



# Long-term Cost Optimization of a Low-carbon Hydrogen Network for Industrial Decarbonization

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# Agenda

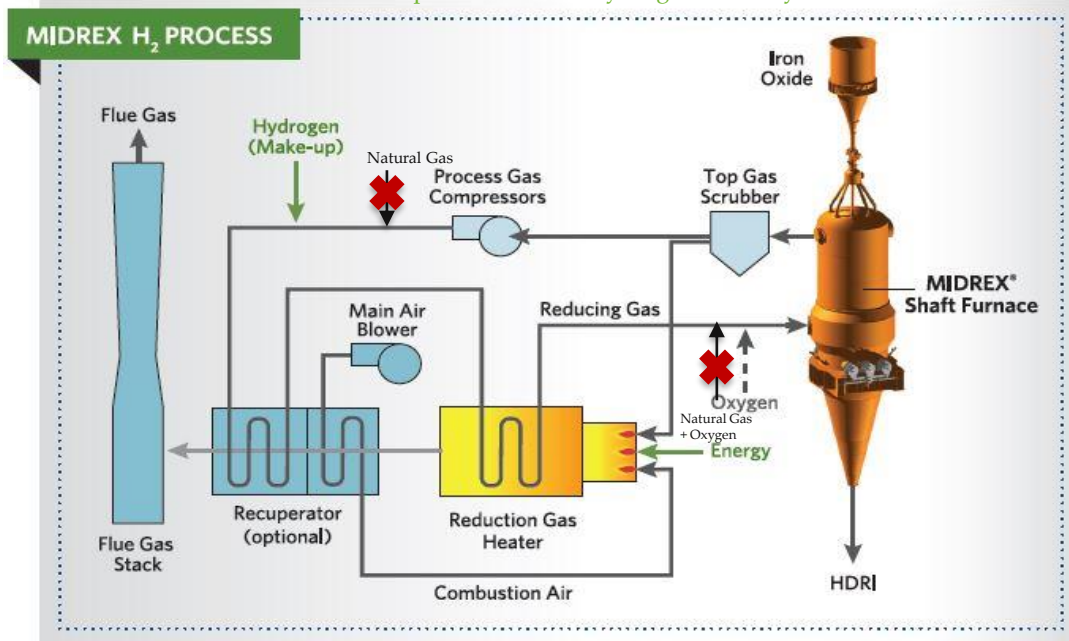
- Introduction
- Research Gap and Objectives
- Methodology
- Case Study
- Results
- Conclusion

# Introduction

## Role of hydrogen in transition pathways

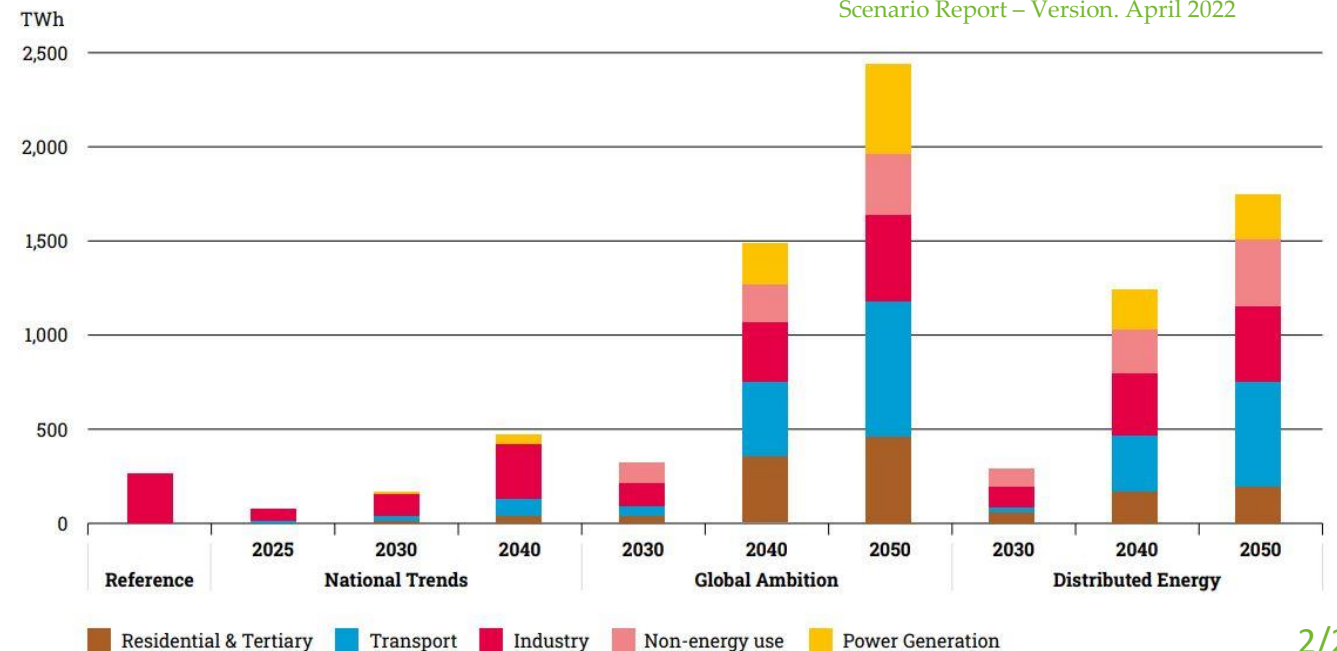
- ❑ **Electrification** → the most efficient way : **residential, commercial, transport, and some industries**
- ❑ Mixed decarbonization routes for a full cross-sector green transition → **clean molecules**
  - **Industry:** Fossil fuel-based feedstocks in the hard-to-abate industries
  - **Transport:** long-distance transport routes (heavy-duty trucks, shipping, aviation)
  - **Power sector:** long-term/short flexibility in the power system with a high share of renewables

Source: MIDREX H2, Ultimate low CO2 ironmaking and its place in the new hydrogen economy



