

# Optimal design of solar assisted industrial processes considering heat pumping: case study of a dairy

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## Abstract

Pinch analysis and Mixed Integer Linear Programming (MILP) have been extensively studied for optimization of industrial processes addressing heat recovery, utility selection and sizing. Analysis of renewable utility integration, such as solar thermal or photovoltaics, introduces several obstacles for established methods: the time-dependency of resources, storage inertia and losses, and intrinsic non-linearities of the system performance are difficult to represent by linearized, time-invariant MILP equations. Moreover, waste heat recovery options such as heat pumping cannot be neglected as a potential competitor to solar heat.

This work presents a set of multi-period MILP equations for solar technologies as well as a superstructure for optimization of heat pump cycles. Additionally, a methodology is proposed and applied to simultaneously optimize the process' refrigeration and renewable utility system using  $\epsilon$ -constrained parametric optimization. The proposed methodology is illustrated on the basis of a dairy plant for which the different utility technologies are compared and evaluated based on economic and environmental criteria.

It is illustrated that integration of solar energy can contribute to strongly reduce the environmental impact of the process (65 - 75% reduction in CO<sub>2</sub> equivalent emissions), but only in combination with heat recovery (27%) and an improved heat pump system (33%). Heat recovery and heat pump placement for industrial processes are hereby shown to reduce exergy destruction and total costs and increase energy efficiency in the system by means of thermo-economic optimization. The solutions show that investment in solar energy can be economically and environmentally attractive for industrial processes by considering the whole system and ensuring that solar energy is optimally integrated and utilized.

*Keywords:* multi-period MILP,  $\epsilon$ -constraint optimization, heat pump superstructure, flat plate thermal collectors, photovoltaics, thermal storage

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## 1. Introduction

Within 90 minutes, enough solar radiation reaches Earth's surface to fulfill the total global primary energy demand of one year [1]. This illustrates the enormous potential related to solar energy which is virtually inexhaustible, abundant, and carbon-neutral if gray energy of the conversion equipment is disregarded. Photovoltaic and solar thermal collectors are widely employed and tested (for warm water, heating and electricity production) in the urban sector; however, application in the industrial sector is still scarce [2]. Although the potential has been extensively proven [3, 4], implementation of solar energy in industrial processes is constrained by several obstacles. Identification of the best point of integration is not trivial and should comply with the process specific thermodynamic and technical constraints related to e.g. the heat exchange equipment [3, 5].

One important point which is often neglected is that integration of more efficient or less emitting heating sources (such as solar thermal) should always be compared to other process optimization measures. Process

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38 integration is a first step in capitalizing the maximum heat recovery potential together with retrofiting of the  
39 heat exchanger network. Beyond this, further measures are possible such as optimization of the operating  
40 points of the available utility equipment (e.g. the temperatures of the refrigeration system), mechanical  
41 vapor re-compression (MVR), or integration of closed cycle heat pumps.

42 Heat pump systems (including refrigeration) allow valorization of low-temperature waste heat and thereby  
43 improve the process energy efficiency. Optimization of industrial heat pumps has been addressed by various  
44 authors. Shelton and Grossmann [6, 7] proposed a mixed integer linear programming (MILP) model  
45 for optimization of flexible heat pump superstructures which complies with the general process integration  
46 methodology presented by Papoulias and Grossmann [8–10]. They define all possible connections of refrigeration  
47 stages with the drawback of high complexity for problems with many temperature levels. Other  
48 authors based their formulation in the linear domain [11–14]. While more recent work dealt with exergy  
49 analysis of heat pumps and Mixed Integer Nonlinear Programming (MINLP) [15, 16]. None of these works  
50 have dealt with solar utility integration.

51 Optimization of a refrigeration and heat pump system for a dairy plant has been investigated by Becker  
52 et al. [17, 18] without the presentation of a flexible superstructure containing a variable number of stages,  
53 mixing, and various temperature levels.

54 Maréchal et al. [19] proposed a multi-period process integration approach that allows utility targeting  
55 and optimization of process heat recovery systems during multiple operating periods. Different authors have  
56 dealt with the problem of clustering meteorological or energetic data into smaller sets [20, 21] demonstrating  
57 that data clustering reduces the computational effort while maintaining a desired accuracy.

58 Solar integration with industrial processes by means of pinch analysis was addressed by several authors  
59 [2, 22–25]. In all cases the importance of process integration and pinch analysis for solar utility integration  
60 was considered. However, the time-variance of solar radiation and the related effect on the solar system  
61 performance as well as the influence of storage was often simplified or even neglected during the design phase.  
62 Furthermore, other process optimization techniques such as heat pumping were completely or partially  
63 disregarded.

64 The main gaps identified in the current literature were the lack of a comprehensive approach for solar  
65 process integration which encompasses: (a) multi-period solar utility and storage modeling, (b) process  
66 integration techniques, while additionally (c) exploring process optimization tools, such as an improvement  
67 of the heat pumping system. Therefore, a step-by-step approach is proposed to overcome some of the  
68 identified gaps. The main goal is to account for the influence of meteorological time-variance on the solar  
69 collector performance and the impact of storage during the design process while respecting the importance  
70 of heat pumping as process optimization measure. A comprehensive method for simultaneous solar design  
71 and process refrigeration system optimization is presented of which the innovative aspects are summarized  
72 in the following points:

- 73 • A multi-period MILP approach is chosen, which has been applied by other authors [19, 21, 25], but is  
74 extended to account for the specific characteristics of solar utilities and contains  $\epsilon$ -constraints.
- 75 • A novel heat pump superstructure presented in [26] is applied for optimal design of multiple stage heat  
76 pump cycles.
- 77 • The meteorological data is clustered based on common clustering algorithms [27] by proposing a new  
78 performance indicator.
- 79 • Solar performance calculations are based on state-of-the-art correlations and data from independent  
80 testing facilities and producers.

## 81 2. Methodology

82 A sketch of the applied methodology is presented in Figure 1. The work is employed in a computational  
83 framework which is based on the Lua [28] programming language. It is separated into three main steps: (A)  
84 data collection, (B) system resolution, and (C) performance calculation.

85 **(A) Data collection.** During the data collection phase, utility and process data are gathered, the  
86 energy and mass balances are formulated, and the thermodynamic models are developed. In a preliminary

step the meteorological data are clustered to form a set of typical days such that the problem size can be reduced from a typical meteorological year (TMY) composed of 8760 hours to a much smaller set (of a few hundred hours). This part of the procedure is presented in Section 2.1.

**(B) System resolution.** The system resolution aims at targeting different utility designs by solving the multi-period MILP for minimum total annual cost subject to the heat cascade constraints. The general formulation of the multi-period MILP can be found in Section 2.2. During the multi-period MILP a single-objective optimization is performed with the objective of minimizing the total annual cost. To compare the different scenarios under equal boundary conditions, an  $\epsilon$ -constraint is introduced to limit the CO<sub>2</sub>-equivalent emissions for a set of values.

**(C) Performance calculation.** Since the results of step (B) are based on linearized equations, it is necessary to recalculate some indicators that are more realistically described by non-linear relations such as the investment cost. Other performance indicators such Carnot efficiency are derived during this step. The respective equations are presented in Section 2.3.

**(\*) Scenario definition & parameter selection.** Different utility scenarios are studied by activating or deactivating the respective integer variables. These scenarios are evaluated based both on cost and emissions for a continuous (24/7) process operation and a daytime only scheme. The different cases are presented in Section 3.1.

### 2.1. Data collection & clustering (A)

This step includes utility and process data gathering, meteorological data clustering, energy and mass balances formulation, and thermodynamic model development.

#### 2.1.1. Process and utility modeling

A flowsheet of the process case study and proposed utility system is presented in Figure 2. The units marked in black (boiler, and ammonia refrigeration cycle) are the utilities in place. Units indicated with an asterisk (\*) are newly added in this study (mainly the heat pump superstructure and solar utilities).

*Process.* The analyzed dairy plant is modeled as a retrofit problem, it transforms raw milk into concentrated milk, pasteurized milk and cream, yogurt, and dessert. Due to various outputs, specific heat requirements will always be provided with respect to the raw milk inlet. The process requires heating (up to 98°C) and cooling (down to 4°C), which in the original plant is provided by a boiler and an ammonia refrigeration cycle. Heating is conveyed through steam and cooling through a water glycol mixture (from the refrigeration) or cooling water. The original process energy requirements are 2.1MW<sub>th</sub> of heat and 167kW<sub>el</sub> of electricity (from the refrigeration cycle) for a raw material consumption of 10 kg/s.

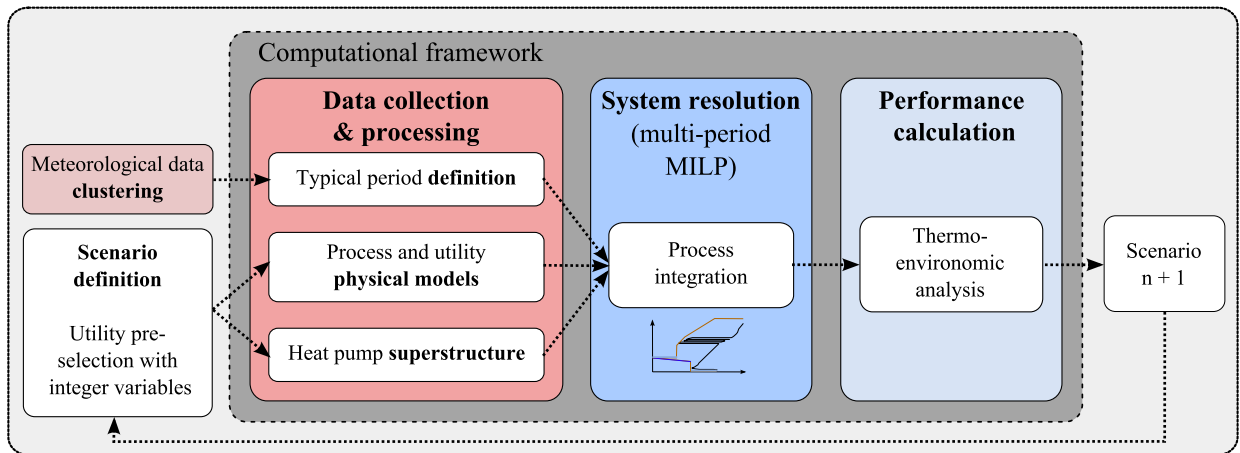


Figure 1: Methodology applied in this study.

118 Figure 3 depicts the process composite curves. The three evaporation stages of the concentrated milk  
119 production create a clear process pinch point at 59°C. The highest temperature heat requirement is slightly  
120 below 100°C. The hot minimum energy requirement,  $MER_{hot}$ , is 1.6  $MW_{th}$  and the  $MER_{cold}$  lies at 0.8  
121  $MW_{th}$ . Through process integration (maximum heat recovery) the hot utility requirement can be reduced  
122 by 24% (compared to 2.1  $MW_{th}$ ).

123 The plant is positioned in Switzerland and the process heat requirements are taken as constant during  
124 its operation. This could eventually be refined by considering shifted operation schedules of different units  
125 throughout a working day, but is currently not considered. A full list of process streams is provided in  
126 Appendix E. The dairy plant was originally modeled by Becker et al. [17, 18], who proposed options  
127 for reduction of CO<sub>2</sub>-emissions with mechanical vapor re-compression and heating with a co-generation  
128 engine. In this study, the referenced work is expanded by evaluation of a flexible heat pump superstructure  
129 comprising various pressure levels and allowing to optimize the refrigeration system, in addition to analysis  
130 of the potential for time-variant solar utility integration.

131 Two process operating schedules are investigated:

- 132 • daytime only operation (7h/day, 2625h/year),  $\Delta$
- 133 • continuous (8760h/year), O

134 *Boiler (BOI)*. It is assumed that the boiler is already installed in the industrial retrofit problem. Therefore,  
135 there is no capital cost associated with the use of the boiler. The boiler is activated in all scenarios as back-up  
136 utility. It relies on natural gas combustion and therefore generates CO<sub>2</sub>-emissions when in operation. Part-  
137 load performance is neglected. All respective modeling equations and input data are specified in Appendix  
138 B.2.

139 *Flat plate collector (FP)*. Single glazing flat plate thermal collectors are modeled according to available  
140 performance data of independent testing facilities (such as the Institut für Solartechnik, (SPF) [29]) with  
141 solar keymark [30] status. The provided test parameters comply with the European norm for efficiency mea-  
142 surements of thermal collectors EN-12975. Flat plate thermal collectors produce heat up to approximately  
143 130°C. However, efficiency decreases with higher operating temperatures due to heat losses.

144 Therefore, the operating temperature range is fit to the dairy process demand which is between 80 and  
145 105°C. The collector working fluid is a water glycol mixture. The efficiency is further dependent on the  
146 intensity of the incoming radiation and its direction. All respective performance equations and input data  
147 are presented in Appendix C.1.

148 *Photovoltaic module (PV)*. High efficiency mono-crystalline photovoltaic modules were considered during  
149 the calculation. The modeled energetic output was based on certified producer data (IEC 61215, IEC  
150 61730,[31] taken from the 10th year of operation. The two main parameters influencing the PV performance  
151 are the cell temperature (dependent on the ambient temperature, the incident radiation, and the wind speed)  
152 and the irradiation intensity. All relevant equations and a performance analysis are presented in Appendix  
153 C.2.

154 *Photovoltaic and thermal (HCPVT)*. The high concentration photovoltaic and thermal system is a concen-  
155 trating dish (with concentrations of up to 2000 at the focal point) with two axis tracking of the sun which  
156 is mounted on a tower. Electricity is generated with photovoltaic cells in the receiver positioned in the focal  
157 point. Highly efficient cooling prevents receiver and photovoltaic cell overheating and provides useful heat  
158 around 100°C. Thereby the exergetic losses of the photovoltaic conversion are recovered. High concentration  
159 devices can only convert direct beam radiation. Performance indicators are retrieved from producer data  
160 [32–35]. All modeling equations are depicted in Appendix C.3.

161 *Thermal storage tank (S)*. The thermal storage mass and energy balances are formulated based on the  
162 assumption of sensible heat storage at different temperature levels modeled one tank operating between two  
163 temperatures. An intra-cyclic constraint is introduced, which ensures that the storage is always at initial  
164 conditions at the end of each day. Furthermore, it is defined (in agreement with a real storage tank with  
165 two outlets) that the fluid leaving the storage tank is always at the lowest temperature (bottom) during

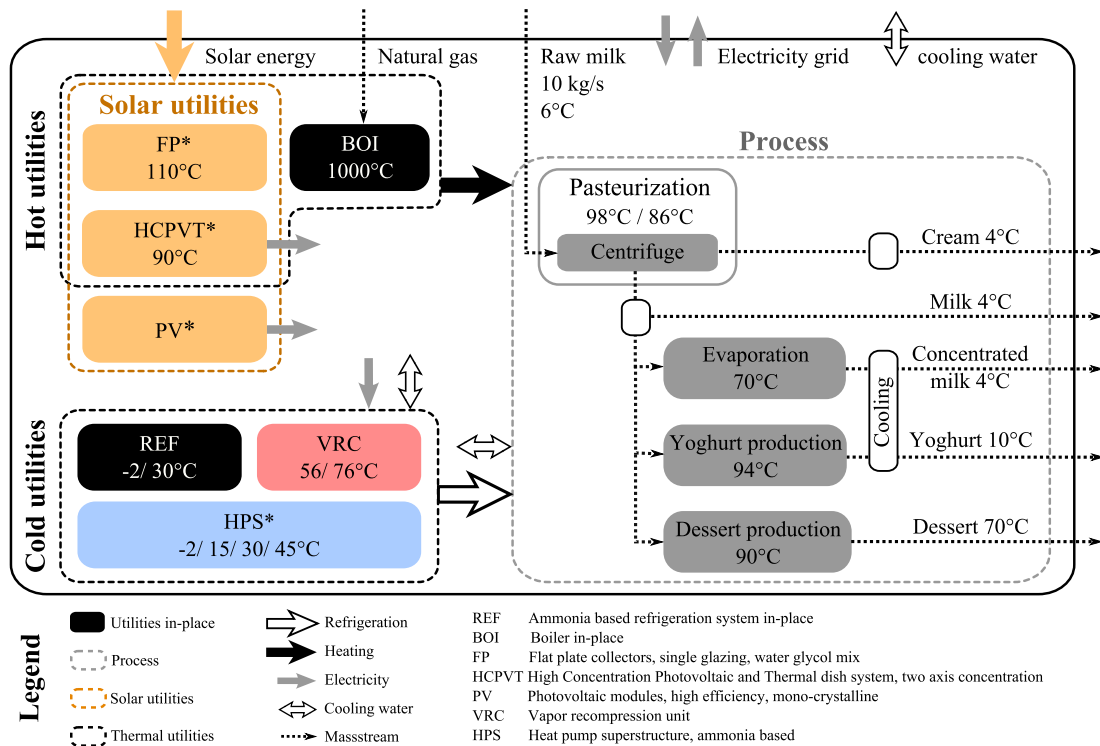


Figure 2: Process flowsheet including utility system. Marked in black are the utilities that are currently in place. Units with (\*) are newly added in this study.

