

# **ENHANCING NATURAL GAS PIPELINES USING OPERATIONS RESEARCH**

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# BACKGROUND

In 2018, China National Petroleum Corporation (**CNPC**) faced challenges due to the increasing demand for natural gas. To expand efficiently, they adopted **Operations Research with linear optimization**, leading to higher profits and reduced infrastructure repair costs.

The method optimized complex transportation processes affected by varying temperature and pressure, ensuring a steady gas supply. CNPC's success demonstrates the power of innovation in the natural gas industry.



# QUESTIONS ADDRESSED IN THIS CASE

- **What is the capacity of the natural gas transportation network?**
- **What is the optimal transmission plan considering gas production, imports, transportation, storage, and sales, based on available natural gas resources, demand locations, and varying gas prices in the network?**



# Stakeholders



## CHINA NATIONAL PETROLEUM CORPORATION (CNPC)

The leading player driving pipeline expansion and optimization, aiming to maximize profits and ensure a reliable gas supply.



## GOVERNMENT AND REGULATORY BODIES

Overseeing the energy sector, with a stake in policy and regulations impacting CNPC's operations.



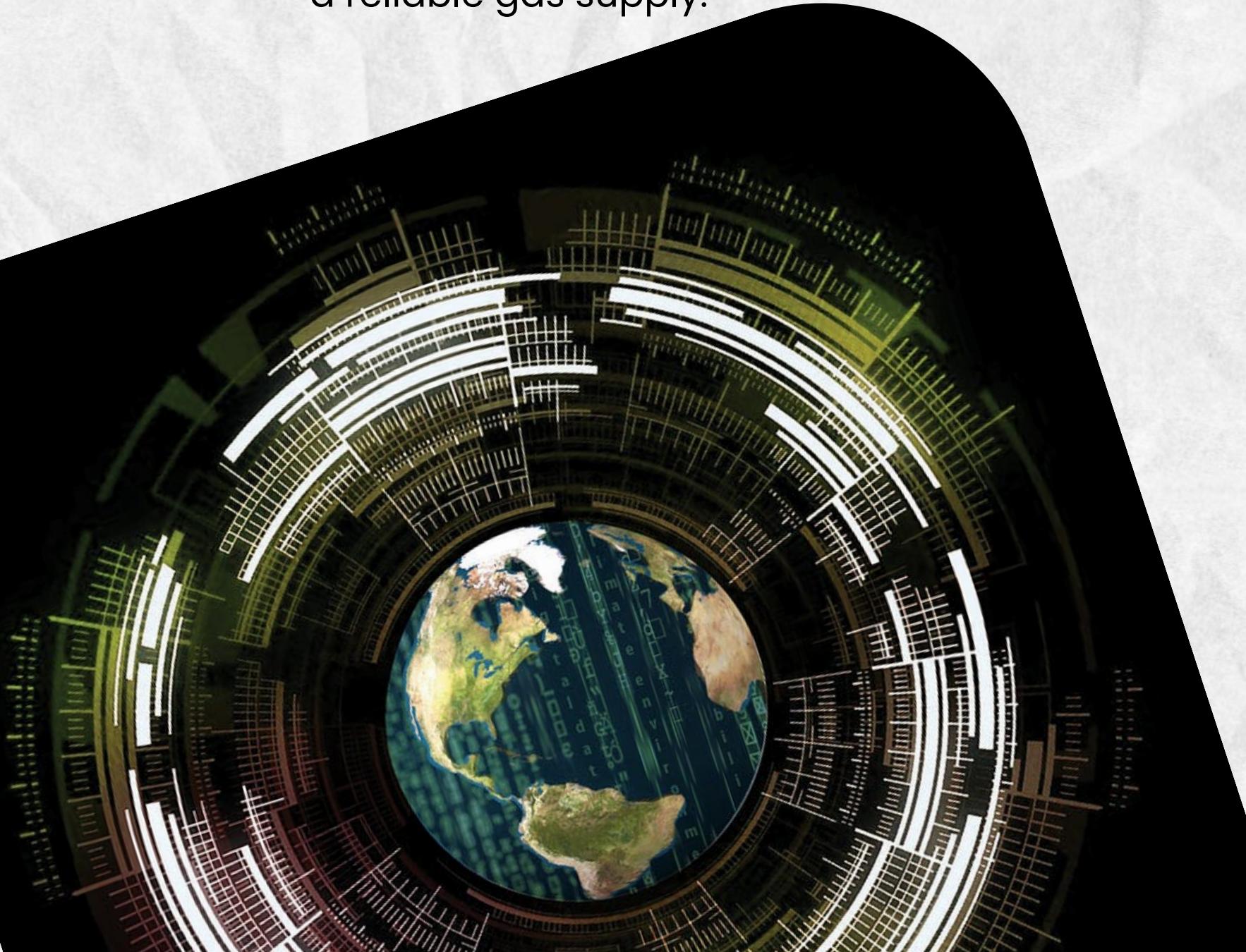
## LOCAL COMMUNITIES AND ENVIRONMENTAL GROUPS

Concerned about safety, environmental effects, and community engagement.



## NATURAL GAS PRODUCERS AND SUPPLIERS

Other companies in the industry, aligning or competing with CNPC's goals.



# Customers



## INDUSTRIAL AND COMMERCIAL ENTITIES

Rely on gas for energy needs, requiring a stable supply.



## RESIDENTIAL CONSUMERS

Depend on gas for heating and household use, seeking affordability and reliability.



## POWER GENERATION SECTOR

Gas serves as a crucial energy source for power plants.



## IMPORTERS AND EXPORTERS

Foreign entities involved in gas import/export may also be customers or stakeholders.



# Traditional Method Using Spreadsheets



1. Divide the system into multiple subsystems.
