



## ENERGY RESEARCH AND DEVELOPMENT DIVISION

# FINAL PROJECT REPORT

# Transforming the Techno-Economics of Decarbonization in California's Bespoke Industrial Sector with the Scalable Front-End Engineering AI — Galileo

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# PREFACE

The California Energy Commission's (CEC) Energy Research and Development Division supports energy research and development programs to spur innovation in energy efficiency, renewable energy and advanced clean generation, energy-related environmental protection, energy transmission, and distribution and transportation.

In 2012, the Electric Program Investment Charge (EPIC) was established by the California Public Utilities Commission to fund public investments in research to create and advance new energy solutions, foster regional innovation, and bring ideas from the lab to the marketplace. The EPIC Program is funded by California utility customers under the auspices of the California Public Utilities Commission. The CEC and the state's three largest investor-owned utilities— Pacific Gas and Electric Company, San Diego Gas and Electric Company, and Southern California Edison Company—were selected to administer the EPIC funds and advance novel technologies, tools, and strategies that provide benefits to their electric ratepayers.

The CEC is committed to ensuring public participation in its research and development programs that promote greater reliability, lower costs, and increase safety for the California electric ratepayer and include:

- Providing societal benefits.
- Reducing greenhouse gas emission in the electricity sector at the lowest possible cost.
- Supporting California's loading order to meet energy needs first with energy efficiency and demand response, next with renewable energy (distributed generation and utility scale), and finally with clean, conventional electricity supply.
- Supporting low-emission vehicles and transportation.
- Providing economic development.
- Using ratepayer funds efficiently.

For more information about the Energy Research and Development Division, please visit the <u>CEC's research website</u> (<u>www.energy.ca.gov/research/</u>) or contact the Energy Research and Development Division at <u>ERDD@energy.ca.gov</u>.

# ABSTRACT

Industrial decarbonization is pivotal to California's environmental targets, given the sector's substantial contribution of 21 percent to the state's greenhouse gas emissions. However, a significant challenge to achieving widespread adoption of efficiency measures is the unique nature of each industrial facility; this is termed the "snowflake problem." The problem demands tailored solutions and specialized expertise for scoping and front-end engineering (FEE) of decarbonization solutions. Companies lack the in-house proficiency for decarbonization FEE, forcing them to choose alternatives such as the cost and technical analysis time of hiring outside expertise or depending on vendor-driven point solutions, which often lead to unsuitable choices and inaction. To address this, Skyven Technologies developed Galileo, an artificially intelligent FEE system aimed at revolutionizing industrial decarbonization by reducing FEE costs by 90 percent, person-hours by 93 percent, and overall timeline from the first technical call to a completed decarbonization report by more than 99 percent. Galileo has been used to analyze more than 135 manufacturing facilities, identifying more than 4.3 million metric tons of potential greenhouse gas savings and more than \$480 million of potential fuel cost savings. Future plans involve expanding Galileo's reach to commercial and residential sectors. This project signifies a significant advancement in accelerating decarbonization efforts across industrial, commercial, and residential domains, underscoring the importance of innovative solutions in meeting California's clean energy goals, as indicated in Assembly Bill 32 (Nunez, Chapter 488, Statutes of 2006), the Global Warming Solutions Act of 2006, and Senate Bill 32 (Pavley, Chapter 249, Statutes of 2016), the California Global Warming Solutions Act of 2016, which requires the California Air Resources Board to ensure that the state's greenhouse gas emissions are reduced to 40 percent below the 1990 levels by 2030.

Keywords: artificial intelligence, front-end engineering, machine learning, Galileo

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# **Executive Summary**

## Background

Industrial decarbonization is integral to California's clean energy and climate objectives, as outlined in Assembly Bill 32 (Nunez, Chapter 488, Statutes of 2006) and Senate Bill 32 (Pavley, Chapter 249, Statutes of 2016). These bills require dramatic decreases in the volume of greenhouse gas emissions in the state, as the industrial sector contributes 21 percent of the state's total greenhouse gas emissions according to the California Air Resources Board. The current Scoping Plan under Assembly Bill 32 identifies various measures, like efficiency improvements, fuel switching, electrification, and renewable natural gas use, to mitigate industrial emissions, emphasizing the significance of enhancing industrial efficiency and competitiveness for California's economy. However, a significant challenge exists to achieving mass adoption of industrial efficiency measures in that each industrial facility is highly specific and unique in nature. This issue, dubbed the "snowflake problem," demands tailored decarbonization solutions and specialized knowledge for front-end engineering that involves pre-project scoping, conceptual design, and preliminary savings estimates. Companies lack the internal capability for front-end engineering, leaving them with inadequate options such as the cost and technical analysis time of hiring outside expertise or relying on vendor-offered point solutions, which can be a time-consuming process (taking up to four months to complete) and often leads to inaction or unsuitable choices. Consequently, many industrial firms continue with conventional practices, hindering progress towards decarbonization. Addressing this challenge is crucial, now more than ever, to advance California's clean energy and climate goals effectively and in a timely manner.

## **Project Purpose and Approach**

The purpose of the project was to develop an artificial intelligence system for front-end engineering that learns from past and present industrial decarbonization projects and applies that learning to future projects to achieve transformative improvements in the technoeconomics of industrial decarbonization. Skyven Technologies (Skyven) has named this artificial intelligence front-end engineering software system Galileo. The goal of the project was to develop an artificial intelligence system that is capable of automatically generating customer-worthy decarbonization solution reports, thereby reducing front-end engineering costs by a factor of 10 and the front-end engineering timeline by a factor of 4. The intended audience for the project includes industrial facilities across all sectors as well as commercial and residential facilities. The project approach involved building an artificial intelligence system using knowledge representation and reasoning and developing an expert user interface for building and refining models, a non-expert user interface for running an analysis, and machine learning (see Chapter 2, Project Approach, for details).

## **Key Results**

With Galileo, the time it takes from the initial technical call with a customer to a completed decarbonization report is as low as 24 hours, compared to the four months that it would take to generate a similar report by hand; this far exceeds the factor of 4 timeline reduction goal. Additionally, Galileo costs 93 percent less and requires 90 percent fewer person-hours to produce a report than typical hand calculations. To date, Galileo has been used to scope projects at more than 135 manufacturing facilities in a variety of sectors, including chemicals (ethanol, sugar beets, plastics), pulp and paper (paper mill, consumer paper goods), and food and beverage (dairies, breweries, snack products), unlocking more than 4.3 million metric tons of potential greenhouse gas savings (the equivalent of the amount of emissions produced by 934,782 cars in a year) and more than \$480 million in potential fuel cost savings for manufacturing facilities. As a validation test for the system, two pilot projects were analyzed using Galileo and the results were compared to best-in-class hand calculations. The annual savings for the decarbonization solutions provided by Galileo were within 0 percent and 13 percent of the hand-calculated results (see Table 4 and Table 5 in Chapter 3).

## **Knowledge Transfer and Next Steps**

To disseminate information about Galileo and foster its adoption, Skyven devised a multifaceted approach. First, the research team completed a comprehensive whitepaper detailing Galileo's functionality, data insights, and a comparison with traditional calculations for posting to Skyven's website, along with a complementary blog post. Additionally, Skyven established a dedicated section on its website to highlight Galileo's features and outcomes. While this was initially used as a scoping tool for industrial clients interested in decarbonization solutions, Galileo's potential extends to diverse markets. Skyven envisions licensing Galileo to service providers, industrial assessment centers, and/or governmental bodies to streamline their decarbonization services. Furthermore, a two-sided marketplace model could be implemented in which Skyven offers Galileo runs for free to potential clients and charges vendors for referrals. Looking ahead, Skyven aims to expand Galileo's applicability to commercial and residential sectors, through advancements of the artificial intelligence and knowledge base. Ultimately, Skyven seeks to use Galileo for front-end scoping across industrial, commercial, and residential facilities, employing various deployment strategies, such as charging for runs, licensing, and vendor partnerships.

# CHAPTER 1: Introduction

The purpose of the project was to develop an artificial intelligence (AI) software that will drastically reduce the costs, person-hours, and timeline of scoping front-end engineering of decarbonization solutions. The successful development of this software is important and timely in the context of California's clean energy and climate goals for several key reasons, as highlighted below.

Industrial decarbonization is critical to achieving California's goals of reducing greenhouse gas (GHG) emissions, as set forth in Assembly Bill 32 (Nunez, Chapter 488, Statutes of 2006) and Senate Bill 32 (Pavley, Chapter 249, Statutes of 2016). According to the California Air Resources Board's current Scoping Plan under Assembly Bill 32, the industrial sector accounts for 21 percent of California's total GHG emissions. The plan cites a combination of efficiency, fuel switching, electrification, and renewable natural gas as potential measures to reduce industrial emissions. The plan further identifies the importance of enhancements to industrial efficiency and competitiveness to California's economy.

A key barrier to achieving the state's statutory energy goals in the industrial sector is the bespoke nature of industrial energy efficiency and fuel-switching projects. The industrial sector displays exceptional variability and uniqueness from facility to facility — the so-called "snowflake problem." Like a snowflake, every industrial facility is unique. Even two facilities owned by the same company, manufacturing the same product at similar throughput, can be substantially different.

The snowflake problem demands not only bespoke solutions but also the sophisticated knowledge and expertise to conceptualize optimal decarbonization solutions for a facility's unique operations. This conceptual design, feasibility analysis, benefits analysis, and budgetary costing constitute "front-end engineering" (FEE). Industrial manufacturers do not have the expertise to perform front-end engineering and to conceptualize decarbonization solutions that meet challenging financial and operational requirements.

Given the lack of internal expertise, companies today have two options, both of which are insufficient. Option 1 is to hire an expert energy consultant. This option is insufficient because hiring an expert consultant costs \$25,000 to \$100,000 per facility, involves three to six months of analysis, and produces a report which the facility often does not have the time or resources act on. Option 2 is to select a point solution presented by a vendor. Equipment vendors commonly approach industrial facilities to sell point solutions like solar photovoltaics or combined heat and power, and companies struggle unsuccessfully to judge the quality, fit, and risk of the proposal. The result is that companies in the industrial sector carry on with business as usual without decarbonizing.

