



Article

Scenario-Based Techno-Economic Analysis of Steam Methane Reforming Process for Hydrogen Production

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Abstract: Steam methane reforming (SMR) process is regarded as a viable option to satisfy the growing demand for hydrogen, mainly because of its capability for the mass production of hydrogen and the maturity of the technology. In this study, an economically optimal process configuration of SMR is proposed by investigating six scenarios with different design and operating conditions, including CO_2 emission permits and CO_2 capture and sale. Of the six scenarios, the process configuration involving CO_2 capture and sale is the most economical, with an H_2 production cost of \$1.80/kg- H_2 . A wide range of economic analyses is performed to identify the tradeoffs and cost drivers of the SMR process in the economically optimal scenario. Depending on the CO_2 selling price and the CO_2 capture cost, the economic feasibility of the SMR-based H_2 production process can be further improved.

Keywords: steam reforming; hydrogen production; renewable energy; sensitivity analysis; global warming



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1. Introduction

Energy demand has steadily increased with the growing global economy [1]. Currently, energy generation systems rely heavily on fossil fuels, which lead to global warming, mainly due to the accumulation of CO₂ in the atmosphere [2]. Net emissions of CO₂ by human activities must approach zero to stabilize global mean temperature [3]. Carbon capture and utilization (CCU) and carbon capture and fixation (CCF) are promising approaches for reducing emissions of greenhouse gases (GHGs) and depletion of fossil resources, especially in the chemical industry [4]. For a more fundamental approach, however, it is necessary to develop new energy resources as alternatives to conventional fossil fuels and the corresponding energy generation systems [5]. A range of studies have been conducted to address this problem, including production of biofuels from fructose [6], production of drop-in fuels from biomass [7], analysis of energy systems utilizing various renewable resources [8], analysis of potential emissions of GHG from proven reserves of fossil fuels [9]. Especially, hydrogen has received substantial attention as a feasible energy carrier to deliver or store a tremendous amount of energy because of its clean properties [10]. In particular, the potential of hydrogen as an energy carrier for hydrogen refueling stations [11] and hydrogen fuel cell vehicles [12] has been reported.

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Hydrogen can be produced by various methods, such as coal and biomass gasification, water electrolysis, and steam methane reforming (SMR) [13]. Coal and biomass gasification requires high operating temperatures, thereby resulting in high energy demands to produce small amounts of hydrogen [14]. Water electrolysis uses electricity generated from renewable resources such as wind and solar energy to produce hydrogen [15]. This method has environmental advantages, but because of its high capital cost for construction, it leads to high hydrogen production costs and has limited capacity compared to that of industrial hydrogen production [16]. Given the maturity of the technology and the capability of mass production, SMR is seen as a viable option for hydrogen production in the near future.

As shown in Figure 1, the SMR process consists of steam reforming, WGS reaction, and hydrogen purification, and is involved in a series of stages comprising natural gas resource use, hydrogen consumption in industry and fuel cells, and CCU. Hydrogen can potentially be used in a wide range of applications—transportation, industrial, residential, and portable, however, only a fuel cell electric vehicle is shown in Figure 1 as an example for simplicity.

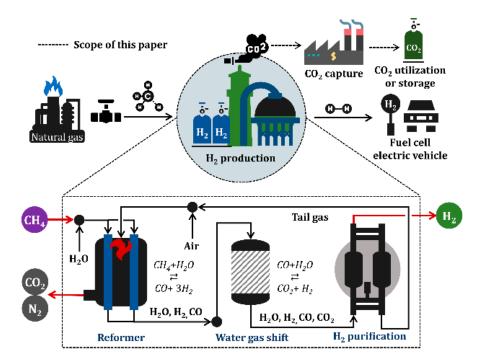


Figure 1. Schematic of industrial hydrogen production using steam methane reforming.