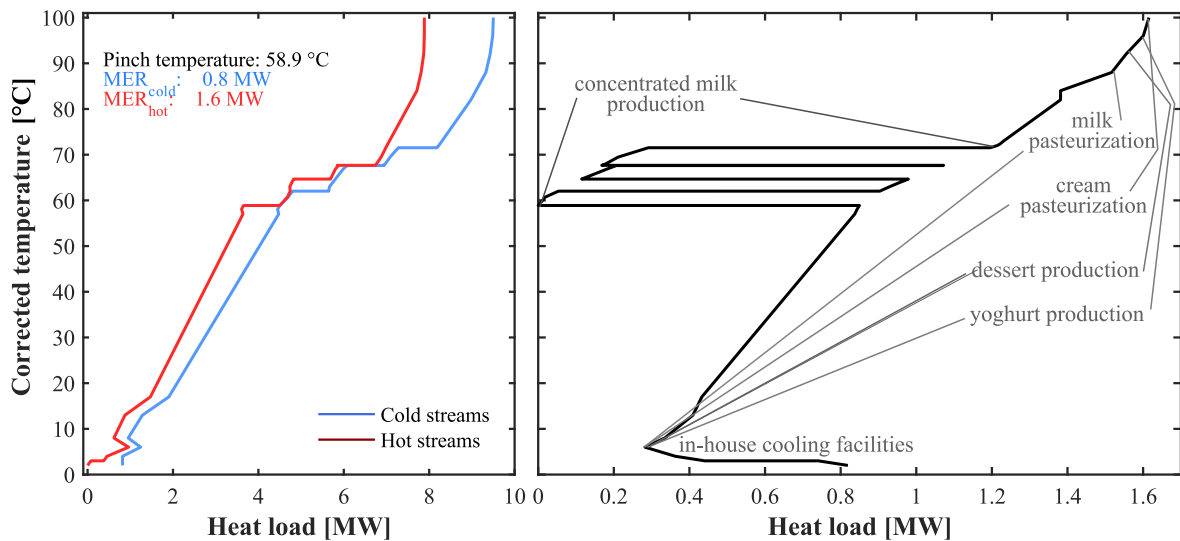


Figure 3: Hot and cold composite curves and grand composite curve of dairy process reproduced from Becker et al. [18] for raw milk inlet of 10 kg/s.

166 charge periods or highest temperature (top) during discharge periods. More information on the storage tank  
 167 considered can be found in Appendix C.4.

168 *Limitations.* The performance of the three respective solar systems is modeled for one piece of equipment.  
 169 Industrial applications require large collector fields and, therefore, a constant loss factor is introduced in  
 170 this work to account for thermal and transmission losses in the field. This factor, in reality, scales with the  
 171 field size and follows certain power laws. Additionally, the impact of shading on the overall output is non-  
 172 negligible especially for the tracking systems considering the space is usually limited which is not accounted  
 173 for either. It is planned to explore the validity of these simplifications by further in-depth analysis in future  
 174 work.

175 *Heat pump superstructure (REF, MVR, HPS).* A superstructure is employed which permits investigation  
 176 of possible combinations between different heat pump components: compressors, evaporators, condensers,  
 177 and presaturators [26].

178 For selecting the optimal heat pump structure, a set of pressure levels must be defined. The active levels  
 179 are selected during the system resolution with help of integer variables. The choices are only constrained by  
 180 the fact that the highest pressure level must be a condenser and the lowest level needs to be an evaporator.  
 181 Since the pressures and respective temperature levels are chosen in advance, the sizing of the components  
 182 can be formulated by linear constraints as part of the MILP. Figure 4(a) presents a temperature entropy  
 183 diagram to illustrate the problem definition, formulating all generic heat pump cycles after the pressure  
 184 levels are selected. Figure 4(b) shows a flow chart of the superstructure. Connections between all pressure  
 185 levels are defined as well as potential presaturation, evaporation, and condensation units on every level.

186 This permits the generation of all possible single and multi-stage cycles between a predefined set of  
 187 pressure levels. The one-stage refrigeration cycle in place, the vapor re-compression system as well as the  
 188 improved multi-stage heat pump cycle are modeled with this superstructure. The performance equations as  
 189 well as all investigated specifications are presented in Appendix B.3.

190 *2.1.2. Meteorological data clustering*

191 *Meteorological data.* Weather data including the solar angles (azimuth and elevation), wind speed, ambient  
 192 temperature, and global horizontal (GHI) and direct normal (DNI) irradiance of hourly time resolution is  
 193 retrieved from a commercial software (Meteonorm 7.0 [36]). The analysis is carried out for the Swiss city of  
 194 Sion, having comparably high yearly solar irradiance (GHI 1430, DNI 1690 kWh/m<sup>2</sup>) relative to the rest of  
 195 the country (1200 kWh/m<sup>2</sup>) due to a favorable micro-climate.

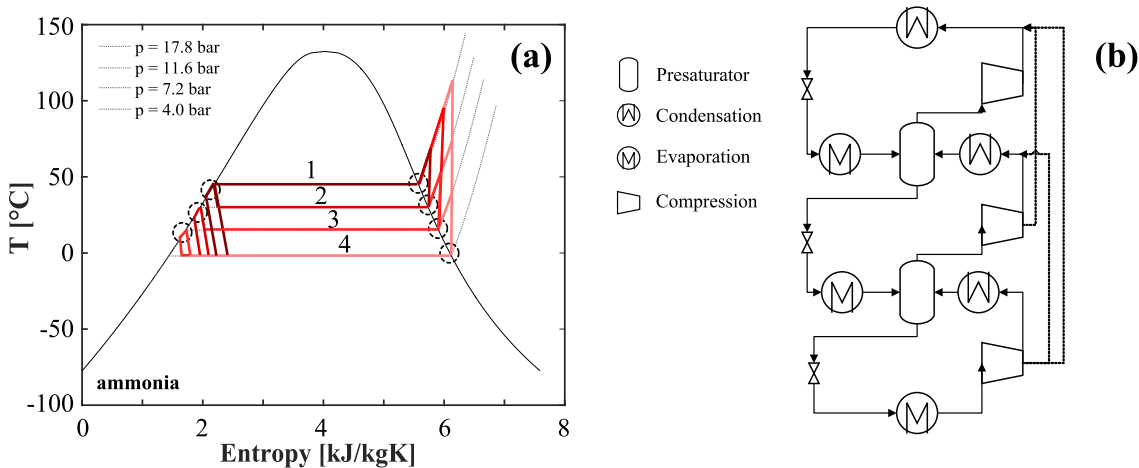


Figure 4: (a) Ammonia liquid-vapor saturation curve with isobars, (b) heat pump superstructure.

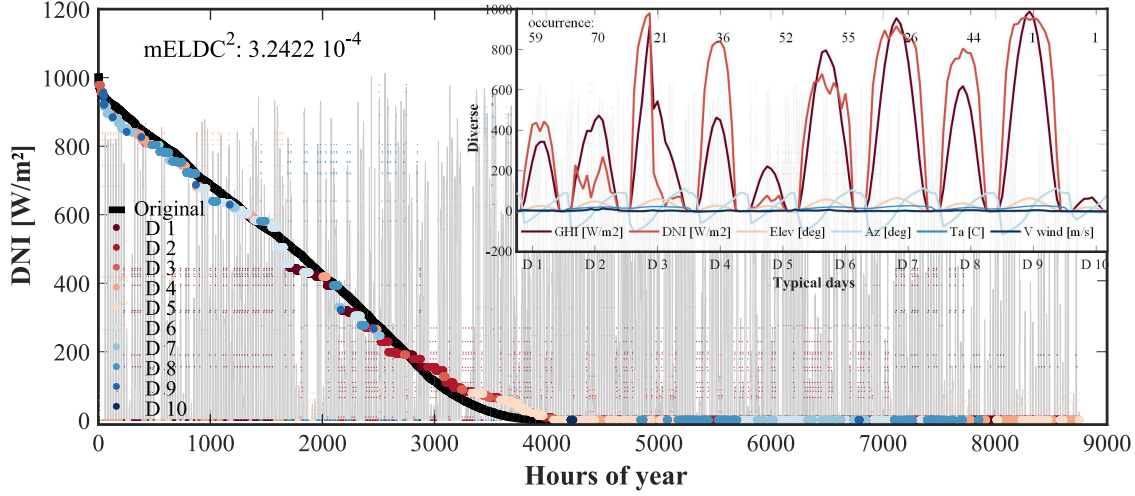


Figure 5: Load duration curve of DNI for Sion, Switzerland, of original data and 8 typical plus 2 extreme days. In background yearly distribution of DNI of original and typical days.

196 *Data clustering.*  $k$ -means or  $k$ -medoids clustering is usually applied when robustness to outliers is required,  
 197 or when the mean or median do not have a clear meaning. Weather data for optimal design of solar systems  
 198 naturally falls into both categories.  $k$ -medoids clustering was selected since the resulting set is always a  
 199 subset of the original data. A MATLAB [37] function, which is based on the widely employed Partitioning  
 200 Around Medoids (PAM) algorithm [27], was used in order to reduce the problem size from 8760 points of  
 201 hourly weather data to below 500 points. In Appendix D the data and parameters are described in more  
 202 detail. Following the indications of Dominguez et al. [20], the typical days were built from  $n$  clusters with 2  
 203 extreme days. For clustering, 3 indicators were chosen which influence the solar performance the most: DNI,  
 204 GHI, and the ambient temperature. Since the DNI fluctuates the most on an hourly, daily, and monthly  
 205 basis with a high influence on the solar output, it was chosen as the main reference for determination of the  
 206 performance indicator. Also the extreme days were determined based on the DNI.

207 The procedure for finding the optimal number of clusters is divided into three steps:

- 208 1. Data normalization: The data are scaled such that all values are represented between zero and one  
 209 [0,1]. Additionally, they are sub-divided into 365 data knots, each containing 24 hours of data.
- 210 2.  $k$ -medoids clustering: Data clustering is performed, increasing the number of clusters after each iter-  
 211 ation until the stopping criterion is met.
- 212 3. Stopping criterion: The mean squared error of the normalized Load Duration Curve (LDC) of the DNI  
 213 is used as stopping criterion, as it is found that the LDC is best representing the data characteristics.  
 214 The limit is set to  $3.5 \times 10^{-4}$ .

$$\text{mELDC}^2 = \frac{\sum_{t=1}^{8760} (\text{LDC}_{\text{original}}(t) - \text{LDC}_{\text{typical days}}(t))^2}{8760}$$

215 Figure 5 presents the results from the clustering algorithm. The load duration curve of the DNI is displayed  
 216 for the original data and the typical days. In the background, the hourly data is displayed showing that  
 217 high values can also be reached during winter. This is particular for the DNI as it is not reduced by cosine  
 218 losses in contrast to the GHI. The fit of the LDC is below the pre-defined limit of  $3.5 \times 10^{-4}$  and is also  
 219 visibly acceptable. In the upper right corner the resulting typical days and their occurrence are illustrated.  
 220 The two extreme days are represented only once. It can be seen that there are few days with very low DNI.

221 *2.2. System resolution (B)*

222 This section presents the optimization problem formulation and the respective constraints. The sets  
 223 presented in Subsection 2.2.1 are specified in the present case study in the following manner. The set  
 224 of utility technologies  $\mathbf{W}$  refers to Section 2.1.  $\mathbf{W} = \{\text{boiler (BOI), refrigeration (REF), mechanical va-}$   
 225  $\text{por re-compression (MVR), heat pump superstructure (HPS), flat plate solar (FP), photovoltaic modules}$   
 226  $\text{(PV), concentrated photovoltaic and thermal system HCPVT), thermal storage (STO), cooling water (CW),}$   
 227  $\text{electricity grid (GRID)}\}$ . The set of periods  $\mathbf{P}$  stems from Section 2.1.2.

228 *2.2.1. MILP utility targeting formulation*

229 The problem is formulated as a multi-period MILP that solves the heat cascade and finds optimal  
 230 utility integration [8–10, 19]. The general optimization problem is described by the following set of linear  
 231 constraints. Scalar decision variables are represented by italic letters and parameters by standard text;  
 232 vectors and sets are represented in bold.

233 *Objective function.* The problem objective is the minimization of the total annualized cost (TAC, depicted  
 234 in Equation (1)) which is composed of the operating cost of each utility technology  $w$  during period  $p$  and  
 235 the annualized investment that is found with aid of the maximum size of each technology.

$$\min_{y_p^w, f_p^w, y^{w, f^w}} \underbrace{\sum_{p=1}^{\mathbf{P}} \left( \sum_{w=1}^{\mathbf{W}} \text{OP}_{1,p}^w \cdot y_p^w + \text{OP}_{2,p}^w \cdot f_p^w \right) \cdot \Delta t_p \cdot \text{occ}_p}_{\text{Operating cost}} + \tau \cdot \underbrace{\sum_{w=1}^{\mathbf{W}} \text{IV}_1^w \cdot y^w + \text{IV}_2^w \cdot f^w}_{\text{Investment cost}} \quad (1)$$

236 Where  $\mathbf{P}$  is the set of periods  $\{1,2,3, \dots, N_p\}$ ,  $\mathbf{W}$  is the set of utility technologies,  $f_p^w \in \mathbf{R}^+$  is the  
 237 multiplication factor of the reference size of a technology  $w$  during period  $p$ ,  $y_p^w$  is a binary variable related  
 238 to the existence of a technology  $w$  during period  $p$ ,  $\text{OP}_{1,p}^w$  [€/h] is the fixed operating cost for using the  
 239 technology  $w$  during period  $p$ ,  $\text{OP}_{2,p}^w$  [€/h] is the proportional operating cost for using technology  $w$  during  
 240 period  $p$  and is scaled with the multiplication factor,  $\text{IV}_1^w$  [€/y] is the fixed cost related to the investment  
 241 of technology  $w$ ,  $\text{IV}_2^w$  [€/y] is the proportional cost related to the investment of technology  $w$ ,  $\Delta t_p$  [h] is the  
 242 operating time of period  $p$ ,  $\text{occ}_p$  [1/y] is the occurrence of period  $p$ , and  $\tau = \frac{i \cdot (1+i)^n}{(1+i)^n - 1}$  [-] is the investment  
 243 cost annualization factor.

244 *Heat cascade constraints.* The heat cascade constraints enforce the second law of thermodynamics, so that  
 245 heat is only transferred from a hot temperature interval to a colder.

$$\sum_{w=1}^{\mathbf{W}} f_p^w \cdot Q_{p,j}^w + \sum_{s=1}^{\mathbf{S}} Q_{p,j}^s + R_{p,j+1} - R_{p,j} = 0 \quad \forall p \in \mathbf{P}, j \in \mathbf{J} \quad (2)$$

246 Where,  $\mathbf{J}$  is the set of temperature intervals  $\{1,2,3, \dots, N_j\}$ ,  $\mathbf{S}$  is the set of process streams,  $Q_{p,j}^w$  [kW] is  
 247 the reference heat release or demand of a technology  $w$  during period  $p$  in the temperature interval  $j$ ,  $Q_{p,j}^s$   
 248 [kW] is the heat release or demand of process stream  $s$  during period  $p$  in the temperature interval  $j$ , and  
 249  $R_{p,j}$  [kW] is the residual heat of temperature interval  $j$  that is cascaded to the next  $j+1$  in period  $p$ .