Hydrogen demand per sector for EU 27

Source: ENTSO-E // ENTSOG TYNDP 2022 Scenario Report – Version. April 2022

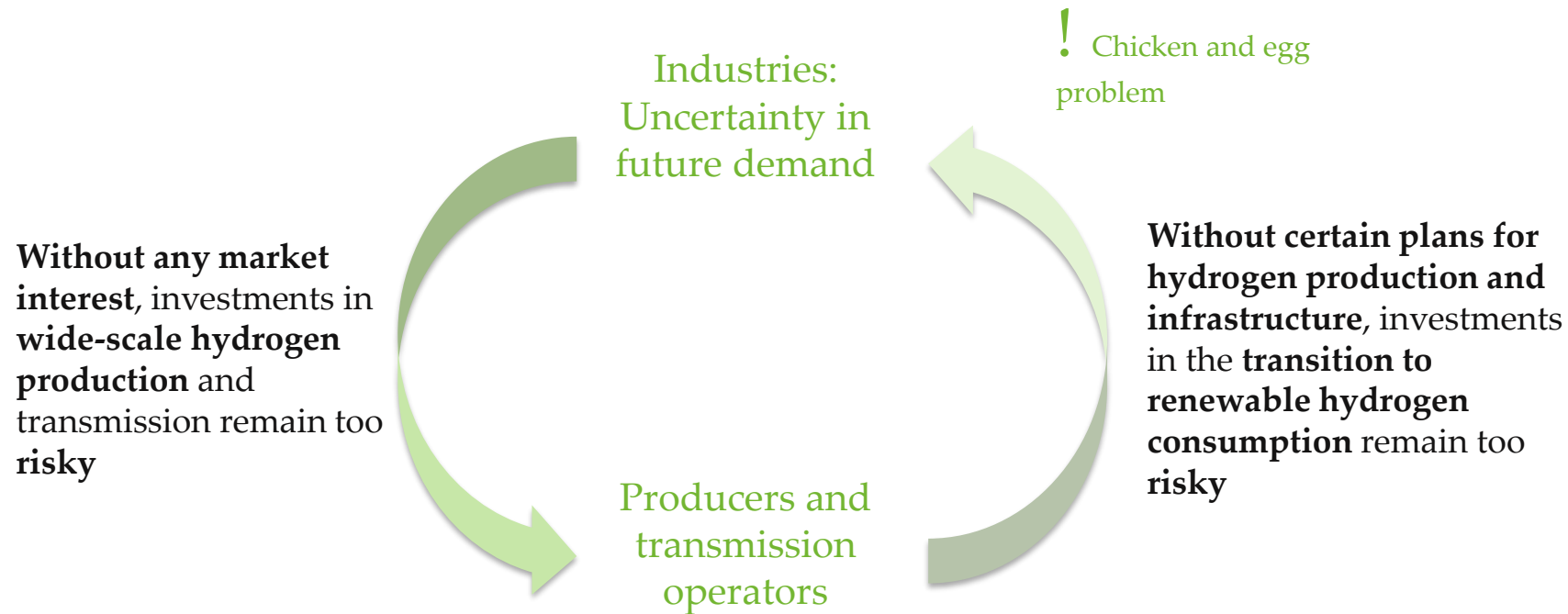


# Introduction

## Uncertainty in the future hydrogen market



Regulatory Framework and Policy Mechanism: lack of value recognition



Detailed national scenario analyses on the future hydrogen supply chain from the required production and **transport capacities** to the final demand estimations

# Research Gap and Objectives

## Research gaps:

- ❑ Most of the studies → **the role of hydrogen in the energy sector (transport, heat, electricity)**
- ❑ Rare attempts at **industrial decarbonization** following a detailed high **spatial resolution network optimization** model
- ❑ Different **supply scenarios** for the **production and imports of low-carbon hydrogen (derivatives)** are still missing

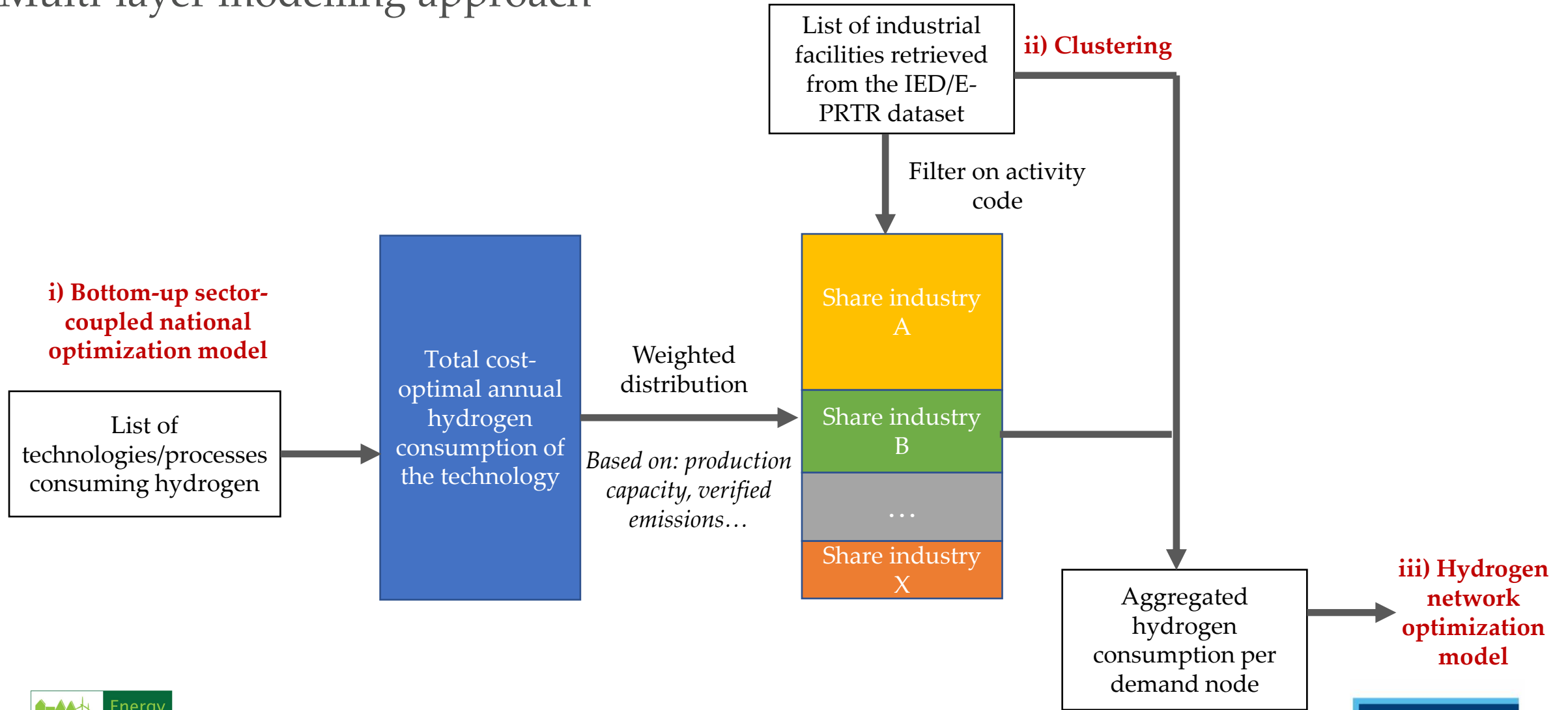
## Objective:

Developing a multi-layer modeling methodology for:

- i. **Future hydrogen demand estimation of industrial facilities**
- ii. **Geospatial analysis for grouping industries in different demand nodes**
- iii. **Cost-optimal sizing of the required future hydrogen network** following the national gas TSOs' topology

