

Optimization for Carbon Capture and Storage



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Carbon Capture and Storage (CCS)

CCS

What?

Why?

How?

Where?

Costs

Scale

PROBLEM

LP MODELING

RESULTS

DISCUSSION

- (1) Capture
 - capture CO₂ at the source (e.g. power plants, cement works, ammonia, gas processing, refineries)
 - compress CO₂ (i.e. to liquid)
- (2) Transport
 - pipelines
 - source may be located above geologic reservoir
- (3) Store
 - inject CO₂ into geologic sink/reservoir (e.g. abandoned oil field, saline aquifer)
 - *sequester* (USA) or *store* (rest of the world) for 1000+ years



CO₂ Emissions

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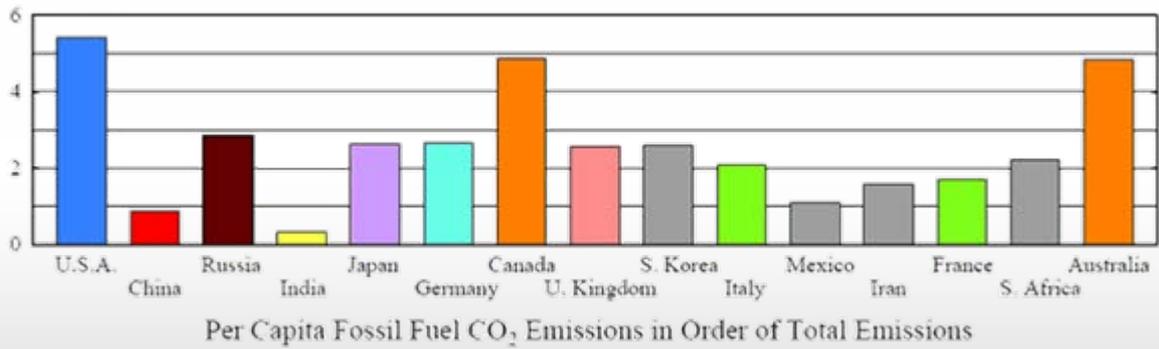
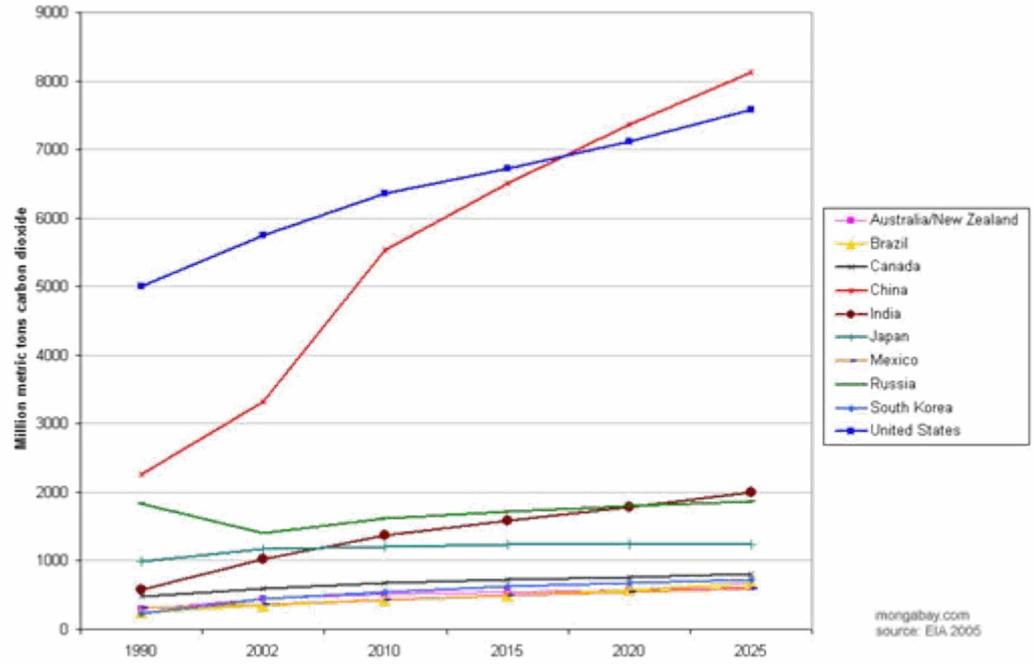
- What?
- Why?
- How?
- Where?
- Costs
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PROBLEM

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Source - Hansen (2007)





CO₂ Capture

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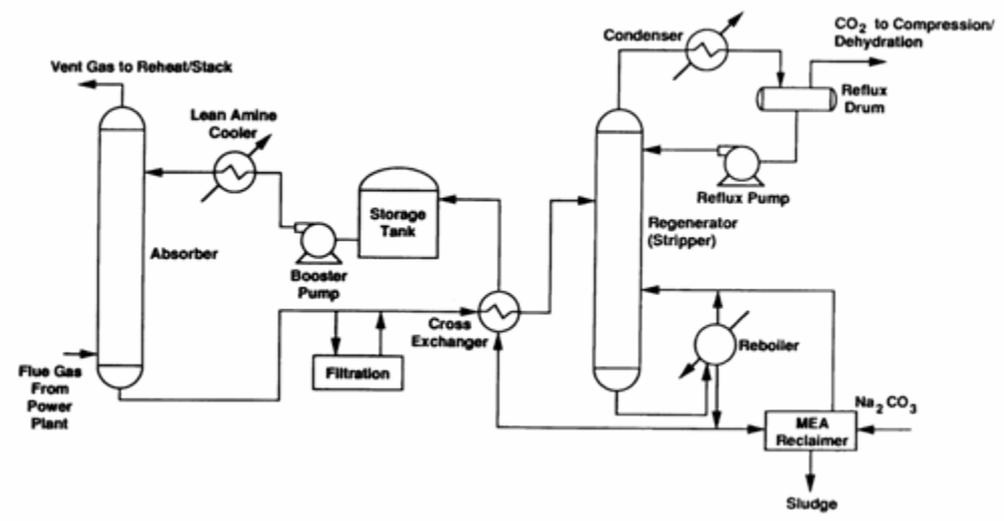
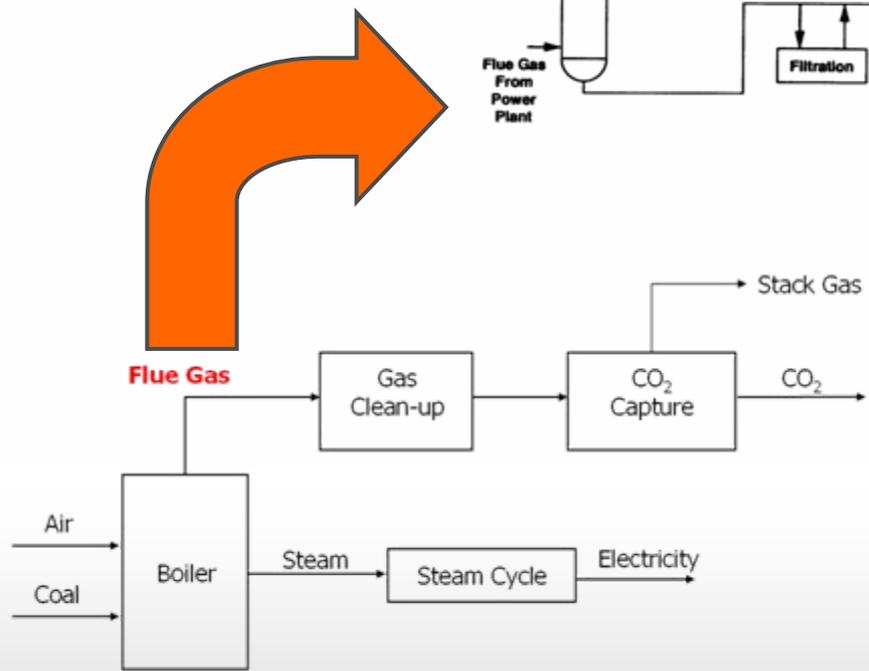
- What?
- Why?
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Amine Process for CO₂ Capture





CO₂ Storage

CCS

What?

Why?

How?

Where?