250 *Thermodynamic feasibility.* The thermodynamic feasibility ensures a closed energy balance:

$$R_{p,1} = 0, R_{p,N_j+1} = 0, R_{p,i} \geq 0 \quad \forall i = \{1, 2, \dots, N_j + 1\}, p \in \mathbf{P} \quad (3)$$

251 *Existence of a technology.* The maximum size of operation and existence of technology  $w$  is given by:

$$\begin{aligned} f^w - f_p^w &\geq 0 && \forall w \in \mathbf{W}, p \in \mathbf{P} \\ y^w - y_p^w &\geq 0 && \forall w \in \mathbf{W}, p \in \mathbf{P} \\ f^{w,\min} \cdot y_p^w &\leq u_p^w \leq f^{w,\max} \cdot y_p^w && \forall w \in \mathbf{W}, p \in \mathbf{P} \end{aligned} \quad (4)$$



252 *Solar equation.* An additional equation for the solar utilities is introduced, since their utilization (multipli-  
 253 cation factor) which is equivalent to the installed capacity of collectors or panels cannot vary over different  
 254 time steps. This stems from the intention to always operate the solar field at full capacity rather than  
 255 allowing active shading of parts of the collector field or defocussing the trackers if less capacity is needed.  
 256 Therefore, the multiplication factor in period  $p$  needs to be equal to the maximum multiplication factor.  
 257 This implies that if the solar system is delivering more heat than the amount needed by the process, cooling  
 258 water will be consumed to evacuate the surplus heat.

$$f^{ws} - f_p^{ws} = 0 \quad \forall ws \in \mathbf{W}_s \subset \mathbf{W}, p \in \mathbf{P} \quad (5)$$

259 Where  $\mathbf{W}_s$  is the set of solar utility technologies. The solar radiation input and therefore the output  
 260 does change with time, but that is accounted for in the constant solar heat release  $Q_{p,r}^{ws}$  [kW] during period  
 261  $p$  (see Appendix C).

262 *Computational environment.* The overall thermo-economic model is solved in Lua-based platform OSMOSE  
 263 developed at École Polytechnique Fédérale de Lausanne in Switzerland [38, 39]. In the Lua-based platform,  
 264 the MILP problem is converted to AMPL mathematical programming language [40] and then solved by  
 265 CPLEX [41].

### 266 2.2.2. $\varepsilon$ -constraint

267 As mentioned, an  $\varepsilon$ -constraint was added to the MILP which constrains the CO<sub>2</sub>-equivalent emissions  
 268 of the system. The total CO<sub>2</sub>-equivalent emissions depicted in Equation 6 are found by taking into account  
 269 emissions from natural gas consumption and the electricity grid. Life cycle assessment of the associated  
 270 technologies is not considered. The positive impact on the grid created by selling solar electricity was as  
 271 well disregarded.

$$CO_{2,tot} = \sum_{p=1}^{\mathbf{P}} (CO_{2,el} \cdot E^{\text{GRID}} \cdot f_p^{\text{GRID,in}} + CO_{2,ng} \cdot Q^{\text{ng}} \cdot f_p^{\text{BOI}}) \cdot \Delta t_p \cdot occ_p \quad (6)$$

272 Where  $CO_{2,el}$  [kgCO<sub>2</sub>eq/kWh] are the life cycle emissions related to buying electricity from the Swiss grid  
 273 and  $CO_{2,ng}$  [kgCO<sub>2</sub>eq/kWh] are the life cycle emissions from natural gas burning,  $E^{\text{GRID}}$  [kW] is the reference  
 274 electricity supply of the grid utility,  $f_p^{\text{GRID,in}}$  [-] is the multiplication factor of the incoming grid utility in  
 275 period  $p$ ,  $f_p^{\text{BOI}}$  [-] is the multiplication factor of the boiler in period  $p$ , and  $Q^{\text{ng}}$  [kW] is the reference natural  
 276 gas consumption in the boiler.

277 The  $\varepsilon$ -constraint ensures that the total emissions do not exceed  $\varepsilon$ , which is specified as a fraction of the  
 278 reference emissions and which is incrementally changed in this work (between 95 and 60% of the reference  
 279 emissions).

$$CO_{2,tot} \leq \varepsilon \quad (7)$$

### 280 2.3. Performance calculation (C)

281 After the optimization step the non-linear functions, such as the investment cost are recalculated as well  
 282 as other performance indicators depicted below. The necessary parameters are presented in Table 1.

283 *Operating cost.* During the MILP optimization step, the buying price of electricity is set to the market  
 284 price displayed in Table 1, while the selling price is set to a very small negative number. This serves as a  
 285 protection against oversizing the photovoltaic systems not to become pure electricity exporters due to too  
 286 high profits from selling electricity. The solar utilities are sized with the  $\varepsilon$ -constraint on the emissions.

287 In the Performance calculation step, the operating cost are recalculated with adequate numbers. It  
 288 is assumed that the solar utilities do not have operating costs. Therefore, the total operating costs are  
 289 composed of the electricity bought from or sold to the grid and the natural gas consumption in the boiler.

Table 1: Data related to emissions, primary energy consumption and operating cost in Switzerland.

Parameter	Unit	Value	Source
Ambient temperature $T_a$	[K]	298	[-]
Interest rate $i$	[-]	0.05	[-]
Equipment lifetime $n$	[years]	20	[-]
Maintenance cost fraction of total investment	$m$	0.05	[-]
Cost of buying electricity $op_{el,in}$	[€/kWh]	0.142	[42]
Cost of buying natural gas $op_{ng}$	[€/kWh]	0.081	[42]
Emissions electricity $CO_{2,el}$	[kgCO <sub>2</sub> eq/kWh]	0.11257	[43]
Emissions natural gas $CO_{2,ng}$	[kgCO <sub>2</sub> eq/kWh]	0.20196	[43]

290 The selling price of electricity is set to 80% of the buying price to represent the market situation more  
 291 realistically.

$$OP_{tot} = \sum_{p=1}^P (op_{el,in} \cdot E^{GRID} \cdot (f_p^{GRID,in} - 0.8 \cdot f_p^{GRID,out}) + op_{ng} \cdot Q^{ng} \cdot f_p^{BOI}) \cdot \Delta t_p \cdot occ_p \quad (8)$$

292 Where  $op_{el,in}$  [€/kWh] is the electricity cost,  $f_p^{GRID,in}$  [-] is the multiplication factor of the incoming grid  
 293 utility in period  $p$ ,  $f_p^{GRID,out}$  [-] is the multiplication factor of the outgoing grid utility in period  $p$ , The  
 294 natural gas and electricity prices are depicted in Table 1.

295 *Investment cost.* The investment cost of the units in-place (the boiler and standard refrigeration cycle) are  
 296 not considered. Other investment cost functions can be found in Appendix B. All cost data are actualized  
 297 with the Marshall and Swift index [44]. The total investment cost  $INV_{tot}$  is calculated as a sum of the  
 298 maximum sizes of each utility technology  $w$  in all periods  $p$ .

299 *Total annual cost.* The total annual cost is derived from the yearly operating cost  $OP_{tot}$ , the annualized  
 300 investment, where  $\tau$  is the annualization factor, and the maintenance cost, which is a fraction  $m$  [-] of the  
 301 total investment, see also Table 1.

$$TAC = OP_{tot} + INV_{tot} \cdot (\tau + m) \quad (9)$$

302 *Carnot factor.* The Carnot factor permits re-scaling the temperature levels on the standard composite  
 303 curve. This has two advantages: firstly, the representation is more compact since the y-axis will always be  
 304 in between -1 and 1 (equivalent to a temperature range of  $[-124, \infty)$  °C) which makes visualization of the  
 305 process easier; and secondly, the factor is proportional to the exergetic potential of a temperature level and  
 306 therefore exergetic losses between sources and sinks can be visualized.

$$\eta_{Carnot} = 1 - \frac{T_a}{T} \quad (10)$$

### 307 3. Results and discussion

#### 308 3.1. Scenario definition

309 A set of cases is analyzed in order to gain a proper understanding of the different options for energy  
 310 efficiency improvement and emissions reduction of the studied dairy plant. In Table 2, all possible utility  
 311 technologies and investigated cases are presented.

312 The Original case refers to the current energy consumption of the plant without process integration (no  
 313 maximum heat recovery) based on the utilities in place (boiler, one-stage ammonia based refrigeration cycle,  
 314 and cooling water); the Reference case is based on the Original case, however, considering process integration  
 315 with maximum heat recuperation. Subsequently, mechanical vapor re-compression around the process pinch  
 316 (1. MVR) and a heat pump superstructure (2. HPS) improving the refrigeration cycle are proposed. The  
 317 heat pump (1. MVR) was also proposed by Becker et al. [18]. The subsequent cases including different  
 318 solar scenarios and the heat pump superstructure display an extension to the previous analysis.

Table 2: Investigated utility technology cases, first four cases: non-renewable utilities, next four: solar utilities. The grid (GRID) and cooling water (CW, Appendix B.1) utility technologies are present for all cases. The detailed models can be found in: Appendix B.2 (BOI), Appendix B.3 (REF, VCR& HPS), Appendix C.1 (FP), Appendix C.3 (HCPVT), Appendix C.2 (PV).

Case	Process integr. (EI)	Boiler (BOI)	Ref- rigeration (REF)	Vapor re-comp. (MVR)	Heat pump superstructure (HPS)	Solar flat plate (FP)	Solar HCPVT (HCPVT)	Solar PV (PV)
<b>Original</b>	-	X	X	-	-	-	-	-
<b>Reference</b>	X	X	X	-	-	-	-	-
<b>1. MVR</b>	X	X	X	X	-	-	-	-
<b>2. HPS</b>	X	X	X	X	X	-	-	-
<b>2.1. FP</b>	X	X	X	X	X	X	-	-
<b>2.2. PV</b>	X	X	X	X	X	-	-	X
<b>2.3. PV&amp;FP</b>	X	X	X	X	X	X	-	X
<b>2.4. HCPVT</b>	X	X	X	X	X	-	X	-

### 3.2. Daytime operation of the process ( $\Delta$ )

Throughout this Section, daytime only operation is investigated. Due to fewer operating hours and with that lower operating costs less space for investment decisions is left.

#### 3.2.1. Reference scenario and heat pump integration

In this Subsection, the Reference case and efficiency improvements related to heat pump integration are investigated. Therefore, mechanical vapor re-compression (1. MVR), and a multi-stage heat pump superstructure (2. HPS) are subsequently added to the Reference case which consists of the process demands considering heat recovery and the utilities in place (as described in Section 3.1).

Figure 6 depicts the integrated Carnot factor enthalpy profiles of the dairy process and respective three utility systems. The process curve is a rescaled version of the grand composite curve presented in Figure 3 and represents the net heating and cooling demands of the dairy process considering maximum heat recovery. The active utilities for each case, which are responsible for closing the energy balance, were selected and sized during the utility targeting step (in Section 2.2.1) by minimizing the total annual costs. The three investigated utility systems are depicted in this *integrated* Carnot factor enthalpy diagram as an envelope to the process composite curve (thus ensuring energy conservation). Figure 7 and Table 3 provide an illustration and the resulting data of the discussed scenarios, respectively.

*Reference case.* The utility envelope (black, Figure 6) of the Reference case shows at a high temperature plateau ( $T \approx 1000^\circ\text{C}$ ,  $\eta_{\text{Carnot}} = 0.77$ ) the radiative heat release of the boiler (BOI) and down to  $50^\circ\text{C}$  the convective heat release of its combustion gases. At  $30^\circ\text{C}$  ( $\eta_{\text{Carnot}} = 0.02$ ) the condensation level of the refrigeration system (REF) in place is visible. Cooling water (CW) is consumed at  $15^\circ\text{C}$  ( $\eta_{\text{Carnot}} = -0.03$ ) to remove the waste heat from the condensation of the refrigeration systems as well as part of the medium temperature waste heat from the process. The energy balance is closed with the evaporation level of the refrigeration cycle which provides refrigeration at  $-2^\circ\text{C}$  ( $\eta_{\text{Carnot}} = -0.1$ ).

The exergy losses between the utility system and the process composite curve are represented by the area between the two curves. Especially between the boiler producing heat at very high temperatures, but also in the lower temperature range between the process self-sufficient pocket and the utility system drastic exergy losses are visible. This becomes increasingly clear when looking at the cooling water which is used for final cooling of the evaporation stage of the refrigeration cycle and partial cooling of the steam from the concentrated milk production which summed up to a cooling water consumption of  $23.6 \text{ kWh/t}$  of raw material (see Table 3).

The total annual costs, TAC, between the Original case and the Reference case were reduced from  $5.9$  to  $4.3 \text{ €/t}$  of raw material if only the reduction in heating and cooling needs are considered and it reduced to  $5.1 \text{ €/t}$  of raw material, if the estimated capital investment of the retrofit heat exchanger network (HEN) analysis are considered.

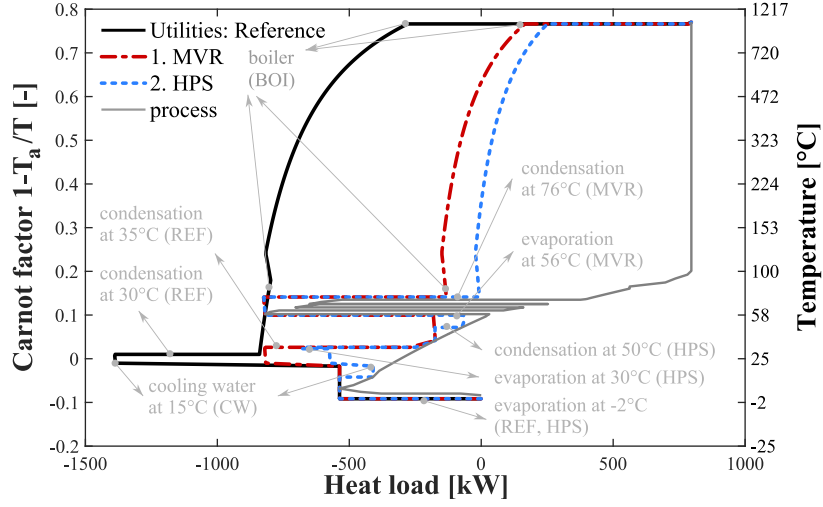


Figure 6: Integrated composite curves of the dairy process and respective utility system. [Reference] case with utilities in place, compared to case [1. MVR] with additional mechanical vapor re-compression around 67°C, and [2. HPS] with additional heat pump superstructure between -2,15,30, and 50°C.

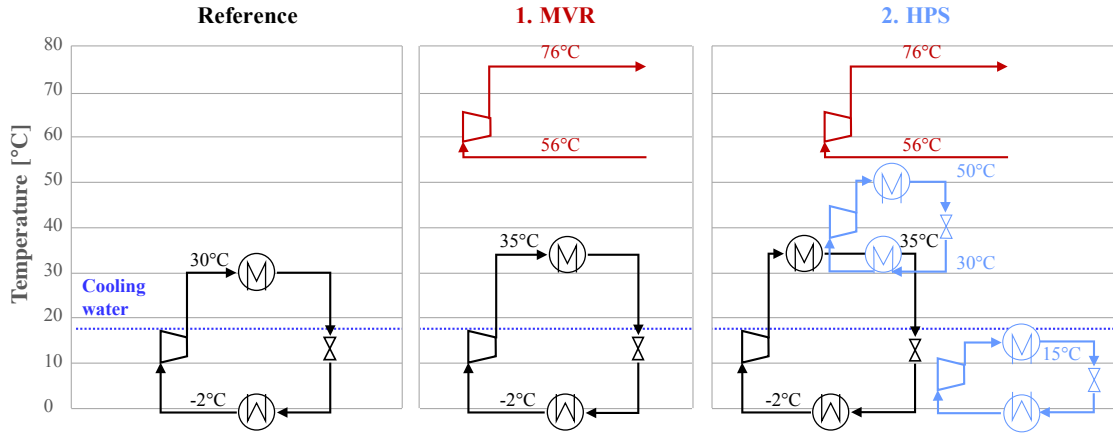


Figure 7: Illustration of the conversion cycles involved in the respective scenarios.