# Methodology

## Multi-layer modelling approach

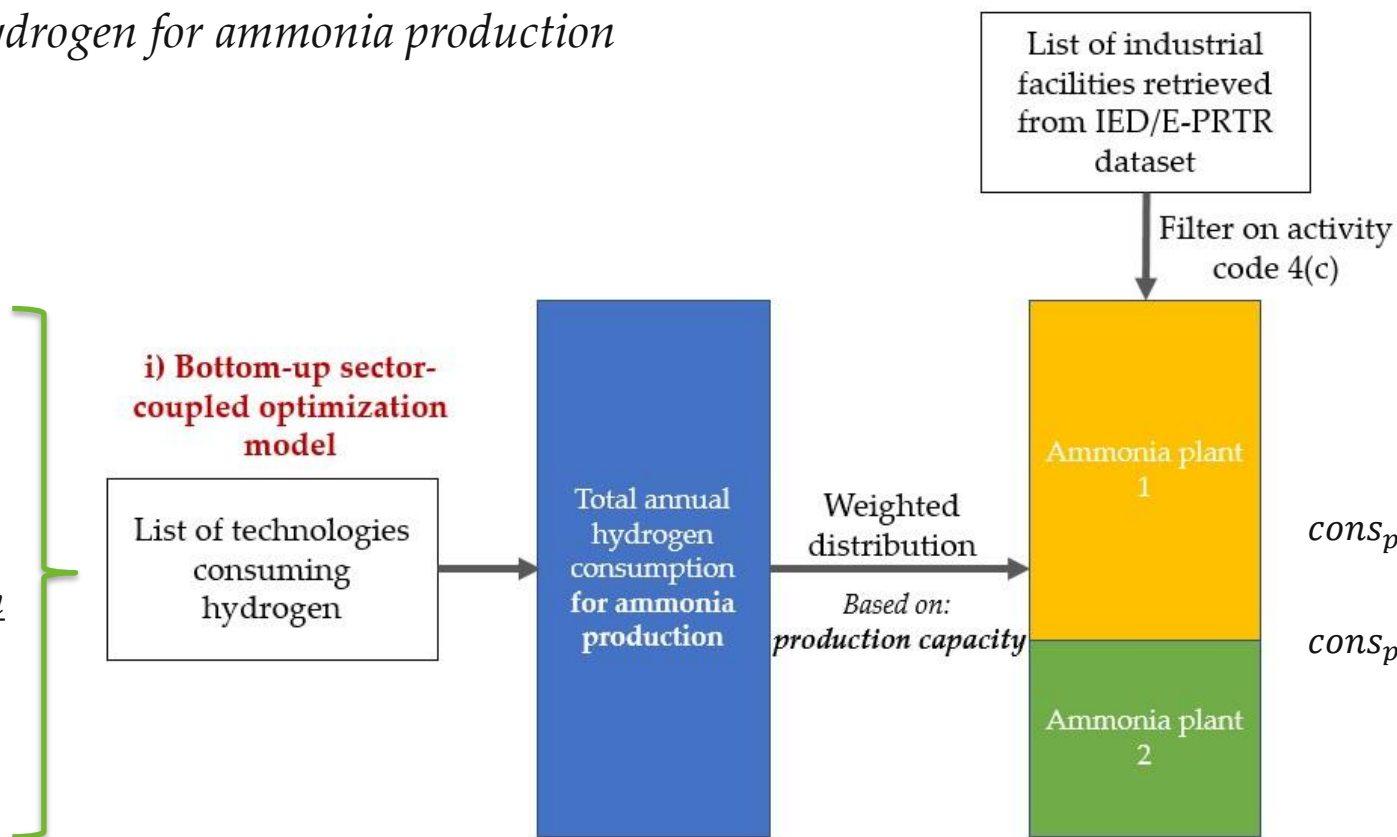


# Methodology

## Layer 1: demand estimation per industrial facility

Example: hydrogen for ammonia production

- Steel
- Glass
- Ammonia (Haber Bosh process)
- Cement & lime
- ...



*All facilities producing nitrogen-based fertilizers*

*~ activity code 4(c) :*

Chemical installations for the production on an industrial scale of basic organic chemicals or fertilizers

$$CONS_{plant1} = \left( \frac{x}{x+y} \right) \times CONSHaberbosh$$

$$CONS_{plant2} = \left( \frac{y}{x+y} \right) \times CONSHaberbosh$$

*Ammonia plant 1 – x kton/y*

*Ammonia plant 2 – y kton/y*



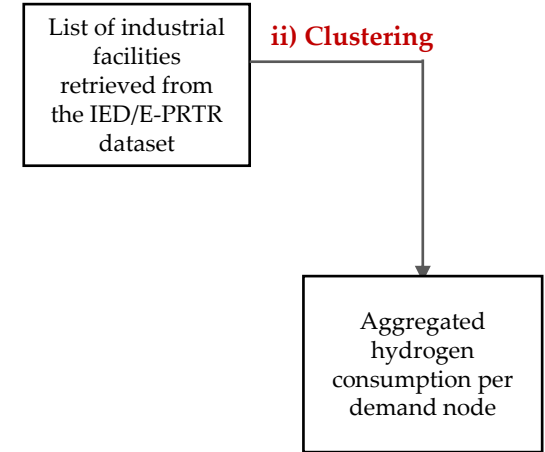
# Methodology

## Layer 2: clustering algorithm

List of facilities with details on annual hydrogen consumption, based on production capacity



How to group these facilities into larger demand zones for the hydrogen grid?



### Solution

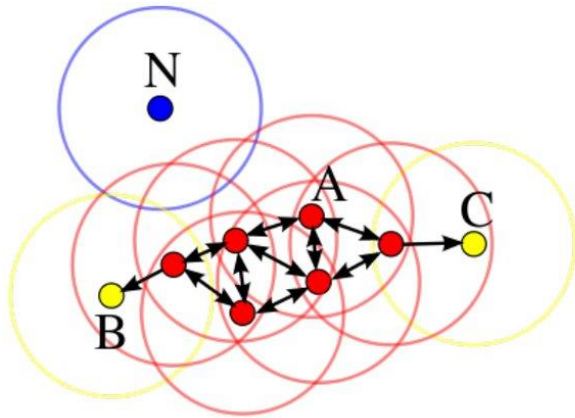
#### Density Based Spatial Clustering of Applications with Noise

- ✓ Identify areas of high density
- ✓ Distinguish clustered from noise points
- ✓ 2 degrees of freedom, epsilon (an upper limit to the distance between two neighboring nodes), and #nodes (min number of nodes)

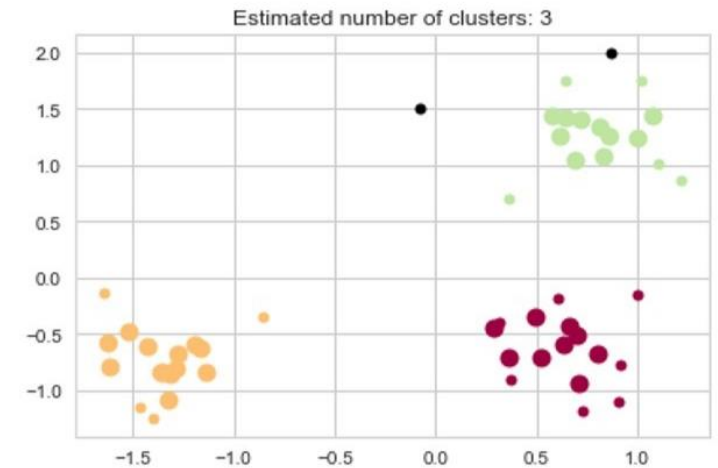
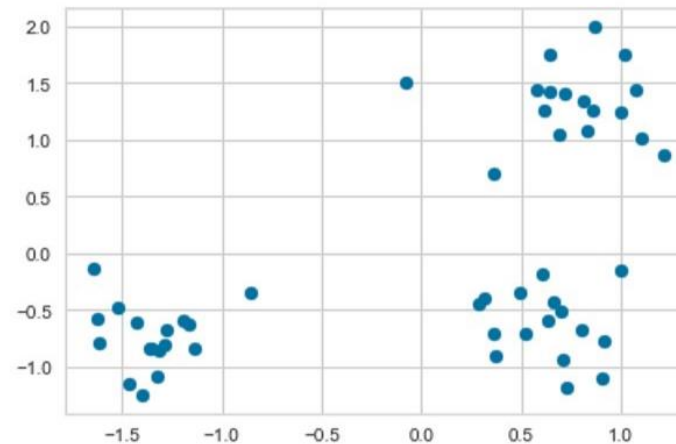