Many studies have been reported on SMR, but most of these studies have focused on an individual SMR reactor design [17], a specific SMR reaction [18], a specific water–gas shift (WGS) reaction [19], and the development of a new catalyst to improve the reaction yield [20]. However, in addition to the concerns of individual reactors, enhancing the efficiency and economics of the entire SMR system from a process perspective is important for engineering companies to secure competitiveness. In the hydrogen production process, operating conditions including the pressure of the reformer and the temperature of the WGS reactor are adjustable and design conditions including the number of WGS reactors can also be selected to improve process economics. Additionally, SMR is inevitably accompanied by CO₂ emissions, which need to be isolated to satisfy environmental regulations [21], e.g., using a moving bed adsorption process [22]. The integration of carbon capture and SMR generally increases the cost of hydrogen production. Therefore, carbon capture is worth considering in the design of the entire SMR process because it affects the economics of the process [23].

No research has been conducted yet to investigate the economic feasibility of overall hydrogen production using SMR under a variety of operating and design conditions,

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including carbon emission allowances and carbon capture and sales. The purpose of this study is therefore to propose an optimal process configuration for an SMR-based hydrogen production system from an economic point of view, considering these conditions. We construct six scenarios according to different design and operating conditions and find which one is the most economically feasible through comparison. For the optimal scenario, a wide range of techno-economic analyses is performed to investigate the impact of key process and economic parameters on process economics.

2. Methods

2.1. Process Description

An SMR process model was developed using a commercial simulator, Aspen Plus, based on the experimental data obtained from the literature. Figure 2 shows the detailed process flow diagram of the SMR process developed in this study (see Figures S1–S3 in the Supplementary Materials for the process flow diagrams for Sc 2–4, respectively). The process consists of four areas: (1) hydrogen production, (2) steam production, (3) hydrogen purification, and (4) feed intake. A detailed description of each process area is given below.

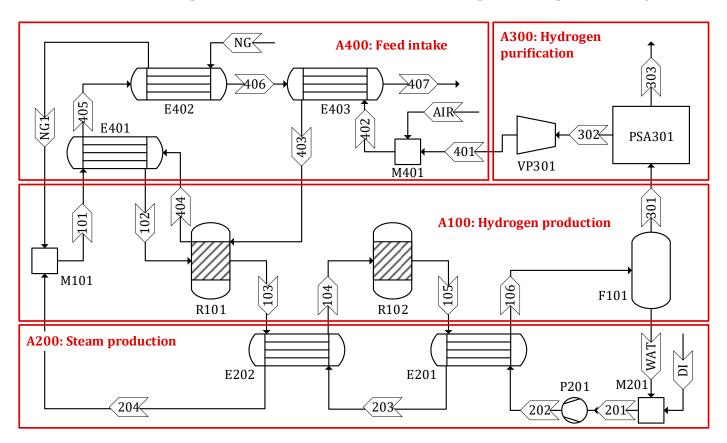


Figure 2. Process flow diagram of steam methane reforming.

Area 100 Hydrogen production: The flow rate of CH_4 is adjusted to produce H_2 at 500 kg/d. Steam (stream 204) and CH_4 (stream NG1) are combined and supplied to the steam methane reformer (R101) where CO and H_2 are produced through a highly endothermic reaction, in the presence of a nickel-based catalyst (Ru–Ni/Al₂O₃) [24]. The steam to CH_4 molar ratio is maintained at 3 to prevent coke deposition on the surface of the catalyst [25]. The heating requirement of the reformer is satisfied by the heat released from the combustion of the tail gas. The effluent from the reformer (stream 104) is then routed to the WGS reactor (R102) where CO and steam are converted to additional H_2 and a coproduct of CO_2 . The WSG reaction occurs over a copper-promoted iron–chromium oxide catalyst (Cu/Fe_3O_4 – Cr_2O_3) to increase the amount of H_2 while decreasing the CO

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content [24]. In the flash (F101), the water is separated as the bottom product (stream WAT) and the gaseous mixture (stream 301) is discharged from the top and sent to the hydrogen purification area for further treatment.

Area 200 Steam production: Steam is produced from deionized water using two heat exchangers, E201 and E202. Approximately 46% of the demineralized water is supplied from recycled water (stream WAT) separated from the flash drum (F101) and the remaining 54% is replenished from external sources (stream DI). The steam produced in this area is used in reactors R101 and R102.

Area 300 Hydrogen purification: The gaseous product of F101 is a mixture of H_2 , H_2O , CO_2 , CO, and CH_4 . To meet the specification of H_2 as the final product, the mixture is purified using a pressure swing adsorption (PSA) process, as is often used in industrial practice [26–29]. H_2 (stream 303) is produced with 99.99% purity and 75% recovery. The tail gas (stream 302) separated from the PSA process (PSA301) is sent to the feed intake area and used for heat generation [30].