Table 3: Utility integration scenarios as described in Section 3.1. Costs and energy specific consumption data (referred to ton of raw material. (\*) TAC neglecting HEN retrofit cost estimation

			Original	Reference	1. MVR	2. HPS				
Operating costs	$OP_{tot}$	[€/t]	5.9	4.3	2.9	2.6				
Natural gas cons.	$Q^{ng}$	[kWh/t]	64.6	47.9	28.1	24.3				
Electricity cons.	$E^{GRID}$	[kWh/t]	4.6	2.6	4.6	4.8				
Compressor size	$E^{HP_{comp}}$	[kW]	167.0	94.7	111.8	87.5	65.1	10.4	9.7	
Coeff. of performance	$COP_c$	[-]		5.7	4.8	11.6	4.8	11.6	11.0	11.0
Cooling water cons.	$Q^{cw}$	[kWh/t]	n.a.	23.6	7.8	4.5				
Compressor cap. exp.	$INV^{HP_{comp}}$	[€/t]		0	0	0.190	0	0.221	0.042	0.040
Heat exchang. area	$A_{tot}^{HEN}$	[m <sup>2</sup> ]		826	1032	1161				
Number of HEX	$N_{min}^{HEN}$	[-]		48	64	85				
HEN capital cost est.	$INV^{HEN}$	[€/t]		0.9	1.2	1.5				
TAC w/o HEN	$TAC^*$	[€/t]	5.9	4.3	3.1	3.0				
Total annual costs	$TAC$	[€/t]	5.9	5.1	4.3	4.4				

353 *1. MVR.* Introducing a mechanical vapor re-compression unit (1. MVR) elevates the pressure of the steam  
 354 exiting the milk evaporation unit to produce useful heat above the process pinch. In Figure 6, this can  
 355 be seen by two horizontal lines surrounding the process pinch ( $T=\{56,76\}^{\circ}\text{C}$ ,  $\eta_{\text{Carnot}} = \{0.1, 0.15\}$ ). What  
 356 has to be noted is that by reusing the steam released in the milk production, the self-sufficient pocket is  
 357 provided with less heat, meaning that the process can no longer be self-sufficient in the lower temperature  
 358 range. This is, however, compensated by the evaporation stage of the refrigeration cycle which provides  
 359 useful heat (at elevated condensation levels of  $35^{\circ}\text{C}$ ) to the process in this scenario. Exergetic losses were  
 360 thus drastically diminished, as well as the cooling water (from 23.6 to 7.8 kWh/t of raw material, Table  
 361 3) and the natural gas consumption (from 47.9 to 28.1 kWh/t of raw material). The electricity usage was  
 362 slightly increased (from 2.6 to 4.6 kWh/t of raw material) which permits the calculation of the incremental  
 363 coefficient of performance  $\text{COP} = \Delta Q^{\text{ng}} / \Delta E^{\text{GRID}} = 9.9 [-]$ . Where  $Q^{\text{ng}}$  and  $E^{\text{GRID}}$  are the natural gas and  
 364 electricity consumption respectively (as reported in Table 3). On top of this improvement in efficiency, the  
 365 total annual cost dropped from 5.1 in the Reference case to 4.3 €/t of raw material due to drastic reductions  
 366 in the operating costs.

367 The elevation of the condensation level (from 30 to  $35^{\circ}\text{C}$ ) is an engineering choice which was motivated by  
 368 the fact that the size of the mechanical vapor re-compression unit is constrained by how much heat could be  
 369 delivered to the process from the evaporation stage of the refrigeration cycle. By elevating this temperature  
 370 more use of vapor re-compression could be made and a higher incremental COP was achieved. However,  
 371 there is a limit to increasing the upper pressure of an existing compressor.

372 *2. HPS.* Therefore, a heat pump superstructure (2. HPS) is introduced to explore further installation of  
 373 heat pumps with respect to the total annual costs. Adding the heat pump superstructure provides various  
 374 options for single- and multi stage cycles between  $-2$  and  $50^{\circ}\text{C}$  (in  $2^{\circ}\text{C}$  intervals) to the system resolution.  
 375 With this, a new utility system configuration was found consisting of the refrigeration cycle in place, the  
 376 mechanical vapor re-compression unit, and two new heat pump cycles between  $-2$  and  $15^{\circ}\text{C}$  and between  $30$   
 377 and  $50^{\circ}\text{C}$ . In Figure 6 it can be seen that this led to a higher use of the mechanical vapor re-compression  
 378 unit, because more heat could be provided to the process by the heat pumps. And this imposed a further  
 379 decrease in the boiler consumption and, consequentially, a reduction of the exergy losses in the system. The  
 380 total annual costs not considering the HEN costs (disregarded in the MILP) were reduced as well. However,  
 381 considering the estimated capital expenses for the HEN, the TAC slightly increased from 4.3 to 4.4 €/t of  
 382 raw material. The cooling water consumption was further decreased from 7.8 to 4.5 kWh/t of raw material;  
 383 and the electricity consumption was only slightly increased from 4.6 to 4.8 kWh/t. This originated from the  
 384 use of a lower temperature refrigeration cycle ( $-2$  to  $15^{\circ}\text{C}$ ) with a higher  $\text{COP}_c$  of 11, which resulted in a  
 385 reduction of the consumption of the refrigeration in place ( $\text{COP}_c$  4.8). Thereby the incremental COP was  
 386 further improved to 24.2 [-] with respect to the previous scenario (1. MVR).

387 *Summary.* What can be concluded from here is that more complex systems (in terms of heat pumping) offer  
 388 higher potential from the energetic point of view. And more complex systems require more complex tools (as  
 389 illustrated with integration of the heat pump superstructure). However, there is always a trade-off between  
 390 efficiency improvements accompanied by potential operating cost reduction and increase of the complexity  
 391 of the system and therewith the heat exchanger network. The presented results indicate the strong potential  
 392 of such installations and enunciates the importance of investigating selected case studies in further detail.

393 In the next Section, the relation between efficiency improvements (through heat pumping) on solar sizing  
 394 is presented and general guidelines are provided.

### 395 *3.2.2. Heat pump & solar integration*

396 *Process schedule.* Figure 8 depicts the process operating scheme and solar global horizontal (GHI) and direct  
 397 normal (DNI) radiation during all typical periods. The winter days are marked by DNI levels exceeding the  
 398 GHI, meaning that the sun elevation is not very high. The starting hours of the process operation was set to  
 399 8:00 o'clock in the morning lasting between 7 and 8 hours per day in order to form 2625 operating hours per  
 400 year. This is a design choice attempting to overlap process operation with the sunshine hours. Observing  
 401 the overlap between solar radiation and process operation, it becomes clear that there are several instances

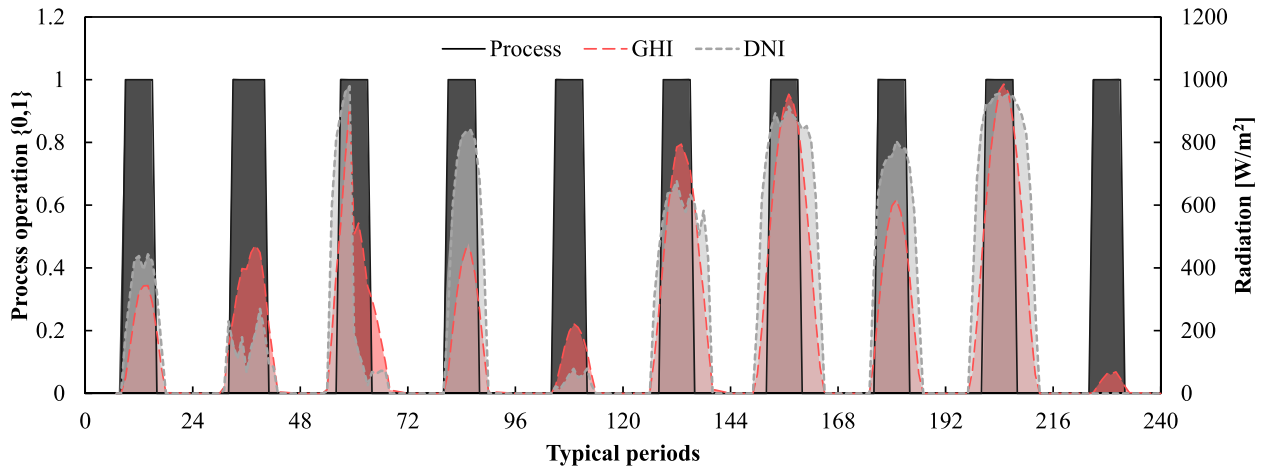


Figure 8: Process operation scheme and solar radiation during all typical periods. (GHI: Global Horizontal Irradiance, DNI: Direct Normal Irradiance.)

402 in which the overlap would be more aligned with the solar insolation if the process starting time was shifted  
 403 to later in the morning. However, knowing that many manufacturing schedules traditionally start at earlier  
 404 hours, 8:00 o'clock was the accepted trade-off.

405 In the daytime operation, the option of storage is not considered. As seen in Figure 8, the main lack of  
 406 solar energy occurs in the early morning hours. It is difficult to store thermal energy over night and thus it  
 407 was unreasonable to consider storage of solar energy for these periods of low solar productivity.

408  *$\epsilon$ -constraint optimization.* The results from the  $\epsilon$ -constraint optimization can be seen in Figure 9. The  
 409 two heat pump cases (1. MVR 6.2 & 2. HPS 5.5 kg CO<sub>2</sub>-eq/t) were determined without  $\epsilon$ -constraint as  
 410 described in Section 3.2.1. Among these, the best scenario in terms of emissions was chosen as reference for  
 411 the solar integration (2. HPS). For integration of the solar components the  $\epsilon$ -constraint was gradually set to  
 412 a fraction of these reference emissions (between 95 and 60%) while minimizing the total system cost. In this  
 413 way a Pareto type curve was produced (Figure 9(a)) between the annualized investment cost and the specific  
 414 emissions. As expected, with decreasing emissions the annualized investment costs increased. The solar cases  
 415 are presented with error bars (the data of which can be found in Appendix C.1, Appendix C.2, Appendix  
 416 C.3). Especially for the HCPVT system which is the most novel technology with the most volatile prices,  
 417 this is a reasonable assumption. Under the current input data, the solar cases performed very similarly  
 418 in terms of investment cost. The total annual cost in Figure 9(b) include besides the investment cost also  
 419 the operating expenses. This leads to a different distribution of the data points. In terms of total annual  
 420 cost, both heat pumping scenarios and most solar options were profitable with respect to the Reference  
 421 case (of the utilities in place). The relative emission reductions amounted to 27% (between Original and  
 422 Reference scenario) due to heat recuperation, 38% due to mechanical vapor re-compression (from Reference  
 423 to 1. MVR), and 12% due to improved refrigeration (from 1. MVR to 2. HPS). The solar scenarios further  
 424 decreased the emissions by 5-40% ( $\epsilon = 95-60\%$ ) with respect to the 2. HPS scenario.

425 It can be observed that some solar technologies potentially resulted in higher emission reductions than  
 426 others. With PV modules the least reductions were achieved since they could not replace the boiler natural  
 427 gas consumption; however, their advantage is the ability to sell overproduction to the grid. Still, up to  
 428 20% emission reduction was achieved integrating solar PV. The reduction is achieved by replacing the  
 429 incoming electricity from the grid with green electricity. The HCPVT system and combined FP and PV  
 430 can reach the highest emission reductions at reasonable cost. At specific CO<sub>2</sub> reductions of 3.8 kg CO<sub>2</sub>-  
 431 equivalent/ton of raw material, which is equivalent to 70% of the best heat pump only (reference) case,  
 432 the TAC of all solar systems overlap, which indicates that this establishes an appropriate balance between  
 433 operating, investment cost and energy waste.

434 The uncertainty related to the solar investment cost is indicated on Figure 9, but not the uncertainty  
 435 related to the heat exchanger area cost estimation. This is a rough estimation with errors varying between  
 436 20 and 40%; therefore, grand conclusions should not be drawn when considering a difference in TAC between  
 437 10 and 20%.

438 Figure 9(c) illustrates the associated total costs of the different scenarios. The operating cost are pre-  
 439 dominant in the Reference case, which explains the fact that the total cost of the solar scenarios did not  
 440 drastically increase. This is attributed to a shift from operating expenses to specific investment cost.

441 A break even CO<sub>2</sub> tax was calculated with respect to the case with lowest TAC (1. MVR). If the  
 442 respective tax was applied all cases would exhibit the same costs as scenario 1. MVR. The tax lied between  
 443 100 and 300 €/ton CO<sub>2</sub>-equivalent which is slightly higher than the current prices, but in the same order  
 444 of magnitude.

445 Figure 10(a) depicts the optimal active solar area for different CO<sub>2</sub>-equivalent emissions ( $\epsilon \in [60\%, 95\%]$ )  
 446 of all studied solar collector types. It can be observed that the required solar area increased with decreasing  
 447 CO<sub>2</sub>-equivalent emissions. The relationship between emission reduction and active solar area does not  
 448 follow a linear regression, but rather flattens out, especially for HCPVT and PV (and the lowest three FP  
 449 data points) systems. This is attributed to the interconnectivity of the system, where higher solar thermal  
 450 production has an influence also the utilization of the heat pumps and mechanical vapor re-compression  
 451 and therewith on the electricity inflicted CO<sub>2</sub>-equivalent emissions. And vice versa, the solar electricity  
 452 production directly affects the utilization of the heat pumps which influences the boiler consumption.

453 The HCPVT system required the smallest active area in comparison to the other solar technologies. This  
 454 stems from the high total conversion efficiency. It has to be noted though that due to two axis tracking and

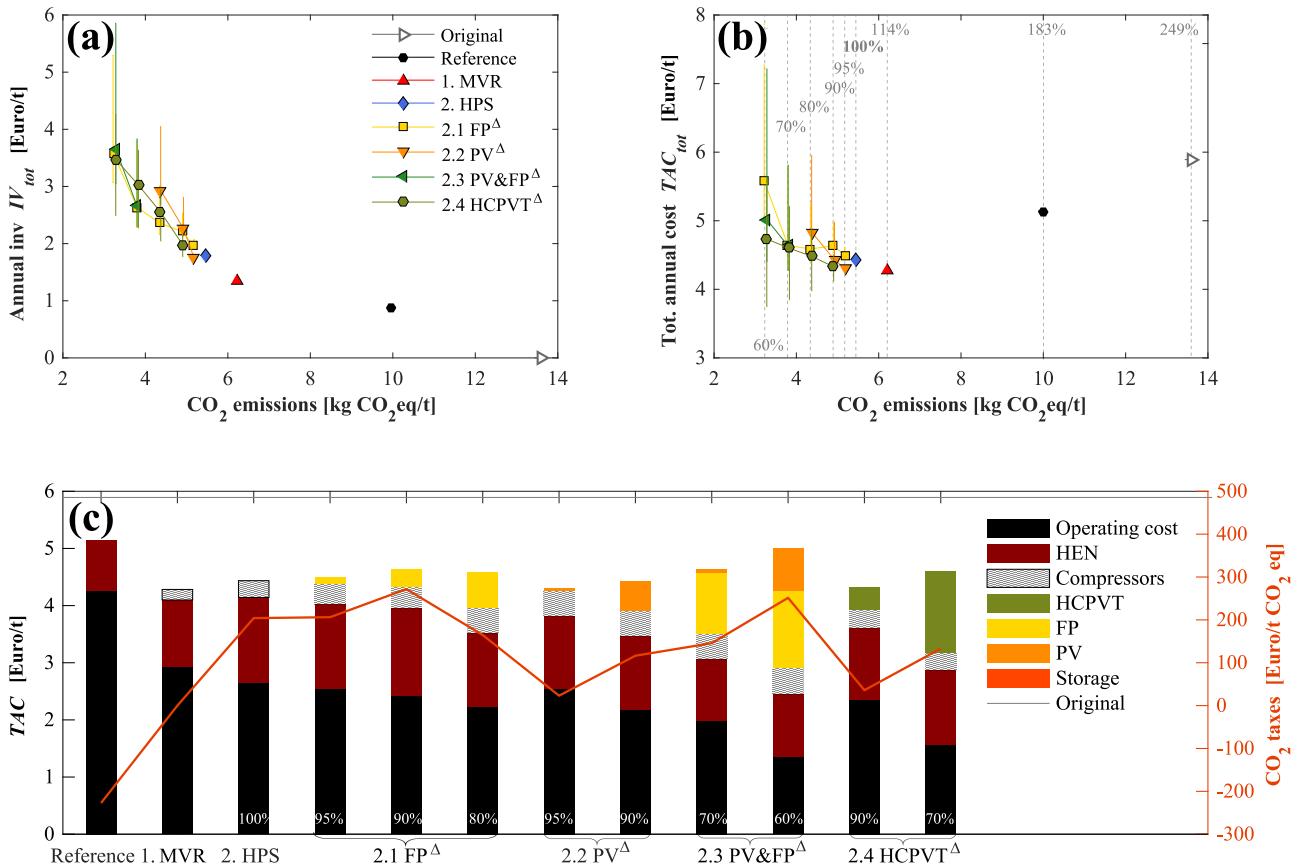


Figure 9: Results from  $\epsilon$ -constraint optimization of different solar options for daytime only process operation.

