

Simulation of heat recovery from data centers using heat pumps

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Abstract

Digitalization has influenced the rapid growth of data centers around the world. The advancement of IT and telecommunication also played a vital role in this expansion of data centers. Data centers facilitate the storage and access of data when required. Electric power is the main energy input and heat is the main energy output from the data center. This work is about the utilization of the excess heat which is the by-product of data center operation. Possible ways to utilize waste heat from data centers have been evaluated. To connect the heat from data centers to a district heating network, a heat pump might be necessary to increase the temperature of the heat. Simulations were performed at varying conditions in Aspen HYSYS to evaluate the waste heat utilization. The economic potential for different conditions and different heat recovery solutions are also evaluated.

Keywords: data center, district heating, heat recovery, heat pump, Aspen HYSYS.

1 Introduction

Data centers have become an indispensable part of the modern digitalized world. Digitalization demands the storage of constantly and rapidly expanding data around the globe, for which the number of data centers is ever-increasing. Apart from digitalization, speedy wireless networks, growing demand for cloud computing have added the crying needs of data centers. The U.S. Environment Protection Agency defines a data center as (Geng, 2014): “Primarily electronic equipment used for data processing (servers), data storage (storage equipment), and communications (network equipment). Collectively, these equipment processes, stores, and transmits digital information”.

Data centers are run by electricity and the functioning of different equipment release heat. So, all the electricity input is converted to heat. Studies show that the electricity requirement for data center has increased from about 1.3% of the world’s total electricity consumption in 2010 to 2% in 2018 and with this pace, it will reach up to 13% in 2030 (Oltmanns *et al.*, 2020).

However, the energy source which is still dependent on the fossil fuels are gradually decreasing because of the ever-growing consumption. So, the dire need for renewable energy sources is beyond description. The rejected or output heat from data centers could be a useful source of renewable energy. So, the waste heat utilization from data centers has become one of the prime researches for the scientists and data center operator to make data centers energy efficient and economically sound.

Data centers reject a vast amount of heat which is the conversion of electricity. For the proper and reliable functioning of the data center cooling down of different IT equipment is essential. 40% of the total energy consumption in a DC can be spent in the cooling system (Capozzoli and Primiceri, 2015). Moreover, excess or rejected heat from a DC can be regarded as lost energy. To make data centers more energy-efficient these lost energies should be utilized. The utilization will be economically profitable also. Furthermore, the cold climate of Nordic countries makes it easy for data centers to provide cooling energy. Besides, the high demand for heat in these countries makes it more convenient to utilize the waste heat. Thus, the necessity of waste heat utilization from data centers arises. The work will also focus on the possible utilization of waste heat using a heat pump in the district heating facility.

2 Literature Review

2.1 General literature on energy recovery from data centers

Ebrahimi *et al.* (2014) investigated different waste heat recovery technologies from the data center. They suggested that district heating is a common low-quality waste heat recovery technique which is also economically and ecologically sound. Liquid-cooled servers are more compatible with the higher waste recovery temperatures. Liquid-cooled servers can provide waste heat of up to 50-60°C (Ebrahimi *et al.*, 2014) that can be applied to district heating over a long area. This waste heat recovery technique is economically profitable as it can earn a revenue stream for data center operators.

The next option found by Ebrahimi *et al.* (2014) was the heating of water in a thermal Rankine cycle. The waste heat cannot fully replace the boiler but can be used to preheat boiler feedwater. So, the consumption of fossil fuel and pollution can be decreased to some extent. Moreover, they suggested on-chip two-phase cooled data centers to utilize most of this technology. The sale of heat to the power plant and carbon offsets can produce substantial income.

Absorption cooling is another choice for utilizing data center waste heat as studied by Ebrahimi *et al.* (2014). Absorption refrigeration systems can function with generator temperatures of 70-90°C which could be supplied by the waste heat from a water-cooled and two-phase cooled data center. An air-cooled data center is not viable for the technology. This technique can minimize the load on data center CRAC (computer room air conditioning) systems by producing chilled water for cooling and thus become economically profitable.

Ebrahimi *et al.* (2014) also proposed that organic Rankine cycle (ORC), multiple-effect distillation (MED), direct power generation like piezoelectric and thermoelectric, biomass co-location are the possible techniques that can be useful to utilize the low-grade waste heat from data centers.