List of demand clusters

- Center of the cluster used as a grid node
- Total hydrogen consumption per cluster instead of per facility



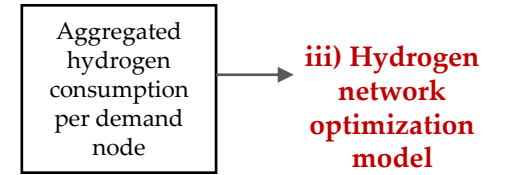
Source: DBSCAN - Wikipedia





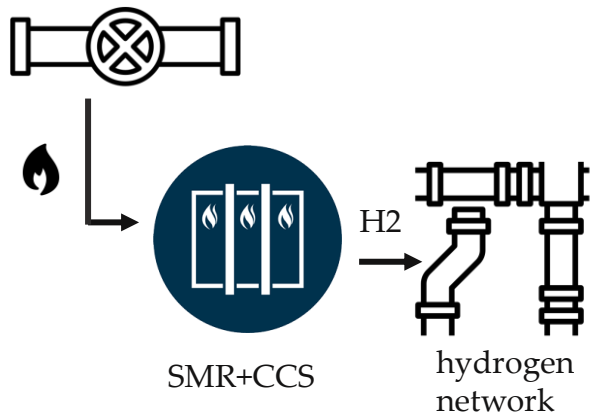
# Methodology

## Layer 3: hydrogen network optimization model

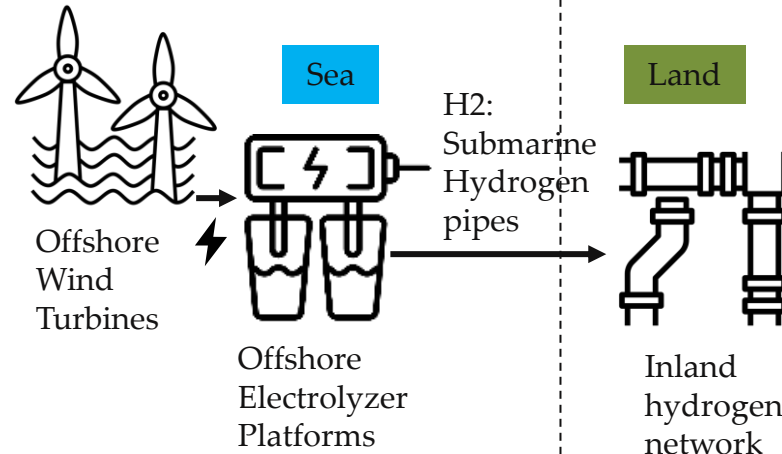


### Different low-carbon/green hydrogen production scenarios

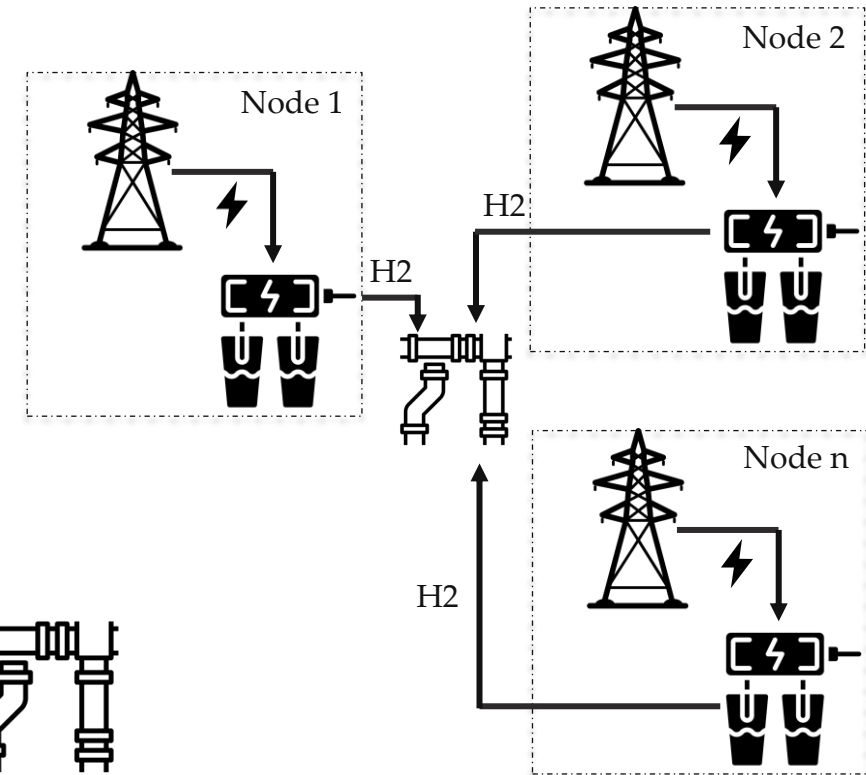
#### I. Blue hydrogen scenario



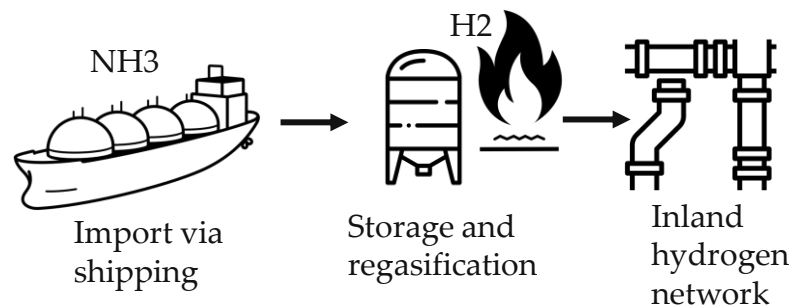
#### II. Offshore scenario



#### II. Decentral inland scenario



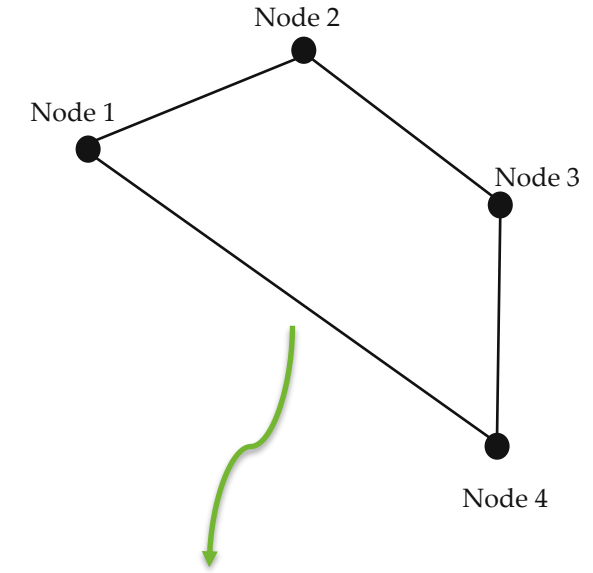
Possibility of **importing hydrogen derivatives** in all the scenarios from overseas and **reconverting** to pure gaseous hydrogen