Costs

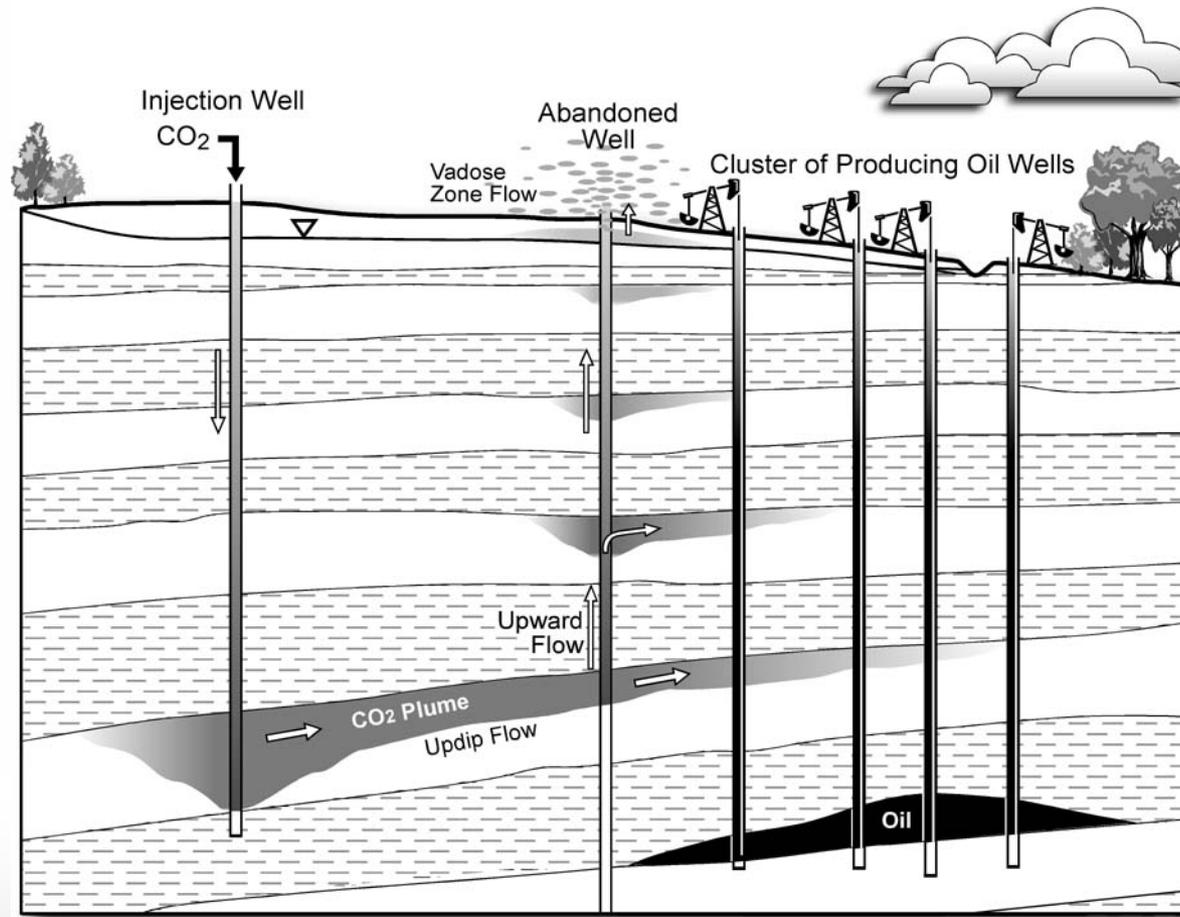
Scale

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Source – Carbon Mitigation Initiative (2007)



Enhanced Oil Recovery

CCS

What?

Why?

How?

Where?

Costs

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PROBLEM

LP MODELING

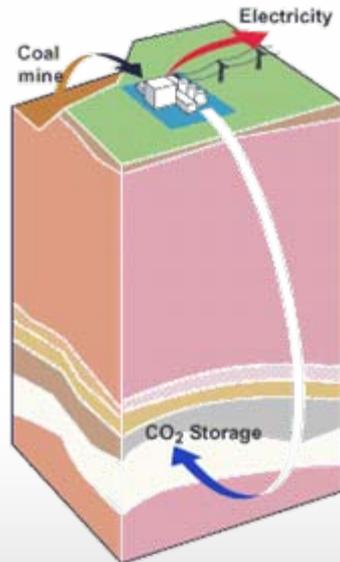
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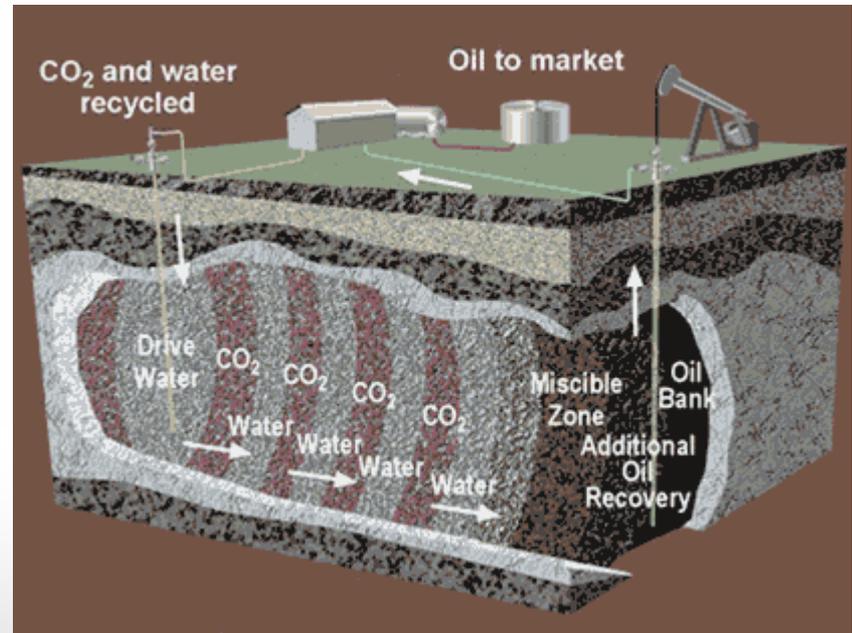
- Weyburn (EnCana Corp.)
 - sequester 30 million tons of CO₂ over project length
 - enhanced oil recovery (EOR)



Source – NRCAN (2007)



Source – CO2Store



Source – EnCana (2007)



Environmental Mitigation

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What?

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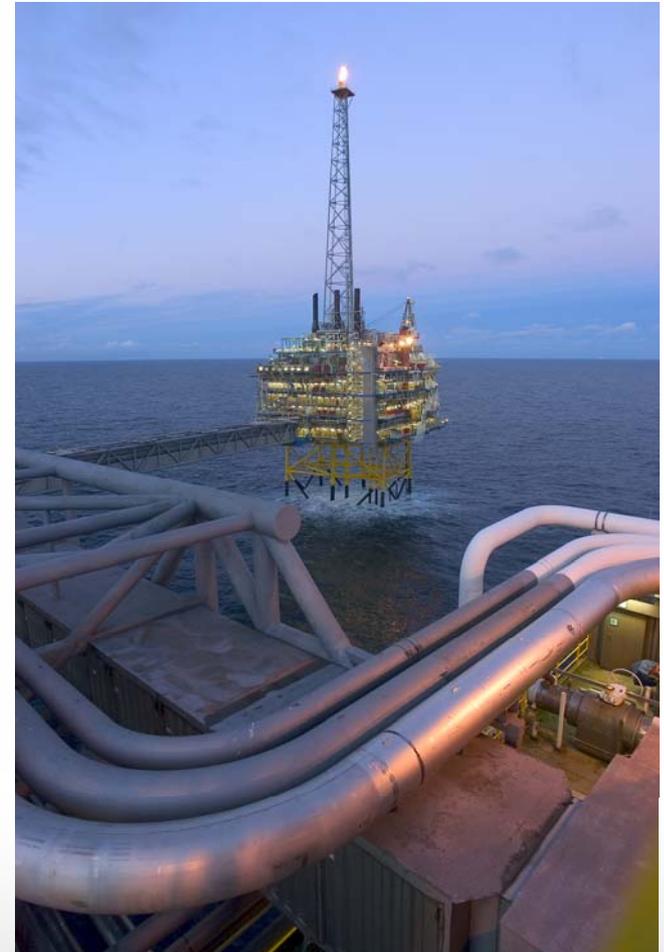
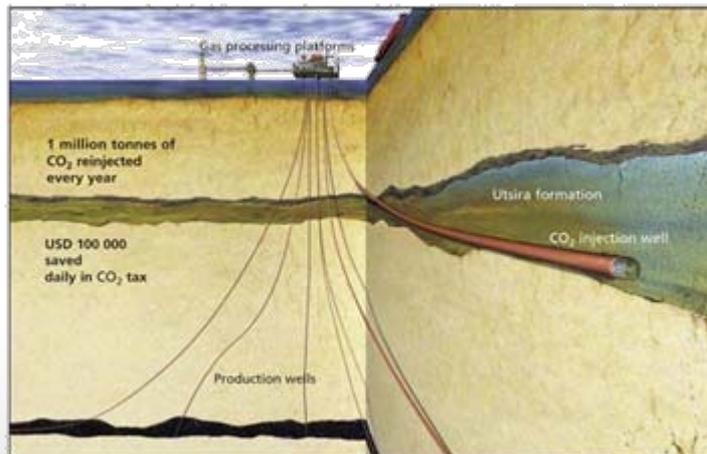
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DISCUSSION

- Sleipner West (StatOil)
 - annually inject 1 million tonnes of liquid CO₂ into saline aquifer (sandstone) 1km below surface
 - 600 billion tonne capacity
 - CO₂ tax (\$100k per day)



Source –StatOil ASA (2007)



Current/Future CCS Projects

CCS

What?

Why?

How?

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PROBLEM

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DISCUSSION

- Monash** (Australia, Fuel)
- ZeroGen** (Australia, Power)
- Gorgon** (Australia, Gas Proc)
- SaskPower** (Canada, Power)
- Greengem** (China, Power)
- nZEC** (China, Power)
- Vattenfall** (Germany, Power)
- RWE** (Germany, Power)
- Draugen** (Norway, Power)
- Mongstad** (Norway, Power)
- Snovit** (Norway, Gas Proc)
- BP Peterhead** (UK, (Power)
- E.On** (UK, Power)
- RWE npower** (UK, Power-r)
- Progressive** (UK, Power)
- Powerfuel** (UK, Power)
- FutureGen (USA, Power)**
- BP Carson** (USA, Power)

FutureGen

- zero-emissions fossil fuel plant
- \$1 billion project
- prototype plant
- operational 2012



Source –DOE (2007)



Capture and Storage Costs

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What?

Why?

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PROBLEM

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DISCUSSION

- Capture
 - reduce power plant efficiency from 50% to ~35%
 - \$40-50 per ton of CO₂
 - ~80% of CCS costs
- Storage
 - injection costs ~\$5 per ton of CO₂
- Transportation
 - pipeline costs \$1-3 per ton of CO₂
- Current state
 - emission tax/credit of ~\$50/ton CO₂ (\$110/tonne carbon) would make CCS competitive
 - all major components for CCS are commercially available
 - not economically feasible



Infrastructure Scale

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What?

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Where?