Oltmanns *et al.* (2020) proposed a new cooling concept which TU Darmstadt will employ in the next generation of the current air-cooled servers with water-cooled rear doors. The new data center will use direct hot-water cooling for the high-performance computer, providing heat at 45°C. The waste heat will be utilized for heating the university's campus Lichtwiese. They suggested two ideas, either heat integration in the return line of the district heating network or utilizing it locally in buildings situated near the data center. The project showed that 20-50% of the waste heat rejected by the high-performance computer can be utilized in the heating sector. A significant reduction of CO₂ emission can also be achieved through the project.

Oró *et al.* (2018) studied a liquid-cooled on-chip server numerically for a case study of utilizing the waste heat for an indoor swimming pool heating. For the most suitable solution, the data center operator decreases its operational costs and produces surplus income by selling the excess heat, obtaining a net present value after 15 years of 330,000 €. Besides the operational cost of the indoor swimming pool was reduced by 18%. The case study was implemented for the assessment of Barcelona's indoor swimming pools.

2.2 Possible temperatures in cooling principle in data centers

For the efficient and proper utilization of excess heat from the data centers determining the temperature of the cooling system is not only very essential but also very

sensitive. Depending on the temperature range the quality of the heat will be evaluated. The investigation is not a very easy task rather it has been a matter of argument.

ASHRAE Technical Committee 9.9 has done a significant job to determine the favorable environment and temperature range for data centers. This is a common thermal guideline. ASHRAE (2011) recommended that the data center's equipment should maintain the temperature range between 18°C and 27°C to fit the manufacturer's provided criteria. The Technical Committee also classified the data center based on their temperature range. For the A1 data center, the temperature range was 15°C to 32°C, for the A2 category the range was set to 10°C to 35°C. For class A3 and A4 data center they increased the temperature range by 5°C to 40°C and 5°C to 45°C, respectively.

Oltmanns *et al.* (2020) studied that the high cooling inlet temperatures of up to 60°C for water-cooled data center allow the possibilities for better waste heat utilization.

According to Patel (2003) for an efficient air-cooling system, the cold air should be supplied at 25°C and exhaust air should exit the room and come back to CRAC at 40°C.

Ebrahimi *et al.* (2014) suggested that the optimum temperature range to utilize the waste heat in the air-cooled data center at rack exit is 30-40°C while for the chiller water return the suitable temperature range is 16-18°C.

Brunschwiler *et al.* (2009) found that the inlet water temperature can be 60°C to keep the junction temperature under 85°C. For this criterion, the maximum inlet temperature could be as high as 75°C.

Sharma *et al.* (2012) depicted that to recover maximum waste heat the suitable inlet temperature can be in the range 40-40.7°C. They suggested microprocessor junction temperature can be a maximum of 90°C.

3 Process Description

Heat pump technology gives an effective and long-lasting solution for both heating and cooling applications. A conventional heat pump is a system working on the compression refrigeration cycle powered by either mechanical energy or electricity (Øi and Tirados, 2015). In data center cooling for both air-cooled and liquid-cooled process heat pump is an essential part that regulates the cooling medium's temperature. Typical refrigerants used in heat pumps are ammonia and chlorinated or fluorinated hydrocarbons electricity (Øi and Tirados, 2015).

In the refrigeration cycle, the refrigerant circulates due to temperature and pressure difference between the components. The four main components of

a refrigeration cycle are the compressor, condenser, expansion valve, and evaporator. Figure 1 depicts the mechanical compression refrigeration cycle of a traditional heat pump. The red lines represent high pressure and temperature and the blue line indicates low pressure and temperature of the refrigerant. The cooling effect is produced by the cold liquid refrigerant in the evaporator. A mixture of vapor and liquid phased refrigerant goes into the evaporator where the vaporization of liquid provides the cooling effect before leaving the evaporator. The vapor refrigerant is sucked by the compressor where it gains high pressure and becomes superheated. The output from the compressor then enters the condenser. In the condenser, the vapor refrigerant is cooled and condensed to a saturated liquid. Heat is released from the refrigerant to the ambient (Smith, 2005).