Area 400 Feed intake: This area includes three heat exchangers (E402, E403, and E404) to preheat CH_4 , steam, and tail gas (streams NG, 101, and 402, respectively) using the heat released from the flue gas (stream 404). The preheated streams 102 and 403 are then sent to the reformer (R101).

See Tables S1–S4 in the Supplementary Materials for detailed process stream information for Sc 1–4, respectively. Table 1 summarizes the main design and operating conditions used in the four process areas of the proposed SMR process.

Parameters	Values	References
Area 100: Hydrogen production		
Natural gas pressure (kPa)	800	[31]
Steam reformer temperature (°C)	800	[25]
GHSV of steam reformer (m ³ /h·kg-cat.)	2.0	[32]
GHSV of high temperature of WGS reactor (m ³ /h·kg-cat.)	1.0	[33]
GHSV of low temperature of WGS reactor (m ³ /h·m ³ -cat.)	6000	[34]
Area 200: Steam production		
Steam to CH ₄ molar ratio	3.0	[25]
Area 300: Hydrogen purification		
H_2 recovery	75%	[24]
H ₂ purification	99.99%	[24]
Operating pressure range (kPa)	2-800	Assumed
Area 400: Feed intake		
Temperature of exhaust gas (°C)	900	Assumed

Table 1. Design and operating conditions in each process area of the developed process.

2.2. Scenario Development

To investigate the effect of process design and operating conditions on process economics, we developed six scenarios as shown in Table 2. We consider five different conditions, namely reformer pressure, number of WGS reactors, WGS reactor temperature, CO_2 emission allowances, and CO_2 capture and sales.

In Sc 2, the temperature of the WGS reactor is 250 $^{\circ}$ C. The higher temperature of the WGS reactor increases the productivity of H₂ but increases utility requirements at the same time, leading to an increase in operating costs.

In industrial SMR processes, two WGS reactors operating at different temperatures are usually introduced to increase the CO-to- H_2 conversion rate. However, the additional reactor leads to an increase in capital cost. To investigate this effect, Sc 3 with two WGS reactors is considered.

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	Steam Reformer Pressure (kPa)	Number of WGS Reactors	WGS Reactor Temperature (°C)	CO ₂ Emission Allowances	CO ₂ Capture and Sales
Sc 1	800	1	450	N	N
Sc 2	800	1	250	N	N
Sc 3	800	2	450, 250	N	N
Sc 4	100	1	450	N	N
Sc 5	800	1	450	Y	N
Sc 6	800	1	450	Υ	Υ

Table 2. Six scenarios of steam methane reforming process with different design and operating conditions.

In this study, reformer pressures of 100 kPa and 800 kPa are considered. As the reformer pressure decreases, the conversion rate of CH_4 to H_2 increases, while the amount of fuel gas required for the reformer increases because of the decrease in the amount of unreacted CH_4 , thus leading to a decrease in the energy content of the tail gas. Moreover, when the reformer pressure is 100 kPa (Sc 4), an additional compression step is required between the reformer and the PSA process.

The CO_2 emission allowances is a cost to be paid and thus has a negative effect on the economics of the process. It is assumed that CO_2 is released into the atmosphere without any restrictions when the CO_2 emission allowances are not considered. In Sc 5, the CO_2 emission allowances apply to 100% of the CO_2 generated from the combustion of the tail gas.

Sc 6 involves the capture and the sale of CO_2 as a byproduct. 90% of the CO_2 produced from the combustion of the tail gas is captured and 10% of the remaining CO_2 is applied to the CO_2 emission allowances. There is a large global market for CO_2 and the demand for CO_2 continues to grow in various industrial sectors including refrigeration, food & beverages, oil & gas, pharmaceuticals, rubber, and firefighting [35]. CO_2 can also be used in CCU [36] and CCF [37] technologies in cleaner ways. If SMR is combined with CCF, the system is clean because no CO_2 is released into the atmosphere. Detailed analysis on the use of CO_2 in CCU and CCF appeared to be beyond the scope of this work, therefore we left it for later analysis.

