# Techno-Economic Assessment of the impact of CO<sub>2</sub> Emissions Constraints on the Design of Hydrogen Production Systems<sup>#</sup>

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#### ABSTRACT

The impact of CO<sub>2</sub> emissions constraints on the optimum configuration of a hydrogen production system and the associated energy flows, material flows and cost was assessed; focusing on Japan as case of study. Two scenarios were considered: Base scenario, focusing on optimizing cost; and WEC+C scenario, focusing on optimizing simultaneously energy use, water use, CO<sub>2</sub> emissions and cost. Results show that all natural gas available is used to produce hydrogen using SMR for CO<sub>2</sub> intensities higher than  $11 \text{ kg-CO}_2/\text{kg-H}_2$  in both scenarios. As CO<sub>2</sub> intensity decreases, SMR is replaced with electrolysis using hydroelectricity. Levelized cost of hydrogen tends to increase as CO<sub>2</sub> intensity decreases, reaching 9.51 USD/kg-H<sub>2</sub> for a CO<sub>2</sub> intensity of 0 kg- $CO_2/kg-H_2$  in both scenarios.  $CO_2$  intensity affects energy and material flows. Reducing CO<sub>2</sub> intensity increases water use in the WEC+C scenario as SMR is replaced with electrolysis using hydroelectricity.

**Keywords:** Hydrogen, Hydrogen Production, Water-Energy-Carbon (WEC) Nexus, Levelized Cost of Hydrogen

#### NONMENCLATURE

Abbreviations	
CTG	Cradle to gate
SMR	Steam methane reforming
Symbols	
α	Hydrogen production share
С	Category for evaluation
Dmd	Annual hydrogen demand
j	Hydrogen production route
Max	Maximum value for the attribute
Min	Minimum value for the attribute
Prod	Annual hydrogen production
S	Score
w	Weighting factor
Ζ	Overall score

#### 1. INTRODUCTION

Adoption of hydrogen in the energy system at a large scale, as part of the strategies to achieve climate change targets, requires the production of hydrogen in different countries at the same scale as fossil fuels are produced today. These countries are likely to have different characteristics regarding availability of fossil fuels, renewable energy and water, ingredients required for the production of hydrogen, that will influence the routes selected for the production of hydrogen.

Hydrogen can be produced through a variety of routes such as coal gasification, steam methane reforming (SMR), methane pyrolysis and water electrolysis; with each route having different characteristics regarding energy use, water use, CO<sub>2</sub> emissions and cost.

Research regarding hydrogen production systems has focused primarily on minimizing costs and/or  $CO_2$ emissions [1,2]. Motivated by fresh water supply concerns associated with climate change [3] and increasing population [4,5], there has been a growing interest in developing solutions for the energy system that have low  $CO_2$  emissions and low water consumption. This has motivated researchers to consider the nexus between energy use, water use and  $CO_2$ emissions (WEC nexus) and cost in hydrogen production [4–6]. However, previous studies have not focused on the impact of  $CO_2$  emissions constraints on energy and material flows associated to hydrogen production.

The objective of this research is to assess the impact of  $CO_2$  emissions constraints on the optimum configuration of a hydrogen production system and the associated energy flows, material flows and cost. Japan was considered as a case of study. The rest of the paper is organized as follows: the formulation of the hydrogen production system model is presented in section 2;

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results and discussion are presented in section 3; and conclusions are presented in section 4.

#### HYDROGEN PRODUCTION SYSTEM MODEL 2.

### 2.1 Scope of the assessment

The energy system diagram is presented in Fig. 1. Hydrogen production was assessed on a cradle to gate (CTG) basis; including hydrogen production process, energy carrier production and feedstock production.

Hydrogen production using SMR and electrolysis was considered. SMR uses natural gas and water as feedstocks; and natural gas and grid electricity as energy carriers. Electrolysis uses water as feedstock; and electricity as energy carrier. Solar photovoltaic (PV), wind, geothermal, hydro and grid were considered as sources for electricity used in electrolysis.

# 2.2 Formulation of the optimization model

Linear programing was used to solve the allocation problem between energy carriers, feedstocks and energy conversion technologies to satisfy the hydrogen demand. The model was developed in GAMS and solved using the solver CPLEX. The complete formulation of the model can be found in [6]. A summarized description of the model is presented below.