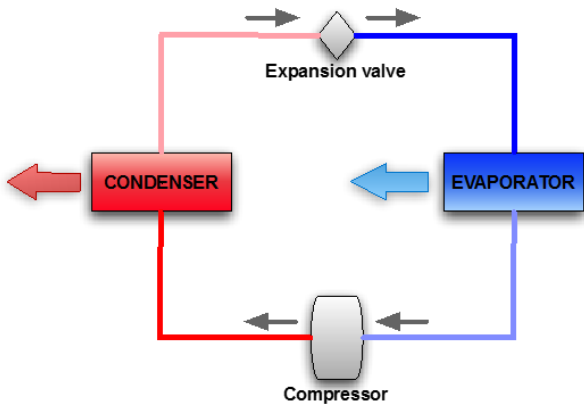


Figure 1. Schematic diagram of a heat pump's mechanical compression cycle (Øi and Tirados, 2015).

The liquid refrigerant then enters the expansion device typically an expansion valve where it is expanded to lower pressure. The liquid refrigerant is partially vaporized due to the expansion process giving a cooling effect in the refrigeration cycle (Smith, 2005).

The efficiency of a heat pump is measured by the coefficient of performance (COP). It is the ratio of the heat delivered or supplied at high temperature to the required power. Equation 1 represents the COP of the heat pump (Øi and Tirados, 2015).

$$COP = \frac{Q_C}{W} \tag{1}$$

$$W = Q_C - Q_E \tag{2}$$

In Equation 2 Q_C is the amount of heat output from the condenser, Q_E is the amount of heat input from the evaporator, and W is the power required in the compressor. When there is no heat loss the work added in the refrigeration cycle is equal to the difference between heat output and heat input (Øi and Tirados, 2015).

Typical COP values calculated in the work of Øi and Tirados (2015) are between 3 and 10, dependent on the difference between the delivery and output temperature.

4 Process Simulation, Results and Discussion

4.1 Simulation setup in Aspen HYSYS

For calculation and simulation first, the simulation was set up in the Aspen HYSYS. Version 10 of Aspen HYSYS was used for simulation. In the component lists two pure components described. The components are pure water and pure Refrig-22(R-22). R-22 was selected as the refrigerant medium and water which will be supplied for the cooling process in the data center was selected. After that, in the fluid packages, Peng-Robinson (PR) package was selected which is the most common and efficient package for HYSYS simulation. The default parameters for the package was used by Aspen HYSYS. Then the units of the heat pump which are evaporator, condenser, compressor, and expansion valve, were defined for the simulation with relevant streams.

4.2 The energy required calculation from Aspen HYSYS

One of the important tasks of the work is to perform the calculation in Aspen HYSYS. Two alternatives were selected for the simulation in the Aspen HYSYS. The setup condition for the alternatives are shown in Table 1 and Table 2.

Table 1. Aspen HYSYS input condition for alternative 1

Stream name	Water 1	Water 6
Temperature (°C)	65	70
Pressure (kPa)	101	101
Fluid package	Peng-Robinson	

Table 2. Aspen HYSYS input condition for alternative 2

Stream name	Water 1	Water 6
Temperature (°C)	65	80
Pressure (kPa)	101	101
Fluid package	Peng-Robinson	

An Aspen HYSYS flow-sheet model of the process for the simulation is presented in Figure 2.

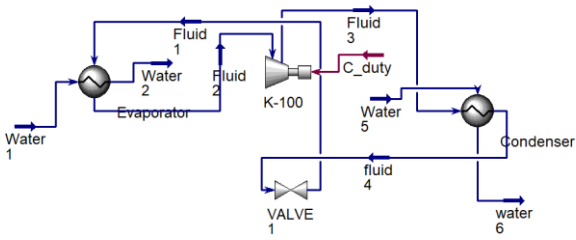


Figure 2. Model representation of the DC heat recovery process via heat pump in Aspen HYSYS

Water 1 is the cooling water from the data center and water 6 is water supplied to the district heating network. The result of the simulation was obtained in a very short time as the simulation in Aspen HYSYS is very quick and efficient. The simulation results for the two alternatives are presented in Table 3 and Table 4.