2.3. Economic Evaluation

Table 3 lists the economic parameters and assumptions used in this study. All equipment and material costs were adjusted to the common base year of 2015 using the Plant Cost Index [38]. Equipment costs were estimated using a scaling expression based on the equipment size and cost data provided in the National Renewable Energy Laboratory (NREL) report [39].

Total capital investment (TCI) is calculated as the sum of fixed capital investment, working capital, and land. The fixed capital investment consists of direct costs (the total installed equipment costs, warehouse, site development, and additional piping) and indirect costs (project contingency, construction fees, and field expenses) [40]. Total operating costs are calculated as the sum of variable operating costs including raw materials and fixed operating costs including labor, maintenance, and property insurance [40]. The labor cost including overhead was scaled based on the H2A model developed by NREL [39] while other overhead costs, namely maintenance and property insurance, were calculated based on the capital cost.

Calculations are performed using facilities of the Core Facility Center for Analysis of Optoelectronic Materials and Devices of the Korea Basic Science Institute (KBSI).

2.4. Sensitivity and Uncertainty Analysis

We conduct a single-point sensitivity analysis to identify the key economic and process parameters that most affect the H₂ production cost. A total of nine parameters are investi-

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gated, including feedstock price, CO_2 capture cost, and internal rate of return (IRR). Each parameter is varied by $\pm 20\%$ from their original values while the remaining parameters are maintained constant.

Table 3. Major economic pa	rameters and assumptions.
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Parameters	Values	References	
Natural gas price (\$/t)	239.0	[41]	
Ru–Ni/Al ₂ O ₃ catalyst (steam reformer) (\$/kg) *	25.0	[24]	
Cu/Fe ₃ O ₄ -Cr ₂ O ₃ catalyst (WGS reactor) (\$/kg) *	25.0	[24]	
Adsorbent (\$/kg) *	2.0	[24]	
Deionized water (\$/t)	14.5	[42]	
CO_2 emission allowances (\$/t)	29.0	[43]	
CO_2 capture cost (\$/t)	70.0	[43]	
CO ₂ selling price (\$/t)	80.0	[43]	
Plant financing by equity (%)	40.0	[39]	
Plant life (y)	20	[39]	
Income tax rate (%)	35.0	[39]	
Internal rate of return (%)	10.0	[39]	
Interest rate for debt financing (%)	8.0	[39]	
Term for debt financing (y)	10.0	[39]	
Plant depreciation (y)	7.0	[39]	
Average labor rate (\$/h)	20.0	[39]	
Land (% of fixed capital investment)	2.0	[39]	
Working capital (% of fixed capital investment)	5.0	[39]	
On-stream percentage after startup (%)	90.0	[39]	
Startup time (y)	0.5	[39]	
Revenue and costs during startup			
Revenue (% of normal)	50.0	[39]	
Variable costs (% of normal)	50.0	[39]	
Fixed costs (% of normal)	75.0	[39]	
Construction period (y)	1.0	[39]	

^{* 10%} of the catalyst and adsorbent is refurbished every three months at a cost equivalent to 40% of its original value.

We can only identify the influence of a single parameter on process economics in sensitivity analysis, not the overall effect. Therefore, based on the three influential parameters (feedstock price, CO_2 capture cost, and IRR) identified in the sensitivity analysis, uncertainty analysis is performed to quantify the risks and uncertainty associated with the proposed process under unpredictable circumstances, using the Monte-Carlo simulation method. We assume that the selected parameters follow a triangular distribution with equal variation ranges. Two economic parameters, feedstock cost and CO_2 capture cost, are changed from $\pm 10\%$ to $\pm 50\%$ with a fixed IRR of 10%. Also, the IRR varies from 10% to 20% while the two economic parameters change by $\pm 20\%$.