Costs

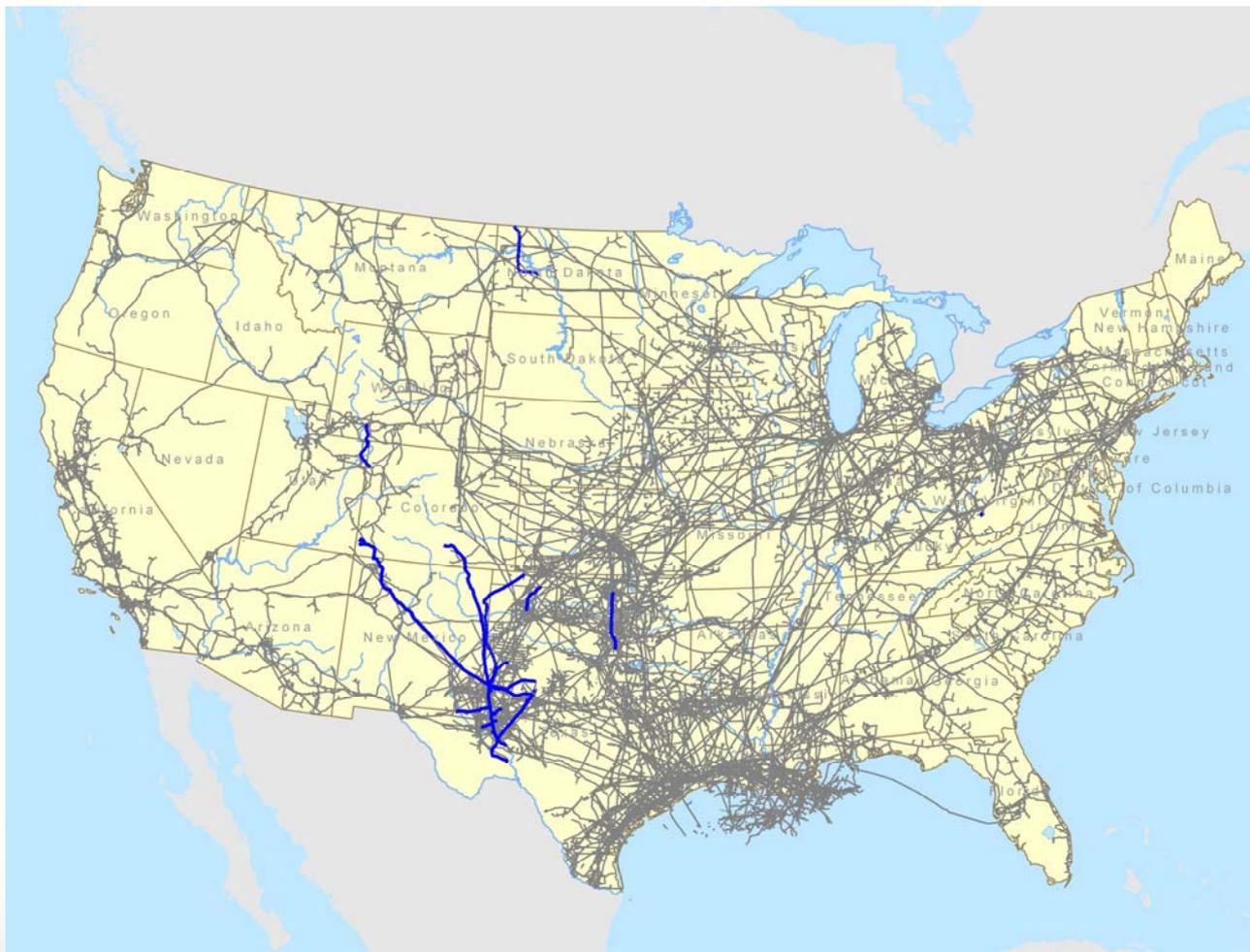
Scale

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RESULTS

DISCUSSION



S. Pacala and R. Socolow (2004) "Stabilization Wedges: Solving the Climate Problem for the Next 50 Years with Current Technologies", *Science* 305, 968-972



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PROBLEM

Definition

Data

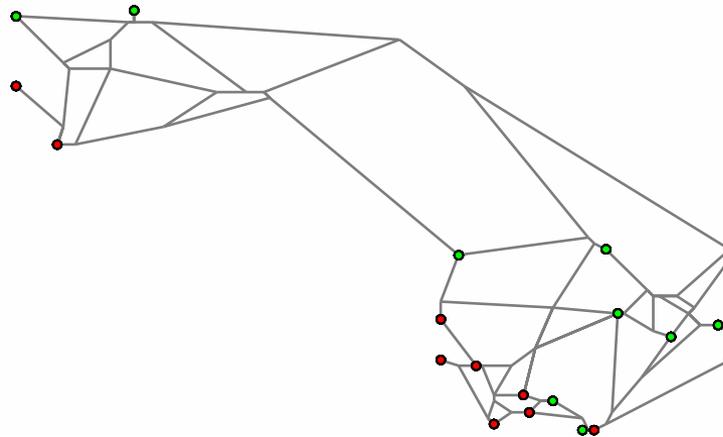
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Problem Statement

- Efficiently decide:
 - where to capture CO₂
 - which sinks to inject CO₂
 - pipeline routes and capacities
 - allocate CO₂ between sources and sinks



- Why?
 - private enterprise will match cheapest sources/sinks at the expense of long term planning



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PROBLEM

Definition

Data

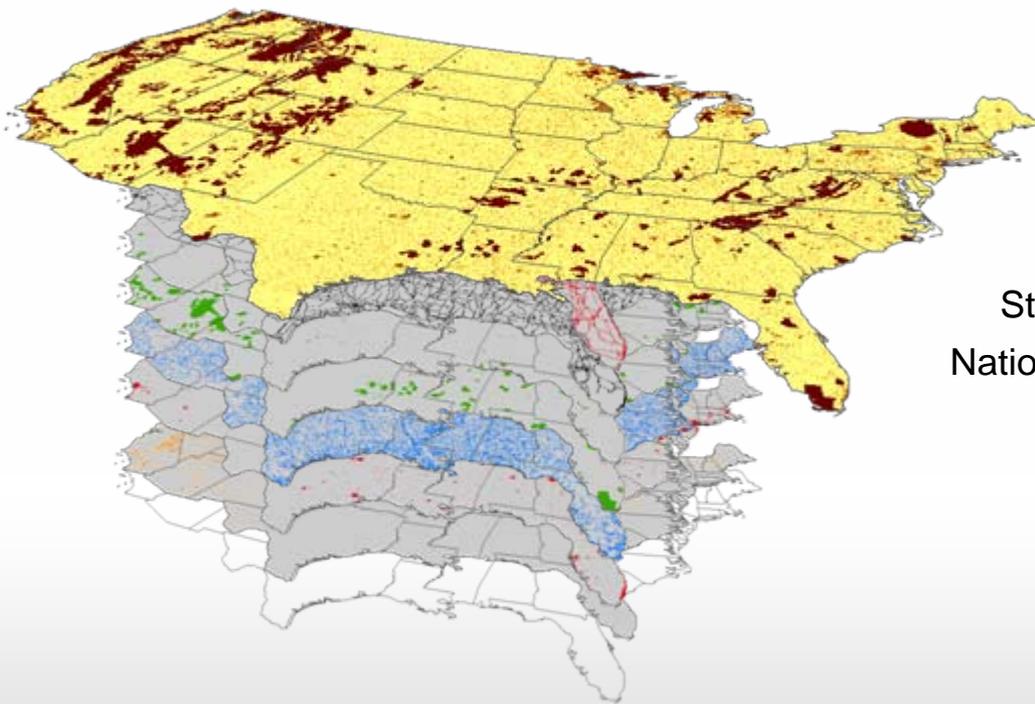
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Pipeline Routing Costs

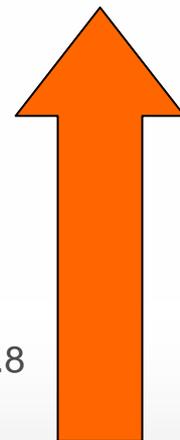
- Create pipeline cost surface (1 km resolution)
 - slope, urban areas, wetland, parks (national/state), crossings (railroad/highway)
-  VB demonstration



COST SURFACE

Highway	3
Railroad	3
State Parks	15
National Parks	30
Wetland	15
Urban	15
Slope	0.1, 0.4, 0.8
Base	1

(base cost for natural gas pipelines)





Cost Grid to Network Conversion

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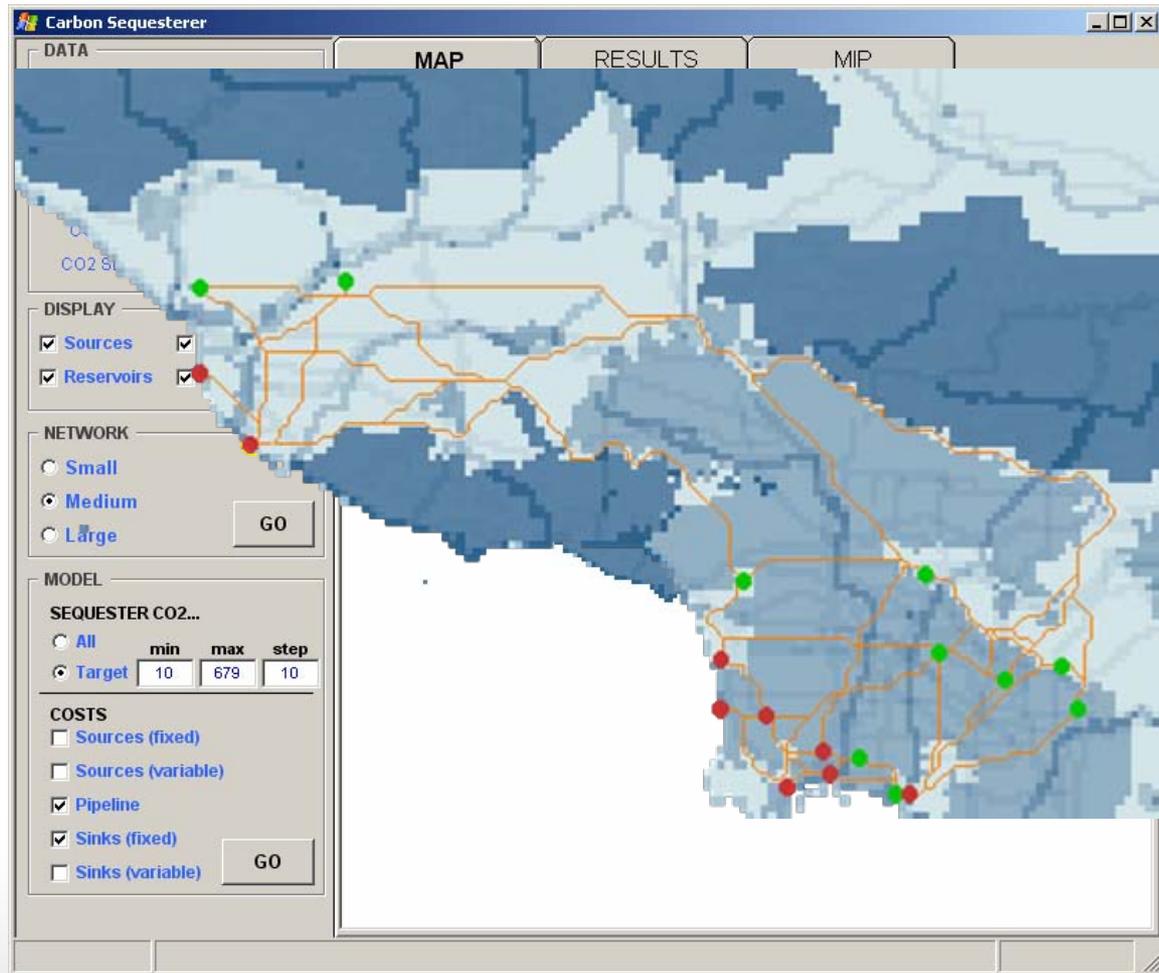
Definition