Table 3. Results of material and energy balance achieved from Aspen HYSYS for alternative 1

	Water 1	Fluid 1	Water 2	Fluid 2	Fluid 3	Water 5	Water 6	Fluid 4
T (°C)	65	51.24	55	51.24	88.84	40	70	74.25
P (kPa)	101	2000	101	2000	3280	101	101	3280
Flow (kgmole/h)	55.	4.369	55.51	4.369	4.369	20.94	20.94	4.369
Flow (kg/h)	1000	377.8	1000	377.8	377.8	377.1	377.1	377.8
Liq flow (m³/h)	1.0	0.308	1.002	0.308	0.308	0.377	0.377	0.308
Heat flow (kJ/h)	1.5e+7	2.131e+06	1.576e+07	2.088e+06	2.082e+06	5.968e+06	5.919e+06	2.131e+06

Table 4. Results of material and energy balance achieved from Aspen HYSYS for alternative 2

	Water 1	Fluid 1	Water 2	Fluid 2	Fluid 3	Water 5	Water 6	Fluid 4
T (°C)	65	51.24	55	51.24	104.7	40	80	84.33
P (kPa)	101	2000	101	2000	4000	101	101	4000
Flow (kgmole/h)	55.	5.419	55.51	5.419	5.419	17.02	17.02	5.419
Mass flow (kg/h)	1000	468.6	1000	468.6	468.6	306.6	306.6	468.6
Liq flow (m³/h)	1.0	0.382	1.002	0.382	0.382	0.307	0.307	0.382
Heat flow (kJ/h)	1.5e+7	2.633e+06	1.576e+07	2.590e+06	2.580e+06	4.851e+06	4.798e+06	2.633e+06

4.3 Calculation of COP for heat pump

For alternative 1

The evaporation temperature from the simulation is found 51.24°C. Condensation temperature from the simulation is found 74.25°C.

From the simulation the amount of heat output from the condenser, $Q_C = 48950$ kJ/h.

From the simulation power required in the compressor, $W = 5651$ kJ/h.

$$COP = \frac{Q_C}{W} = \frac{48950}{5651} = 8.66$$

For alternative 2

The evaporation temperature from the simulation is found 51.24°C.

Condensation temperature from the simulation is found 84.33°C.

From the simulation the amount of heat output from the condenser, $Q_C = 53130$ kJ/h.

From the simulation power required in the compressor, $W = 9829$ kJ/h.

$$COP = \frac{Q_C}{W} = \frac{53130}{9829} = 5.4$$

So, when the cooling water from the data center is 65°C and the supply water to district heating is 70°C the COP is found 8.66. On the other hand, when the cooling water from the data center is 65°C and the supply water to district heating is 80°C the COP is found 5.4. The two COP values can be compared to an average performance COP value of 6.8 from Oltmanns et al. (2020). In that case the cooling water input was 45 °C and the return temperature for the heat delivery system varied between 50 and 70 °C.

4.4 Economic calculation

For the energy cost calculation, simple assumptions are made. The price of electricity is estimated to be 0.1 EUR/kWh, and the district heat price was specified to 0.05 EUR/kWh.

So, the formula for the estimated economic potential is presented in equation 3.

$$\begin{aligned}
 \text{Economic potential} &= \text{Price} \cdot \text{Recovered heat} \\
 &= \left(\text{Elc. price} \cdot \frac{\text{Recovered heat}}{COP} \right) \quad (3)
 \end{aligned}$$

Oltmanns et al. (2020) have found that in 2018 the Telia data center in Helsinki, Finland supplied 200GWh/a in the nearby city of Espoo. So, taking this recovered heat value as a reference, the economy for a large data center facility can be calculated.

For alternative 1

$$\text{Economic potential} = 0.05 \frac{\text{EUR}}{\text{kWh}} \cdot 200\text{GWh} - \left(0.1 \frac{\text{EUR}}{\text{kWh}} \cdot \frac{200\text{GWh}}{8.66} \right) = 7.7 \text{ MEUR}$$

For alternative 2

$$\text{Economic potential} = 0.05 \frac{\text{EUR}}{\text{kWh}} \cdot 200\text{GWh} - \left(0.1 \frac{\text{EUR}}{\text{kWh}} \cdot \frac{200\text{GWh}}{5.4}\right) = 6.3 \text{ MEUR}$$

For the case of omitting heat pump, all the 200GW energy can be utilized to district heating network, which is worth of value 10 MEUR, as per kW district heat price is 0.05 EUR.