To overcome the snowflake problem, Skyven Technologies (Skyven) developed Galileo, an artificial intelligence front-end engineering software system (FEE AI) solution that automates the in-depth technical analysis and front-end engineering of the customer facility, cutting costs by a factor greater than 10 (from \$25,000-plus to \$1,800 per facility). The cost reduction

stems from a 10-time reduction in total engineering hours, from 120 hours to 12 hours, and a reduction in the overall timeline, from the first technical conversation to a decarbonization report, of from four months to one day. Galileo achieved these results by learning from expert users and from prior project data. It applied this learning to guide non-expert users through the analysis, asking for appropriate data at the right time. Galileo automatically evaluates dozens of potential decarbonization measures and chooses the best fit for the facility, instead of trying to fit a suboptimal vendor-provided point solution inappropriately. It generates a customer-worthy engineering report justifying the selection and presenting costs, risks, and expected energy and carbon savings, ultimately making the process of decarbonizing easy, impactful, and lucrative.

With Galileo's rapid, low-cost results, the barrier to explore decarbonization in plants would fade, enabling rapid and widespread adoption of decarbonization projects across California's industrial sector. Since the industrial sector currently accounts for 21 percent of GHG in California, this solution is a multiplicative game changer to help dramatically reduce GHG emissions across the entire state.

# CHAPTER 2: Project Approach

Skyven's overall approach to building the FEE AI, Galileo, was to define ontologies for each of the multitude of potential decarbonization measures, the associated plant processes, and the associated types of industrial plants. Rules were then defined that governed relationships with the ontology, and procedures were defined in the expert user interface (UI) for building and refining the analytical models for the calculation or estimation of properties related to a decarbonization solution. These calculations were dependent on values the customer provided in the non-expert/customer UI for running an analysis. To connect the non-expert/customer UI for running an analysis with the expert UI for building and refining the analytical models, the research team developed a knowledge representation and reasoning (KRR) engine to connect the two platforms, perform calculations, and use logic to determine the questions asked during an analysis. The following paragraphs describe the KRR, expert UI, and non-expert UI in more detail.

## **Knowledge Representation and Reasoning Engine**

The KRR engine is the background engine that connects all of the Galileo components to perform analysis and produce results. It gets rules and other components, such as plant type, equipment, question formats, and units, from the Galileo expert UI for refining the analytical models and synchronizes them with the customers inputs from the non-expert/customer UI for running an analysis. The engine determines what information is needed for an analysis and presents the next questions in the non-expert/customer UI to generate the answers. The questions asked in the non-expert/customer UI for running an analysis are thus dynamic and customized based on user inputs (see the User Interface for Running an Analysis section in this chapter for details). The KRR engine then evaluates the customer answers and repeats the process of asking all of the necessary and relevant questions until it can generate solutions and related metrics. The coding language used was python (with a Flask framework and GraphQL), and a Neo4j graph database was used as the database management system.

Every time the Skyven team analyzed a new type of plant, process, or decarbonization solution, the solution was added to the knowledge base ontology, with appropriate relationships, rules, and procedures specified. However, without a dedicated UI for ontology and model building, this would have required knowledge of logic programming and KRR. Therefore, an expert UI for building and refining the analytical models was designed to meet this requirement.

## User Interface for Building/Refining Analytical Models

In the UI for building and refining the analytical models, Skyven's engineering team generated generic digital twin models of a wide variety of manufacturing processes and decarbonization solutions and added these models into the software. The models were used as the basis of Galileo's KRR engine. An expert user (defined as a user who is capable of defining the

relationships between the equipment and the decarbonization solution and who has intimate knowledge of the user for building and refining the analytical models) specified the properties for each model, including the qualitative or quantitative relationship between the properties. New models were frequently developed and added to Galileo as Skyven worked with manufacturers in new industrial sectors.

This UI consists of several different user windows, including: Plant & Properties, Equipment & Properties, Units, Constants, Components, and Solutions & Properties.

In the Plant & Properties UI window, the expert energy user can input a plant type and its North American Industry Classification System code and link that plant to an industry type and associated equipment. This window is also the location where the expert energy user can define certain plant-level property questions that are asked during the analysis, such as the plant address, operating hours, and electric and fuel consumptions and costs. Figure 1 shows a snapshot of the Plant & Properties UI window.

kyventech	nnologies <sup>v3.5.2</sup>		Plants Plant Properties Import		0
All Plants				Create 🛱 Filter Q, Enter Keyword	5
	Plant	NAICS Code	Industry	Equipment	
	Plastics (General)	326141	Plastics Product Manufacturing 🗸 🗸	Separation Tower, Process Cooling Tower, Vapor Condenser, Process Co $\checkmark$	> 🖻
	Dehydrated Foods	311423	Fruit and Vegetable Preserving and Specialty Food Production $\smile$	Steam Usage, Process Dryer, Water Cooled Process Chiller, Steam Boile $\checkmark$	> 🕫
	Rendering and Meat Bypro	311613	Meat Product Processing 🗸	Water Cooled Process Chiller, Wastewater Discharge, Process Cooling T $\checkmark$	> 🕫
	Soup	311442	Fruit and Vegetable Preserving and Specialty Food Production $\smile$	Steam Usage, Wastewater Discharge, Process Oven, Water Cooled Pro $\checkmark$	> 🕫
	Metallic Reagents	325997	Other Chemical Product and Preparation Manufacturing $\sim$	Process Cooling Tower, Separation Tower, Process Cooler, Lake or Pond $\checkmark$	> 루
	Polymer Additives	325900	Other Chemical Product and Preparation Manufacturing 🛛 🗸	Steam Boiler, Lake or Pond or River Source Process Cooling, Thermal $\checkmark$	> 루
	Flavoring Compounds	311942	Snacks, Sauces and Misc. Foods Production 🗸	Steam Boiler, Steam Blow Off, Vapor Condenser, Ammonia Refrigeratio 🗸	> 🕫
	Polyvinyl Alcohol	325210	Resin, Synthetic Rubber, and Artificial and Synthetic Fibers a $\checkmark$	Steam Boiler, Water Cooled Process Chiller, Vapor Condenser, Loop Rea $\checkmark$	> 🕫
	Frozen Food	311412	Fruit and Vegetable Preserving and Specialty Food Production $\smile$	Industrial Deep Fryers, Ammonia Refrigeration Compressors, Vapor Co $\checkmark$	> 🖻
	Chemical Catalysts	325181	Basic Chemical Manufacturing 🗸 🗸	Water Cooled Process Chiller, Process Cooling Tower, Steam Fired Spra $\checkmark$	> 🖻
	Cosmetics	325620	Soap and Cleaning Compounds 🗸	Process Cooling Tower, Water Cooled Air Compressor, Lake or Pond or $\checkmark$	> 🕫
	Polyurethane Components	325214	Resin, Synthetic Rubber, and Artificial and Synthetic Fibers a $\checkmark$	Municipal or Well Water Process Cooling, Thermal Oxidizer, Steam Blo $\checkmark$	> 루
	Plasticizers	325213	Resin, Synthetic Rubber, and Artificial and Synthetic Fibers a $\checkmark$	Vapor Condenser, Process Oven, Process Water Heater, Loop Reactor, 🗸	> 🕫
	Styrene Products	326140	Plastics Product Manufacturing 🗸 🗸	Water Cooled Air Compressor, Process Water Heater, Dehydrogenator, $\checkmark$	> 루
	Paper and Cardboard Chem	325992	Other Chemical Product and Preparation Manufacturing $\sim$	Municipal or Well Water Process Cooling, Thermal Oxidizer, Wastewate $\checkmark$	> 🗭
	Bromine	325180	Basic Chemical Manufacturing 🗸	Process Cooling Tower, Thermal Oxidizer, Wastewater Discharge, Ther 🗸	> 🕫

### Figure 1: Plant & Properties Expert UI Window

Source: Skyven Technologies, 2024

In the Equipment & Properties UI window, the expert energy user can define new pieces of equipment and link that equipment to its associated properties. The expert user can also define the equipment property questions that are asked during the analysis such as process temperatures, flow rates, and operating hours of the equipment. Figure 2 and Figure 3 show snapshots of the Equipment & Properties UI window.

### Figure 2: Equipment & Properties Expert UI Window #1

skyvente	echnologies <sup>v3.5,2</sup>	Equipment Equipment Propertiess Import		0
All Equi	ipments		€ Create ﷺ Filter Q Enter	Keywords
	Equipment	Equipment Property	Category	
	Continuous Cooker	ContinuousCooker_ExistsBoolean 🗸	Select 🗸	> 🖻
	Recovery Boiler	RecoveryBoiler_RecoveredFuelName, RecoveryBoiler_Contin 🗸	Select 🗸	> 🖻
	Steam Blow Off	SteamBlowoff_OperatingHours, SteamBlowoff_BlowoffLocati $\checkmark$	Select V	> 🗭
	Vapor Condenser	VaporCondenser_ExistingHRBoolean, VaporCondenser_Conti 🗸	Select 🗸	> 🖻
	Loop Reactor	LoopReactor_OperatingHours, LoopReactor_ExistingHRBool 🗸	Select 🗸	> 🖻
	Dehydrogenator	Dehydro_PCTNatGasUsage, Dehydro_AuxSuperheatMMbtuh ∨	Select 🗸	> 🗊
	Tail Brine Evaporative Cooler	TallBrineEvapClg_EvapMassLossDesiredBoolean, TallBrineEv 💛	Select V	> 🗭
	Separation Tower	SepTower_ContinuousBoolean, SepTower_BottomsTemperat 🗸	Select 🗸	> 🖻
	Process Dryer	ProcessDryer_AvgInputkW, ProcessDryer_ExhaustFlowRateB $\checkmark$	Select V	> 🗭
	Process Cooler	ProcessCir_CigWaterFlow, ProcessCir_CigSource, ProcessCir 🗸	Select 🗸	> 🗊
	Granule Coating Machine	GranuleCoater_PCTNGUsage, GranuleCoater_HeatSource, G 🗸	Select 🗸	> 🖻
	Corrugator Machine	Corrugator_AuxHtrAvgHeatLoad, CorrugatorDryer_ExhaustFl $\checkmark$	Select 🗸	> 🖻
	Wastewater Discharge	Wastewater_ExistingHRPreDigesterBoolean, Wastewater_Di 🗸	Select 🗸	> 🖻
	Paper Machine	PaperMachine_CondensateReturnTemp, PaperMachine_Aux 🗸	Select 🗸	> 🕫
	Municipal or Well Water Process Cooling	MuniWellWtrClg_AvgFlowRate, MuniWellWtrClg_ConstantLo 🗸	Select 🗸	> 🕫
.0	Grain Kiln	GrainKiln_CombBurnerFuel, GrainKiln_HeatSource, GrainKiln 🗸	Select 🗸	> 🕫