Data

LP MODELING

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DISCUSSION





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LP MODELING

Overview

Variables

Model

RESULTS

DISCUSSION

Linear Programming (LP) Approach

- First phase of modeling
 - capture variables explaining major variability
- *Simultaneously* optimizing for five *dependant* decisions
 - *at which sources to capture CO₂*
 - *which geologic sinks to open*
 - *pipeline network route*
 - *pipeline diameter*
 - *allocate CO₂ between sources and sinks*
- 25 year project period



Linear Programming Variables

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LP MODELING

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x_{ij} units of CO₂ transported from node i to j

A_i amount of CO₂ captured at node i

y_{ijd} if pipeline constructed from i to j with diameter d

s_i if source at node i is opened

r_j if reservoir at node j is opened

F^s, F^p, F^r fixed cost for opening a source, pipeline, reservoir

V^s, V^p, V^r variable cost for capturing, transporting, storing CO₂

Q^s, Q^p, Q^r CO₂ capacity of source, pipeline, reservoir

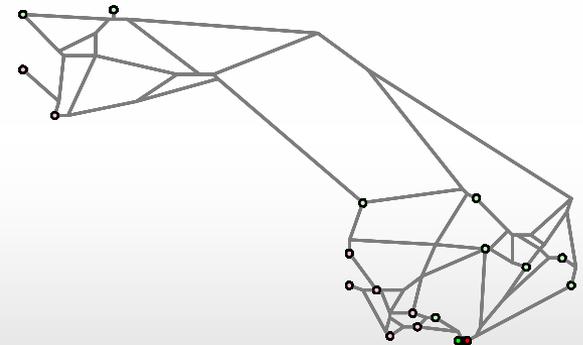
C_j credit received for CO₂ stored at reservoir j

T target of amount of CO₂ to be stored

N_i, N_j nodes adjacent to nodes i, j

R set of reservoir nodes

S set of source nodes





LP Model

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LP MODELING

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MINIMIZE

$$\sum_{i \in S} F_i^s s_i + \sum_{i \in S} \sum_{j \in N_i} V_{ij}^s x_{ij} + \sum_i \sum_{j \in N_i} \sum_d F_{ijd}^p y_{ijd} + \sum_i \sum_{j \in N_i} V_{ij}^p x_{ij} + \sum_{j \in K} F_j^r + \sum_{j \in K} \sum_{i \in N_j} V_{ij}^r x_{ij}$$

Cost to open or site a source + Cost to construct and maintain pipelines + Cost to open reservoir, inject CO₂

$$(1) \quad x_{ij} - \sum_d Q_{ijd}^p y_{ijd} \leq 0 \quad \forall i, j \in N_i$$

CO₂ flow must be less than pipeline diameter

$$(2) \quad \sum_{j \in N_i} x_{ij} - \sum_{j \in N_{i \notin R}} x_{ji} - A_i = 0 \quad \forall i$$

CO₂ leaving a node must equal inflow

$$(3) \quad A_i - Q_i^r s_i \leq 0 \quad \forall i \in S$$

CO₂ leaving a source not to exceed supply

$$(4) \quad \sum_{i \in N_j} x_{ij} - Q_j^r r_j \leq 0 \quad \forall j \in R$$

CO₂ entering a sink not to exceed capacity

$$(5) \quad \sum_{i \in S} A_i = T$$

Target amount of CO₂ to sequester

$$(6) \quad y_{ijd} \leq 1 \quad \forall i, j \in N_i, d$$

One pipeline between nodes (optional)

Pipeline either built or not built

CO₂ flow must be positive

Open source fully or not at all

Open reservoir fully or not at all



Sequester all CO₂ (25 years)

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LP MODELING

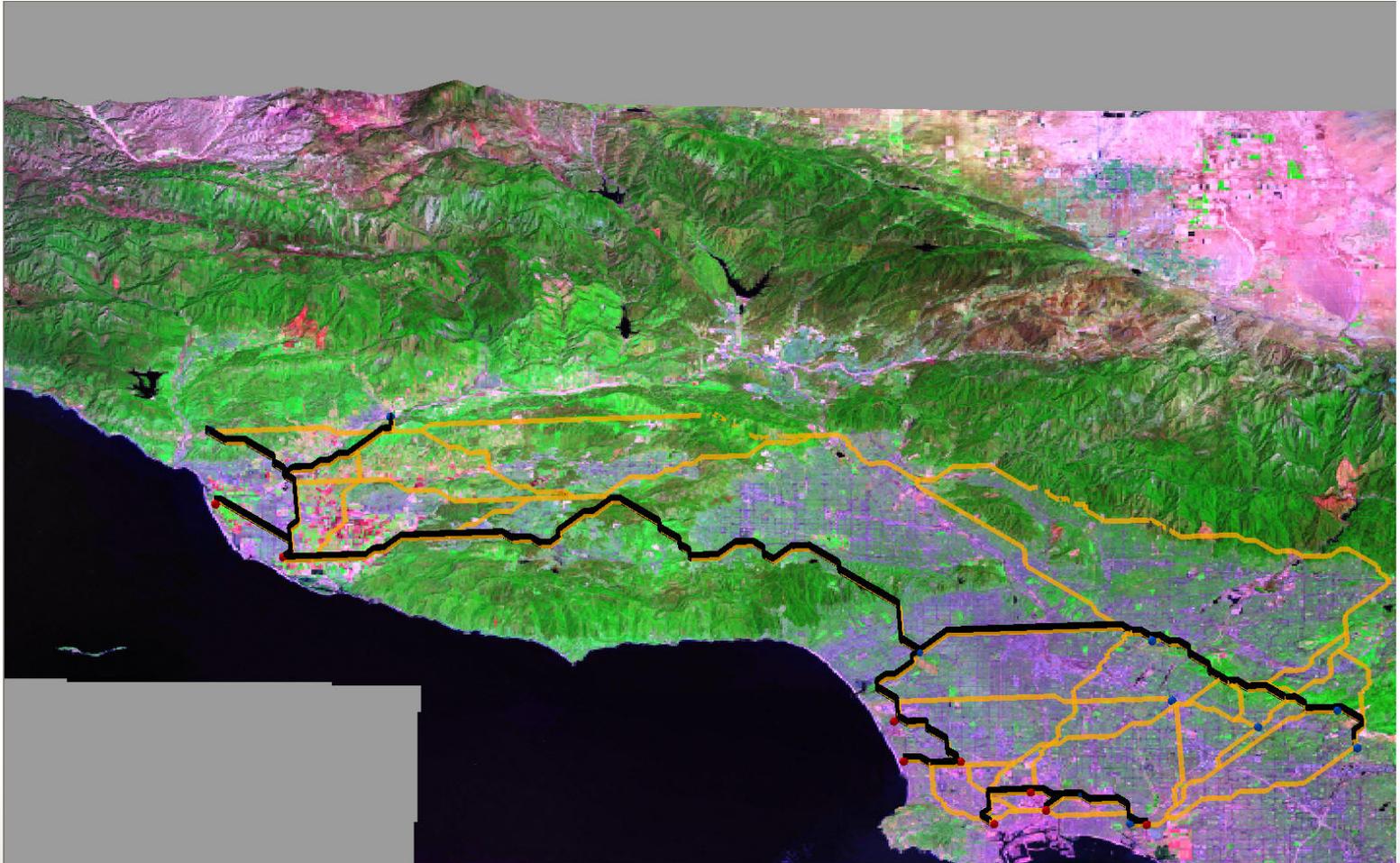
RESULTS

Graphics

Graphs

Demo

DISCUSSION





Sequester all CO₂ (25 years)