3. Results and Discussion

3.1. Capital and Operating Costs

Table 4 shows the capital and operating costs of the six scenarios (see Tables S5–S8 in the Supplementary Materials for the equipment costs calculated in Sc 1–4, respectively). The TCI and total operating cost in Sc 1 are the lowest of all scenarios, at \$902,183 and \$181,063/y, respectively (the TCI in Sc 1, 5, and 6 are calculated equally). This is due to the low overall conversion from natural gas to hydrogen, which decreases the capital costs of the hydrogen production and hydrogen purification process areas and the operating costs owing to the reduced consumption of deionized water. The low temperature of the WGS reaction causes a high equilibrium value, thus increasing the amount of H_2 produced from CO. Therefore, the low temperature (250 °C) of the WGS reaction in Sc 2 leads to a larger reactor and a higher catalyst consumption, which in turn increases the TCI and total operating cost by 4.8% and 0.92%, respectively, compared to Sc 1. In Sc 3, two WGS reactors are employed, each operating at high (450 °C) and low (250 °C) temperatures. The

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TCI and total operating cost in Sc 3 increase by 19% and 1.5%, respectively, above those in Sc 1 because of the additional WGS reactor. The TCI and total operating costs of Sc 4 are 35% and 16% higher than those of Sc 1, respectively, owing to the installation of the additional compressor. In particular, the consumption of electricity and deionized water is significantly increased owing to the low vapor pressure of the additional compressor. Sc 5 and 6 consider CO_2 emissions and CO_2 capture, increasing the total operating costs.

		Capital Cost	s (\$)			
	Sc 1	Sc 2	Sc 3	Sc 4	Sc 5	Sc 6
A100: Hydrogen production	307,888	326,817	393,578	289,849	307,888	307,888
A200: Steam production	23,608	25,331	26,493	10,759	23,608	23,608
A300: Hydrogen purification	102,747	104,032	104,032	295,521	102,747	102,747
A400: Feed intake	12,347	11,842	12,210	11,827	12,347	12,347
Total installed equipment costs	446,590	468,021	536,312	607,956	446,590	446,590
Total direct costs	526,976	552,265	627,231	717,388	526,976	526,976
Total indirect costs	316,186	331,359	376,338	430,433	316,186	316,186
Fixed capital investment	843,162	883,624	1,003,569	1,147,821	843,162	843,162
Total capital investment	902,183	945,478	1,073,819	1,228,168	902,183	902,183
	(Operating Cost	ts (\$/y)			
	Sc 1	Sc 2	Sc 3	Sc 4	Sc 5	Sc 6
Feedstock	121,977	121,860	120,588	119,368	121,977	121,977
Ru–Ni/Al ₂ O ₃ catalyst	462	438	438	420	462	462
Cu/Fe ₃ O ₄ -Cr ₂ O ₃ catalyst	513	665	879	478	513	513
Adsorbent	1776	1813	1813	1940	1776	1776
Electricity	6215	6391	6391	30,434	6215	6215
Cooling water	834	783	696	834	834	834

14,434

36,346

182,730

Table 4. Capital and operating costs in six scenarios.

In the six scenarios, the hydrogen production area accounts for the largest proportion of the TCI: 34.1%, 34.6%, 36.7%, and 23.6% in Sc 1, 2, 3, and 4, respectively. This is because multiple reactors are used, including the reformer and the WGS reactor, which accounts for 67.4% of the total installed equipment cost in Sc 1. The next largest contributor is the hydrogen purification area, owing to the high cost of the PSA unit. As for the operating cost, the feedstock cost is the most dominant cost contributor in the six scenarios, accounting for 67.4%, 66.7%, 65.6%, and 56.7% of the total operating cost in Sc 1, 2, 3, and 4, respectively.

14,434

38,456

183,695

16,056

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40,994

210,524

13,652

40,632

35,634

221,696

13,652

40,632

88,270

35,634

273,397

From the capital and operating costs, it is observed that the SMR process is economically beneficial when the reformer pressure is 800 kPa and the temperature of the WGS reaction is 450 $^{\circ}$ C with one reactor. In the next section, we consider the costs associated with the emissions, capture, and sale of CO₂ and investigate which scenario is the most economical.

3.2. Hydrogen Production Cost

13,652

35,634

181,063

Deionized water

CO₂ emission allowances

CO₂ capture

Fixed operating costs

Total operating costs

Figure 3 shows the costs and revenues of the six scenarios. The H_2 production cost, defined as the price of production at the breakeven point, is calculated using the discounted cash flow methodology presented in the NREL reports [37,38] (see Tables S9–S14 in the Supplementary Materials for detailed discounted cash flows for Sc 1–6, respectively). H_2 production costs consist of feedstock costs, operating costs, capital depreciation, income taxes, and return on investment calculated by the formula [44]. Sc 5 includes CO_2 emission allowances, and Sc 6 includes CO_2 emission allowances, CO_2 capture cost, and sales credit.