455 the danger of shading, the actual required land area may be increased by a factor of 2.

456 Figure 10(b) shows the integrated Carnot factor enthalpy profiles of the dairy process and respective  
 457 utility systems. Flat plate collectors (scenario 2.1 FP) at 80% emissions with respect to the 2. HPS case  
 458 (at 4.3 kg CO<sub>2</sub>-equivalent/ton of raw material) are shown at solar noon during different typical days. The  
 459 optimization results show that in comparison to the 2. HPS scenario, a different heat pump configuration  
 460 was chosen: instead of two heat pumps (30 to 50 °C and -2 to 15°C) a two stage heat pump between -2,  
 461 15, and 50 with flash gas removal and intercooling at 30°C was selected during the MILP. In the curve, this  
 462 can be traced with help of the missing evaporation plateau at 30°C which is present in case 2 .HPS. The  
 463 higher operational cost due the higher electricity consumption were compensated by reduced natural gas  
 464 consumption and apparently higher flexibility towards solar variations. This supports again the advantage  
 465 of the holistic approach that takes into account the complete system for the complete operating range.  
 466 It is further visible that the solar thermal production drastically contributed to reducing the exergetic  
 467 losses between process and utility system, as it produces heat at temperatures much closer to the actual  
 468 requirements.

469 Figure 11 shows a graphical representation of the multi-period results of case 2.1 FP at 80% emissions  
 470 with respect to case 2. HPS. In (a) the hot utility streams heat load and meteorological input data are  
 471 shown, illustrating that the solar flat plate collector output (filled area) reduces the boiler consumption. The

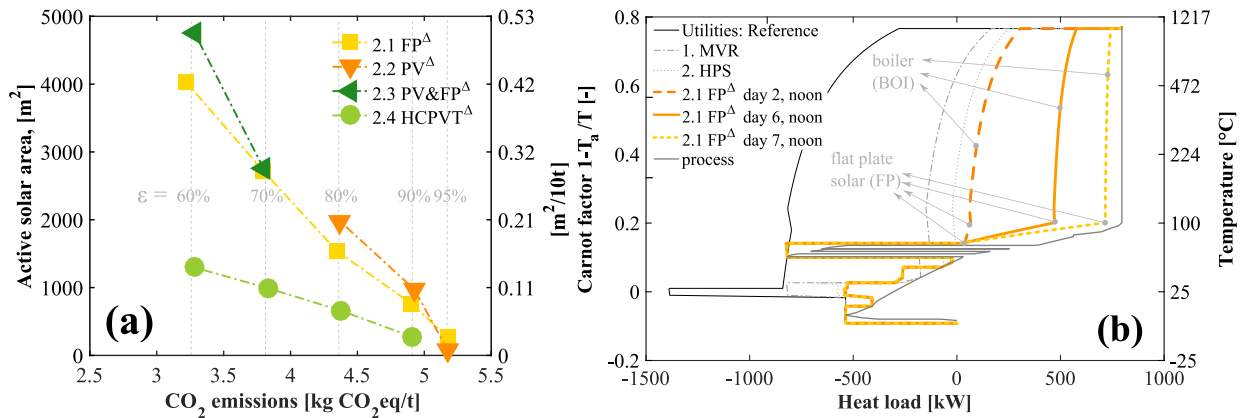


Figure 10: (a) Optimal active solar area, from  $\epsilon$ -constraint optimization ( $\epsilon$  between 95 and 60%). (b) Integrated composite curves of the dairy process and respective utility system. [Reference, 1. MVR, 2. HPS] and Solar integration of Case 2.1 FP at 80% emissions with respect to the reference and 4.3 kg CO<sub>2</sub>-equivalent/ton of raw material during different typical days.

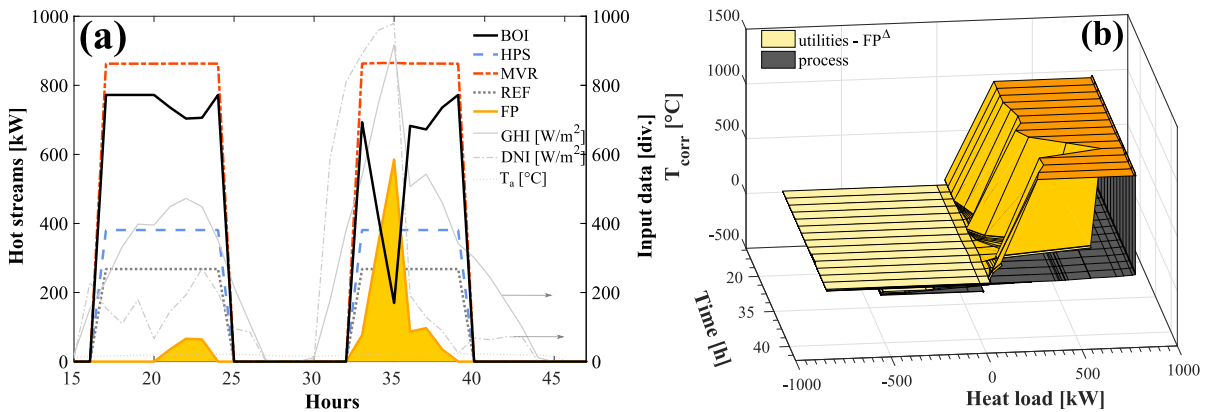


Figure 11: Solar integration, Case 2.1 FP<sup>Δ</sup> at 80% emissions with respect to the reference i.e. 4.3 kg CO<sub>2</sub>-equivalent/ton of raw material, multi-period MILP results: (a) hot utility streams heat load vs time, (b) multi-period integrated composite curves of the dairy process and respective utility system.



472 solar output follows the available global radiation drawn in gray. In Figure 11(b) the respective integrated  
 473 composite curves are shown for multiple periods. Close investigation shows the pattern of the solar output  
 474 from Figure 11(a) in the high temperature plane of the boiler in the curves in Figure 11(b). This is related  
 475 to the much lower operating temperatures of the solar system compared to the boiler and the related drop  
 476 on the temperature axis.

477 It should be noted that the required boiler output changes drastically over time when solar heat is present.  
 478 This might have an influence on the overall efficiency of the energy conversion if part load performance of  
 479 the boiler is modeled in more detail, which was not considered here.

480 In conclusion, it can be stated that there is high economic and environmental potential for this type  
 481 of industrial dairy plants for heat pump and solar integration. Results may be extrapolated to other  
 482 low temperature food processing plants especially when operated in the underlying temperature range.  
 483 Integration of both types of systems, solar and heat pumping should always be investigated with a holistic  
 484 approach. For further steps, it is crucial to investigate the heat exchanger network design to explore technical  
 485 feasibility of integrated systems.

### 486 3.3. Continuous process operation (O)

487 Throughout this Section, continuous process operation is investigated. Due to a higher number of  
 488 operating hours (8760 vs 2625h) and with that increased operating costs more space for investment decisions  
 489 is potentially available.

490 Figure 12 shows the results from the  $\epsilon$ -constraint optimization. It can be observed that the raw material  
 491 specific annualized investment cost were lower than the cost for the daytime only operation. This is explained  
 492 by the higher operating hours and thus increased yearly raw material consumption. This increase had no

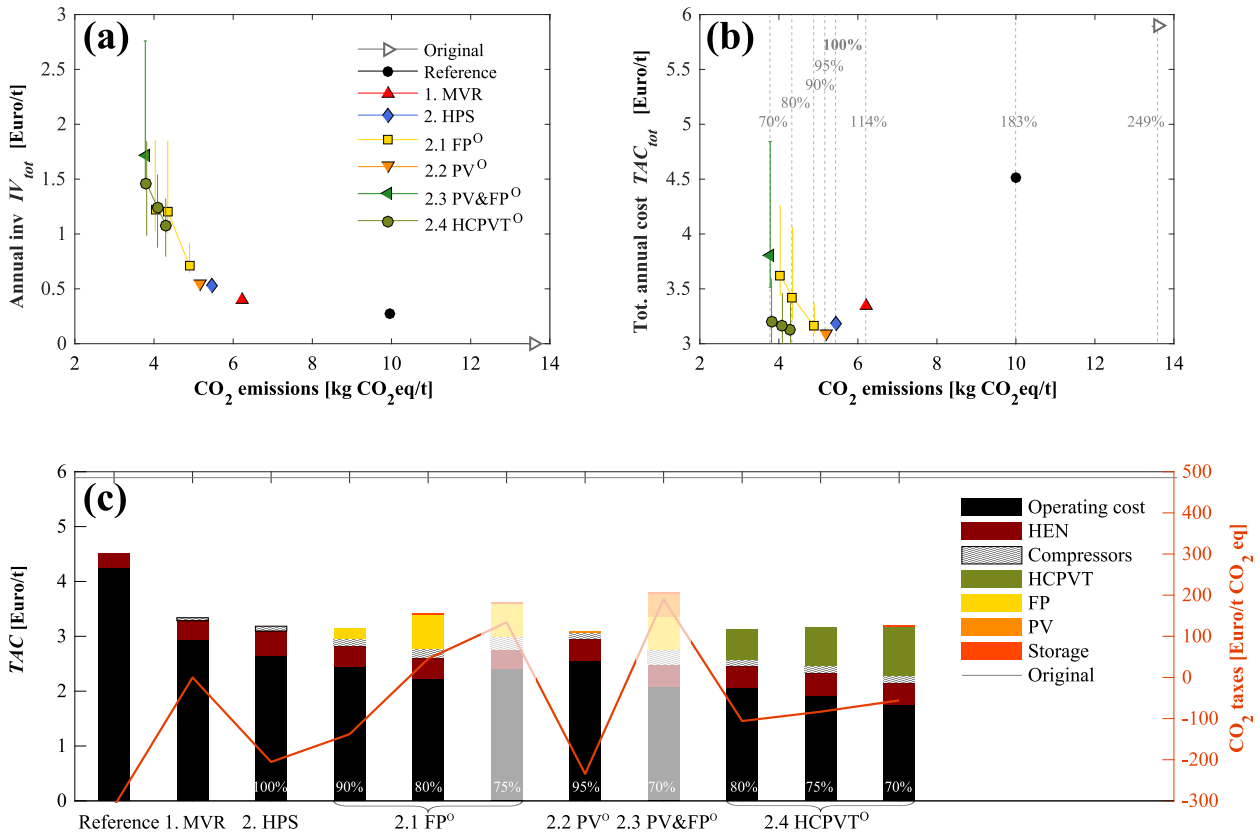


Figure 12: Results of  $\epsilon$ -constraint optimization of different solar options for continuous process operation.

493 influence on the specific operating cost which scale linearly with the raw material consumption. But the  
 494 estimated HEN area and compressor sizes remains unchanged compared to daytime only operation and,  
 495 therefore, the specific capital cost estimations decrease for a higher yearly raw material consumption. This  
 496 leads to lower TAC of the 2. HPS scenario in comparison to 1. MVR and daytime operation.

497 This decrease in relative specific investment costs also showed improvements for the flat plate (FP) and  
 498 photovoltaic modules (PV) at low emission reductions ( $\epsilon = 95\%$ ), which in this case are both profitable with  
 499 respect to the best non-solar case (2. HPS). The PV system could not reach higher emission reductions than  
 500 95%, because batteries are not considered and the positive impact from a renewable source to the grid is not  
 501 counted. With increasing emission reductions the solar size and cost increased and the flat plate scenarios'  
 502 TAC reached slightly above best non-solar case. The HCPVT exhibited the smallest specific TAC of all  
 503 solar options as the overproduced electricity could be sold and therefore the operating costs decrease.

504 The option of storage was only chosen by the optimizer for emission reductions below and including 80%  
 505 (FP) and 70% (HCPVT), respectively. This is attributed to the additional investment cost imposed by the  
 506 storage. Therefore, if the emission goals could be achieved without storage, the storage was not selected.  
 507 The storage volume of the FP cases amounted to 182m<sup>3</sup> (80%) which resulted in an investment cost of about  
 508 5% of the investment cost for the solar collectors, and for the HCPVT to 80m<sup>3</sup> (70%) which corresponded  
 509 to 3% of the solar investment cost.

510 Figure 13(a) depicts the optimal active solar area for different CO<sub>2</sub>-equivalent emissions ( $\epsilon \in [70\%, 95\%]$ )  
 511 of all studied solar collector types. Similarly to the daytime only operation, it can be observed that the  
 512 required solar area increased with decreasing CO<sub>2</sub>-equivalent emissions. This was, however, not the case  
 513 between the FP 80 and 75% emission reductions. Referring to Figure 12(c), it becomes clear that the  
 514 improvement in emission reductions was achieved by an increase in operating cost and compressor investment  
 515 cost, rather than an increase in solar collector area. This solution together with the 70% FP&PV case should  
 516 be excluded from further conclusions as they lead to an extreme oversizing of the heat pump system without  
 517 thermodynamic needs in order fulfill the  $\epsilon$ -constraint. This could be prevented by choosing more carefully  
 518 the variable bounds for the heat pump cycles. As seen in the case of daytime only operation, it can be seen  
 519 that the HCPVT system required the smallest active area in comparison to the other solar technologies for  
 520 strong emission reductions due to high efficiency and high uptime.

521 Figure 13(b) shows the integrated composite curves of the dairy process and respective utility systems.  
 522 The HCPVT system (scenario 2.1 HCPVT) at 70% emissions with respect to the 2. HPS case (at 3.8 kg  
 523 CO<sub>2</sub>-equivalent/ton of raw material) are shown at solar noon and evening during two typical days. The  
 524 same heat pump configuration as for the daytime operation scheme was chosen by the optimizer: instead of  
 525 two heat pumps (30 to 50 °C and -2 to 15°C, 2. HPS) a two stage heat pump between -2, 15, and 50 with

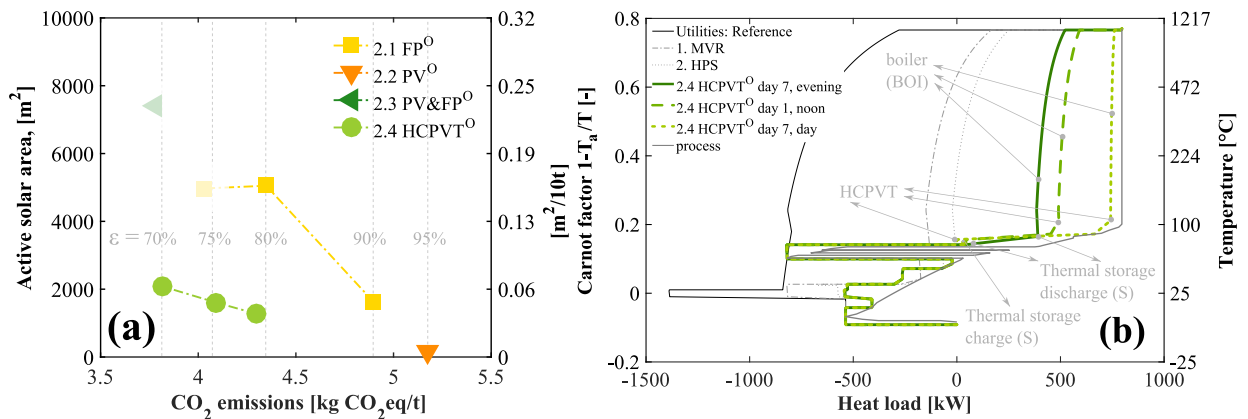


Figure 13: (a) Optimal active solar area, from  $\epsilon$ -constraint optimization ( $\epsilon$  between 95 and 70%). (b) Integrated composite curves of the dairy process and respective utility system. [Reference, 1. MVR, 2. HPS] and Solar integration of Case 2.4 HCPVT<sup>O</sup> at 70% emissions with respect to the reference i.e. 3.8 kg CO<sub>2</sub>-equivalent/ton of raw material during different typical days.