#### Source: Skyven Technologies, 2024

skyvente	:hnologies <sup>v3.5.2</sup>		Equipment Propertiess Import	0
All Prop	erties		Creat	te 🛱 Filter Q Enter Keywords
	Property	Estimate/Question type	Question/Sub-text	
<b>!!</b> 🗆	ContinuousCooker_ExistsBoolean  Boolean + Unit + Aggregate	Not applicable 🛃 📩	Does the facility have a continuous cooker? Sub-text	▶ ‡ = x ⊚ [
	RecoveryBoiler_ExistingStackHR 1 Boolean + Unit + Aggregate	Not applicable 🛃	Is heat currently being recovered from the recovery boler ex For example, preheating boiler feedwater via an exhaust air-t	ا بى 🗧
	RecoveryBoiler_SteamPressure Float ( # ) • PSIG • Avg	Not applicable 🛃	At what pressure does the recovery boller produce steam? Sub-text	ا بى 🗧
	RecoveryBoiler_AvgSteamGeneration () Float ( # ) • lb/hr • Sum	Not applicable 🛃	What is the average mass flow rate of steam produced by th Sub-text	ا بې 🗧
	RecoveryBoiler_CombustionAirFlowra Float ( # ) • lb/hr • Sum	Not applicable +2	What is the mass flow rate of combustion air provided to the Sub-text	► \$3 Ę
	RecoveryBoiler_ExhaustTemp 0 Float (#) + F + Avg	Not applicable +2	What is the temperature of the recovery boiler exhaust? Please provide the temperature downstream of any air treat	► دیج
	SteamBlowoff_OperatingHours Float (#) + Hours • Avg	Not applicable 🛃	How many hours per year is blowoff steam available? Sub-text	► 553 E
	RecoveryBoiler_RecoveredFuelName     Text - Unit - Aggregate	Not applicable +/	What is used as fuel for the recovery boller? Please provide a brief description (e.g. process byproduct, ex	🕨 لائع ا
	SteamBlowoff_BlowoffLocationsProxi () Boolean - Unit - Aggregate	Not applicable +	Are the locations in which blowoff steam is released confined Select "Yes" if steam blowoff locations are all relatively close	<b>&gt;</b> १ <u>°</u> ३ ६
	RecoveryBoiler_ContinuousBoolean  Boolean • Unit • Aggregate	Not applicable +	Is the steam production rate of the recovery boiler continuous? Please select "Yes" if the flow rate of steam is steady. Please	► 🖧 פ
	SteamBlowoff_QtyTieInLocations Float (#) = Unit • Avg	Not applicable 🛃	How many locations are there throughout the plant where st Sub-text	▶ 終 厚

### Figure 3: Equipment & Properties Expert UI Window #2

Source: Skyven Technologies, 2024

In the Units UI window, the expert user can define base units for measurements. Additionally, the expert user can define the conversion factors for those measurements to be converted into other commonly used units for ease during the analysis. This logic programming allows for a customer/non-expert user to input a temperature value during the analysis in Celsius and the AI converts this to the base unit of Fahrenheit (as defined by the expert user in the conversion

factor section of the Units UI window) before using the value in the specified equations. This allows for all procedures and equations to be standardized regardless of the units the customer/non-expert user provides. Figure 4 shows a snapshot of the Units UI window.

kyvente	echnologies <sup>v3.5.2</sup>			0
All Un	its			Create Q Enter Keywords
	Unit	Conversion	Description	
	℅ Electric Power - MW			▶ ज़
	℅ Electric Input Power ・ kW			> 🖻
	Sarbon Tax • \$/Metric Ton			> 🖻
	⇒ Distance • ft			> 🖻
	≫ General Heat Capacity + MMbtuh, Mbtuh			> 🖻
	≫ Annual Steam Usage + klb/yr, Metric Tons/yr			> 🖻
	≫ Time • Hours			> 🖻
	👳 Airflow * CFM			> 🖻
	≫ Area + Sq R			> 🖻
	℅ Volumetric Fluid Flow Rate + GPM, Gal/Day			> 🖻
	℅ Absolute Pressure ・ PSIA, BarA, mbara			> 🖻
				> 🖻
	℅ CO2e Emmissions Reduction (New) ・ Metric Tons			> 🕫
				> 🖻
	Sauge Pressure • PSIG, BarG			> 🖻
	℅ Mass Flow Rate + lb/hr, kg/hr			> 🖻
	Scooling Capacity • Tons, MMbtuh			> 🖻

#### Figure 4: Units Expert UI Window

Source: Skyven Technologies, 2024

In the Constants UI window, the expert user can define constants that are used in the procedures and equations. These constants include, but are not limited to, conversion factors, polynomial fit numbers, and efficiency assumptions. Figure 5 shows a snapshot of the Constants UI window.

skyvented	hnologies* <sup>352</sup>				0
All Const	lants			•	reate Q Enter Keywords
	Constant	Unit	Туре	Value	
	PolyFit_Steam_PSI_to_LatHeat_a	Select 🗡	Number 🗠		$\triangleright \in$
	PolyFit_Steam_F_to_PSI_e	Select 🛩	Number 🗠		
	PolyFit_Steam_F_to_PSI_d	Select 🗸	Number 🗸		$\triangleright \in$
	PolyFit_Steam_F_to_PSI_c	Select 💙	Number 🗠		Þ
	PolyFit_Steam_F_to_PSI_b	Select 🗡	Number $\sim$		$\triangleright$
	PolyFit_Steam_F_to_PSI_a	Select 💙	Number $\sim$		$\triangleright$
	PSIGtoPSIA	Select 🗸	Number 💙		۵ 🗲
	PolyFit_Steam_PSI_to_F_e	Select 🗸	Number \vee		⊳€
	PolyFit_Steam_PSI_to_F_d	Select 🗡	Number 🗠		⊳€
	PolyFit_Steam_PSI_to_F_c	Select 🗸	Number 🗡		Þ
	PolyFit_Steam_PSI_to_F_b	Select 💙	Number 🖌		$\triangleright \in$
	PolyFit_Steam_PSI_to_F_a	Select 💙	Number 🗡		$\geqslant$
	HoursperYear	Select 🗡	Number 😒		> 6
	kwhperMM	selec 🗡	Number 🗠		> 0
	DistillationColumn_PercentRecoverable_Pct	Select 💙	Number \vee		۵ 🖌
	DistillationColumn_PercentVapor_Pct	Select 🛩	Number 💛		۵ 🖊

Figure 5: Constants Expert UI Window

Source: Skyven Technologies, 2024

In the Components UI window, the expert user can create interim procedures and equations that will ultimately be used in the final equations that the expert user creates in the Solutions & Properties UI window. The intent of the Components window is to help compartmentalize certain portions of the equations so that it's easier to edit equations as new information is learned over time and it's easier to view and understand the equations in the Solutions & Properties window. Examples of equations that were added to the Components window include calculations of heat available in a specific heat source/piece of equipment, heat exchanger approach temperatures, and flash vessel temperatures. Figure 6 shows a snapshot of the Components UI window.

kyvento	echnologies <sup>v352</sup>						0
All Com	nponents						Reate Q Enter Keywords
	Component	Unit	Format	Category	Sub-category	Rule	
	COP_SGHP_PaperMachineExhaust			Calculated Field			>
	COP_SGHP_ProdCirAir			Calculated Field			>
	COP_SGHP_ProdCirWater			Calculated Field			>
	COP_SGHP_SteamSprayDryerExhaust			Calculated Field			>
	COP_SGHP_TallBrineEvapClg			Calculated Field			>
	COP_SGHP_ThermalFluidHeater			Calculated Field			>
	EC_MaxAvgSteamDemand_BilledConsumption			Calculated Field	Error Checking		>
	ElectricInclusiveCost			Calculated Field			>
	EquipProp_Ethanol			Calculated Field			>
	EquipProp_PolymerizationRctr			Calculated Field			>
	ExhaustHeatPCTCapture_PaperMachine			Calculated Field			>
	ExhaustHeatPCTCapture_ProcessDryer_Burner			Calculated Field			>
	ExhaustHeatPCTCapture_ProcessDryer_Steam			Calculated Field			>
	ExhaustHeatToInput_PaperMachine			Calculated Field			>
	ExhaustHeatTotInput_ProcessDryer_Burner_PCTofUsage			Calculated Field			>
	ExhaustHeatTotInput_ProcessDryer_Steam_InputSteamFlow			Calculated Field			>

### Figure 6: Components Expert UI Window

Source: Skyven Technologies, 2024

In the Solutions & Properties UI window, the expert user can create specific solutions for decarbonization, such as hot water heat pumps, steam generating heat pumps, condensing economizers, and steam traps. Within these solutions, the expert user can create rules using plant properties, equipment properties, constants, and components to calculate technical feasibilities and environmental and economic metrics for a decarbonization solution. Solutions are specifically linked to the equipment & properties window so that solutions show up based on equipment that the customer selects during the run (see the User Interface for Running an Analysis section in this chapter for more details). Technical feasibilities include compatibility checks, such as determining if a heat source is large enough for a certain decarbonization technology or determining if the facility's steam pressure and usage are compatible with a decarbonization solution that produces steam. Environmental and economic metrics may include, but are not limited to, calculations and rules for determining the Scope 1 and Scope 2 emissions, annual fuel usage reduction, annual fuel cost reduction, and, in certain instances, the steam production capacity of the decarbonization technology. In this UI window, the expert user can also identify engineering considerations and other benefits associated with the

decarbonization solution. Engineering considerations may include, but are not limited to, checks for consistency of the heat source, discussions of multiple heat sources, footprint and placement considerations for the technology, and refrigerant considerations. Other benefits may include, but are not limited to, electrification benefits, redundancy with existing equipment, and grant funding eligibility. Figure 7 shows a snapshot of the Solutions & Properties UI window.