The model estimates the optimum share of each hydrogen production route on hydrogen production on a one-year basis; optimizing simultaneously energy use, water use, CO<sub>2</sub> emissions and cost (Eqs. (1, 2)).

Similar to Acar and Dincer [7], a normalized indicator (Eq. (3)) is used to perform the simultaneous

optimization of the hydrogen production system in terms of energy use, water use, CO<sub>2</sub> emissions and cost. The normalized indicator represents how each hydrogen production route performs against the top performer in each category.

$$Z = \sum_{j} \sum_{c} \alpha_{j} S_{j,c} w_{c} \tag{1}$$

$$\alpha_j = \frac{Prod_j}{Dmd} \tag{2}$$

$$S_{j,c} = \frac{Max_c - Attribute_c}{Max_c - Min_c}$$
(3)

The objective function was solved under the following six constraints:

- 1) Non-negativity constraint
- 2) Hydrogen demand satisfaction
- Feedstock availability
- 4) Energy carrier availability
- 5) Feedstock-energycarrier-hydrogen production technology combinations that are not feasible are excluded.
- 6) CO<sub>2</sub> emissions constraint

# 2.3 Scenarios for hydrogen production in Japan

In 2020, Japan committed to achieve net zero greenhouse gas emissions by 2050. As part of the ongoing efforts to achieve this goal, the Japanese government set the target to increase hydrogen supply from 2 Mt-H<sub>2</sub>/year in 2020 to 3 Mt-H<sub>2</sub>/year by 2030 [8]. In 2020, hydrogen was mainly used as feedstock in industrial processes. The net 1 Mt-H<sub>2</sub>/year increase between 2020 and 2030 corresponds to hydrogen used



Fig. 1 Energy system diagram

as energy carrier; distributed as 0.8 Mt-H<sub>2</sub>/year to achieve 1% of electricity production by co-firing hydrogen or ammonia in thermal power plants, and 0.2 Mt-H<sub>2</sub>/year in the transportation sector [9]. In the same direction, the most recent 'Basic Hydrogen Strategy' released in June 2023 kept the 1% target for hydrogen and ammonia use in electricity generation, without specifying the target for hydrogen use in the transportation sector [10]. Focusing on hydrogen use as energy carrier in Japan in 2030, this research assumed a hydrogen demand of 1 Mt-H<sub>2</sub>/year.

Even though challenges associated with the WEC nexus are global, the characteristics vary depending on each country or region [4]. In the case of Japan, the country is water-rich and fossil fuel-poor. Nevertheless, there are concerns about future fresh water availability due to climate change [11].

Two scenarios were considered: Base scenario and WEC+C scenario. Priorities for hydrogen production system design in each scenario are shown in Table 1. The Base scenario represents the business-as-usual situation, where cost is optimized in the design of the hydrogen production system (weighting coefficient of 1.0 for cost and 0 for energy use, water use and CO<sub>2</sub> emissions). The WEC+C scenario focuses on achieving sustainable development by optimizing simultaneously energy use, water use and CO<sub>2</sub> emissions together with cost (weighting coefficient of 0.25 for energy use, water use, CO<sub>2</sub> emissions and cost).

# Table 1 Priorities for hydrogen production system design

	in each scenario								
	Cost	Energy	Water	Carbon					
Base									
WEC+C									

Only domestic resources were considered for hydrogen production, aiming to improve energy security.

The amount of available water was assumed equal to 10% of industrial water consumption, 1.11 Billion m<sup>3</sup>- $H_2O$ /year [12]; while the amount of natural gas available was assumed equal to 2.29 Mt-natural gas/year [13]. Feedstock costs were assumed equal to 0.203 USD/m<sup>3</sup>- $H_2O$  [14] and 0.437 USD/kg-natural gas [15] for water and natural gas, respectively.

Capital costs for SMR and electrolysis were assumed equal to 121 [16] and 800 USD/kW [17], respectively. Capital costs were annualized utilizing a discount rate of 10%. Service lives of 25 and 10 years were assumed for SMR and electrolysis, respectively. Operating and maintenance costs of 0.212 USD/kg-H<sub>2</sub> for SMR, and 0.150 USD/kg-H<sub>2</sub>, for electrolysis were used [16,18]. Main characteristics of hydrogen production routes are presented in Table 2.