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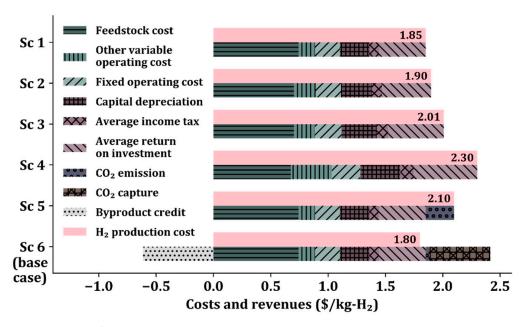


Figure 3. H₂ production cost comparison in six scenarios.

As discussed in Section 3.1, the cost of H_2 production increases from Sc 1 to 2, 3, and 4 because of the use of a low-temperature WGS reactor, the addition of the low-temperature WGS reactor, and the low pressure in the reformer, respectively. In Sc 5, the CO_2 emission allowances are applied to 100% of the CO_2 generated from the burning of the tail gas, adding a cost of 0.25/kg- H_2 . In Sc 6, the CO_2 emission allowances are applied to only 10% of CO_2 , increasing the cost by 0.025/kg- H_2 because 90% of the generated CO_2 is captured. Among the six scenarios, Sc 6 shows the lowest H_2 production cost of 0.80/kg-0.02/kg-

3.3. Sensitivity Analysis

We perform a sensitivity analysis of Sc 6 to investigate the influence of main parameters on the H_2 production process, including CO_2 capture, by varying key economic and process parameters by $\pm 20\%$ from the base conditions, as shown in Figure 4. Among the parameters, the feedstock cost is the most significant cost driver; a $\pm 20\%$ variation of it leads to a $\pm 8.3\%$ variation in the H_2 production cost. The second most important cost driver is the CO_2 capture cost; a $\pm 20\%$ variation of it leads to a $\pm 6.1\%$ change in the H_2 production cost. The third factor is the IRR, leading to a $\pm 3.9\%$ change in the H_2 production cost with a $\pm 20\%$ change. The next important cost drivers are the GHSV of the reformer, GHSV of the WGS reactor, and deionized water price, sequentially. Therefore, the economics of the SMR process can be further improved with the lower feedstock price, CO_2 capture cost, and IRR.

Figure 5 shows a viability envelope for Sc 6, which is used to investigate the effect of TCI and IRR on the H_2 production cost according to the CO_2 selling price. The general H_2 production cost using SMR is between \$1.70/kg- H_2 and \$2.09/kg- H_2 , as reported in the literature [45], and shown in Figure 5. Figure 5a shows the change in H_2 production cost when the TCI in the base case is multiplied by a given multiplier (0.8 or 1.2), and the curves in Figure 5b represent the change in H_2 production cost for a 12.5% IRR and 15.0% IRR [46].

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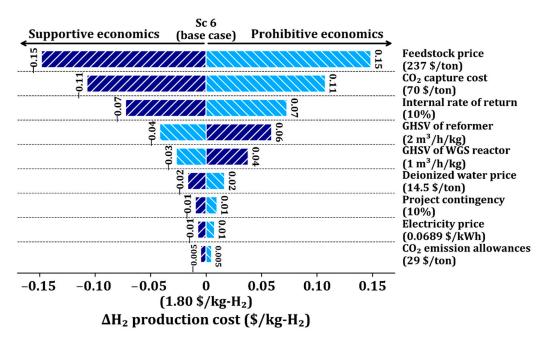


Figure 4. Sensitivity analysis of key economic parameters in Sc 6 using single-point tornado chart.