kyventechnologies <sup>v352</sup>	Solution Solution Properties		0
All Solutions		Croate Q, Enter Keywo	rds
Solution*	Equipment*	Description	
0713_SGHP_RecoveryBoiler	Steam Usage, Recovery Boller	A single Arcturus system can have multiple heat sources. If multiple Arc 🕨 🕫 😗 🛞 🗓	
contract of the second se	Steam Blow Off, Steam Usage	A single Arcturus system can have multiple heat sources. If multi 🕨 🤝 🚯	
0621_SGHP_Clg_VaporCondenserSteam	Vapor Condenser, Steam Usage	A single Arcturus system can have multiple heat sources. If multi > 🖻 🖄 🛞	
C A 0621_SGHP_Clg_VaporCondenserBurner	Steam Usage, Vapor Condenser	A single Arcturus system can have multiple heat sources. If multi > 🤛 🖄 🛞	
619_SGHP_LoopReactorJacketCooling	Loop Reactor, Steam Usage	An Arcturus system can have multiple heat sources, but sourcing > 🖻 🖄 🛞	
C 🗠 616_SGHP_SeparationTowerFuelFired	Separation Tower, Steam Usage	A single Arcturus system can have multiple heat sources. If multi > ᠵ 🖻 🖄 🚳	
616_SGHP_SeparationTowerSteamFired	Separation Tower, Steam Usage	A single Arcturus system can have multiple heat sources. If multi > 🤛 👘 🚳	
616_SGHP_DehydrogenatorBurnerFired	Dehydrogenator, Steam Usage	A single Arcturus system can have multiple heat sources. If multi > 🤛 🖄 🛞	
616_SGHP_DehydrogenatorSteamFired	Steam Usage, Dehydrogenator	A single Arcturus system can have multiple heat sources. If multi > 🤛 👘 🐵	
0615_SGHP_ExFu_ProcessDryer	Steam Usage, Process Dryer	A single Arcturus system can have multiple heat sources. If multi 🕨 🤛 🖄 🛞	
6615_SGHP_ExSt_ProcessDryer	Process Dryer, Steam Usage	A single Arcturus system can have multiple heat sources. If multi > 🤛 🖄 🐵	
🗇 \land 608_SGHP_MuniWellWtrClg	Municipal or Well Water Process Cooling, Steam Usage	A single Arcturus system can have multiple heat sources. If multi 🕨 🖻 👘 🛞	
608_SGHP_ThermalFluidHeaterExhaust	Steam Usage, Thermal Fluid Heater	A single Arcturus system can have multiple heat sources. If multi > 🤛 🛱 🛞	
607_SGHP_TailBrineEvapClg	Steam Usage, Tail Brine Evaporative Cooler	A single Arcturus system can have multiple heat sources. If multi 🕨 🐖 👘 🛞	
🗍 \land 602_SGHP_ProdClrAir	Steam Usage, Process Cooler	A single Arcturus system can have multiple heat sources. If multi > ᠵ 🖻 🖄 🚳	
602_SGHP_ProdCirWater	Process Cooler, Steam Usage	A single Arcturus system can have multiple heat sources. If multi 🕨 🤛 🖄 🛞	
S17_SGHP_ProcessOvenSteam	Process Oven, Steam Usage	A single Arcturus system can have multiple heat sources. If multi 🕨 📂 😰 🛞 🐵	
516_SGHP_CorrugatorSteamFired	Steam Usage, Corrugator Machine	A single Arcturus system can have multiple heat sources. If multi > 🗩 🗇 🖄	

Figure 7: Solutions & Properties Expert UI Window

Source: Skyven Technologies, 2024

Skyven designed the Plant & Properties, Equipment & Properties, Units, Constants, Components, and Solutions & Properties windows so that an expert user can populate the knowledge base of the AI without needing to understand logic programming or KRR.

## **User Interface for Running an Analysis**

In addition to the UI designed for an expert user to populate the knowledge base, Skyven also developed a UI for running a Galileo analysis and visualizing the decarbonization solution results. To assess potential decarbonization solutions, Galileo asks industrial users questions based on facility metrics. To generate these questions, Galileo's KRR engine translates the models described in the previous section into a question tree, which uses automated reasoning to gather all of the required data for plant analysis. The answers to these questions are used to automatically build a custom model of the facility. This interface was designed to be completed by a non-expert user with the assistance of a Skyven employee. The four different windows in this UI include Company, Facility, Equipment, and Report. The Report window is discussed in further detail in the Results section of Chapter 3.

In the Company window, the customer is asked to input information regarding the facility as a whole. This includes plant address, plant operating hours, total annual electric usage and cost,

total annual fuel usage and cost, whether the facility is subject to a carbon tax or not, and what percentage of facility steam (if any) is produced by on-site combined heat and power. Figure 8, Figure 9, and Figure 10 show snapshots of the Company UI window.

skyventechnologies <sup>v3.5.2</sup>						0 A
← FEE SW Final Report ⓒ Saved	COMPANY	FACILITY	EQUIPMENT	REPORT		
		What is the addres	s of the plant?*			
	Address Line 1 12345					
	Address Line 2 (optional)					
	<sub>Oty</sub> Abernathy	~	State Texas	~		
	ZIP Code 12345		Country United States	~		
		What are the annual operat Does your facility run				
		Yes	No No			
		What is your annual d	lowntime in hours?			
	72					
		Are your Annual Oper	ating Hours 8688?		Next question 🕑	

Figure 8: Company Non-expert UI Window #1

Source: Skyven Technologies, 2024

### Figure 9: Company Non-expert UI Window #2

skyventechnologies <sup>v3.5.2</sup>			@ _ R
	Let's get an idea	cility's electric consumption and costs. of your electricity use provided to your facility? On Site Steam Turbine Electric Generation On Site Solar Electric Generation	
		e Electric Generation annual electricity consumption v(ce Cost \$1,750.000	
	Annual Utility Supplied Electric Service Cost \$1.750.000	Annual Utility Supplied Electric Service Consumption CD TH 25,000,000 Wh ~ Average Utility Supplied Electric Service Rate CD TH 0,007 /Wh	
	Does the electric rate above inci fre Yes, it does	ude the cost of sourcing 100% carbon- energy? ()	
		your electricity bills	Next page 🕤

Source: Skyven Technologies, 2024

🛠 skyventechnologies <sup>v3.5.2</sup>			٢	8					
Please provide details on your annual fuel usage.									
	Natural Gas	Steam Produced Offsite							
	Fuel Oil	Biomass							
	Coal	Propane							
	Let's comb through yo	ur annual fuel consumption							
	Natural Gas * Annual fuel Cost \$3,750,000								
	Annual Natural Gas Cost \$3,750,000 Annual Natural Gas Cost \$0,000 Metric Annual Natural Gas Consump Solution Metric Annual Natural Gas Consump Solution Metric Solution M								
Please upload your fuel bills									
CT Drag and drop file here or browse									
If your facility is subject to a carbon tax, please enter the rate below.									

Figure 10: Company Non-expert UI Window #3

Source: Skyven Technologies, 2024

In the Facility window, the customer is asked to select the type of facility, starting with whether or not the business would be described as manufacturing or non-manufacturing. The customer is then asked to select the subsector that best describes the business. Some examples of non-manufacturing business subsectors are district heating, hospitals, and office buildings; some examples of manufacturing business subsectors are chemicals, food and beverage, paper and wood, and plastics. After selecting the subsector, the customer is asked to select the industry group that best describes the business. Some examples of industry groups associated with the subsector for chemicals are basic chemical manufacturing, paint and adhesives, resin and fibers, and pharmaceuticals and medicine. Figure 11 shows a snapshot of the Facility UI window.

skyventechnologies <sup>v3.5.2</sup>					@ A
FEE SW Final Report		COMPANY FACILITY	EQUIPMENT REPO		
			bout yourfacility operations be your business? *		
		MANUFACTURING	NON-MANUFACTURING		
		What is your	sub-sector? *		
	Chemicals	Electronic and Electrical Products	Food, Beverage, Tobacco	Machinery and Trasportation Equipment	
	Metals and Metal Products	Miscellaneous	Paper and Wood	Petroleum and Goal Products	
		Plastics, Rubber, Nonmetallic, Mineral	Textiles, Apparel, Leather		
		Select your In	dustry Group *	~	
	Basic Chemical Manufacturing	Other Chemical Product and Preparation Manufacturing	Paint, Coating and Adhesives	Pharmaceuticals and Medicine	

### Figure 11: Facility Non-expert UI Window #1

Source: Skyven Technologies, 2024

After selecting the industry group, the customer is asked to select the products that the plant manufactures. This can be a multiple-selection answer if a facility manufactures more than one product. Examples of products associated with the industry group for basic chemical manufacturing are chemical catalysts, ethanol, petrochemicals, and synthetic dye and pigment. After selecting the products, the customer is asked to select the plant equipment. The equipment that shows up by plant type is set by the expert user in the Plant & Properties expert UI window. Examples of equipment associated with the production of chemical catalysts are ammonia refrigeration compressors, fuel-fired and steam-fired spray dryers, process ovens, steam boilers, and vapor condensers. A feature allows for the selection of multiples. For example, if the facility has three steam boilers on site, the customer can select a quantity of (3) when selecting the steam boiler equipment. After selecting all of the equipment associated with the facility, the customer is asked to select which type of fuel each piece of equipment uses. This selection is linked to the electric and fuel inputs that the customer selects in the Company window. For example, if the customer selects natural gas for the fuel type and utility-supplied electric service for the electricity type, the customer would then have to choose between natural gas and utility-supplied electric service as the "type of fuel" each piece of equipment uses. Finally, this window has a section for the customer to add descriptions of each piece of equipment. For example, if there are three steam boilers at the site, the customer can specify the name or location of the boiler in this section for ease of communication and future reference. Figure 12 shows a snapshot of the Facility UI window.