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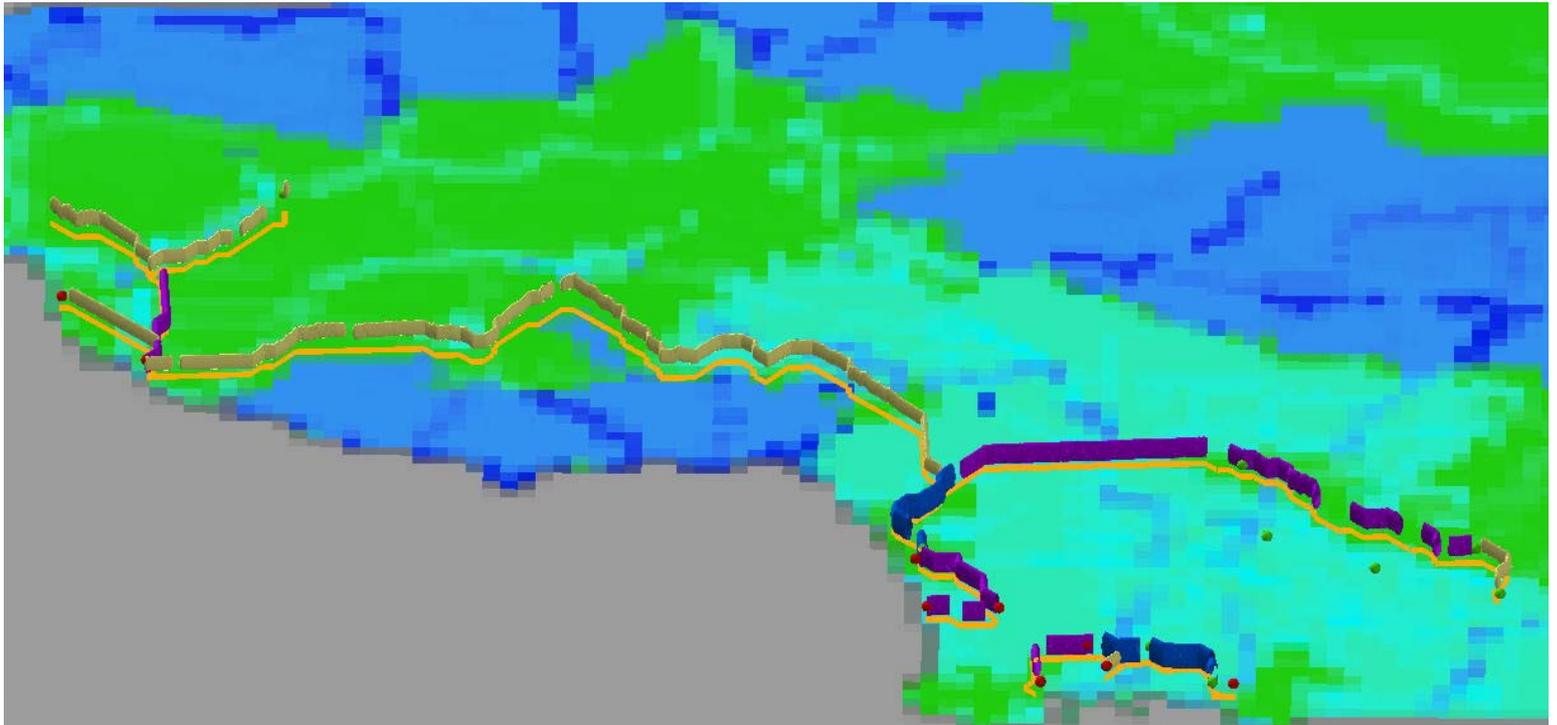
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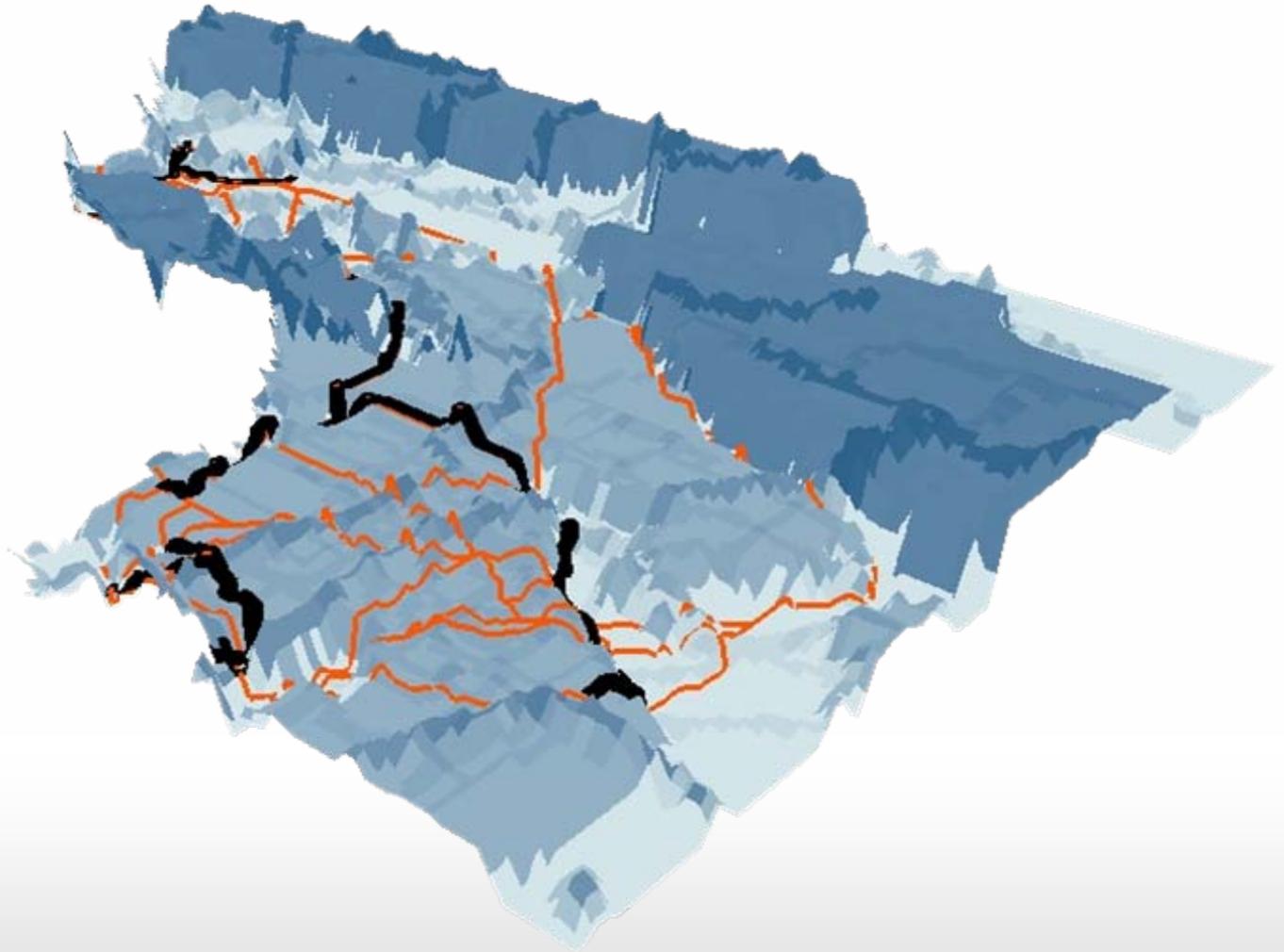
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Sequester CO₂ Target Amount