526 flash gas removal and intercooling at 30°C. During noon at day 1, there was not enough solar heat available  
527 to cover the process demand completely which is why the boiler was required to back-up.

528 On day 7 at solar noon, the HCPVT produced heat which was not required by the process. As a result,  
529 the storage system was filled which can be seen by the little nose in the curve. This permits to store the  
530 surplus of heat in the thermal storage unit, which can then be released in the evening when solar heat is not  
531 available. This can be seen on the third curve, where the storage system provides the low temperature heat  
532 for the process and the HCPVT system is not active any more. The behavior of the storage system, boiler,  
533 and solar dish is further illustrated in Figure C.18 (in Appendix C.4) indicating a prolongation of the solar  
534 operation between 1-4 hours (at  $\epsilon=70\%$ ).

535 It has to be noted that with the HCPVT the boiler is always active to provide high temperature heat  
536 that cannot be provided by the HCPVT due to a process utility pinch. Limiting the operating range of the  
537 boiler between the maximum and a minimum at 80% of the maximum would make study of the storage  
538 system even more interesting and put aside the question of part load performance of the boiler, but was not  
539 considered in this work. This will, however, be subject to further studies.

#### 540 4. Conclusions

541 The work presented here has proposed a comprehensive methodology that allows simultaneous optimiza-  
542 tion of the process' refrigeration and solar utility system with respect to economic and environmental criteria.  
543 This includes data collection and clustering, development of a heat pump superstructure, and multi-period,  
544  $\epsilon$ -constrained Mixed Integer Linear Programming (MILP) optimization. The proposed methodology was  
545 demonstrated on the basis of a dairy plant where different solar components are compared and evaluated  
546 based on the total cost and CO<sub>2</sub>-equivalent emissions. The methodology permits to derive cost optimal  
547 solar field, heat pump, and thermal storage tank sizing as well as optimal operation of the system during  
548 all operating periods at selected emission levels.

549 Optimization of heat recovery, heat pump, and mechanical vapor re-compression placement (disregarding  
550 the solar options) shows reduced exergy destruction and total costs at increased energy efficiency in the  
551 system.

552 Three solar systems were investigated for daytime only and continuous operation of the dairy process:  
553 photovoltaic modules (PV), flat plate collectors (FP), and a high concentration photovoltaic and thermal  
554 system (HCPVT). One mayor conclusion from the presented case study is that integration of solar energy can  
555 contribute to reduce the environmental impact and exergetic losses of the process at beneficial total costs.  
556 Solar energy is, however, only selected by the thermo-economic optimization algorithm in combination with  
557 an optimized system comprising heat recuperation, mechanical vapor re-compression, and heat pumping.  
558 This supports the choice of a comprehensive approach.

559 For continuous operation of the process, the reduction in specific emissions was not as significant as  
560 for daytime only operation. Due to the capital cost the thermal storage system, it is only chosen by  
561 the optimization for high emission reductions requirements. Photovoltaic panel integration offers the least  
562 emission reduction potential (up to 20% reduction in daytime only operation with respect to the best non-  
563 solar case). However, installation is simple, independent, and if overproduced, can be exported to the  
564 grid. In comparison, the HCPVT system, has high potential with very high efficiencies bringing emission  
565 reductions easily up to 40% (daytime only) at uncertain cost and shading losses. The very low cost, low  
566 efficiency flat plate collectors offer a simple solution providing more reliability of the system performance  
567 capital cost expenses with emission reductions of up to 30% (daytime only).

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## 699 Appendix A. Heat Exchanger Network (HEN) cost

700 The heat exchanger area is estimated as presented by Ian C. Kemp [45–47] (area targeting) based on  
 701 vertical intervals placed between the hot and cold composite curves. In each interval the approximate heat  
 702 exchanger area is estimated based on the logarithmic mean temperature difference, the hot and cold average  
 703 heat transfer coefficients, and the heat transferred within the interval. The total area  $A_{tot}^{HEN}$  [m<sup>2</sup>] is found  
 704 by the summing over all intervals. Estimation of the installed heat exchanger capital expenses springs from  
 705 the assumption that all heat exchangers are equal.

$$C_p^{HEN} = a + b * \left( \frac{A_{tot,p}^{HEN}}{N_{min,p}^{HEN}} \right)^c * N_{min,p}^{HEN} \quad (\text{A.1})$$

706 The minimum number of heat exchangers (units)  $N_{min}^{HEN}$  to be placed in each zone (between pinches) is  
 707 estimated following the suggestion of Linnhoff et al. [48] based on graph theory. The cost correlations are  
 708 taken from Taal et al. [49] reprinted from Hall et al. [50] and can be found in Table A.4 for retrofit heat  
 709 exchanger costs. The total cost is calculated for each period  $p \in \mathbf{P}$  and the final installed cost is then found  
 710 as the maximum of all periods.

$$C^{HEN} = \max_p (C_p^{HEN}) \quad (\text{A.2})$$

Table A.4: Heat exchanger network (HEN) cost estimation parameters from Hall et al. [50] reprinted by Taal et al. [49](2.33) updated to 2015 €, Carbon steel (CS)-CS heat exchangers.

Parameter	Symbol	Value	Unit
Heat exchanger cost estimations	HEN		
Fixed parameter	a	9'500	€
Scaling parameter	b	460	€/m <sup>2</sup>
Non-linear parameter	c	0.8	-

711

## 712 Appendix B. Non-renewable technologies

### 713 Appendix B.1. Cooling water (CW)

714 The cooling water is modeled by one cold stream between 15 (T<sub>in</sub><sup>cw</sup>) and 17°C (T<sub>out</sub><sup>cw</sup>). The operating cost  
 715 are negligible as the cooling water is assumed to origin from a river close by the plant. The cooling thermal  
 716 stream is formulated by the following relation, where  $c_p^{CW}$  [kJ/kgK] is the specific heat capacity, and  $m^{CW}$ ,  
 717 1 kg/s, is the reference mass flow rate.

$$Q^{CW} = m^{CW} \cdot c_p^{CW} \cdot (T_{out}^{CW} - T_{in}^{CW}) \quad (\text{B.1})$$

### 718 Appendix B.2. Boiler (BOI)

719 The boiler heat release is modeled by three streams: air preheating, radiative and convective thermal  
 720 power from natural gas combustion. The total heat release is derived by a multiplication of the lower heating  
 721 value (LHV) with the reference fuel flow rate including the efficiency. Cooling down the combustion gases  
 722 from the adiabatic flame temperature to a pre-defined radiation temperature defines the radiative component  
 723 and is displayed as a hot stream at constant temperature (radiation temperature). The convective component  
 724 is defined as a hot stream between the radiation temperature and the exhaust gases outlet temperature.  
 725 The air preheating is written as a cold stream from ambient to preheating temperature. This practice has  
 726 been published by Maréchal et al. [51] and is applied in the same manner by Becker et al. [18]. The heat  
 727 release is illustrated below in equation B.2.

$$Q^{\text{BOI}} = -Q_{\text{pre}}|_{T_a}^{T_{\text{preh}}} + Q_{\text{rad}}|_{T_{\text{rad}}} + Q_{\text{conv}}|_{T_{\text{out}}}^{T_{\text{rad}}} \quad (\text{B.2})$$

728 The parameters are described in Table B.5. The boiler investment cost is set to zero, since it is already  
 729 in-place. The natural gas consumption (eq. B.3) is derived from the boiler useful heat release based on  
 730 a conversion fraction. The conversion fraction includes the thermal losses as well as the part of the heat  
 731 released in the combustion that is dispensed in the exhaust gases and therefore not delivered to the process  
 732 as useful heat.

$$Q^{\text{ng}} = Q^{\text{BOI}} / f^{\text{BOI}} \quad (\text{B.3})$$

Table B.5: Boiler (BOI) parameters, adapted from [18].

Parameter	Symbol	Value	Unit
Investment (in-place)	$IV^{\text{BOI}}$	0	€/kW
Adiabatic flame temperature	$T_{\text{ad}}^f$	2768	°C
Radiation temperature	$T_{\text{rad}}$	1027	°C
Exhaust gases temperature	$T_{\text{out}}$	120	°C
Air preheating temperature	$T_{\text{preh}}$	120	°C
Radiative heat load	$Q_{\text{rad}}$	28842	kW
Convective heat load	$Q_{\text{conv}}$	15031	kW
Air preheating load	$Q_{\text{preh}}$	1740	kW
Boiler conversion fraction	$f^{\text{BOI}}$	90	%

### 733 Appendix B.3. Heat pump superstructure

734 In the following, the heat and electricity consumption and production of all heat pump utilities are  
 735 described for a reference mass flow rate which is to say, a fixed size. These parameters enter into the utility  
 736 targeting constraints (1)-(4) and are multiplied with sizing factors.

737 The heat release in a condenser at temperature level  $T_i$  of fluid  $f$  for a reference flow rate  $m_{\text{ref}}$  is composed  
 738 of two parts: condensation at the saturation temperature and subcooling between saturation and subcooling  
 739 temperature. Likewise, the heat consumption in an evaporator is defined.

$$\begin{aligned} Q_i^{\text{HP}_{\text{cond/evap}}} &= m_{\text{ref}} \cdot \left( [h_V(T_i) - h_L(T_i)]_{T_i} + [h_L(T_i) - h_{\text{SC}}(T_i)]_{T_i, \text{SC}}^{T_i} \right) \\ &= m_{\text{ref}} \cdot (\Delta h_{\text{cond/evap}}(T_i) + \Delta h_{\text{SC}}(T_i)) \end{aligned} \quad (\text{B.4})$$

740 Also the liquid side of the presaturator needs to be cooled down to the subcooling temperature.

$$Q_i^{\text{HP}_{\text{presat,SC}}} = m_{\text{ref}} \cdot [h_L(T_i) - h_{\text{SC}}(T_i)]_{T_i, \text{SC}}^{T_i} \quad (\text{B.5})$$

741 Desuperheating from the superheated vapor balance can be achieved by mixing in the presaturator or  
 742 with help of a heat exchanger.

$$Q_i^{\text{HP}_{\text{desupQ}}} = m_{\text{ref}} \cdot [h_{\text{SH}}(T_i) - h_V(T_i)]_{T_i}^{T_i, \text{SH}} \quad (\text{B.6})$$

743 The power consumption depends on the isentropic efficiency and the enthalpies of both pressure levels.

$$E_{k \rightarrow i}^{\text{HP}_{\text{comp}}} = m_{\text{ref}} \cdot \left[ \frac{h_{\text{isentropic},k}(T_i) - h_V(T_j)}{\eta_{\text{isentropic}}} \right] \quad (\text{B.7})$$

744 The non-linear cost function for compressors [in €, 2010] is formulated after reference [52] reprinted by [18]  
 745 where the installation factor was assumed to be 1.5.

$$IV^{\text{HP,comp}} = 1.5 \cdot 1500 \cdot 160^{0.1} \cdot (E_{\text{HP,comp}})^{0.9} \quad (\text{B.8})$$

746 To ensure mass and energy conservation within the heat pump, linear constraints are defined at all liquid,  
 747 vapor and superheated vapor points. These constraint are added to the utility targeting constraints. These  
 748 equations are further documented in [26].

749 Figure B.14 presents the annualized compressor capital costs as a function of the compressor power rating  
 750 including the maintenance cost and its linear fitting function which was assumed during the MILP problem  
 751 resolution.

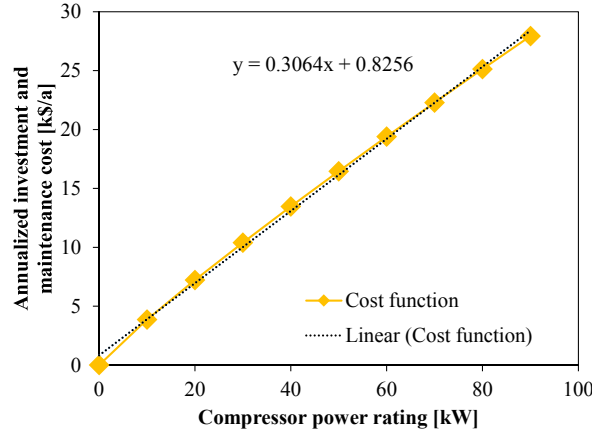


Figure B.14: Linearized, annualized capital cost function of the compressor, including maintenance costs.

Table B.6: Heat pump parameters.

Parameter	Symbol	Value	Unit
Heat pump superstructure (HPS)			
Investment	$IV^{HPS}$	eq. (B.8)	
Temperatures	$T_{cond,1}^{HPS}$	-2,10,15,20,25,30,35,40,45,50	°C
Isentropic compressor efficiency	$\eta_{comp}^{HPS}$	0.76	-
Fluid	Ammonia		
Refrigeration in-place (REF)			
Investment	$IV^{REF}$	0	€/kW
Condenser temperature	$T_{cond}^{REF}$	30 & 35	°C
Evaporator temperature	$T_{evap}^{REF}$	-2	°C
Isentropic compressor efficiency	$\eta_{comp}^{REF}$	0.76	-
Fluid	Ammonia		
Vapor recompression as proposed by [18] (MVR)			
Investment	$IV^{HP}$	eq. (B.8)	
Condenser temperature	$T_{cond}^{HP}$	76	°C
Evaporator temperature	$T_{evap}^{HP}$	56	°C
Isentropic compressor efficiency	$\eta_{comp}^{HP}$	0.76	-
Fluid	Water		

## 752 Appendix C. Solar technologies

753 *Global horizontal radiation.* The global solar radiation incident on a plane is composed partly of direct and  
 754 partly of diffuse radiation reflected from the ground, clouds and the atmosphere. A common measurement  
 755 provided by weather stations around the globe is the Global Horizontal Radiation (GHI,  $\mathbf{g}_h$ , [W/m<sup>2</sup>]) as



756 well as the Direct Normal Incidence (DNI,  $\mathbf{b}_n$ , [ $\text{W}/\text{m}^2$ ]) or beam radiation. The GHI is derived from the  
 757 diffuse and the direct radiation incident on the plane [53].

$$\begin{aligned} \mathbf{g}_h &= \mathbf{d}_h + \mathbf{b}_h \\ &= \mathbf{d}_h + \mathbf{b}_n \cdot \cos(\theta_s) \end{aligned} \quad (\text{C.1})$$

758 where  $\mathbf{d}_h$  [ $\text{W}/\text{m}^2$ ] is the diffuse horizontal and  $\mathbf{b}_h$  [ $\text{W}/\text{m}^2$ ] is the direct horizontal radiation,  $\theta_s$  [ $^\circ$ ] is the  
 759 solar zenith angle indicated in Figure C.15 (in grey) as the angle between the earth surface normal (zenith)  
 760 and the sun.

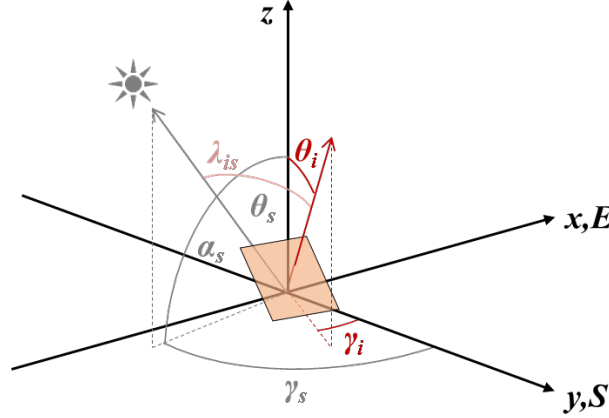


Figure C.15: Angles of the sun and an inclined surface.