ventechnologies <sup>v152</sup>	8
Which products does your plant manufacture? *	
Bromine Carbon Dioxide Carbon Dioxide Ethanol Oxygen Petrochemical Synthetic Dye and Pigment	
Select equipment your plant has *	
Ammonia Refrigeration Compressors Fuel Fired Spray Dryer Lake or Pond or River Source Process Cooling Process Cooler	
Process Cooling Tower Process Dryer Process Oven Separation Tower Steam Blow Off	
Steam Fired Spray Dryer Steam Usage Thermal Fluid Heater Thermal Oxidizer Vapor Condenser	
Wastewater Discharge Water Cooled Process Chiller	
What type of fuel each equipment uses? *	
Steam Boller >>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>>	
Please enter details of equipment	
A Steam Boiler	
Steam Boiler 1 Boiler 001 - Outside	
Steam Boiler 2 Boiler 002 - Inside	
Steam Boller 3 Boller 003 - Inside	
(ⓒ Previous page) Next page ⊙	

Figure 12: Facility Non-expert UI Window #2

Source: Skyven Technologies, 2024

In the Equipment window, the Galileo software asks questions related to the equipment selected on the Facility window. These questions are designed to quantify the amount of energy going to the equipment and the amount of heat that could possibly be recovered. The order of the questions is determined by the KRR engine and logic programming, as questions are asked in the order of how often they are referenced or used in the knowledge base calculations. For example, the quantity of steam the facility uses is an important metric in determining the quantity of savings that a particular decarbonization solution can provide. Therefore, this question often appears as one of the first few questions when a customer selects steam boiler and steam usage as equipment. The questions are linked to the equipment type and are set by the expert user in the Equipment & Properties expert UI window.

Using the information entered by the user in the Company, Facility, and Equipment windows, Galileo carries out conceptual engineering calculations on the configured digital twin models developed in the knowledge base by the expert user. Based on these calculations, Galileo uses automated reasoning to quickly generate a user-friendly report with two to five decarbonization solutions; these solutions quantify the energy savings and environmental benefits, the engineering considerations, the technical feasibilities, and other benefits. See the Results section of Chapter 3 for more information on the report. Figure 13 shows a snapshot of the Equipment UI window.

skyventechnologies <sup>v3.5.2</sup>						0 A
FEE SW Final Report	COMPANY	FACILITY	EQUIPMENT	REPORT		
	Proces	ss Oven How is heat sup	plied to the process oven(s)? ①			
	<ul> <li>Select All</li> <li>✓ Steam</li> <li>Fuel Burners</li> </ul>					
	(1) I guessed my answer					
	Steam Us	age What is the total ave	erage steam demand of the facili	ity?		
	100,000			lb/hr 👻		
	(1) I guessed my answer					
	Proces	55 Dryer How is heat sup	plied to the process dryer(s)? ①			
	<ul> <li>Select All</li> <li>Steam</li> <li>Fuel Burners</li> <li>Other</li> </ul>					
	(12) I guessed my answer					
	Steam Usage	Approximately how many st	eam traps are there throughout	the plant?		
€ Previous page	An exac	ct number is not needed - an order-	of-magnitude estimate is acceptable.		Next question 🕑	

Figure 13: Equipment Non-expert UI Window

Source: Skyven Technologies, 2024

## **Machine Learning**

The machine learning (ML) model was coded in python and uses a gradient boosting algorithm that builds a strong predictive model by combining weaker models (specifically, decision trees) to provide highly accurate predictions. The ML model was designed to estimate the full material cost of equipment, which would allow for further economic analysis within Galileo.

The first step in building the ML model involved collection of cost data for equipment. The raw data were then cleaned, formatted, and organized for the ML model. This involved acquiring the dataset in CSV, XLSX, or HTML format, importing essential libraries (such as NumPy, pandas, and matplotlib), handling missing values in the dataset, encoding categorical data, and scaling features to ensure uniformity. Finally, XGBoost (extreme gradient boosting) was used for the model building and training phase. This involved developing an XGBoost regression model, evaluating the model through K-fold cross validation to assess mean absolute error and mean absolute percentage error, choosing the best-fit model, and refining and improving the model as necessary.

Currently, there were limited data available to train the model (see the Results section of Chapter 3 for details). However, once there were sufficient data available, the ML model will be further refined and thus more capable of accurately predicting implementation costs based on historical data.

## **Building Up Software Features**

New features are added to the KRR engine and updated on the UIs as they are identified by Skyven's expert users. Skyven is continually developing software to provide both the expert

and the non-expert user with the most technically accurate and user-friendly experience possible, and it is constantly looking for ways to improve Galileo. Some of these improvements include: adding the Components UI window so that solutions can be more easily followed by the expert user, adding the Units UI window so that the customer can enter values in whatever units are available, adding an information icon on the equipment questions so that the expert user can add additional clarifying information for the customer to view when answering questions, and adding a feature to export the Galileo report to an Excel workbook.

## **Next Steps**

Galileo offers significant value to customers by performing rapid initial analyses of their existing equipment and by presenting a range of decarbonization options and preliminary estimates of potential savings. If one of the decarbonization options presented by Galileo is attractive to the customer, Skyven and the customer will work to establish an agreement through a contract that will enable detailed engineering and front-end engineering level two analyses to be completed.

Once detailed engineering proves the economic and technical feasibility of a decarbonization solution, the project can be executed and operated under Skyven's Energy-as-a-Service model. Under this model, the customer pays no upfront capital costs for the equipment (which is funded through investments and third-party financing); instead, the customer pays only for the verified savings provided by the equipment, as measured by the installed metering equipment.

# CHAPTER 3: Results

To date, Skyven has run Galileo with more than 135 different facilities, unlocking more than 4.3 million metric tons of potential GHG savings and more than \$480 million in potential fuel cost savings for manufacturing facilities. Galileo is currently capable of analyzing 76 different industrial facility types, 67 different pieces of equipment, and 60 different decarbonization solutions making for more than 4,000 different combinations.

## **Reductions in Time Frame, Person-Hours, and Costs**

The time it takes from the initial technical call with a customer to a completed decarbonization report using Galileo is as low as 24 hours. Compared to the four months that it would take to generate a similar report by hand, Galileo has well exceeded the goal of decreasing the timeline by a factor of 4. The four-month metric came from the timeline it took to complete the analysis for Pilot Plant A. Table 1 summarizes the difference.

### Table 1: Timeline — Galileo Versus Manual Calculations

	Manual Calculations	Galileo	Percent Decrease
Timeline (hours)	2,904	24	99.2%

Source: Skyven Technologies, 2024

A total of 12 hours of Skyven employee time is required to generate a decarbonization report. Compared to the 120 hours that it would take to generate a similar report by hand, Galileo has met the goal of decreasing the person-hours required to perform the analysis by a factor of 10. The 120-hour metric came from analysis of the time it took to perform manual calculations for Pilot Plant A. Table 2 illustrates the difference between Galileo and the manual calculations.

The following is a breakdown of the total person-hours required for a Galileo run:

- 1 employee x 1 hour (introductory call/prep meeting with client schedule Galileo run)
- 1 employee x 4 hours (Galileo prep work)
- 3 employees x 2 hours (Galileo run)
- 1 employee x 1 hour (Galileo report review/finalization)

### Table 2: Person-Hours — Galileo Versus Manual Calculations

	Manual Calculations	Galileo	Percent Decrease
Timeline (hours)	120	12	90%

Source: Skyven Technologies, 2024

At an average of \$150 per hour per employee, the current total of scoping and conceptualizing projects using Galileo is \$1,800. Compared to the \$25,000 that it would take to generate a similar report, Galileo has exceeded the goal of decreasing the costs to perform the analysis

by a factor of 10, as shown in Table 3. These figures came from an analysis of the costs required to perform calculations for Pilot Plant A, including person-hours and overhead costs.

	Manual Calculations	Galileo	Percent Decrease
Timeline (hours)	\$25,000	\$1,800	93%

 Table 3: Cost — Galileo Versus Manual Calculations

Source: Skyven Technologies, 2024

## Galileo — Analysis Window and Reports

After the customer works through all of the questions on the Equipment window of the analysis AI window, a decarbonization report showing between two and five profitable decarbonization solutions appears. For each decarbonization solution, Galileo shows environmental and economic metrics calculated from the customer's inputs, such as emissions reduction, fuel usage, steam generation capacity, and electric consumption. Additionally, each solution shows the associated engineering considerations, technical feasibilities, and other benefits as specified by the expert user in the knowledge base. Figure 14 illustrates this window.

Plant A Galileo Run	Ø	<u> </u>	<u> </u>	<b>⊘</b>	
(S) Saved	COMPANY	FACILITY	EQUIPMENT	REPORT	
		Here's a summar	y of our analysis		
		Our sole	utions		
1 Skyven Arcturus Steam-Generating Heat Pump S					
£ 8,	is. It multiple Arcturus solutions are shown, they can be nual Scope 1 & 2 CO2e Net Emissions Reduction ~ 861 stric Tons	combined into one centralized syst	em.	Aresual Fuel Cost Reduction ~	
រារាំ Environmental and Economic Metrics			🛠 Technical Feasibility		
Emissions Reduction Annual Scope 1 & 2 CO2e Net Emissions Reducti Fuel Usage Fuel Serving Thermal Loads Natural Gas Annual Fuel Ostep Reduction 167,817 MM/btu Annual Fuel Cost Reduction 116,0012	on 8,861 Metric Tons		Compatibility <ul> <li>Steam pressure and usage rate</li> </ul>	are compatible with a steam-generating heat pump system.	
Steam Generation Capacity 17,995 lb/hr     Percentage of Total Steam Load 22%			Grant Eligibility		
Inclusion     Considerations	$\checkmark$		<ul> <li>SGHPs are innovative technolog</li> </ul>	y that likely qualify for grants through the OCED Industrial Demonstrations Program. ling through the California Energy Commission Food Production Investment Program (FPIP).	
Considerations	×		•	×	
2 Skyven Arcturus Steam-Generating Heat Pump S	System (Heat Source: Ammonia System Hot Gas) is. If multiple Arcturus solutions are shown, they can be		em.		