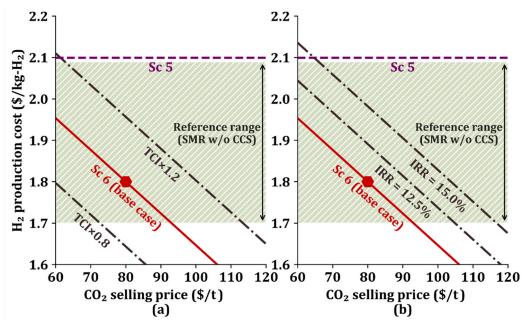


Figure 5. Viability envelope according to changes in (a) total capital investment (TCI) and (b) internal rate of return (IRR) in Sc 6. The reference range is between $1.7/kg-H_2$ and $2.09/kg-H_2$.

When there is no change in TCI and IRR values, Sc 6 is economically viable if the CO_2 selling price is between \$60/t and \$92/t and economically attractive if the CO_2 selling price is larger than \$92/t because the H_2 production cost is lower than the general production cost range.

When the TCI is decreased by 0.8 times and the CO₂ selling price is higher than \$72/t, then the H₂ production cost is lower than the lowest H₂ production cost of \$1.70/kg-H₂, and the proposed process becomes economically favorable. When the TCI increases by 1.2 times, Sc 6 becomes economically attractive if the CO₂ sells for higher than \$114/t.

Even if the IRR increases by 12.5% or 15.0%, the H_2 production cost remains within the general H_2 production cost range if CO_2 sells for lower than \$105/t or \$118/t, respectively. In addition, it enters the cost preference area if CO_2 sells for higher than \$105/t or \$118/t for a 12.5% or 15.0% IRR, respectively.

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3.4. Uncertainty Analysis

From the results of the sensitivity analysis in the previous section, feedstock price, CO₂ capture cost, and IRR are identified as critical parameters. We perform the Monte Carlo simulations (10,000 trials) for Sc 6 to quantify the uncertainty in the H₂ production cost by randomly sampling from the triangular distribution of these three parameters [47].

Figure 6a shows the cumulative probability of H_2 production cost with two economic parameters (feedstock cost and CO_2 capture cost) ranging from $\pm 10\%$ to $\pm 50\%$ for a fixed IRR of 10%. The range of $\pm 10\%$ results in an increase in the H_2 production cost from \$1.68/kg- H_2 to \$1.92/kg- H_2 , while a range of $\pm 50\%$ results in a larger change in H_2 production cost from \$1.22/kg- H_2 to \$2.40/kg- H_2 . This implies that the fluctuations in the H_2 production cost increase as the uncertainty of the two influential costs increases.

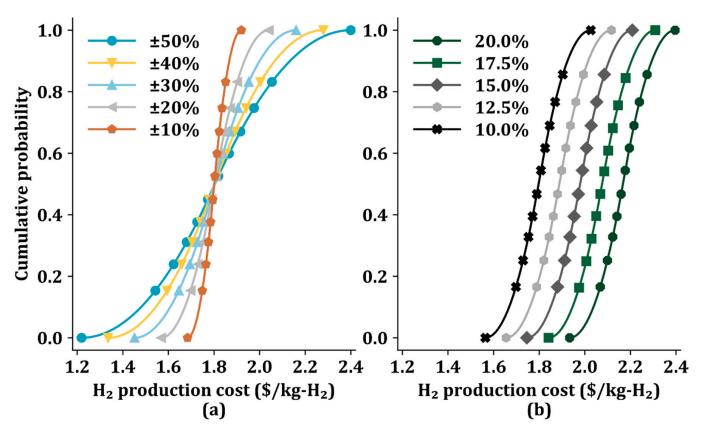


Figure 6. Cumulative probability of H_2 production cost in Sc 6 using the Monte Carlo method with (a) different influential economic parameters from $\pm 10\%$ to $\pm 50\%$ and a fixed internal rate of return of 10%, and (b) different internal rates of return from 10.0% to 20.0% and two key parameters (feedstock cost and CO_2 capture cost) of $\pm 20\%$.

The cumulative probability also varies with IRR difference (10.0–20.0%), as shown in Figure 6b. with the two key economic parameters (feedstock cost and CO_2 capture cost) of $\pm 20\%$. The cumulative probability curves indicate that as the IRR decreases, the probability of a low H_2 production cost increase. When the IRR is 20.0%, the H_2 production cost corresponding to a cumulative probability of 0.5 is \$ 2.17/kg- H_2 ; the lower bound (when the cumulative probability is 0) and the upper bound (when the cumulative probability is 1) are \$1.93/kg- H_2 and \$2.40/kg- H_2 , respectively.