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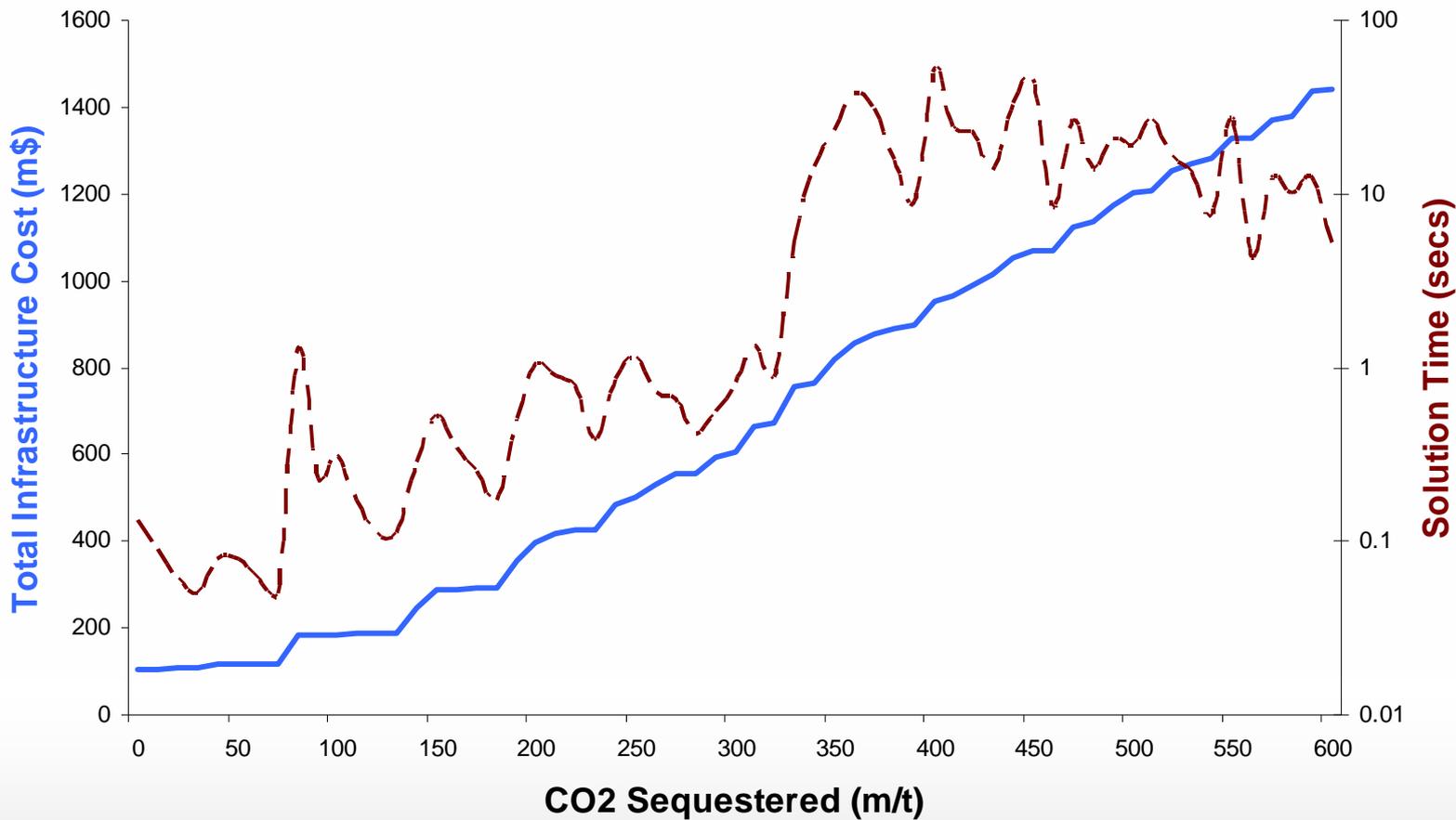
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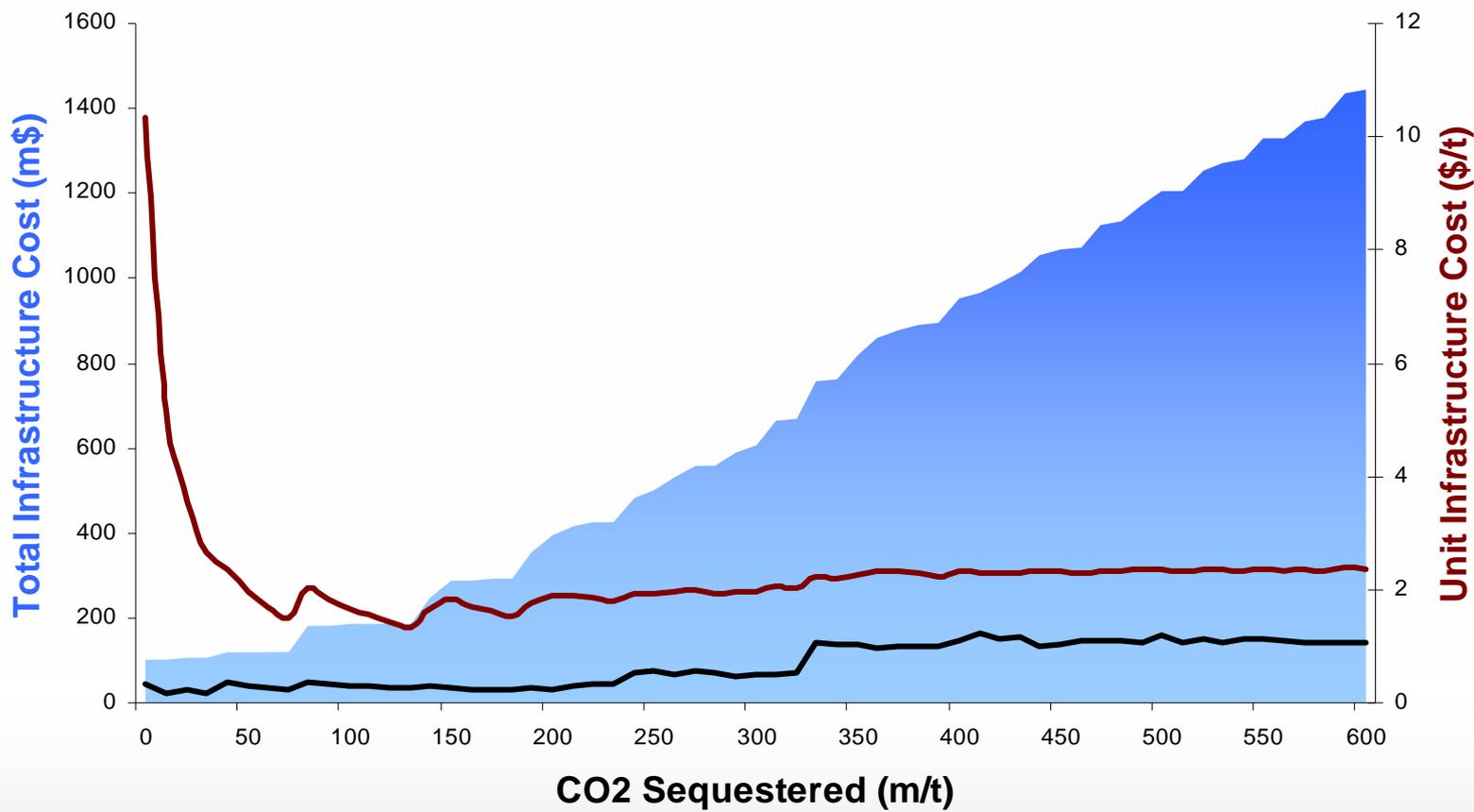
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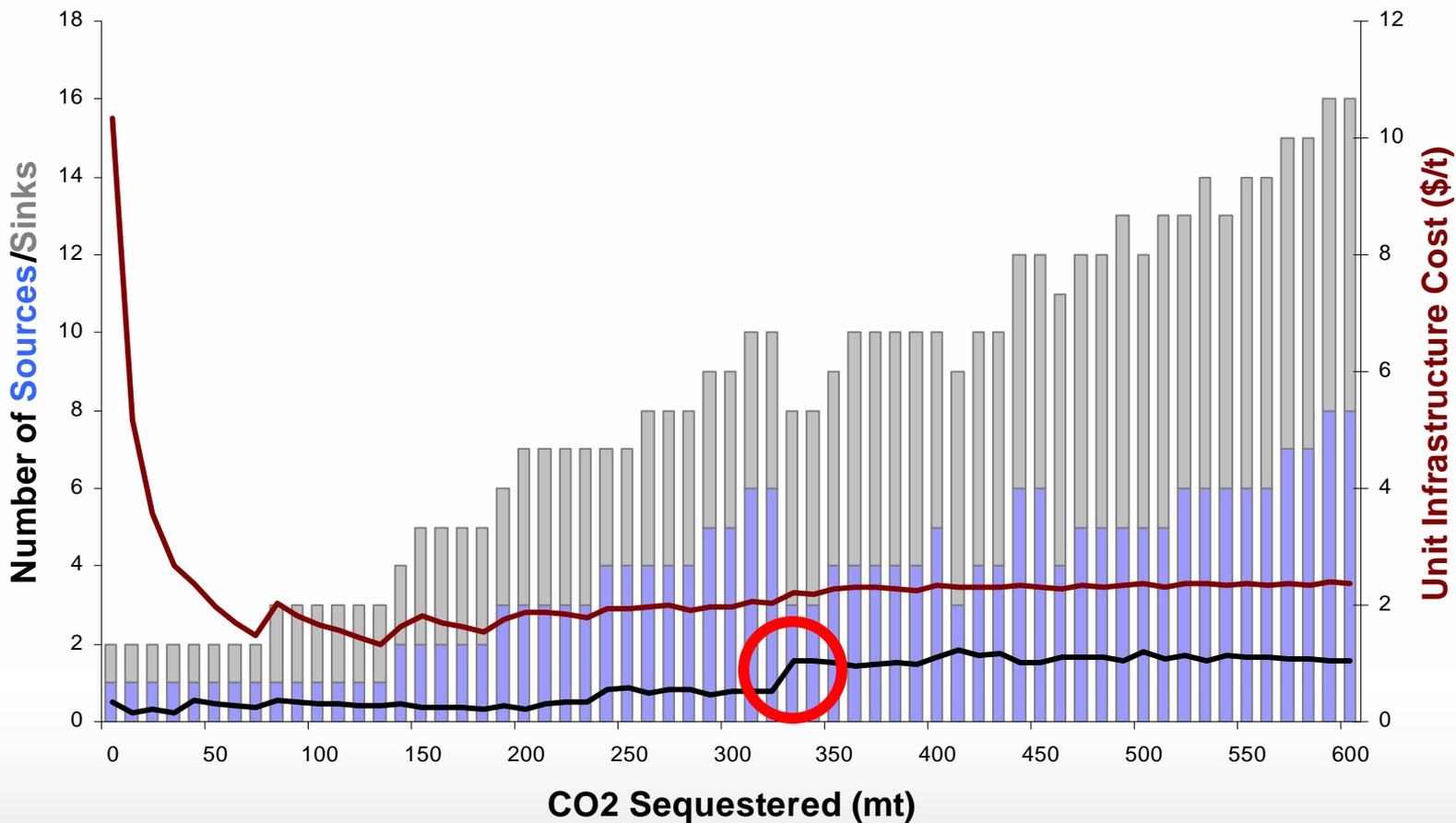
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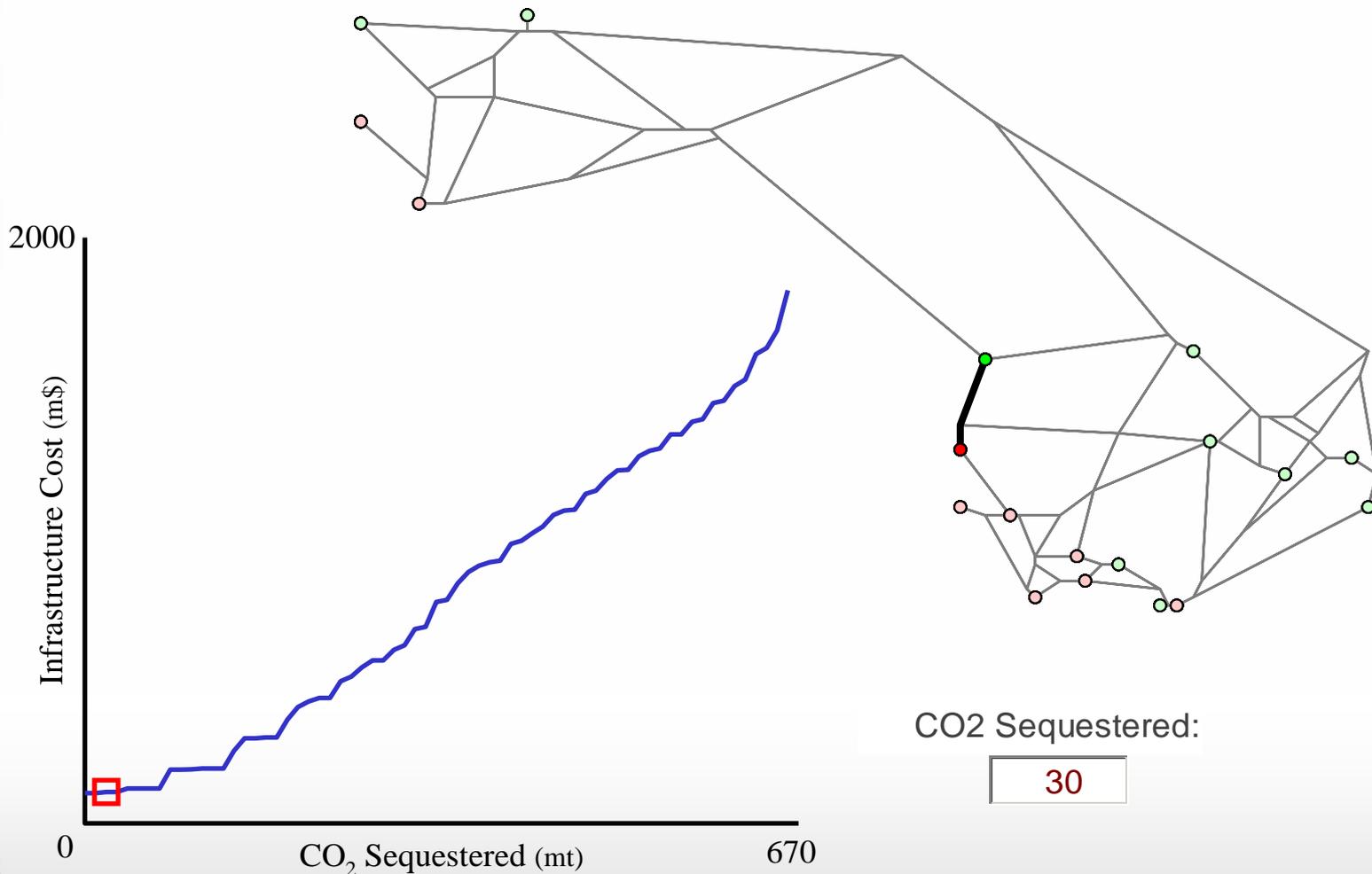
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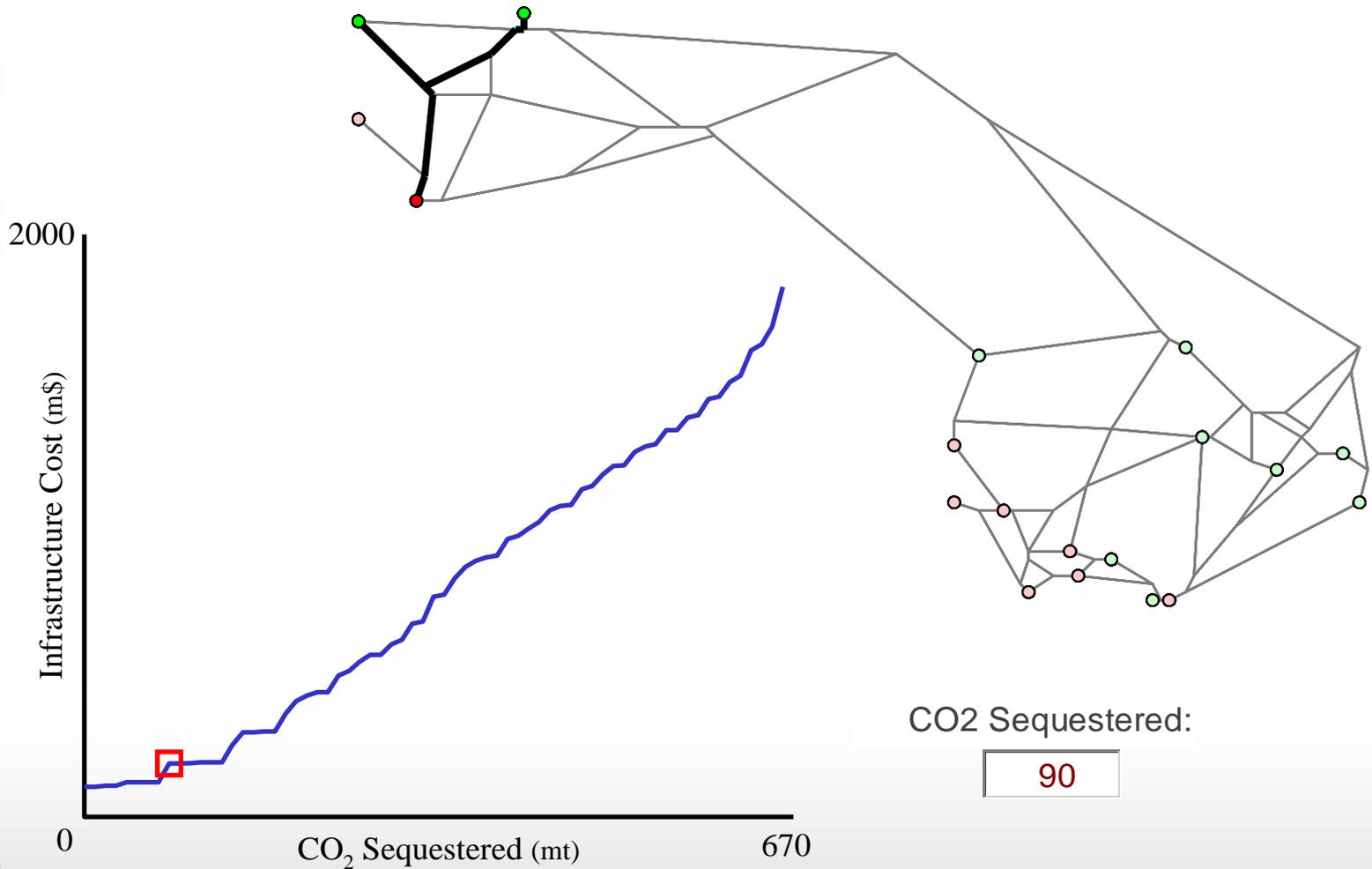
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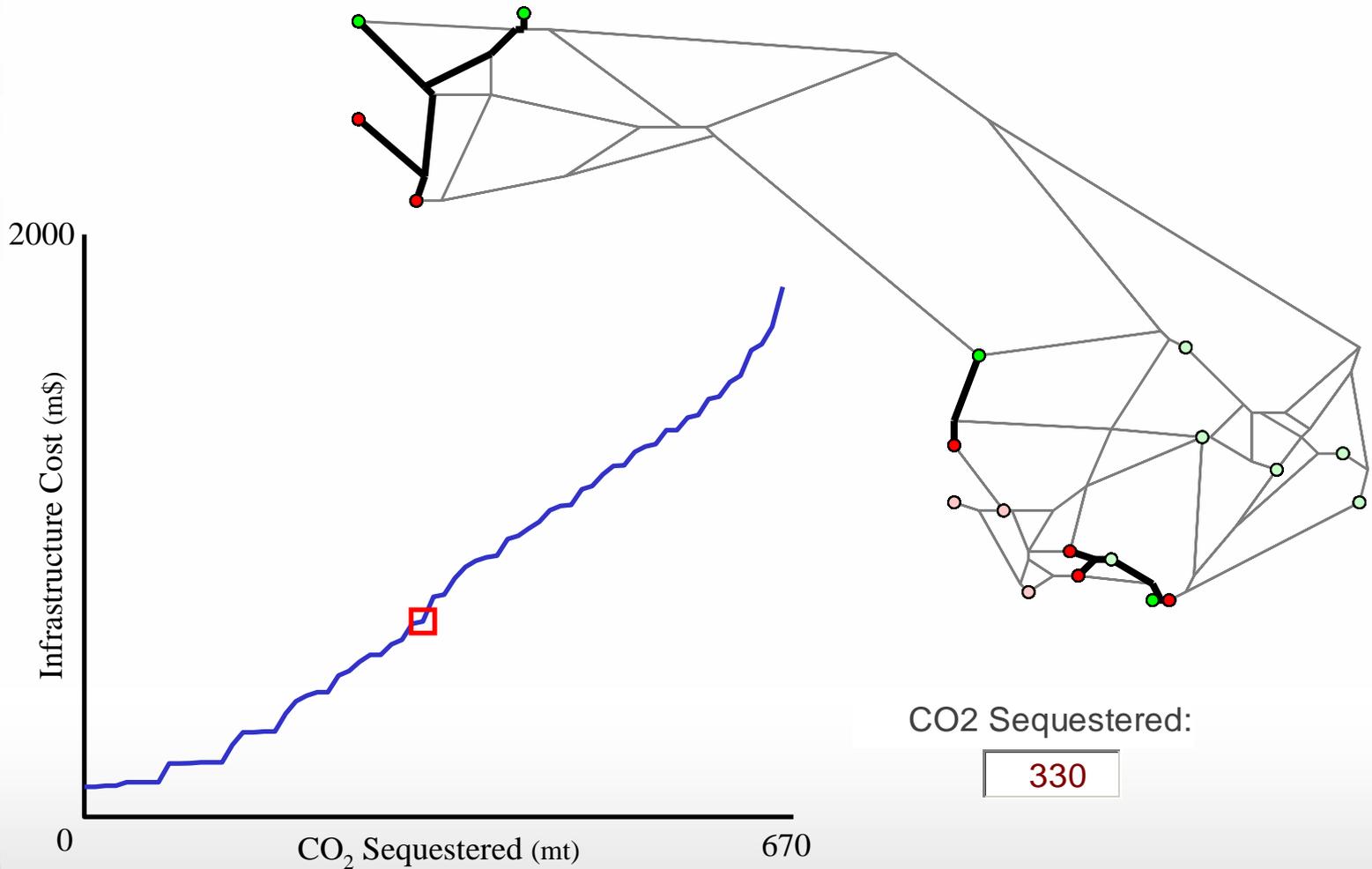
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Sequester CO₂ Target Amount