Figure 14: Report Non-expert UI Window

Source: Skyven Technologies, 2024

Additional features on this page include an option for the user to export the results to a PDF report or to an Excel spreadsheet. Examples of the PDF reports can be found in the appendices.

## **Pilot Plants — Galileo Reports Compared to Hand Calculations**

To validate the Galileo software, two pilot plants were run through the Galileo analysis and the results were compared to manual hand calculations.

Pilot Plant A is a real dairy plant in California. For Pilot Plant A, manual analysis was conducted for a condensing economizer and steam traps. Skyven worked with ConDex (a condensing economizer vendor) on the condensing economizer analysis and with Steam Management (a steam trap maintenance and monitoring company) on the steam trap analysis. Table 4 shows the comparison of the yearly savings calculated by the Galileo software, measured in one million British thermal units (MMBtu), compared to the manual calculations.

	Galileo Software Report	Manual Calculations	Percent Difference
Condensing Economizer (Yearly MMBtu Savings)	51,351	59,211	14%
Steam Traps (Yearly MMBtu Savings)	30,327	30,616	1%

 Table 4: Pilot Plant A — Galileo Versus Manual Calculations

Source: Skyven Technologies, 2024

Detailed manual calculations for Pilot Plant A can be found in Appendix A. The full Galileo report for Pilot Plant A can be found in Appendix B.

Pilot Plant B is a real ethanol manufacturing facility in Kansas. For Pilot Plant B, a manual analysis was performed for a steam generating heat pump system using rectifier condensers as the heat source. Skyven worked with S&B Engineers and Contractors Ltd. on the steam generating heat pump manual calculations. Table 5 shows the comparison of the yearly savings calculated by the Galileo software versus the manual calculations.

 Table 5: Pilot Plant B – Galileo Versus Manual Calculations

	Galileo Software Report	Manual Calculations	Percent Difference
SGHP – Rectifier Column (Steam Capacity – pounds per hour)	46,000	46,000	0%
SGHP – Rectifier Column (Electricity Usage – kilowatt- hours)	30,111,722	27,370,000	10%

Source: Skyven Technologies, 2024

The Galileo software calculated the exact same steam capacity (46,000 pounds per hour) as that calculated by manual calculations because both calculation methodologies encountered the same maximum steam generation capacity. That is, the maximum amount of steam that

could be used in this plant was entered by the customer in response to a Galileo question as 46,000 pounds per hour. Detailed manual calculations for Pilot Plant B can be found in Appendix C. The full Galileo report for Pilot Plant B can be found in Appendix D.

## **Machine Learning Results**

Skyven used ML to estimate equipment costs within the Galileo system. The Skyven team began working on the framework for this ML technology and pilot tested the ML capabilities using quotes received from various equipment manufacturers. At this time, the number of quotes and therefore the amount of data the ML system has to work with is relatively small, so there is a rather large range in terms of accuracy. In the screenshots in Table 6 and Table 7, the information shown in blue and light green was received via equipment manufacturer quotes and fed into the ML system to train it. The Skyven team then re-ran the system with the information in blue as the inputs and received predicted cost estimates from the ML system (in dark green). The accuracy between the ML system and the equipment manufacturer quotes is shown in orange in Table 6 and Table 7.

-										
No	Total Motor Horsepower	Number of Stages	Low-Side Temperature (*F)	High-Side Temperature ("F)	COP	Heat Capacity (MMbtuh)	Date Quote Received	Full-Build Material Cost	Predict	Accuracy (%) (MAPE)
1	650	2	76	173	6.08	5.00	6/1/2022	\$972,149	\$972,148.8125	0.0000192871668849117
2	800	1	75	175	4.81	8.80	11/18/2020	\$796,690	\$796,689.9375	0.0000078449585158594
3	900	1	90	170	3.49	7.13	2/20/2023	\$660,000	\$642,453.8125	2.6585132575757600000
4	700	1	. 90	170	4.45	6.48	2/20/2023	\$640,000	\$639,999.9375	0.0000097656250000000
5	900	1	85	170	3.53	7.43	2/20/2023	\$660,000	\$642,453.8125	2.6585132575757600000
6	700	1	. 85	170	4.43	6.50	2/20/2023	\$640,000	\$639,999.9375	0.0000097656250000000
7	500	1	65	150	4.08	5.77	11/10/2022	\$546,075	\$546,074.9375	0.0000114453142883304
8	725	2	42	180	3.12	5.00	5/17/2022	\$875,000	\$874,999.93750	0.0000071428571428571
9	400	1	90	170	4.33	4.61	2/28/2023	\$475,000	\$474,999.96875	0.0000065789473684211
10	400	1	85	170	4.33	4.61	2/28/2023	\$475,000	\$474,999.96875	0.0000065789473684211
11	550	1	70	175	3.98	4.99	6/10/2022	\$600,000	\$700,311.06250	16.7185104166667000000
12	600	1	. 80	180	5.1	5.7	3/8/2023	\$640,278	794236.0625	24.0455025004764000000
13	400	1	. 90	170	6.0	4.7	3/8/2023	\$540,000	593698.9375	9.9442476851851900000
	000	1	70	100	4.3	7.5	2/8/2022	000 000	705590 0375	0.4137578135000000000

 Table 6: Machine Learning Accuracy — Heat Pump Equipment

Source: Skyven Technologies, 2023

For heat pump equipment, the accuracy of the ML ranged from 0 percent to 24 percent. This is acceptable due to limited data.

### Table 7: Machine Learning Accuracy — Heat Recovery Steam Generating Equipment



Source: Skyven Technologies, 2023

The estimates had a large deviation of about 40 percent, resulting from limited data available for training the model.

## **Technical Advisory Committee Comments**

During the technical advisory committee meeting, one of the committee members asked how the manual hand calculations compared to the finalized results of the project. There were no projects ultimately installed at Pilot Plant B. However, both the condensing economizer and the steam trap projects at Pilot A were installed. Table 8 shows the percentage difference between the manual calculations and the actual performance of the steam trap and the condensing economizer projects at Pilot Plant A.

	Manual Calculations	Actual Performance	Percent Difference
Condensing Economizer (Yearly MMBTU Savings)	59,211	47,452	-22%
Steam Traps (Yearly MMBTU Savings)	30,616	42,929	+33%

 Table 8: Pilot Plant A — Manual Calculations Versus Actual Performance

Source: Skyven Technologies, 2024

It is important to note that the actual performance value for the condensing economizers was extrapolated to a year's worth of data. The yearly value was extrapolated from data collected in September 2022, when the condensing economizer was running at full capacity (the project had not been operating for several months due to changes in the steam boilers at the site). The difference in the values stems from the extrapolation of the existing data on the condensing economizers and the conservative estimates of the steam trap savings in the hand calculations. Additional data collected on this equipment in the coming months/years will help address/alleviate these differences.

## Challenges

Skyven's biggest challenge is obtaining more cost data so that the ML cost model can be further refined. Currently, the model includes about 20 equipment manufacturer quotes, but something on the order of 1,000 or more is needed for improved accuracy. Skyven is also working to develop a feature that can estimate the answers to a question that the customer cannot answer, based on previously submitted data from similar industries/customers. To do this, more data points are needed here as well, again, more on the order of 1,000 rather than the 100-plus currently in the system.

# CHAPTER 4: Conclusion

A large barrier to achieving California's clean energy and climate goals is the specific and unique nature of industrial facilities, which requires bespoke decarbonization solutions. The current options for scoping and FEE of decarbonization solutions are either to hire costly and time-consuming outside energy consultants or to seek vendor-specific solutions. These options are insufficient and often lead to inaction by the facility and continuation of the status quo. Therefore, Skyven developed a FEE AI system that is capable of analyzing a facility and, using input provided by the customer, automatically generating a decarbonization proposal with between two and five solutions; these solutions include economic and environmental benefits as well as engineering considerations, technical feasibilities, and other benefits.

Skyven has used Galileo with more than 135 different facilities across various sectors, such as chemical (ethanol, sugar beets, plastics), pulp and paper (paper mill, consumer paper goods), and food and beverage (dairies, breweries, snack products), resulting in the identification of more than 4.3 million metric tons of potential GHG savings and more than \$480 million in potential fuel cost savings for manufacturing establishments. Galileo's current capabilities include analyzing 76 distinct industrial facility types, 67 different pieces of equipment, and 60 diverse decarbonization solutions, totaling more than 4,000 unique combinations. From the initial technical call with a customer to a finalized decarbonization report, Galileo can produce results in as little as 24 hours, a stark contrast to the four months required for a similar report generated manually. Furthermore, production of decarbonization reports using Galileo costs 93 percent less and necessitates 90 percent fewer person-hours compared to typical hand calculations.

Skyven devised a diverse approach to sharing information about Galileo and promoting its adoption. A detailed whitepaper outlining Galileo's capabilities, data insights, and a comparison with traditional methods was finalized for posting on Skyven's website, accompanied by a corresponding blog post. Additionally, Skyven created a dedicated section on its website to showcase Galileo's features and achievements. While Galileo was initially developed as a scoping tool for industrial clients interested in decarbonization solutions, its potential extends across various sectors. Skyven plans to offer licenses for Galileo to service providers, industrial assessment centers, and/or governmental bodies to enhance their decarbonization services. Furthermore, Skyven envisions a two-sided marketplace model, where Galileo runs are provided free to potential clients while vendors pay for referrals.

Looking forward, Skyven aims to broaden Galileo's reach to include commercial and residential sectors through advancements in AI and the knowledge base. Ultimately, Skyven intends to use Galileo for decarbonization assessments across industrial, commercial, and residential properties, using various strategies such as charging for runs, licensing, and forming partnerships with vendors.