761 *Global radiation on inclined surface.* The global radiation present on an inclined surface (i) is derived from  
 762 the solar beam on the slope and the present diffuse radiation. The direct beam on an inclined surface  
 763 is calculated by the product of the direct horizontal radiation and the cosine of the incidence angle between  
 764 beam and slope. Calculation of the diffuse component on a slope is not trivial since the diffuse sky radiation  
 765 is anisotropic meaning that it is not uniformly distributed over the hemisphere. Perez et al. [54, 55] offer  
 766 correlations for modeling the anisotropic component of the diffuse radiation. In order to keep the problem  
 767 at reasonable complexity the isotropic diffuse model proposed by Liu and Jordan [56], reprinted in [57] is  
 768 used in this work. It is divided into three components: the beam, isotropic diffuse, and global radiation  
 769 diffusely reflected from the ground (Eq. 2.15.1 [57]).

$$\begin{aligned} \mathbf{g}_i &= \underbrace{\mathbf{b}_n \cdot \cos(\lambda_{is})}_{\mathbf{b}_i} + \underbrace{\mathbf{d}_h \cdot \left( \frac{1 + \cos(\vartheta_i)}{2} \right)}_{\mathbf{d}_i} + \underbrace{\mathbf{g}_h \cdot \rho_g \cdot \left( \frac{1 - \cos(\vartheta_i)}{2} \right)}_{\mathbf{g}_{gr,i}} \\ &= \mathbf{b}_i + \mathbf{d}_i + \mathbf{g}_{gr,i} \end{aligned} \quad (\text{C.2})$$

770 where  $\mathbf{b}_i$  [ $\text{W}/\text{m}^2$ ] is the direct beam,  $\mathbf{d}_i$  [ $\text{W}/\text{m}^2$ ] is the sky diffuse and  $\mathbf{g}_{gr,i}$  [ $\text{W}/\text{m}^2$ ] is the ground reflected  
 771 diffuse radiation present on the surface i,  $\vartheta_i$  [ $^\circ$ ] is the slope inclination. The ground reflectivity is given in  
 772 Table C.7.

773 Under the assumption that the solar angles are known, the incidence angle of the solar beam with respect  
 774 to an inclined surface  $\lambda_{is}$  can be calculated (Eq. 1.6.3 [57]) as follows.

$$\begin{aligned} \cos(\lambda_{is}) &= \cos(\vartheta_s) \cdot \cos(\vartheta_i) + \sin(\vartheta_s) \cdot \sin(\vartheta_i) \cdot \cos(\gamma_s - \gamma_i) \\ &= \sin(\alpha_s) \cdot \cos(\vartheta_i) + \cos(\alpha_s) \cdot \sin(\vartheta_i) \cdot \cos(\gamma_s - \gamma_i) \end{aligned} \quad (\text{C.3})$$

Table C.7: Parameters to calculate incident radiation.

Parameter	Symbol	Value	Unit
Ground reflectivity [58]	$\rho_g$	0.154	-

775 *Appendix C.1. Solar thermal: flat plate collector (FP)*

776 The efficiency of solar thermal collectors at steady state conditions is commonly described by a quadratic  
777 performance curve that depends on the operating temperature  $T_m^{\text{FP}} = 0.5 \cdot (T_{\text{in}}^{\text{FP}} + T_{\text{out}}^{\text{FP}})$ , the incoming radi-  
778 ation intensity during that period  $g_{p,i}$  [ $\text{W}/\text{m}^2$ ], the conversion factor  $\eta_0^{\text{FP}}$ , and two experimental parameters  
779  $a_1^{\text{FP}}$  and  $a_2^{\text{FP}}$ .

780 The general conversion factor is defined by the absorber material, thickness, and heat transfer fluid  
781 flow characteristics. The first experimental coefficient is usually related to the collector convective heat  
782 losses, and the latter is influenced by the collector re-radiation losses. The temperature dependent efficiency  
783 Equation C.4 is then written as follows ([57] Eq. 6.17.7, [22]).

$$\eta_p^{\text{FP}} = \eta_0^{\text{FP}} - a_1^{\text{FP}} \cdot \frac{T_m^{\text{FP}} - T_{p,a}}{g_{p,i}} - a_2^{\text{FP}} \cdot g_{p,i} \cdot \left( \frac{T_m^{\text{FP}} - T_{p,a}}{g_{p,i}} \right)^2 \quad \forall p \in \mathbf{P} \quad (\text{C.4})$$

784 All parameters can be found in Table C.8. The formula accounts for a reduction in efficiency for operating  
785 temperatures higher than the ambient (due to thermal losses) and for reduction in efficiency due to reduced  
786 radiation intensities at normal incidence. However, since panels are installed at a fixed position, an incidence  
787 angle modifier is introduced in order to account for optical losses related to the angle of the incident radiation.  
788 By definition, it is set to one at  $0^\circ$  incidence and is usually provided at  $50^\circ$ . In order to find other data  
789 points a cosine law is traditionally suggested (e.g. 6.17.10 [57] also in ASHRAE 93-2003), which however  
790 cannot be evaluated for angles close to  $90^\circ$ . Therefore an Ambrosetti type Equation [59] is used here which  
791 can be evaluated up to  $90^\circ$ .

$$f_{\text{IAM}}^{\text{FP}}(\lambda) = 1 - \tan^a \left( \frac{\lambda}{2} \right) \quad (\text{C.5})$$

792 where the coefficient  $a$  here provided in Table C.8, is usually derived from known data at a certain inclination  
793 (e.g.  $50^\circ$ ); for beam radiation, the incidence angle  $\lambda$  is equivalent to the solar angle of incidence on the slope  
794  $\lambda_{\text{is}}$  [ $^\circ$ ]. For the diffuse and ground reflected component, the incidence angle is found from Equation (C.6)  
795 based on the slope inclination  $\vartheta_i^{\text{FP}}$  ([57], Figure 5.4.1, Eq. 5.4.1, 5.4.2).

$$\begin{aligned} \lambda_{\text{id}} &= 90 - 0.5788 \cdot \vartheta_i^{\text{FP}} + 0.002693 \cdot \left( \vartheta_i^{\text{FP}} \right)^2 \\ \lambda_{\text{igr}} &= 59.7 - 0.1388 \cdot \vartheta_i^{\text{FP}} + 0.001497 \cdot \left( \vartheta_i^{\text{FP}} \right)^2 \end{aligned} \quad (\text{C.6})$$

796 With this, the time-dependent thermal energy production  $Q_p^{\text{FP}}$  [W] of the solar flat plate collectors can be  
797 formulated.

$$Q_p^{\text{FP}} = \eta_p^{\text{FP}} \cdot f_{\text{field}}^{\text{FP}} \cdot \left( b_{p,i} \cdot f_{\text{IAM,ib}}^{\text{FP}} + d_{p,i} \cdot f_{\text{IAM,id}}^{\text{FP}} + g_{p,\text{gr},i} \cdot f_{\text{IAM,ir}}^{\text{FP}} \right) \cdot A^{\text{FP}} \quad \forall p \in \mathbf{P} \quad (\text{C.7})$$

798 where each type of radiation (direct beam  $b_{p,i}$ , sky diffuse  $d_{p,i}$ , ground reflected diffuse  $g_{p,\text{gr},i}$ ) is multiplied  
799 with the respective incidence angle modifier Eq. (C.5,C.6), the collector area, thermal field loss factor (Table  
800 C.8) and efficiency from Eq. (C.4).

801 *Performance.* Figure C.16 shows the thermal conversion efficiency  $\eta_{p,\text{tot}}^{\text{FP}} = Q_p^{\text{FP}} / (g_{h,p} * A^{\text{FP}})$  of the thermal  
802 energy production of a flat plate collector  $Q_p^{\text{FP}}$  in period  $p$  with respect to the global horizontal radiation  
803  $g_{h,p}$  in each period  $p$ . This efficiency is comprised of not only the conductive and radiative thermal losses,  
804 but also the losses caused by the non-perpendicular angle of incidence of the sun. Since the collectors are  
805 installed in a fixed position, different angles of inclination need to be tested. The graph indicates clearly

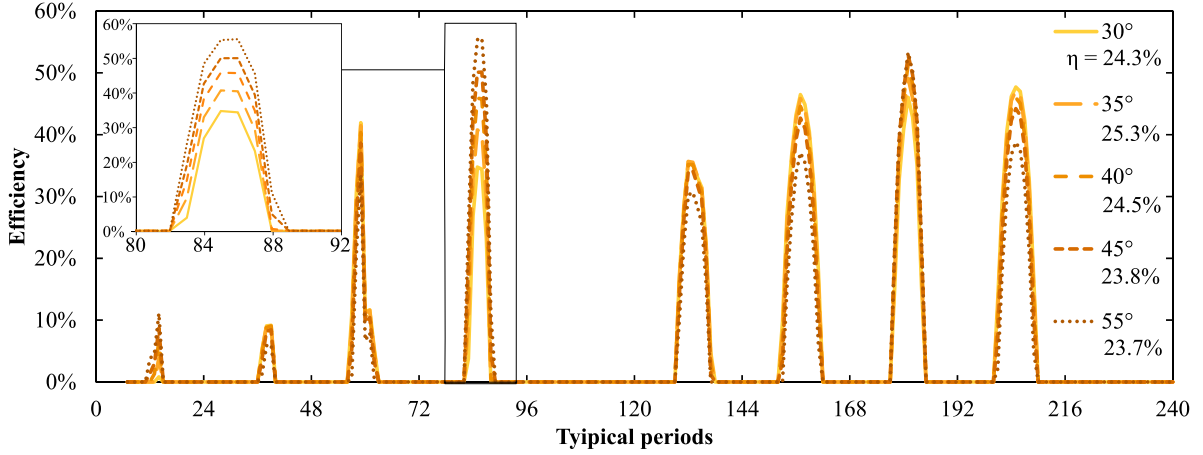


Figure C.16: Thermal conversion efficiency of flat plate (FP) solar thermal collectors as a function of time for different inclination angles, performance equations presented in Appendix C.1.

806 that in some days (e.g. day number four and eight) collectors with 55° inclination outperform the collectors  
 807 with smaller inclination angles. This stems from the fact that on these (winter) days the solar elevation  
 808 angle is not very high (see Figure 5) and collectors installed at higher inclination can capture more of the  
 809 incoming radiation. On days in the middle of the summer (e.g. day number seven and nine), the solar  
 810 elevation angle is very high and therefore the collectors with the smallest inclination angles exhibit the best  
 811 performance. In the end, the total yearly performance is the most important indicator which is displayed in  
 812 Figure C.16 for all the inclination angles. It is weighted by the relative occurrence of each typical period in  
 813 the year. An inclination angle of 35° with an overall efficiency of about 25.3% exhibits the best performance  
 814 and was therefore chosen for further analysis.

815 This average efficiency of the considered flat plate collectors is far below the theoretical maximum of up to  
 816 60%. In this study a balance is struck between performance and capital investment. The efficiency of single  
 817 glazed flat plate thermal collectors drops with higher operating temperatures, lower ambient temperatures,  
 818 and the inclination of the sun. These insufficiencies are partly overcome by better insulation or by changing  
 819 the collector model (e.g. evacuated tube collectors). Both of these options come at distinctly higher costs

Table C.8: Flat plate solar collector (FP) parameters, if no other indication, data taken for single glazing flat plate collectors from Tehnomont [60] data tested by SPF [29].

Parameter	Symbol	Value	Unit
Ground reflectivity	$\rho_g$	0.154	-
Heat transfer fluid		water glycol mix	
Investment cost ([29],2012)	$IV_{FP}$	196	€/m <sup>2</sup>
Installation cost factor	$f_{FP}$	1.5	-
Total investment {min,max}		{200,600}	€/m <sup>2</sup>
Collector area	$A^{FP}$	2.059	m <sup>2</sup>
Standard efficiency/ conversion factor	$\eta_0^{FP}$	0.74	-
Efficiency coefficient 1	$a_1^{FP}$	3.5940	W/m <sup>2</sup> K
Efficiency coefficient 2	$a_2^{FP}$	0.00864	W/m <sup>2</sup> K <sup>2</sup>
Incidence angle modifier coefficient	$a$	2.40	-
Fluid inlet temperature	$T_{in}^{FP}$	80	C
Fluid outlet temperature	$T_{out}^{FP}$	105	C
Slope Inclination (recommended: similar to latitude)	$\vartheta_i^{FP}$	35	°
Azimuth, shift towards south	$\gamma_i^{FP}$	0	°
Thermal field loss factor	$f_{field}^{FP}$	0.97	-

820 (factor 2 and higher [29]) and were, therefore, not considered.

### 821 Appendix C.2. Photovoltaic module (PV)

As mentioned before, the two main parameters influencing the PV performance is the cell temperature and the irradiation intensity. The cell temperature can be determined by correlations found in the literature (Eq. 23.3.4 [57]).

$$T_{p,c}^{\text{PV}} = T_{p,a} + \frac{g_{p,i}}{g_{\text{NOCT}}} \cdot \frac{9.5}{5.7 + 3.8 \cdot v_{p,a}} \cdot \left[ 1 - \frac{\eta_{\text{lm}}^{\text{PV}}}{(\tau\alpha)} \right] \cdot (T_{\text{NOCT}}^{\text{PV}} - T_{a,\text{NOCT}}) \quad \forall p \in \mathbf{P} \quad (\text{C.8})$$

822 where  $T_{p,a}$  is the (time dependent) ambient temperature,  $v_{p,a}$  is the ambient wind speed, and  $g_{p,i}$  is the global  
 823 incident radiation on an inclined surface during period  $p$  (see Appendix C). The irradiation and ambient  
 824 temperature at nominal operating cell temperature (NOCT) conditions as well as all other parameters are  
 825 depicted in Table C.9. The ambient temperature and wind speed are provided from the meteorological data  
 826 described in Section 2.1.2.

A factor accounting for the influence of the incident radiation intensity is calculated by linear interpolation between the standard testing conditions (STC, see Table C.9) and the certified indication at 200W/m<sup>2</sup>.

$$f_{p,g}^{\text{PV}} = f_{200} + (g_{p,i} - g_{200}) \cdot \frac{1 - f_{200}}{g_{\text{STC}} - g_{200}} \quad \forall p \in \mathbf{P} \quad (\text{C.9})$$

The time-dependent electricity production  $E_p^{\text{PV}}$  [W] is then written according to the following (Eq. 23.2.16 [57]).

$$E_p^{\text{PV}} = \eta_{\text{lm}}^{\text{PV}} \cdot f_{\text{gen}}^{\text{PV}} \cdot f_{p,g}^{\text{PV}} \cdot \left[ 1 - f_{\text{T}}^{\text{PV}} \cdot (T_{p,c}^{\text{PV}} - T_{\text{STC}}^{\text{PV}}) \right] \cdot g_{p,i} \cdot A^{\text{PV}} \quad \forall p \in \mathbf{P} \quad (\text{C.10})$$

827 where all parameters such as the module area, the temperature reduction factor, and the electrical conversion  
 828 factor are depicted either in Table C.9 or in the Equations above.

Table C.9: Photovoltaic module (PV) parameters, if no other indication, data taken from [31]. Nominal Cell Operating Temperature (NOCT) are a set of conditions which are defined in order to find the nominal cell operating temperature. Standard Testing Conditions (STC) are at 1000W/m<sup>2</sup>, 25°C cell temperature and air mass 1.5.

Parameter	Symbol	Value	Unit
Investment cost [61]	$IV^{\text{PV}}$	260	€/m <sup>2</sup>
Installation cost factor	$f_{\text{FP}}$	1.5	-
Total investment {min,max}		{300,800}	€/m <sup>2</sup>
Maximum power		290	W
Module area	$A^{\text{PV}}$	1.63	m <sup>2</sup>
Module efficiency	$\eta_{\text{lm}}^{\text{PV}}$	0.178	-
Temperature reduction factor	$f_{\text{T}}^{\text{PV}}$	0.004	-/K
Efficiency reduction at $g_{200} = 200\text{W/m}^2$	$f_{200}$	0.98	-
STC radiation	$g_{\text{STC}}$	1000	W/m <sup>2</sup>
Nominal Operating Cell Temperature	$T_{\text{NOCT}}$	45	°C
NOCT radiation	$g_{\text{NOCT}}$	800	W/m <sup>2</sup>
NOCT ambient temperature	$T_{a,\text{NOCT}}$	20	°C
NOCT wind speed	$v_{a,\text{NOCT}}$	1	m/s
Inclination (around latitude)	$\vartheta_i^{\text{PV}}$	30	°
Azimuth, shift towards south	$\gamma_i^{\text{PV}}$	0	°
Effective transmittance-absorptance product	$\tau\alpha$	0.9	-
Electrical conversion factor	$f_{\text{gen}}^{\text{PV}}$	0.95	-

829 *Performance.* Figure C.17 shows the conversion efficiency from the global horizontal irradiance (GHI)  $g_{p,i}$   
830 in each period  $p$  to the electricity produced in the photovoltaic modules  $\eta_{p,\text{tot}}^{\text{PV}} = E_p^{\text{PV}} / (g_{p,i} \cdot A^{\text{PV}})$ , where  
831  $E_p^{\text{PV}}$  is the electrical production of a PV module in period  $p$ . As discussed previously, the GHI only covers  
832 the fraction of the solar radiation that hits the earth at a perpendicular angle. This allows the conversion  
833 efficiency (if it is described in this manner) to exceed the rated efficiency of the PV modules (e.g. on day 1),  
834 since the inclined modules may capture more of the inclined sun rays than the GHI takes into account. The  
835 assessment also changes if shadowing is taken into account, though this was not considered as a factor in this  
836 study. The winter days (1, 4, and 9) show due to this peculiarity and due to lower ambient temperatures the  
837 highest efficiencies. In agreement with the observation from the plate collectors, it can be seen that higher  
838 inclinations are favored in winter days while lower inclination angles perform better during summer days.  
839 The highest overall efficiency is found for the lowest inclination angle of 30° with an average of 18.1%. Such  
840 efficiencies may only be reached for high performance PV modules such as the ones assumed. More detailed  
841 modeling, considering shading and conversion losses, will most likely show lower performance values.

