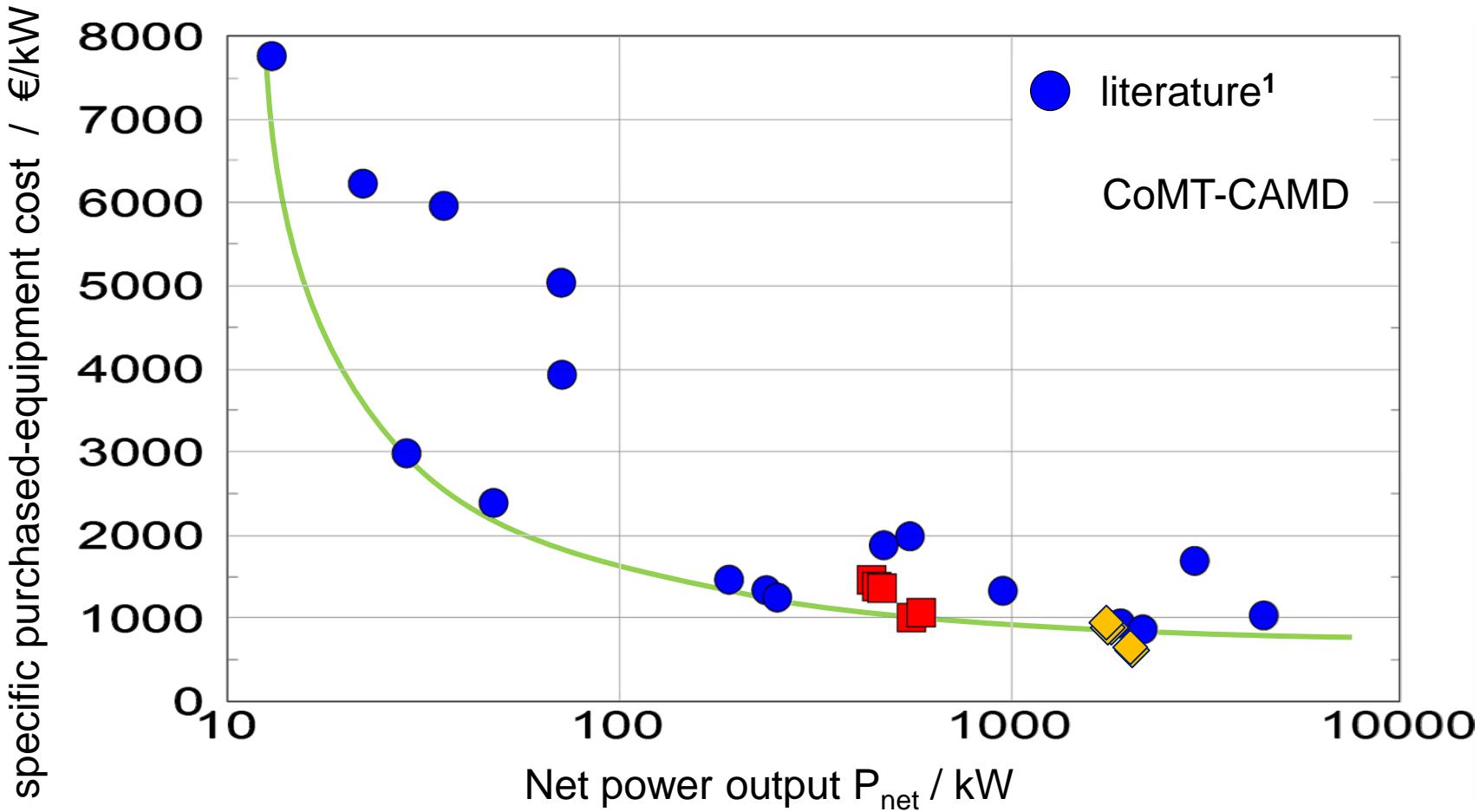
Heat sink: cooling water

$$T_{in} = 15^\circ\text{C}$$

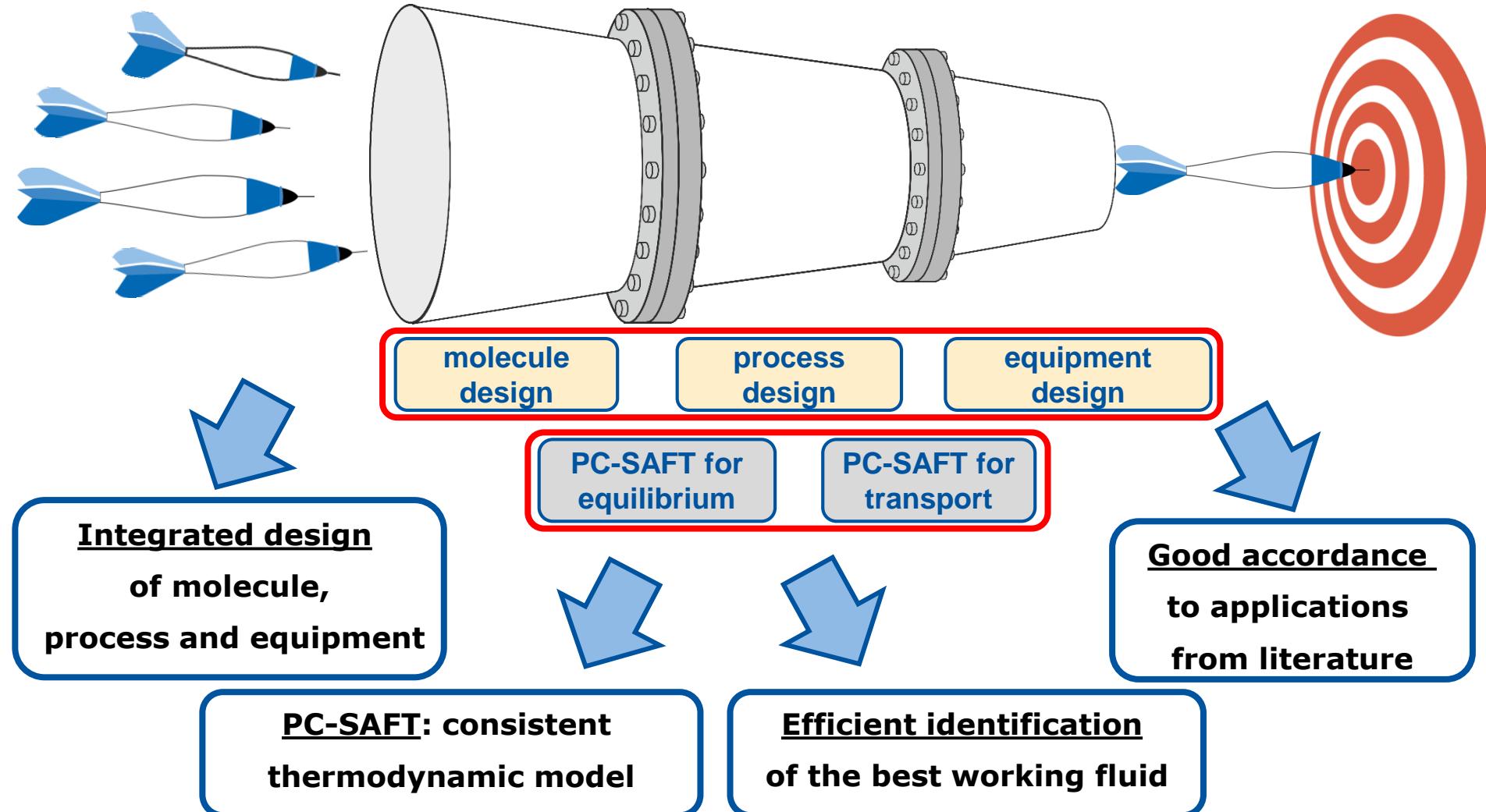
$$\Delta T = 10 \text{ K}$$

Rank	Name	SIC / €/kW	$P_{net}$ / kW	TCI / $10^6$ €
-	Target	2915	456	1.33
1	Propene	3303	417	1.38
2	Propane	3474	411	1.43
3	But-1-ene	4546	389	1.77
4	Isobutane	4573	387	1.77
5	n-Butane	4874	378	1.84

## Results: specific purchased-equipment cost



# Conclusions



# Thank you for your attention

Johannes Schilling<sup>a</sup>, Dominik Tillmanns<sup>a</sup>, Matthias Lampe<sup>a</sup>, Madlen Hopp<sup>b</sup>,  
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Deutsche  
Forschungsgemeinschaft

## References on CoMT-CAMD:

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- Schilling, J., Lampe, M., Gross, J., Bardow, A., 2017. 1-stage CoMT-CAMD: An approach for integrated design of ORC process and working fluid using PC-SAFT. *Chem. Eng. Sci.* 159, 217-230.
- Lampe, M., Stavrou, M., Schilling, J., Sauer, E., Gross, J., Bardow, A., 2015. Computer-aided molecular design in the continuous-molecular targeting framework using group-contribution PC-SAFT. *Comput. Chem. Eng.* 81, 278–287.
- Stavrou, M., Lampe, M., Bardow, A., Gross, J., 2014. Continuous molecular targeting-computer-aided molecular design (CoMT-CAMD) for simultaneous process and solvent design for CO<sub>2</sub> capture. *Ind. Eng. Chem. Res.* 53 (46), 18029–18041.
- Lampe, M., Stavrou, M., Bücker, H. M., Gross, J., Bardow, A., 2014. Simultaneous optimization of working fluid and process for organic Rankine cycles using PC-SAFT. *Ind. Eng. Chem. Res.* 53 (21), 8821–8830.
- Bardow, A., Steur, K., Gross, J., 2010. Continuous-molecular targeting for integrated solvent and process design. *Ind. Eng. Chem. Res.* 49 (6), 2834–2840.