# **GLOSSARY AND LIST OF ACRONYMS**

Term	Definition		
AI	artificial intelligence — technology that enables computers and digital devices to learn, write, create, and analyze		
FEE	front-end engineering — an engineering design approach that focuses on the technical requirements as well as the rough cost savings for a project		
FEE AI	artificial intelligence front-end engineering system		
KRR	knowledge representation and reasoning — a field in artificial intelligence that focuses on how to represent information in a way that a computer system can use to make decisions with human like reasoning		
ML	machine learning		
MMBtu	million British thermal unit		
Skyven	Skyven Technologies		
UI	user interface — the point of human-computer interaction and communication		

# References

- CARB (California Air Resources Board). 2017 (Nov). <u>California's 2017 Climate Change Scoping</u> <u>Plan</u>. California Air Resources Board. Available at https://ww2.arb.ca.gov/sites/default/ files/classic/cc/scopingplan/scoping\_plan\_2017.pdf.
- Nunez. 2006 (Sep 27). "<u>AB 32 Air pollution: greenhouse gases: California Global Warming</u> <u>Solutions Act of 2006</u>." California State Legislature, Assembly Bill 32, Chapter 488, Statutes of 2006. Available at http://www.leginfo.ca.gov/pub/05-06/bill/asm/ab\_0001-0050/ab\_32\_bill\_20060927\_chaptered.html.
- Pavley. 2016 (Sep 8). "<u>SB 32 California Global Warming Solutions Act of 2006: emissions</u> <u>limit</u>." California State Legislature, Senate Bill 32, Chapter 249, Statutes of 2016. Available at https://legiscan.com/CA/text/SB32/id/1428776.

# **Project Deliverables**

The following is a list of all of the products produced under this agreement:

- KRR Framework Test Plan and Report
- Wireframe Plans
- UI Development and Test Plan
- Report for Pilot Plant A
- Report for Pilot Plant B
- Technology Transfer Plan and Report
- Critical Project Review (CPR) Report
- Quarterly Progress Reports (QPR)

These project deliverables, including the CPR and QPR interim project reports, are available upon request by submitting an email to <u>pubs@energy.ca.gov</u>.





# ENERGY RESEARCH AND DEVELOPMENT DIVISION

# APPENDIX A: Pilot Plant "A" and "B" Hand Calculations and Galileo Reports

August 2024 | CEC-500-2024-091



# APPENDIX A: Pilot Plant "A" and "B" Hand Calculations and Galileo Reports

### **Condensing Economizer:**

Heat recovery system in the *condensing* mode.

Fuel: Natural Gas

Gas side:	Gas type	Boiler Flue
	Total flow rate	91,422 lb/hr
	Inlet temperature	296 °F
	Outlet temperature	_115 °F
	Dew point	_127 °F
	H <sub>2</sub> O vapor by weight @ inlet	_9.2 %
	H <sub>2</sub> O vapor flow @ inlet	8,410 lb/hr
	H <sub>2</sub> O vapor flow @ outlet	5,801 lb/hr
	H <sub>2</sub> O condensed	2,609 lb/hr
	Specific heat @ avg. temperature_	0.264 Btu/lb.°F
	Pressure drop	1.38 inch w.c.
	Fouling factor	_0.001 hr· ft <sup>2</sup> · F/Btu
	Maximum velocity at inlet temperate	ure
	through the new free area	_17.6 fps
Liquid side:	Fluid type	Water
	Total flow rate	_66,000 lb/hr
	Inlet temperature	80 °F
	Outlet temperature	181 °F
	Pressure drop	
	Fouling factor	
	Velocity at average temperature	
	Sensible Heat Load:	4,175,568 Btu/hr
	Latent Heat Load:	2,621,024 Btu/hr
	TOTAL HEAT RECOVERED (with 2% los	sses)6,796,592 Btu/hr

There are 8,712 operating hours, therefore the Condensing Economizer can save up to 59,211 MMBTU/year.

### **Steam Traps:**

Tag#-Location	Steam Leak Average Prior to Fix (klbs/hr)	Steam Leak Average Post Fix (klbs/hr)	Steam Saved (klbs/hr)	Steam Saved (klbs/month)	Thermal Energy Savings (MMBtu/month)
Tag2 - Boiler Room	0.028	0.006	0.021	15.472	15.472
Tag4 - Boiler Room	0.194	0.043	0.151	109.010	109.010
Tag8 - Boiler Room	0.035	0.008	0.027	19.654	19.654
Tag 10 - Boiler Room	0.078	0.017	0.061	43.670	43.670
Tag 11 - Boiler Room	0.004	0.001	0.003	2.130	2.130
Tag 9 - Butter	0.009	0.002	0.007	5.230	5.230
Tag 10 - Butter	0.006	0.001	0.004	3.123	3.123
Tag 16 - Plant 6 (Size 2)	0.474	0.104	0.370	266.383	266.383
Tag 16 - Plant 6 (Size 1.5 #1)	0.217	0.048	0.169	121.830	121.830
Tag 16 - Plant 6 (Size 1.5 #2)	0.321	0.071	0.250	180.343	180.343
Tag 20 - Receive	0.024	0.005	0.019	13.737	13.737
Tag14 - Butter	0.041	0.009	0.032	22.903	22.903
Tag 73 - Plant 8 (Size 2)	1.479	0.325	1.153	830.427	830.427
Tag 73 - Plant 8 (Size 1)	0.099	0.022	0.077	55.647	55.647
Tag 73 - Plant 8 (Size 0.5)	0.004	0.001	0.003	2.424	2.424
Tag 70 - Plant 7 (Size 0.5 #1)	0.004	0.001	0.003	2.261	2.261
Tag 70 - Plant 7 (Size 0.5 #2)	0.005	0.001	0.004	2.800	2.800
Tag67 - Plant 7	0.005	0.001	0.004	2.796	2.796
Tag66 - Plant 7	0.022	0.005	0.017	12.089	12.089
Tag 70 - Plant 8	0.133	0.029	0. 103	74.465	74.465
Tag 23 - Receive	0.025	0.006	0.020	14.079	14.079
Tag 22 - Receive (Size 0.75 #1)	0.035	0.008	0.027	19.554	19.554
Tag 22 - Receive (Size 0.75 #2)	0.008	0.002	0.006	4.614	4.614
Tag 22 - Receive (Size 0.75 #3)	0.077	0.017	0.060	43.325	43.325
Tag 24 - Pipe Chase	0.022	0.005	0.017	12.168	12.168
Tag 27 - Pipe Chase	0.076	0.017	0.059	42.438	42.438
Tag 28 - Pipe Chase	0.063	0.014	0.049	35.246	35.246
Tag 29 - Pipe Chase	0.075	0.016	0.058	42.048	42.048
Tag 26 - Pipe Chase	0.014	0.003	0.011	7.960	7.960
Tag 32 - Pipe Chase	0.020	0.004	0.015	11.134	11.134
Tag 39 - Pipe Chase	0.032	0.007	0.025	18.245	18.245
Tag 40 - Pipe Chase	0.022	0.005	0.017	12.253	12.253
Tag 38 - Pipe Chase	0.013	0.003	0.010	7.377	7.377
Tag 41 - Pipe Chase (Size 1)	0.039	0.009	0.031	22.127	22.127
Tag 41 - Pipe Chase (Size 0.75)	0.025	0.005	0.019	14.010	14.010
Tag 44 - Pipe Chase	0.020	0.004	0.015	11.121	11.121
Tag80 - Plant 8	0.006	0.001	0.005	3.619	3.619
Tag HEX - Plant 7	0.790	0.174	0.616	443.656	443.656
				Monthly Total (MMBTU/month)	2551.367
				Yearly Total (MMBtu/year)	30,616





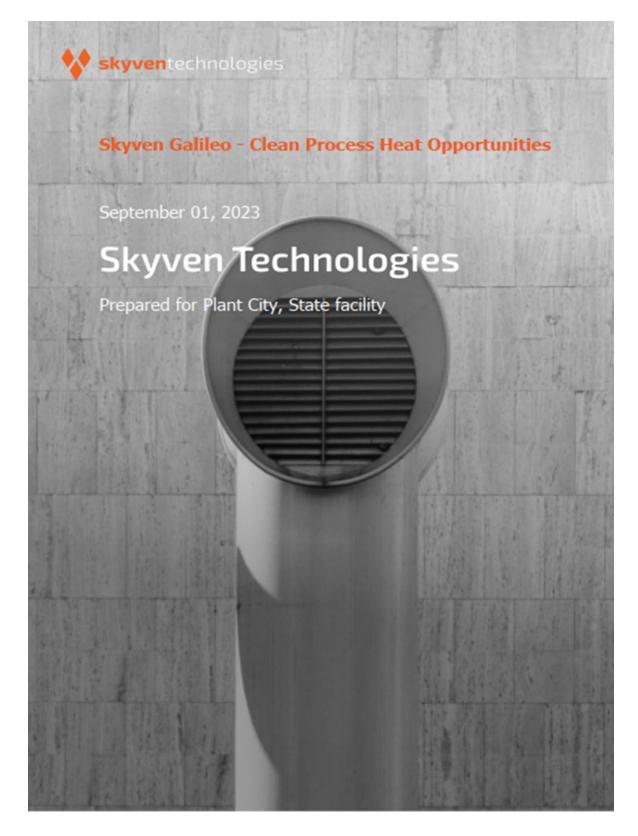
# ENERGY RESEARCH AND DEVELOPMENT DIVISION

# **APPENDIX B: Pilot Plant "A" Galileo Report**

August 2024 | CEC-500-2024-091



# APPENDIX B: Pilot Plant "A" Galileo Report



# Introduction

The following report determines projects to significantly reduce CO2 from the Pilot Plant A site in Plant City, State. Included is the following key information gathered during the meeting to inform the results:

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### Site Information

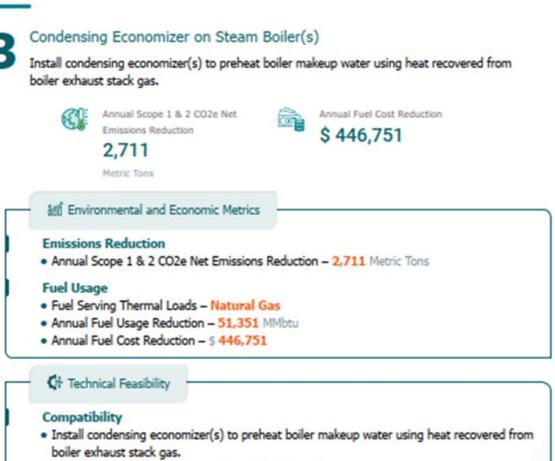
• Site operates 8,712 hours a year

#### Natural Gas

- Annual Natural Gas Usage: 8,739,664 Therm
- Average Natural Gas Rate: \$0.87 per Therm
- Annual Natural Gas Cost: \$7,603,507.68



## Solutions



The steam boiler makeup water is a viable heat sink.