2. Use **Microsoft Excel** to establish internal balance for production, imports, transmission, storage, and sales within each subsystem.
3. Adjust decisions based on the management team's experience and feedback.
4. Seek a preliminary balance for the entire system by adjusting interflows between subsystems.
5. Check and iterate if necessary to ensure balanced natural gas amounts in each subsystem.

# Limitations of Using Excel for Operations Research

## 1. Limited Solver Capabilities

- Excel's built-in Solver tool is useful for basic optimization problems.
- Struggles with complex or large-scale OR models.
- Lacks the efficiency and robustness of specialized OR solvers.

## 2. Model Size Constraints

- Excel has limitations on the number of variables and constraints it can handle in a Solver model. Large-scale OR problems may exceed Excel's capacity.

## 3. Performance Issues

- As the problem size grows, Excel's performance may degrade.
- Slower calculations and increased computation time can be problematic.

## 4. Lack of Support for Advanced Modeling Features

- Excel lacks some advanced features required for certain types of OR problems.
- Not suitable for handling complex constraints and scenarios.

## 5. Difficulty with Integer Variables

- Excel can handle integer variables in the Solver, but it might not be as efficient as specialized OR solvers. Integer programming problems may require more sophisticated techniques.



**Hence, It became very difficult for CNPC to solve their Optimization problems using Excel.**

**They needed a new robust optimization algorithms.**

# Model

**Objective Function:** Optimize natural gas flow rates, pressure, and temperature in a fixed network topology.

**Decision Variables:** Nodes - Net supply, pressure, and temperature, Arcs - Flow rates.

**Objective:** Maximize total profit (revenue minus purchasing cost) or minimize total cost.

**Constraints:** Flow balance, flow range (min and max), pressure range, and physical laws in components (e.g., compressor, regulator valve, pipeline).