The investment cost is mostly dependent on the installation cost of the heat pump facility. Other costs can be negligible for the heat recovery solution. The heat pump cost is very critical to determine. From the study of Nishihata et al. (2013) the installed cost for a 2 kW pump is found to be 552.4 EUR. Thus, for a 24 MW capacity data center, the cost of the heat pump will be equal to 6.6 MEUR. Hence for a large amount of heat recovery from DC, it can be estimated that the investment of heat pump cost is high enough.

If the project is run for 10 years, the economic value for all three alternatives to be calculated. The factor for constant income is given by equation

$$\text{Factor} = \frac{1 - (1 + i)^{-n}}{i} \quad (4)$$

For n = 10 years and i = 7%, the factor is 7.02. The economic result is to be calculated by equation 5

$$\begin{aligned} \text{Economic result} &= \text{Economic potential} \cdot \text{Factor} - \text{Investment cost} \end{aligned} \quad (5)$$

For alternative 1

$$\text{The economic result} = 7.7 \cdot 7.02 - 6.6 = 47.45 \text{ MEUR}$$

For alternative 2

$$\text{The economic result} = 6.3 \cdot 7.02 - 6.6 = 37.63 \text{ MEUR}$$

For the alternative without a heat pump, there will be no investment cost. So, the economic result will be 70.2 MEUR.

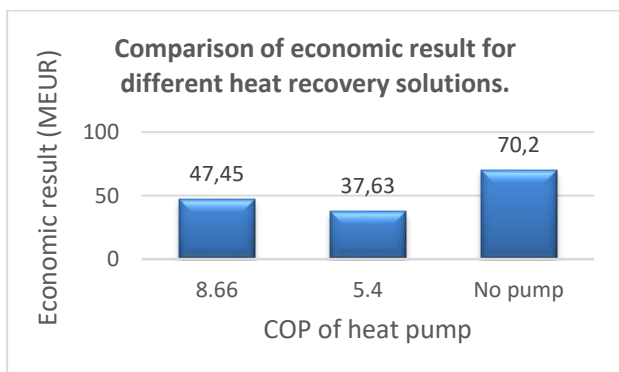


Figure 3. COP of pump versus the economic value of heat recovery solutions

The comparison of the economic results for different heat recovery scenarios is represented in Figure 3.

4.5 Evaluation of uncertainties

The three alternative solutions for heat recovery from a data center depend on certain things. The most vital thing is the temperature dependency. The required cooling temperature specified by data centers and the required temperature for the district heating network should be specified by the respective companies. In future work, it would be interesting to continue this work based on data from existing data centers. These two temperatures play a vital role in heat recovery solutions. If the temperatures change the value of the economic result will also vary. Besides the prices of electricity and district heating may vary country wise which will also affect the result. For the required calculation, they are assumed. Moreover, pipeline cost is very difficult to estimate as it depends on the climate, length of connection, and environmental condition. However, it can be assumed that the heat pump cost is relatively larger than the pipeline cost.

5 Conclusion

Simulations and economical optimization at different conditions in Aspen HYSYS were carried out. Especially three alternatives were evaluated. The first is an alternative without a heat pump in which the cooling water leaves the data center at 80 °C and enters the district heat network at 70 °C. The second is an alternative with a slight temperature increase in the heat pump. The cooling water temperature from the data center is 65 °C and the temperature to the district heat system is 70 °C. The third is an alternative with a higher temperature increase in the heat pump. The cooling water temperature from the data center is 65 °C and the temperature to the district heat system is 80 °C. The COP (Coefficient of Performance) in a heat pump for these alternatives were calculated using the refrigerant R-22 in the simulation program Aspen HYSYS. The estimated economic potential for each alternative was calculated by estimated values on electricity cost and district heat price. In one alternative, the electricity cost was specified to 0.1 EUR/kWh, and the district heat price was specified to 0.05 EUR/kWh. For the alternatives using heat pumps, the capital cost was estimated assuming that the heat pump investment was dominating.

The COPs for the two heat pump alternatives were calculated to be 8.66 and 5.4, respectively. The economy for a large data center facility with recovered waste heat of 200 GWh/year was calculated for 10 years.

For the specified conditions, the net present value was calculated to be large and positive for all the alternatives. As expected, the most economical alternative was without a heat pump, and the most economical heat pump was the one with the highest COP. Pipeline cost is very much dependent on the length and the local conditions for which it was not possible to make a reasonable estimation.

The calculations show that there is a large potential in using waste heat from data centers for district heating.

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