# Methodology

## Layer 3: hydrogen network optimization model

- High spatial resolution following a nodal approach
  - Demand nodes → resulted from the clustering algorithm
  - Supply nodes → depending on the given scenarios
    - Offshore zones
    - Coastal regions: interconnector between offshore zones and inland zones
    - Terminals: import zones for hydrogen derivatives
    - Interconnection with neighboring regions/countries
    - Industrial zones with steam methane reforming capacities
- High temporal hourly resolution
- Multi-year investment periods



A connection among each pair of regions can be chosen and installed from the given candidate pipe (for e.g., DN500, DN900, DN1200):

CP1:  $C_1$  GW capacity

CP2:  $C_2$  GW capacity

...

CP3:  $C_n$  GW capacity

A binary variable is defined for each candidate pipe

# Methodology

## Layer 3: hydrogen network optimization model

What do we minimize/maximize in this model?

Objective function:

$$Cost^{tot} = \boxed{Cost^{prod}} + Cost^{imp} + Cost^{trans}$$

- Production cost components depend on the scenario

I. Blue hydrogen scenario

$$Cost^{prod} = \sum_{y \in Y} \left( (1 + D_y)^{-y} \cdot \underbrace{\sum_{s \in S} C_{s,y} \cdot cap_{s,y}^{new} + F_{s,y} \cdot cap_{s,y}^{tot}}_{\text{CAPEX and OPEX SMR+CCS}} + \underbrace{\sum_{t \in T} \sum_{e \in E} P_{gas,t,y}^{da} \cdot cons_{s,t,y}^{gas}}_{\text{Variable cost for gas consumption}} \right)$$

II. Offshore scenario

$$Cost^{prod} = \sum_{y \in Y} \left( (1 + D_y)^{-y} \cdot \left( \underbrace{C_{w,y} \cdot cap_{w,y}^{new} + F_{w,y} \cdot cap_{w,y}^{tot}}_{\text{Costs of offshore wind turbine}} + \underbrace{C_{ofe,y} \cdot cap_{ofe,y}^{new} + F_{ofe,y} \cdot cap_{ofe,y}^{tot} + V_{ofe,y} \cdot p_{ofe}^{H2}}_{\text{Costs of offshore Electrolyzer}} \right) \right)$$

III. Decentral inland scenario

$$Cost^{prod} = \sum_{y \in Y} \left( (1 + D_y)^{-y} \cdot \left( \underbrace{\sum_{e \in IE} C_{ie,y} \cdot cap_{ie,y}^{new} + F_{ie,y} \cdot cap_{ie,y}^{tot}}_{\text{CAPEX and OPEX of inland Electrolyzer}} + \underbrace{\sum_{t \in T} \sum_{e \in IE} P_{elec,t,y}^{da} \cdot cons_{ie,t,y}^{elec}}_{\text{Variable cost of electricity purchase in the day-ahead electricity market}} \right) \right)$$

# Methodology

## Layer 3: hydrogen network optimization model

What do we minimize/maximize in this model?

Objective function:

$$Cost^{tot} = Cost^{prod} + \boxed{Cost^{imp}} + \boxed{Cost^{trans}}$$

$$Cost^{imp} = \sum_{y \in Y} \left( (1 + D_y)^{-y} \cdot \sum_{y \in Y} \left( \sum_{n \in N^{imp}} \left( \sum_{t \in T} \underbrace{(p_{a,t,y}^{imp} \cdot imp_{t,y}^a)}_{\text{Import price}} + \underbrace{C_{conv,y} \cdot cap_{conv,y}^{new} + F_{conv,y} \cdot cap_{conv,y}^{tot}}_{\text{CAPEX and OPEX ammonia tank and regasification}} \right) \right) \right)$$

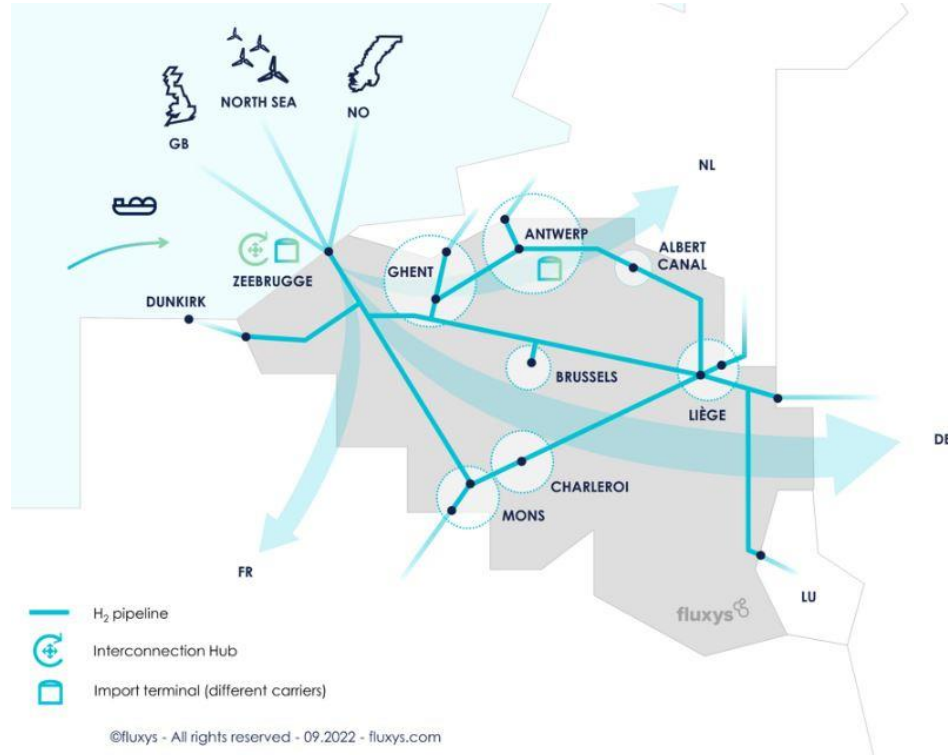
$$Cost^{trans} = \sum_{y \in Y} \left( (1 + D_y)^{-y} \cdot \sum_{(n,\hat{n}) \in P} \sum_{cp \in CP} \left( \underbrace{(C_{cp,y} + C_{cp,y}^{comp}) \cdot z_{n,\hat{n},cp,y} \cdot L_{n,\hat{n}}}_{\text{CAPEX pipelines and compressor stations}} + \underbrace{(F_{cp,y} + F_{cp,y}^{comp}) \cdot \sum_{y_k=y_0}^y z_{n,\hat{n},cp,y_k} \cdot L_{n,\hat{n}}}_{\text{OPEX pipelines and compressor stations (including the electricity price)}} \right) \right)$$

Compressor investment and operational cost are calculated based on the required compression capacity per km of the hydrogen pipeline