 $CO_2$  emission factors for natural gas production and water production were assumed equal to 2.29 kg- $CO_2$ /kg-natural gas [19] and 0.453 kg- $CO_2$ /m<sup>3</sup>-H<sub>2</sub>O, respectively. Grid electricity generation emits 0.142 kg- $CO_2$ /MJ [20]; while  $CO_2$  emissions for renewable electricity are zero. Hydrogen production through SMR produces 8.34 kg- $CO_2$ /kg-H<sub>2</sub> [17]; while  $CO_2$  emissions for hydrogen production using electrolysis are zero.

# 2.4 Main assumptions and limitations

All calculations were performed on a one-year basis, using the Fiscal Year 2017 as base year. Water consumption associated with energy carrier production includes water evaporated and water transpired. Water consumption was limited to 'operational water consumption', excluding water embedded in equipment and materials used to fabricate energy conversion technologies and feedstock production technologies. Water purification to meet water purity requirements for electrolysis was not considered.

		SMR	Electrolysis				
			Grid	Wind	Solar PV	Geothermal	Hydro
Feedstock consumption	Water	9.09	15.5	15.5	15.5	15.5	15.5
[kg/kg-H <sub>2</sub> ]	Natural gas	2.0	-	-	-	-	-
Energy consumption	Natural gas	46.3	-	-	-	-	-
[MJ/kg-H <sub>2</sub> ]	Grid electricity	2.1	195	-	-	-	-
	Wind electricity	-	-	195	-	-	-
	Solar electricity	-	-	-	195	-	-
	Geothermal electricity	-	-	-	-	195	-
	Hydroelectricity	-	-	-	-	-	195
Capacity factor [-]		0.90	0.97	0.19	0.12	0.78	0.52
Electricity price [USD/GJ]		35.7	35.7	38.7	52.0	27.0	42.7

Table 2 Main characteristics of hydrogen production routes. Built using data from [13,16,17,21–25]

#### 3. RESULTS AND DISCUSSION

#### 3.1 Hydrogen production system configuration

The impact of  $CO_2$  emissions constraints on hydrogen production share is shown in Fig. 2. The x axis represents the constraint on  $CO_2$  emissions for hydrogen production expressed in terms of  $CO_2$  emissions per unit  $H_2$ produced, known as  $CO_2$  intensity. As values for  $CO_2$ intensity decrease from 18 to 0 kg- $CO_2$ /kg- $H_2$ , the enforcement of  $CO_2$  emissions constraints necessary to achieve net zero GHG emissions targets is represented.

All natural gas available is used in the production of hydrogen using SMR for  $CO_2$  intensities higher than 11 kg- $CO_2$ /kg- $H_2$  in both scenarios. Due to its high availability factor, grid electricity is selected in the Base scenario for  $CO_2$  intensities higher than 11 kg- $CO_2$ /kg- $H_2$ ; while in the WEC+C scenario electrolysis using hydroelectricity and wind electricity are used. Reducing the  $CO_2$  intensity under 11 kg- $CO_2$ /kg- $H_2$  replaces SMR with electrolysis using hydroelectricity in both scenarios.



Installed capacity is shown in Fig. 3. In both scenarios, installed capacity increases as CO<sub>2</sub> intensity

decreases from 18 to 0 kg-CO<sub>2</sub>/kg-H<sub>2</sub>, driven by penetration of electrolysis using renewable energy, which has lower availability factors and higher energy costs than SMR. The Japanese government targets installing 15 GW of electrolyzers by 2030 [10]. Producing hydrogen using electrolysis with hydro, geothermal and wind electricity makes possible to produce 1 Mt-H<sub>2</sub>/year with zero emissions by 2030 with an installed capacity for electrolyzers of 10 GW.



#### 3.2 Economic assessment

Levelized cost of hydrogen (LCOH) is presented in Fig. 4. In both scenarios, LCOH tends to increase as  $CO_2$  intensity decreases. In the Base scenario, the increase is moderate for  $CO_2$  intensities between 18 and 11 kg- $CO_2/kg-H_2$ ; and becomes steeper for lower  $CO_2$  intensities. In the WEC+C scenario, LCOH remains constant for  $CO_2$  intensities between 18 and 11 kg- $CO_2/kg-H_2$ ; and decreases following a trend similar to the Base scenario for lower  $CO_2$  intensities. Energy costs accounts for the largest share of LCOH in both scenarios, followed by capital costs. The share of energy costs in LCOH increases as  $CO_2$  intensity decreases in both scenarios; reaching 87 and 85% for zero emissions hydrogen in the Base scenario and WEC+C scenario, respectively.