The CO_2 capture cost and CO_2 selling price affect the H_2 production cost. Accordingly, we further study the attributes associated with CO_2 , including CO_2 capture rate and CO_2 emission allowances as well as CO_2 capture cost and CO_2 selling price, as shown in Figure 7. The white line is the production cost of the base case ($$1.80/kg-H_2$). The upper left and lower right regions of the white line indicate unfavorable and favorable economics, respectively.

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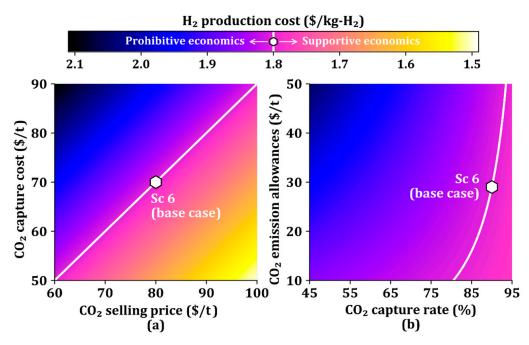


Figure 7. H_2 production cost as a function of (a) CO_2 capture cost and CO_2 selling price, and (b) CO_2 capture rate and CO_2 emission allowances.

Figure 7a shows the changes in the H_2 production cost against the changes in the CO_2 selling price and CO_2 capture cost. The H_2 production cost is determined by the ratio of CO_2 capture cost to CO_2 selling price, resulting in H_2 production costs represented by the values in the straight line. The low CO_2 selling price and high CO_2 capture cost cause a prohibitive region of the H_2 production cost, whereas the high CO_2 selling price and low CO_2 capture cost drive it into a favorable economic region.

Figure 7b shows the changes in the H_2 production cost against the changes in the CO_2 capture rate and CO_2 emission allowances. The white line in Figure 7b is not straight because of the small effect of CO_2 emission allowances on the H_2 production cost when the CO_2 capture rate is high and the large effect of CO_2 emission allowances on the H_2 production cost when the CO_2 capture rate is low. As can be seen in Figure 7a,b, the CO_2 selling price is a more dominant parameter in determining the H_2 production cost than the CO_2 emission allowances if the CO_2 capture is considered.

4. Conclusions

Steam methane reforming (SMR) is a well-developed technology for the mass production of hydrogen. So far, research on SMR has focused on increasing the reaction yield of individual processes. In this study, we proposed an economically optimal process configuration to improve the economics of the SMR process from a process perspective. To this end, six scenarios were developed with different design conditions of the number of water–gas shift (WGS) reactors, CO_2 capture, and CO_2 emissions and operating conditions of the pressure of the reformer and temperature of the WGS reactor. As a result, it was found that the optimal SMR process had the lowest H_2 production cost at \$1.80/kg- H_2 . With a hydrogen production capacity of 500 kg/d, the optimal process configuration and operating conditions were proposed: a pressure of 800 kPa in the reformer, temperature of 450 °C in one WGS reactor, and CO_2 capture and sales. It is also noted that the efficient utilization of CO_2 will enable the mass production of hydrogen as a potential energy carrier.

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Supplementary Materials: The following are available online at Available online: Available online: www.mdpi.com/xxx/s1 (accessed on 8 May 2012). (accessed on 8 May 2012)., Figure S1: Process flow diagram of steam methane reforming process in scenario 2, Figure S2: Process flow diagram of steam methane reforming process in scenario 3, Figure S3: Process flow diagram of steam methane reforming process in scenario 4, Table S1: Process stream information for scenario 1, Table S2: Process stream information for scenario 2, Table S3: Process stream information for scenario 3, Table S4: Process stream information for scenario 4, Table S5: Equipment cost in scenario 1, Table S6: Equipment cost in scenario 2, Table S7: Equipment cost in scenario 3, Table S8: Equipment cost in scenario 4, Table S9: Discounted cash flow for scenario 3, Table S10: Discounted cash flow for scenario 4, Table S13: Discounted cash flow for scenario 5, Table S14: Discounted cash flow for scenario 6.

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