# Case Study

## Fluxys roadmap

### Belgium – Fluxys (2040)



Source: [Hydrogen: Preparing to build the network \(fluxys.com\)](https://www.fluxys.com/en/hydrogen-preparing-to-build-the-network)

A hydrogen infrastructure proposal by the gas TSO based on the **identification of potential industrial demand and supply clusters and their market interest**

No analysis and quantitative information on:

- Required **hydrogen volumes per each cluster**
- Required **pipeline capacities** among each pair of industrial zone considering **different supply scenarios**

**Input to our model: boundary condition** in terms of **potential connections** among regions within Belgium

✗ The interconnection and potential trade with neighboring countries

# Case Study

## Demand estimation: TIMES – BE model

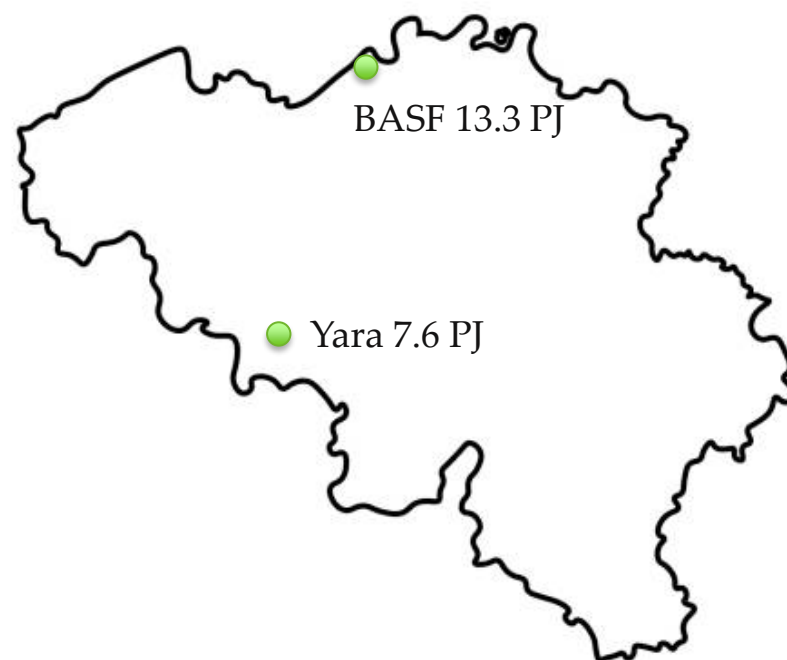
*Example: hydrogen for ammonia production*

2 ammonia production plants in Belgium (~ E-PRTR database):

- Yara Tertre, 400 kton/year (36%)
- BASF Antwerp, 700 kton/year (64%)

Total annual hydrogen consumption from TIMES BE model for ammonia production (Haber boch process): 20.9 PJ

- Yara Tertre, 7.6 PJ (36%)
- BASF Antwerp, 13.3 PJ (64%)

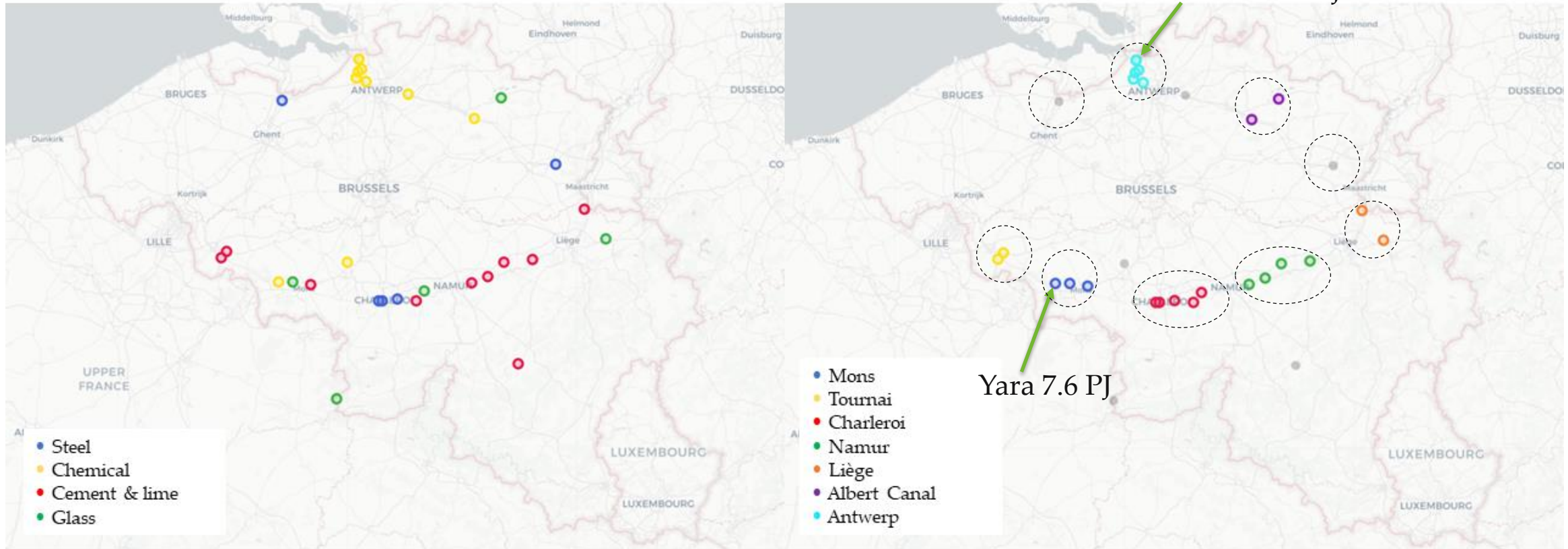




# Case Study

## Clustering application (Demand nodes)

All industrial activities are assumed to stay in Belgium



Ghent: ArcelorMittal

Genk: Aperam Stainless Belgium



# Case Study

## Network optimization (Supply nodes and pipelines)

Blue hydrogen → Antwerp and Ghent (existing SMR capacities)

Offshore → Princess Elisabeth Zone connected to Zeebrugge (45 km)