### 3.3 Energy and material flows

CO<sub>2</sub> emissions constraints will affect energy and material flows associated with hydrogen production. For example, energy and material flows for hydrogen

production on a CTG basis for the WEC+C scenario for CO<sub>2</sub> intensities of 18 and 0 kg-CO<sub>2</sub>/kg-H<sub>2</sub> are presented in Figs. 5 and 6, respectively. CO<sub>2</sub> intensity reduction causes the shift from SMR to electrolysis using hydroelectricity. This causes a significant increase in water consumption, explained by evaporation losses in dams associated with hydroelectricity generation. In addition, energy consumption increases, due to higher specific energy consumption for electrolysis compared with SMR and energy consumption for energy carrier production for hydroelectricity compared with natural gas.

# 4. CONCLUSIONS

In this research a linear programming model that optimizes simultaneously energy use, water use,  $CO_2$  emissions and cost was used to estimate the optimum configuration of a hydrogen production system and the associated energy flows, material flows and cost. Main conclusions are presented below:

 All natural gas available is utilized to produce hydrogen using SMR for CO<sub>2</sub> intensities higher than 11 kg-CO<sub>2</sub>/kg-H<sub>2</sub> in the Base scenario and WEC+C scenario. As CO<sub>2</sub> intensity decreases,



Fig. 5 Energy and material flows in the system for the WEC+C scenario for CO<sub>2</sub> intensity of 18 kg-CO<sub>2</sub>/kg-H<sub>2</sub>



Fig. 6 Energy and material flows in the system for the WEC+C scenario for CO<sub>2</sub> intensity of 0 kg-CO<sub>2</sub>/kg-H<sub>2</sub>

SMR is replaced by electrolysis using hydroelectricity.

- LCOH tends to increase as CO<sub>2</sub> intensity increases in the Base scenario and WEC+C scenario. LCOH increase becomes steeper for CO<sub>2</sub> intensities lower than 11 kg-CO<sub>2</sub>/kg-H<sub>2</sub>.
- Reduction of CO<sub>2</sub> intensity affects energy and material flows associated with hydrogen production. In the WEC+C scenario, reducing CO<sub>2</sub> intensity causes an increase of water use, mainly associated to hydroelectricity production.

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# REFERENCES

 Caglayan DG, Heinrichs HU, Robinius M, Stolten D. Robust design of a future 100% renewable european energy supply system with hydrogen infrastructure. Int J Hydrogen Energy 2021;46:29376–90.

- [2] Weimann L, Gabrielli P, Boldrini A, Kramer GJ, Gazzani M. Optimal hydrogen production in a wind-dominated zero-emission energy system. Adv Appl Energy 2021;3:100032.
- [3] Elaouzy Y, El Fadar A. Water-energy-carbon-cost nexus in hydrogen production, storage, transportation and utilization. Int J Hydrogen Energy 2024;53:1190–209.
- [4] Jolaoso LA, Asadi J, Duan C, Kazempoor P. A novel green hydrogen production using water-energy nexus framework. Energy Convers Manag 2023;276:116344.
- [5] Bamisile O, Cai D, Adun H, Taiwo M, Li J, Hu Y, et al. Geothermal energy prospect for decarbonization, EWF nexus and energy poverty mitigation in East Africa; the role of hydrogen production. Energy Strateg Rev 2023;49:101157.
- [6] González Palencia JC, Itoi Y, Araki M. Design of a Hydrogen Production System Considering Energy Consumption, Water Consumption, CO2 Emissions and Cost. Energies 2022;15:7938.
- [7] Acar C, Dincer I. Review and evaluation of hydrogen production options for better

environment. J Clean Prod 2019;218:835-49.