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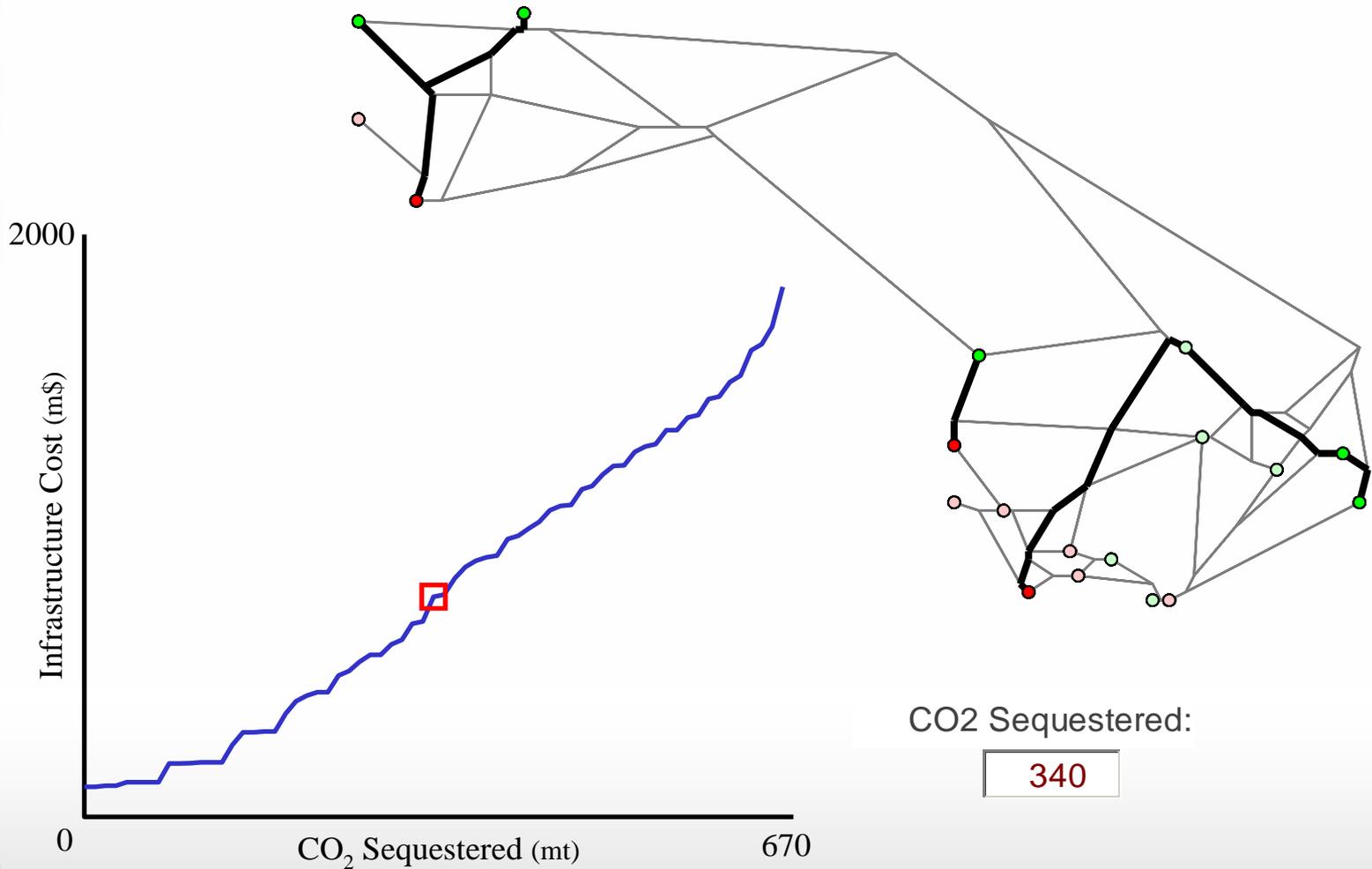
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CO₂ Sequestered:

340



Sequester CO₂ Target Amount

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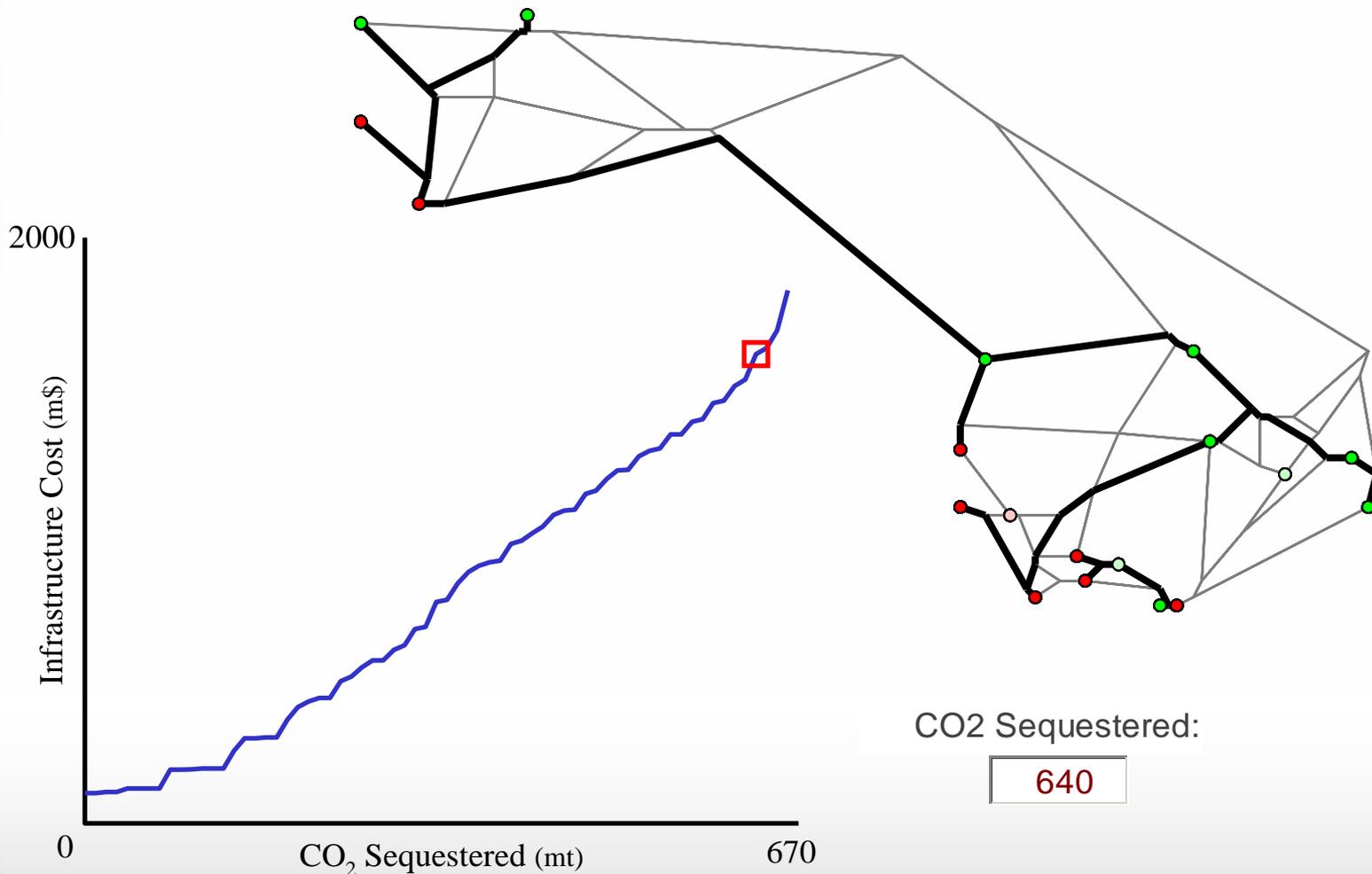
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Next Steps in Modeling

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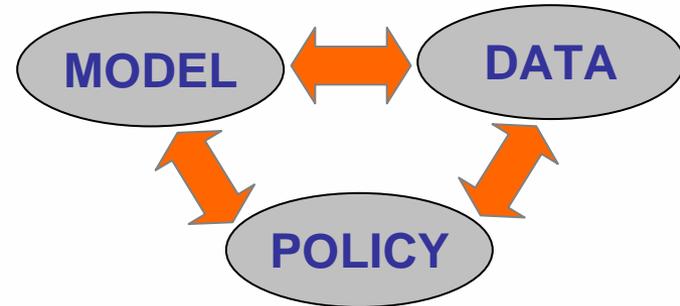
RESULTS

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Future?

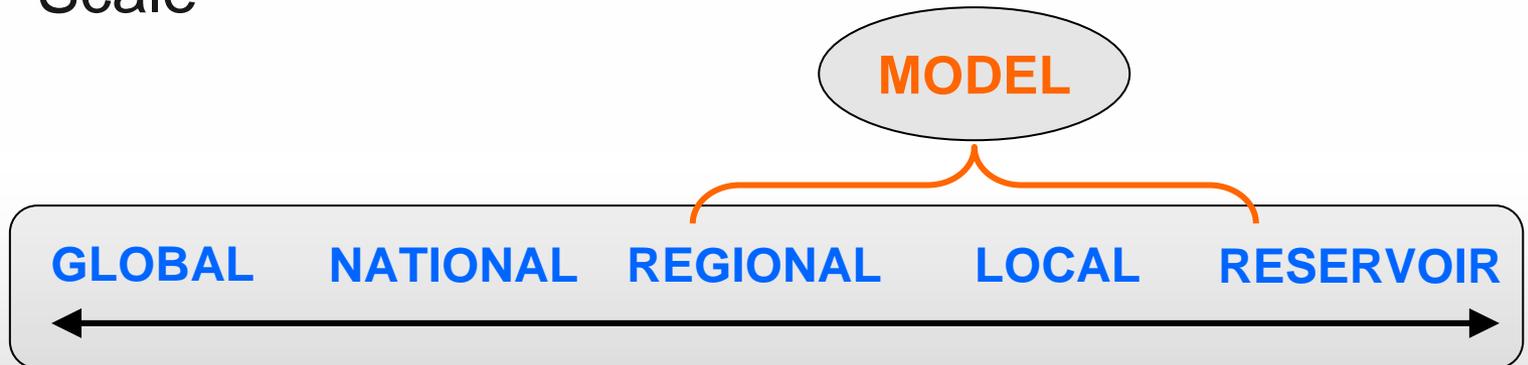
Conclusions

- Improvements
 - improved data, time-steps, uncertainty, pumping stations, pressure drops



- Future developments

- Scale





Conclusions

CCS

PROBLEM

LP MODELING

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DISCUSSION

Future?

Conclusions

- CCS will play a part in moving towards a carbon-neutral society
- Capture and storage costs are mostly fixed
 - efficient allocation
 - robust network
- Coal/CO₂/electricity transportation
 - coal transportation (~\$9) vs. coal waste i.e. CO₂ (\$1.8-5)
- Models will provide system overview and drive policy



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