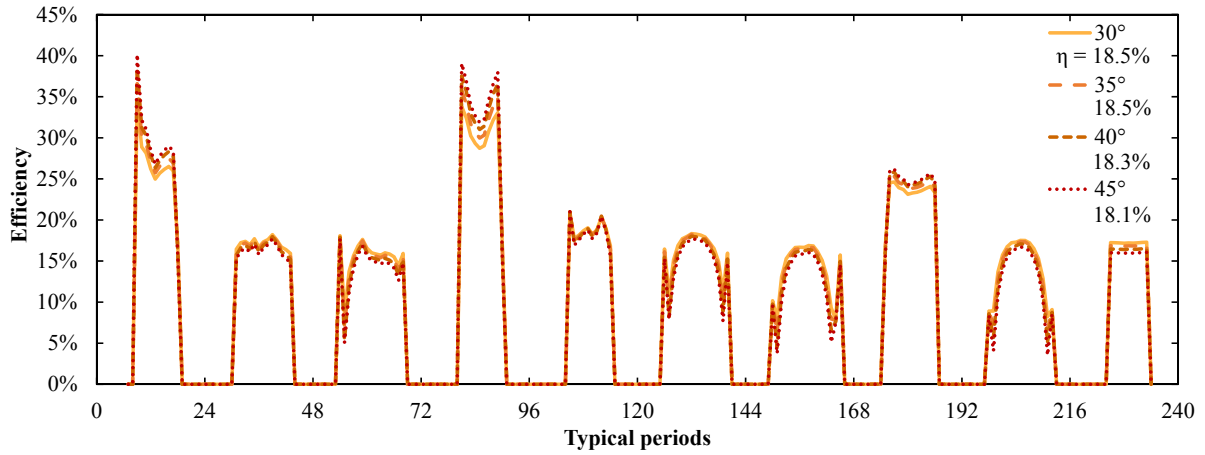


Figure C.17: Electrical conversion efficiency of photovoltaic modules (PV) solar thermal collectors as a function of time for different inclination angles, input data presented in Appendix C.2.

### 842 Appendix C.3. Photovoltaic and thermal (HCPVT)

843 High concentration devices only convert direct beam radiation. Performance indicators are retrieved  
844 from the producer [32–35]. Due to the high concentration ratio, the efficiency is assumed to be independent  
845 of the incident radiation intensity and due to the two axis tracking the angle of incidence is always zero. The  
846 time-dependent electricity  $E_p^{\text{HCPVT}}$  [W] and thermal energy production  $Q_p^{\text{HCPVT}}$  [W] is formulated according  
847 to the following.

$$\begin{aligned}
E_p^{\text{HCPVT}} &= f_{\text{gen}}^{\text{HCPVT}} \cdot \eta_{\text{el}}^{\text{HCPVT}} \cdot b_{p,n} \cdot A^{\text{HCPVT}} \quad \forall p \in \mathbf{P} \\
Q_p^{\text{HCPVT}} &= Q_{p,\text{prim}}^{\text{HCPVT}} \Big|_{T_{\text{in,prim}}^{\text{HCPVT}}}^{T_{\text{out,prim}}^{\text{HCPVT}}} + Q_{p,\text{sec}}^{\text{HCPVT}} \Big|_{T_{\text{out,prim}}^{\text{HCPVT}}}^{T_{\text{out,sec}}^{\text{HCPVT}}} \\
&= f_{\text{field}}^{\text{HCPVT}} \cdot \left( \eta_{\text{th,prim}}^{\text{HCPVT}} + \eta_{\text{th,sec}}^{\text{HCPVT}} \right) \cdot b_{p,n} \cdot A^{\text{HCPVT}} \quad \forall p \in \mathbf{P}
\end{aligned} \tag{C.11}$$

848 where  $b_{p,n}$  is the direct beam normal radiation in period  $p$ , all further parameters are presented in Table  
849 C.10. The primary efficiency  $\eta_{\text{th,prim}}^{\text{HCPVT}}$  stems from the PV cell cooling while the secondary efficiency  $\eta_{\text{th,sec}}^{\text{HCPVT}}$   
850 is derived from the cooling of the secondary concentrators positioned immediately prior to the receiver. The  
851 PV cell cooling is constrained by the cell temperature which should not exceed 100°C; therefore, the cooling  
852 stream cannot reach temperatures higher than 95°C. The secondary cooling, contrary to the restriction im-  
853 posed for the primary PV cooling, can reach any superheating temperature. Therefore, two thermal streams  
854 are produced which are between the three temperatures  $T_{\text{in,prim}}^{\text{HCPVT}}$ ,  $T_{\text{out,prim}}^{\text{HCPVT}}$ , and  $T_{\text{out,sec}}^{\text{HCPVT}}$ . The average

855 yearly overall efficiency of the HCPVT system with respect to the DNI is 24%<sub>el</sub> and 55%<sub>th</sub>, respectively,  
856 which is extremely high and may be overestimated.

857

Table C.10: High concentration photovoltaic and thermal system (HCPVT) parameters, data taken from [32].

Parameter	Symbol	Value	Unit
Heat transfer fluid		water glycol mix	
Investment cost	$IV^{\text{HCPVT}}$	700	€/m <sup>2</sup>
Dish area	$A^{\text{HCPVT}}$	40.05	m <sup>2</sup>
Installation cost factor	$f_{\text{FP}}$	1.5	-
Total investment {min,max}		{500,1500}	€/m <sup>2</sup>
Primary efficiency	$\eta_{\text{th,prim}}^{\text{HCPVT}}$	0.5	-
Secondary efficiency	$\eta_{\text{th,sec}}^{\text{HCPVT}}$	0.05	-
Electrical efficiency	$\eta_{\text{el}}^{\text{HCPVT}}$	0.25	-
Fluid temperature primary in	$T_{\text{in,prim}}^{\text{HCPVT}}$	85	°C
Fluid temperature primary out	$T_{\text{out,prim}}^{\text{HCPVT}}$	92	°C
Fluid temperature secondary out	$T_{\text{out,sec}}^{\text{HCPVT}}$	110	°C
Thermal field loss factor	$f_{\text{field}}^{\text{HCPVT}}$	0.9	-
Electrical conversion factor	$f_{\text{gen}}^{\text{HCPVT}}$	0.9	-

858 *Performance.* The HCPVT conversion efficiencies are not depicted here as they are assumed to be constant  
859 over time independent from the irradiance and other potentially influencing factors such as the ambient  
860 temperature (active cooling). The dish thermal efficiency is assumed to approximate 55%, and the electrical  
861 efficiency 25%. Constant electrical conversion losses and solar thermal losses in the field were considered in  
862 this study.

#### 863 *Appendix C.4. Storage*

864 The MILP Equations of the storage are explained by Becker et al. [18], where the thermal storage mass  
865 and energy balances are formulated based on different temperature levels modeled as different interconnected  
866 tanks. The implementation relies on the mass storage presented by Moret et al. [62] which is expanded to  
867 represent the thermal behavior. The parameters of the sensible heat storage are presented in Table C.11.

868 The non-linear storage [€/m<sup>3</sup>, 2002] cost is taken from [63] where the volume  $V$  is in m<sup>3</sup>, and an  
869 installation factor of 1.5 is assumed.

$$IV^{\text{STO}} = 1.5 * 18179 \cdot (V \cdot 1000)^{-0.3653} \quad (\text{C.12})$$

870 The coefficients of the linearized, annualized, and actualized cost  $IV^{\text{STO}} = a + b * V$  are depicted in Table  
871 C.11.

Table C.11: Storage parameters.

Parameter	Symbol	Value	Unit
Storage tank	STO		
Investment	$IV^{\text{STO}}$	Eq. (C.12)	
Constant investment cost coefficient	$a$	871	€/a
Linear investment cost coefficient	$b$	67.5	€/m <sup>3</sup> /a
Hot temperature (FP, HCPVT)	$T_{\text{h}}$	90,85	°C
Cold temperature	$T_{\text{c}}$	75	°C
Hourly thermal losses		0.1	%/h

872 *Performance.* Figure C.18 illustrates the thermal storage filling in addition to the boiler and solar dish  
 873 behavior over a selected range of operating periods. The storage is charged when the availability of the sun  
 874 exceeds the process requirements (at around 80% of its total potential) and is consumed with decreasing  
 875 solar availability. It can be seen that the solar availability is increased by the storage or in other words  
 876 that the boiler utilization is reduced due to the emptying of the tank, which indicates the advantage of the  
 877 storage. For higher utilization of the storage, the  $\epsilon$ -constraint would have to be decreased.

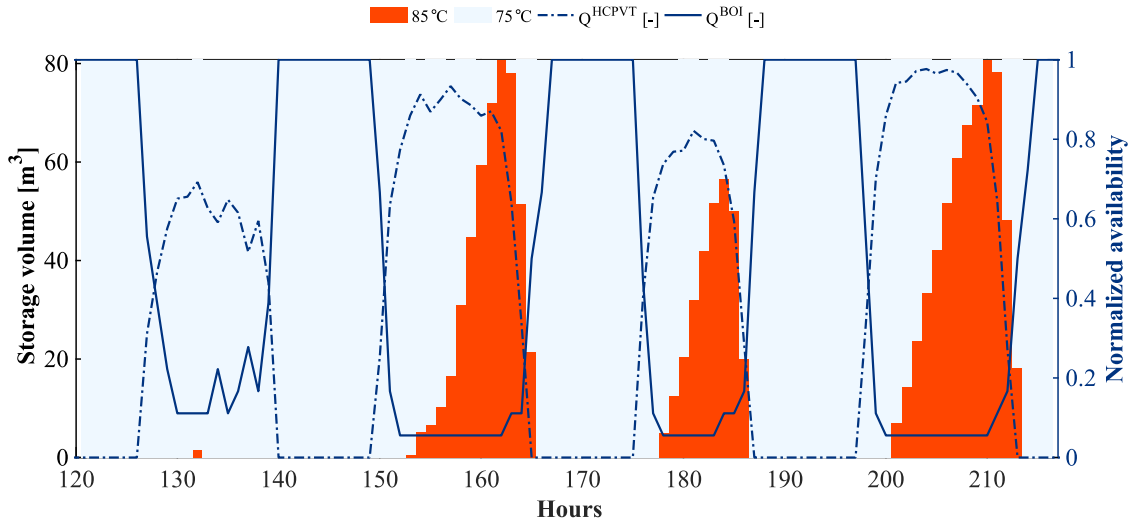


Figure C.18: Thermal storage volume and temperature distribution between typical day 6 and 9 with HCPVT solar dish and non-stop operation of the industrial process, case 2.4. HCPVT<sup>O</sup> at  $\epsilon = 70\%$  of the 2. HPS case. In dark blue: operation of boiler and solar dish normalized between [0,1].

## 878 Appendix D. Weather data & clustering

879 Following the indications of Dominguez et al. [20] the typical days are built from  $n$  clusters with 2  
 880 extreme days. For clustering, 3 indicators are chosen which influence the solar performance the most: DNI,  
 881 GHI, and the ambient temperature. Since the DNI fluctuates the most on an hourly, daily, and monthly  
 882 basis with a high influence on the solar output, it is chosen as the main reference for determination of the  
 883 performance indicator. Also the extreme days are determined based on the DNI, which means that one  
 884 extreme day is found for the highest daily radiation and lowest solar radiation. In Figure 5 in the upper  
 885 corner the typical days and their occurrence are illustrated. The two last days are extreme days which are  
 886 represented only once. The operating time of one period is one hour which leads to 240 operating periods.

887 Table D.12 displays the yearly average values and mean squared error of the six weather data attributes  
 888 of which only three are subject to the clustering. The yearly means of the three attributes that are used for  
 889 clustering are very close to the original data and thus the error of the first three indicators is comparably  
 890 small. Errors for the outside temperature and the wind speed, however, are distinctly higher. This may  
 891 be explained by stronger fluctuations throughout the year even though the ambient temperature is used as  
 892 input to the k-medoids clustering.

## 893 Appendix E. Dairy process

894 The process streams as discussed in [18] are depicted in Table E.13.

Table D.12: Data of typical days compared to original.

Attribute	Unit	Mean <sub>original</sub>	Mean <sub>typical</sub>	mELDC $10^{-4}$
GHI	[W/m <sup>2</sup> ]	163.2	163.3	1.685
DNI	[W/m <sup>2</sup> ]	192.8	190.1	3.242
Elevation $\alpha_s$	[°]	14.1	13.4	2.603
Azimuth $\gamma_s$	[°]	44.4	45.2	5.592
T <sub>a</sub>	[°C]	10.7	10.5	51.321
v <sub>a</sub>	[m/s]	2.1	3.1	100.837

Table E.13: Hot and cold streams of the dairy process, reproduced from Becker et al. [18].

Unit	Name	T <sub>in</sub> [°C]	T <sub>out</sub> [°C]	Heat load [kW]	$\Delta T_{min}/2$ [°C]	Remarks
Refrigeration	ref	6.0	4.0	76.0	2.0	refrigeration inlet milk
Pasteurization	pasto1a	4.0	66.0	2356.0	2.0	preheating
	pasto2a	66.0	86.0	676.4	2.0	pasteurization milk
	pasto3a	86.0	4.0	2773.2	2.0	refrigeration milk
	pasto4a	66.0	98.0	119.7	2.0	pasteurization cream
	pasto5a	98.0	4.0	351.6	2.0	refrigeration cream
Concentration	eva1	4.0	70.3	504.0	2.0	preheating
	eva2	70.3	70.3	904.2	1.2	evaporation 1.effect
	eva3	66.4	66.4	864.1	1.2	evaporation 2.effect
	eva4	60.8	60.8	849.8	1.2	evaporation 3.effect
	eva5	60.8	4.0	151.5	2.0	refrigeration concentrated milk
	eva6	68.9	68.9	904.2	1.2	condensation 1.effect
	eva7	65.9	65.9	864.1	1.2	condensation 2.effect
	eva9	68.9	15.0	87.8	2.0	condensation 3.effect
	eva10	65.9	15.0	80.8	2.0	cooling condensates 1.effect
	Condensates cooling	eva8	60.1	60.1	849.8	1.2
eva11		60.1	15.0	69.7	2.0	cooling condensates 3.effect
Yoghurt production	yog1	4.0	94.0	1026.0	2.0	heating
	yog2	94.0	10.0	957.6	2.0	cooling
Desert production	des1	4.0	90.0	817.0	2.0	heating
	des2	90.0	70.0	190.0	2.0	cooling
Hot water	hw	15.0	55.0	167.2	2.0	hot water production
Cleaning in place	CIP1a	58.7	70.0	188.6	2.0	maintain temperature CIP1
	CIP1b	65.0	15.0	104.5	2.0	recuperation waste heat CIP1
	CIP2a	67.5	80.0	209.5	2.0	maintain temperature CIP2
	CIP2b	75.0	15.0	125.4	2.0	recuperation waste heat CIP2
Fridge	frig	5.0	5.0	300.0	2.0	maintain storage temperature