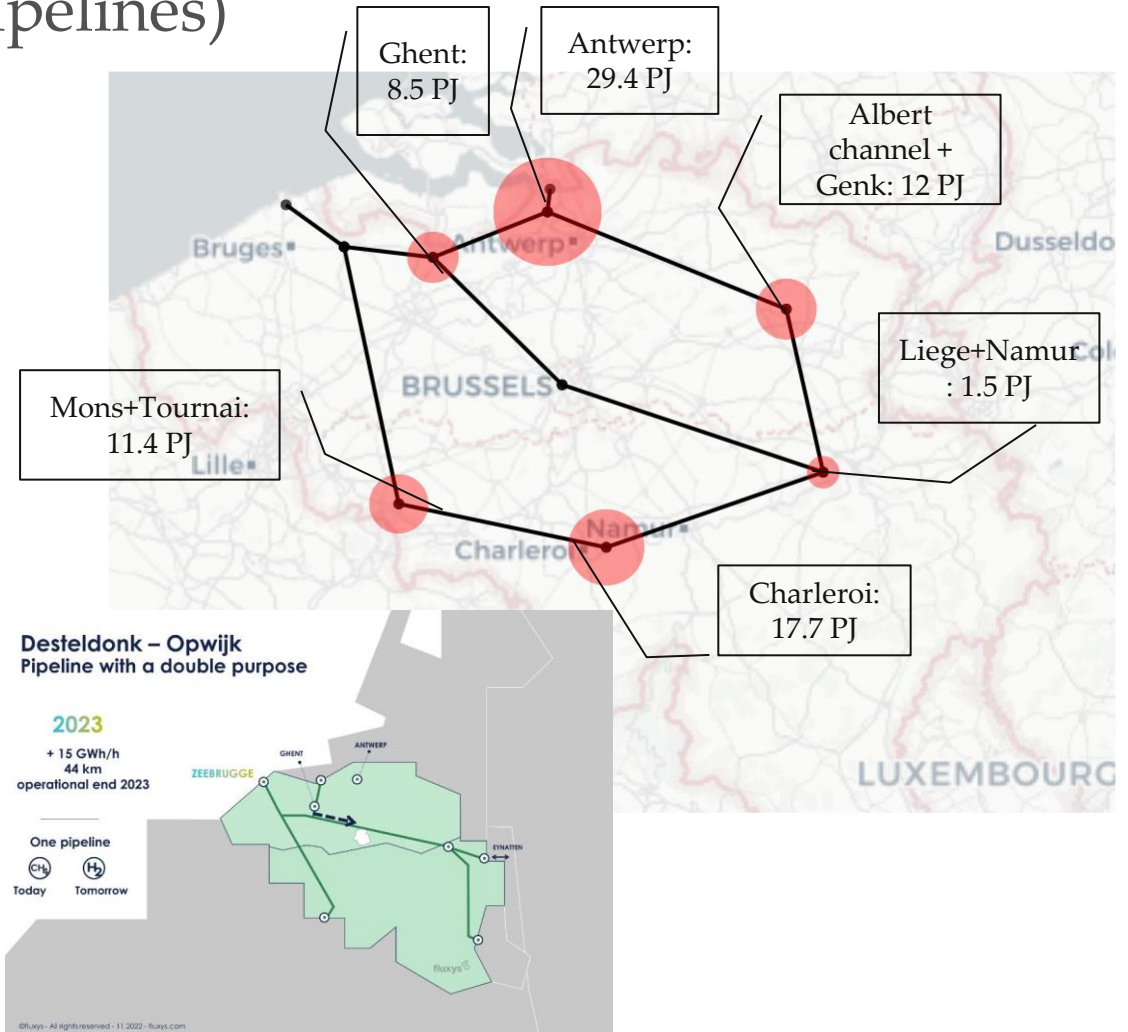
Decentral inland → electrolysis capacities are located in demand clusters themselves

✗ Belgium as a transit country to Germany

Assumptions:

Most of the pipes → newly installed

Candidate pipes and compressors	Construction	CAPEX (M€/km)	OPEX (% CAPEX)
Pipe DN500	New	2.5	0.9
	Repurposed	0.25	0.9
Pipe DN900	New	2.75	0.9
	Repurposed	0.5	0.9
Compressor DN500	New	0.09	1.7
	Repurposed	0.09	1.7
Compressor DN900	New	0.32	1.7
	Repurposed	0.14	1.7



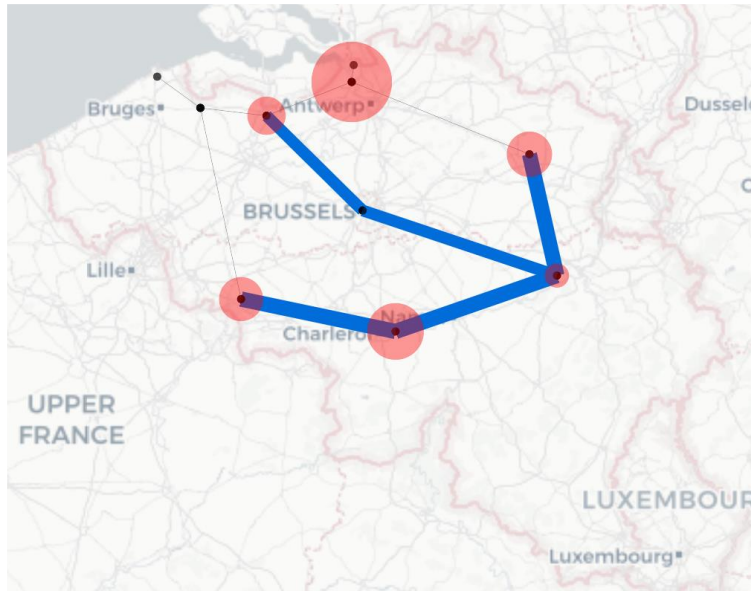
Source: [Fluxys increases transmission capacity with the second Desteldonk-Opwijk pipeline and takes a first step in realizing hydrogen ambitions](#)



# Results

## Future hydrogen backbone in each scenario

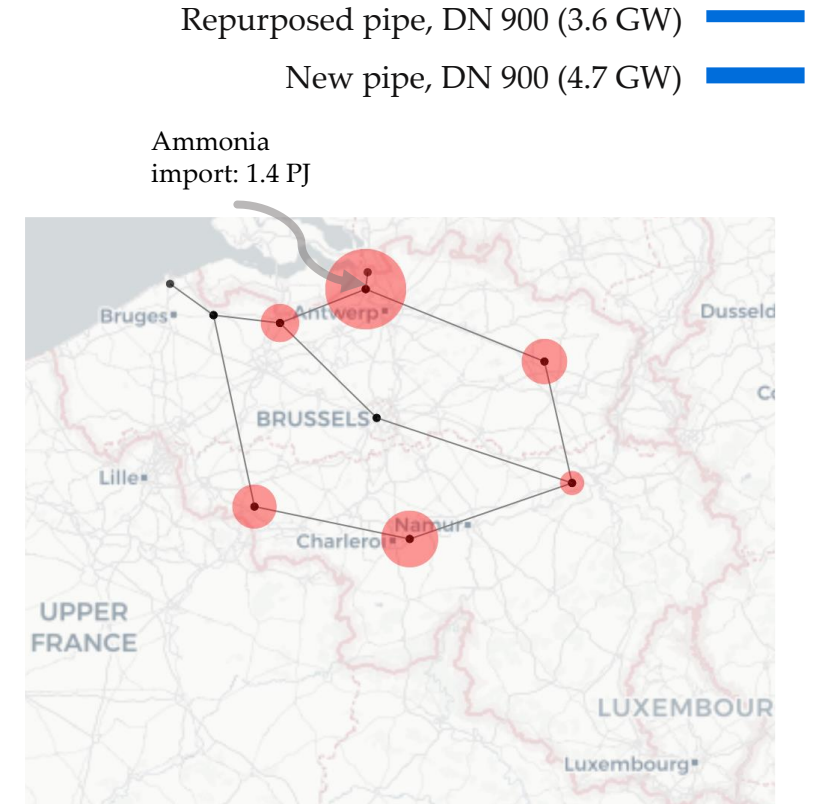
Ammonia import limited to 50% of the demand