- [8] METI. The Sixth Strategic Energy Plan (Outline). Ministry of Economy, Trade and Industry. [online] available at: https://www.enecho.meti.go.jp/en/ category/others/basic\_plan/. Last accessed in June 2024.
- [9] Renewable Energy Institute. Re-examining Japan's Hydrogen Strategy: Moving Beyond the "Hydrogen Society" Fantasy. Tokyo, Japan: [online] available at: https://www.renewableei.org/pdfdownload/activities/REI\_JapanHydrog enStrategy\_EN\_202209.pdf. Last accessed in June 2024.
- [10] METI. Basic Hydrogen Strategy (in Japanese). Ministry of Economy, Trade and Industry. [online] available at: https://www.meti.go.jp/shingikai/ enecho/shoene\_shinene/suiso\_seisaku/2023060 6\_report.html. Last accessed in June 2024.
- [11] Ohba M, Arai R, Sato T, Imamura M, Toyoda Y. Projected future changes in water availability and dry spells in Japan: Dynamic and thermodynamic climate impacts. Weather Clim Extrem 2022;38:100523.
- [12] MLIT. Utilization of Water Resources (in Japanese). Ministry of Land, Infrastructure,Transport and Tourism. [online] available at: http://www.mlit.go.jp/mizukokudo/ mizsei/mizukokudo\_mizsei\_tk2\_000014.html. Last accessed in April 2022.
- [13] METI. Annual Energy Report 2018 (Energy Whitepaper 2018) (in Japanese). Ministry of Economy, Trade and Industry. [online] available at: https://www.enecho.meti.go.jp/about/white paper/2019pdf/. Last accessed in November 2023.
- [14] METI. Overview of Industrial Water Supply Business (in Japanese). Ministry of Economy, Trade and Industry. [online] available at: http://warp.da.ndl.go.jp/info:ndljp/pid/1118129 4/www.meti.go.jp/shingikai/sankoshin/chiiki\_kei zai/kogyoyo\_suido/pdf/004\_s01\_00.pdf. Last accessed in November 2023.
- [15] EDMC I. EDMC Handbook of energy & economic statistics 2023 (in Japanese). Tokyo, Japan: The Energy Data and Modelling Center, The Institute of Energy Economic, Japan; The Energy Conservation Center; 2023.
- [16] Nikolaidis P, Poullikkas A. A comparative overview of hydrogen production processes. Renew Sustain Energy Rev 2017;67:597–611.
- [17] Parkinson B, Tabatabaei M, Upham DC, Ballinger

B, Greig C, Smart S, et al. Hydrogen production using methane: Techno-economics of decarbonizing fuels and chemicals. Int J Hydrogen Energy 2018;43:2540–55.

- [18] Samsatli S, Samsatli NJ. A multi-objective MILP model for the design and operation of future integrated multi-vector energy networks capturing detailed spatio-temporal dependencies. Appl Energy 2018;220:893–920.
- [19] Ruth M, Laffen M, Timbario TA. Hydrogen Pathways: Cost, Well-to-Wheels Energy Use, and Emissions for the Current Technology Status of Seven Hydrogen Production, DElivery and Distribution Scenarios. National Renewable Energy Laboratory. [online] available at: https://www.nrel.gov/docs/fy10osti/46612.pdf. Last accessed in November 2023.
- [20] METI. FY2017 Energy Supply and Demand Report (Revised Report). Ministry of Economy, Trade and Industry. [online] available at: https://www.meti.go.jp/english/press/2019/041 2\_004.html. Last accessed in August 2022.
- [21] METI. Significance of Introducing Renewable Energy and Characteristics of Each Source (in Japanese). Ministry of Economy, Trade and Industry. [online] available at: https://www.enecho.meti.go.jp/committee/cou ncil/basic\_policy\_subcommittee/mitoshi/004/pd f/004\_05.pdf. Last accessed in May 2022.
- [22] NEDO. Chapter 2 Solar Power Generation. NEDO Renew. Energy Technol. White Pap. (in Japanese), New Energy and Industrial Technology Development Organization. [online] available at: https://www.nedo.go.jp/content/100544817.pd f. Last accessed in November 2023.
- [23] NEDO. Chapter 3 Wind Power Generation. NEDO Renew. Energy Technol. White Pap. (in Japanese), New Energy and Industrial Technology Development Organization. [online] available at: https://www.nedo.go.jp/content/100544818.pd f. Last accessed in November 2023.
- [24] Zarrouk SJ, Moon H. Efficiency of geothermal power plants: A worldwide review. Geothermics 2014;51:142–53.
- [25] METI. Power cost verification report of the longterm energy supply and demand subcommittee (in Japanese). Ministry of Economy, Trade and Industry. [online] available at: http:// www.enecho.meti.go.jp/committee/council/basi c\_policy\_subcommittee/mitoshi/cost\_wg/007/p df/007\_05.pdf. Last accessed in November 2023.