#### Engineering Considerations

#### **Condensing Flue Gas**

 Condensing economizer and associated equipment will be designed to resist corrosion from water condensing out of flue gas.

#### Other Benefits

#### **Grant Eligibility**

 This project may qualify for funding through the California Energy Commission Food Production Investment Program (FPIP).

### Solutions



#### Intelligent Steam Traps and Active Monitoring/Repair

Install IOT steam traps with automatic remote monitoring and repair or replace failed traps.



and Environmental and Economic Metrics

#### **Emissions Reduction**

Annual Scope 1 & 2 CO2e Net Emissions Reduction – 1,601 Metric Tons

#### Steam

- Steam Demand Offset 3,252 lb/hr
- Percentage of Total Steam Load 4 %

#### Fuel Usage

- Fuel Serving Thermal Loads Natural Gas
- Annual Fuel Usage Reduction 30,327 MMbtu
- Annual Fuel Cost Reduction \$ 263,844

#### C Technical Feasibility

#### Compatibility

- Existing steam trap audit schedule does not identify and repair all failed traps.
- The quantity of steam traps is high enough to justify installing a remote monitoring system.

#### Engineering Considerations

#### **Remote Connectivity**

 Steam traps communicate with remote monitoring systems via cellular data link, avoiding any need to tie into the plant network.

#### S Other Benefits

#### System Performance

· Properly operating steam traps help prevent water hammer and other undesirable conditions.

#### **Grant Eligibility**

 This project may qualify for funding through the California Energy Commission Food Production Investment Program (FPIP).

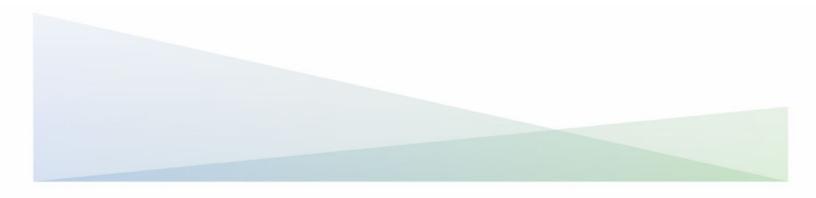




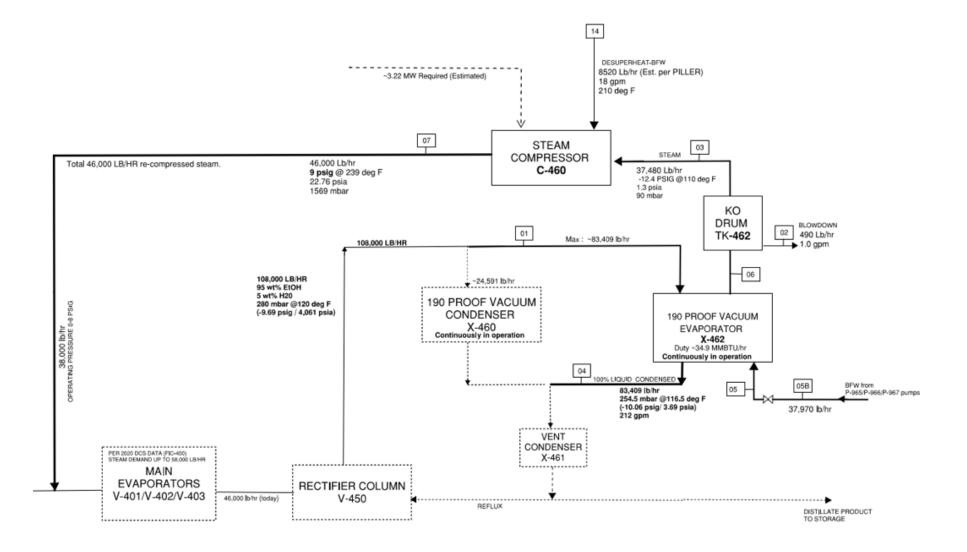
# ENERGY RESEARCH AND DEVELOPMENT DIVISION

# **APPENDIX C: Pilot Plant "B" Manual** Calculations

August 2024 | CEC-500-2024-091



# APPENDIX C: Pilot Plant "B" Manual Calculations



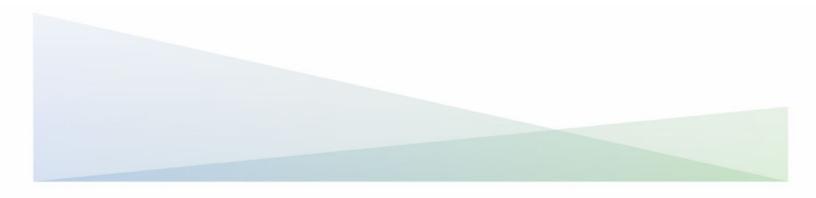




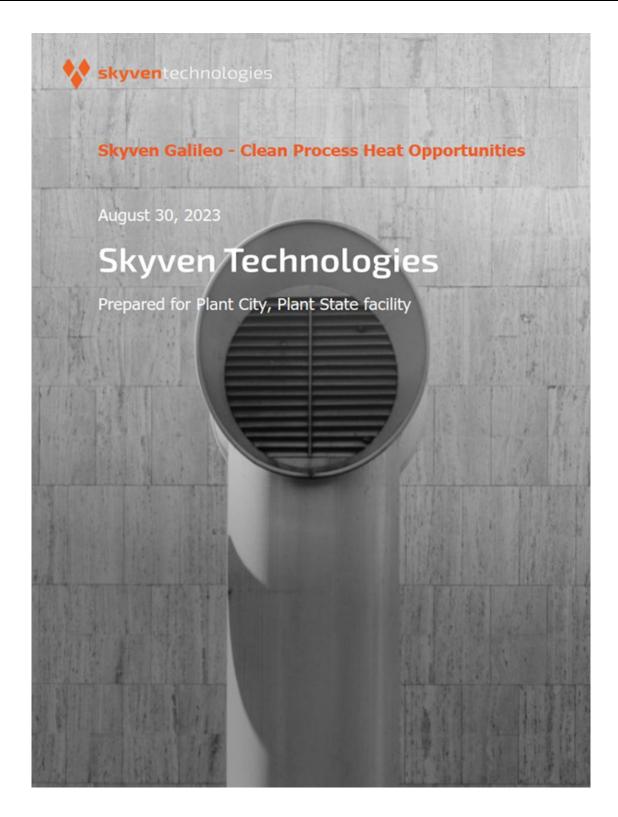
# ENERGY RESEARCH AND DEVELOPMENT DIVISION

# **APPENDIX D: Pilot Plant "B" Galileo Reports**

August 2024 | CEC-500-2024-091



# APPENDIX D: Pilot Plant "B" Galileo Reports



# Introduction

The following report determines projects to significantly reduce CO2 from the Pilot Plant B site in Plant City, State. Included is the following key information gathered during the meeting to inform the results:

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### Site Information

• Site operates 8,500 hours a year

#### Natural Gas

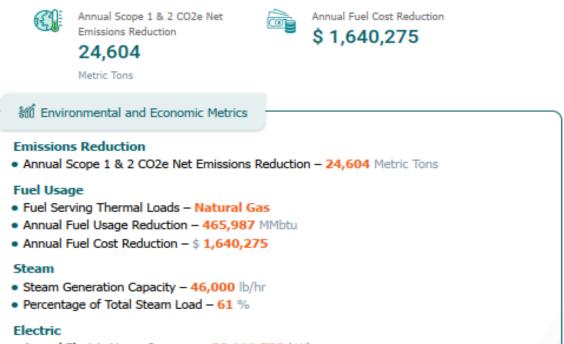
- Annual Natural Gas Usage: 814,300 MMbtu
- Average Natural Gas Rate: \$3.52 per MMbtu
- Annual Natural Gas Cost: \$2,866,336



# Solutions

### Skyven Arcturus Steam-Generating Heat Pump (Heat Source: Rectifier Condensers)

An Arcturus system can have multiple heat sources, but sourcing heat from the condenser may decrease the heat available from cooling equipment.



#### Annual Electric Usage Increase – 30,111,722 kWh

#### 🕼 Technical Feasibility

#### Basic Fit

Steam pressure and usage rate are compatible with a steam-generating heat pump system.

#### Engineering Considerations

#### Heat Source - Rectifier Condenser

- Heat can be recovered directly from the condenser at a higher temperature than from centralized cooling systems.
- Arcturus operating COP improves with higher temperature heat sources.

#### Multiple Heat Sources

- The Skyven Arcturus SGHP can utilize waste heat from multiple sources.
- Additional engineering is required to determine the best combination of heat sources to use.
- Heat available from condenser(s) can't be double-counted with heat from centralized cooling system serving the condenser(s).

## Solutions

### 2 Skyven Arcturus Steam-Generating Heat Pump (Heat Source: Rectifier Condensers) (cont.)

#### Regineering Considerations (cont.)

#### Footprint

 The steam generating heat pump has a large footprint. Additional analysis is required to determine ideal placement.

#### Other Benefits

#### **Grant Eligibility**

 SGHPs are innovative technology that likely qualify for grants through the OCED Industrial Demonstrations Program.

#### Electrification

- Electrically-driven heat source allows for sourcing of renewable electricity.
- Skyven Technologies can facilitate installation of solar PV electric generation to avoid increase in Scope 2 emissions.
- If on-site solar PV is not feasible, renewable energy credits shall be purchased to offset increase in Scope 2 emissions.
- Skyven covers the cost of the increase in electric usage due to the heat pump.

#### **Redundant with Existing Equipment**

 SGHP system will be installed in parallel with the existing equipment, keeping existing steam generation equipment as backup.