I. Blue hydrogen scenario



II. Offshore scenario



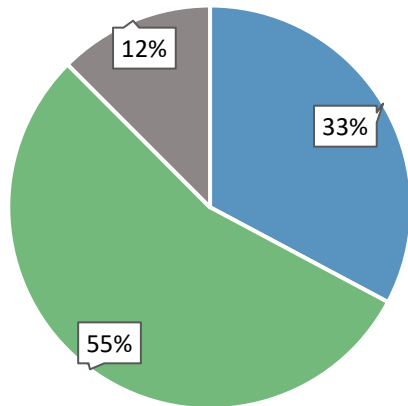
II. Decentral inland scenario

Total electricity in decentral scenario consumption: 30.6 TWh  
Total renewable electricity produced in 2021: 25 TWh

# Results

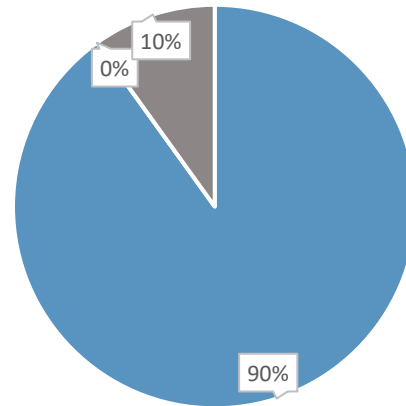
The total cost of hydrogen production and transport in each scenario  
*(considering costs for the whole model time horizon including the salvage values)*

Offshore scenario



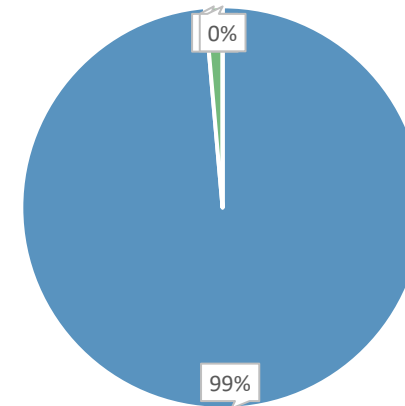
Total cost ~ 1.72 bn EUR-2025

Blue hydrogen scenario



Total cost ~ 1.67 bn EUR-2025

Decentral inland scenario



Total cost ~ 1.72 EUR-2025

- Hydrogen production
- Ammonia import and reconversion
- Hydrogen network

Offshore scenario:

- 1) network-intensive scenario
- 2) Import-intensive scenario (green block is mostly due to regasification and storage)



# Conclusions

- Regionalization methods → high spatial demand estimation (after a system-level net zero perspective) → hydrogen network analyses
- Belgian case: DBSCAN clustering algorithm verifies the gas TSO's proposal for industrial hydrogen demand clusters (identifying areas with a high density of facilities)
- Belgian case: the cost-optimal configuration of the future hydrogen network varies based on different supply scenarios
- Offshore scenario → the most network-intensive scenario and slightly higher (total production, import and transport cost)
- Belgian case: longer refurbished pipeline trajectories are more cost-optimal than shorter newly installed pipe segments (Ghent – Liege vs Antwerp – Albert Channel)
- Belgian case: no hydrogen network investments in the decentral scenario with very high additional electricity demand → can the future grid cope with this additional demand?

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Thank you!

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## Back-Up Slides



# Network Optimization Model

## Input parameters and assumptions

Technology	Investment (M€/GW)		Fixed O&M (M€/GWa)		Variable O&M (M€/GWh)		Lifetime (y)		Conversion efficiency (%)		Availability factor (%)	
	2025	2040	2025	2040	2025	2040	2025	2040	2025	2040	2025	2040
SMR + CCS	1613	1413	50	50	-	-	20	20	69	69	90	90
Ammonia reconversion + storage	3150	3150	72.6	72.6	-	-	30	30	84	84	92	92
Offshore wind	1875	1625	72.5	57	-	-	30	30	-	-	Time series 1	Time series
Offshore electrolyzer + platform	870	670	32	23	0.0022	0.002	20	20	69	72	96	96
Inland electrolyzer	653	463	9.8	6.7	-	-	20	20	69	72	96	96

1. The hourly time series for offshore wind → renewable ninja considering a hub height of 80 m
2. The variable cost of offshore electrolyzer → water desalination process

# TIMES – BE Processes

TIMES technology	Main activity	Main activity code
Steel - Hydrogen DRI source for H2 shaft	Metal ore (including sulphide ore) roasting or sintering installations	2(a)
Steel - Blast Furnace with Hydrogen injection	Installations for the production of pig iron or steel (primary or secondary melting) including continuous casting	2(b)
Steel - Finishing Heat_Hydrogen (H2)		
Ammonia - Haber Bosh Process (Refurbished)	Chemical installations for the production on an industrial scale of basic organic chemicals OR fertilizers	4(a)(i), 4(c)
Ammonia - Harber Bosh Process (BY)		
Chemical: HVC - Methanol Syntesis (New)	NA	NA
ICH – Other Chemicals Boiler High Temperature Heat	NA	NA
Glass- Flat with hydrogen	Installations for the manufacture of glass, including glass fibre	3(e)
Glass- Hollow with hydrogen		
Glass- Fiber with hydrogen		
Cement - Process Heat Kiln H2 and plasma substitution (New)	Opencast mining and quarrying OR Installations for the production of cement clinker and lime in rotary kilns or other furnaces	3(b), 3(c)(i), 3(c)(ii), 3(c)(iii)
Lime - Process Heat Kiln H2 and plasma substitution (New)		3(b), 3(c)(i), 3(c)(ii), 3(c)(iii)



# E-PRTR Industrial Database

Industrial Companies	Main Activity Code	TRILATE Cluster
ARCELORMITTAL BELGIUM - GENT	2(a)	Gent
APERAM GENK	2(b)	Genk
APERAM STAINLESS BELGIUM SA	2(b)	Charleroi
INDUSTEEL	2(b)	Charleroi
THY MARCINELLE sa	2(b)	Charleroi
CARMEUSE sa - Carrière de Moha	3(b)	Namur
CARMEUSE sa - Carrière d'Aisemont	3(b)	Charleroi
CCB sa - Carrière de Gaurain-Ramecroix	3(b)	Tournai
HOLCIM Belgique sa - Usine d'OBOURG	3(c)(i)	Mons
CBR sa - Site d'Antoing	3(c)(i)	Tournai
CBR sa - Site de Lixhe	3(c)(i)	Liège
LHOIST INDUSTRIE sa - Site de On	3(c)(ii)	NA
CARRIERES ET FOURS A CHAUX DUMONT WAUTIER SA	3(c)(iii)	Namur
DOLOMIES DE MARCHE-LES-DAMES sa	3(c)(iii)	Namur
CARMEUSE sa - Site de Seilles	3(c)(iii)	Namur
3B-FIBREGLASS sprl	3(e)	Liège
AGC GLASS EUROPE VESTIGING MOL	3(e)	Albert Canal
AGC GLASS EUROPE - Site de Moustier (ex-GLAVERBEL sa)	3(e)	Charleroi
GERRESHEIMER MOMIGNIES sa	3(e)	NA
SAVERGLASS MD Verre	3(e)	Mons
YARA TERTRE sa-nv - CETPROBEL sa	4(c)	Mons
BASF ANTWERPEN	4(a)(i)	Antwerp