# Algorithms Used

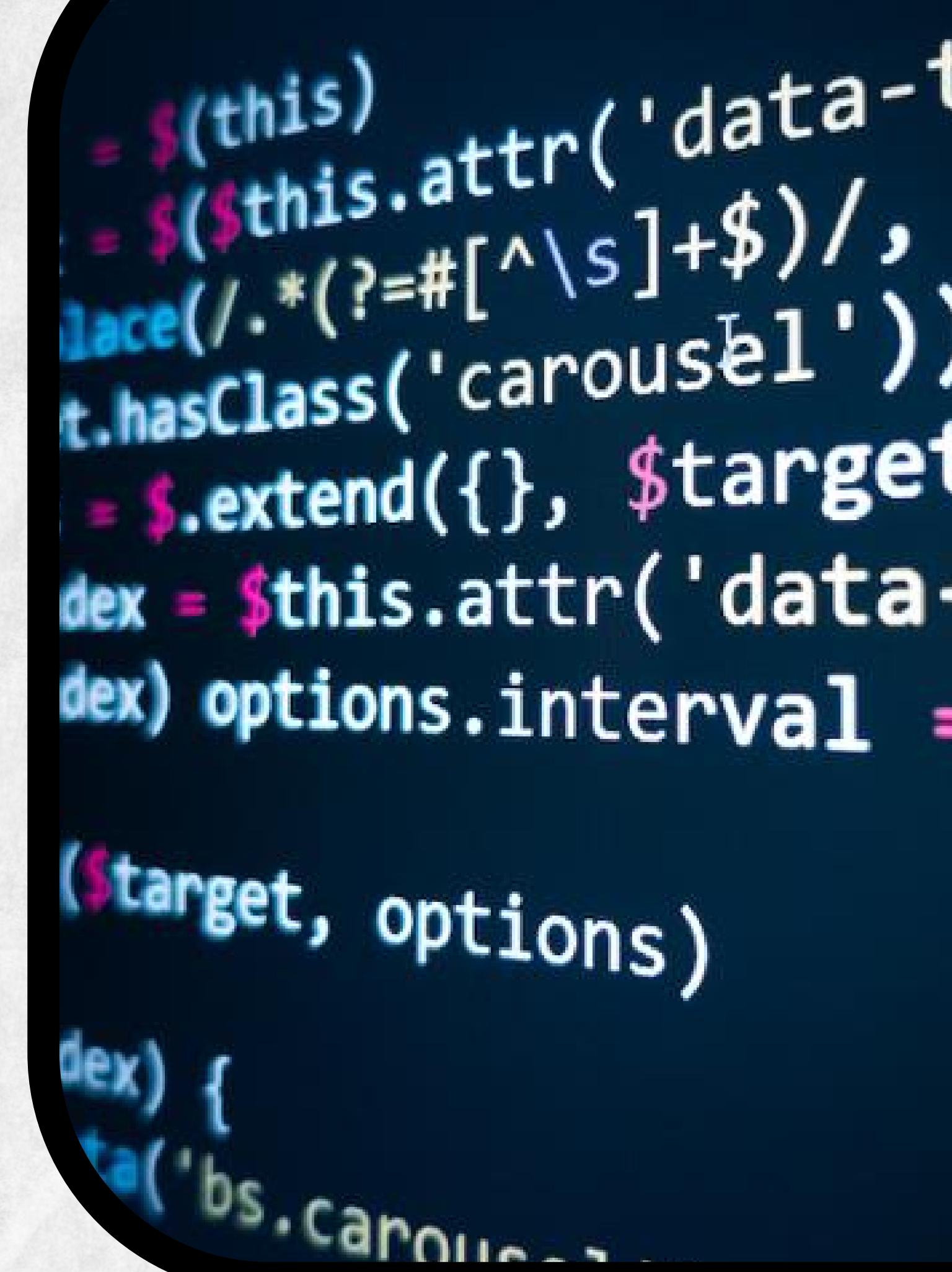
**Mixed Integer Linear Programming:** is a mathematical optimization technique used to solve problems with both continuous and discrete variables

**Piecewise Linear Approximation:** is a method of approximating a complex curve or function by breaking it into smaller linear segments, simplifying the representation while retaining accuracy.

**Non-convex optimization Problems:** are complex mathematical challenges where the objective function and constraints may have multiple local minima or maxima, making it difficult to find the global optimal solution.

**Convex relaxation:** is a technique used to simplify and solve non-convex optimization problems by transforming them into convex ones, facilitating efficient solutions.

**3SCR Algorithm:** is a Three-Step Consecutive Refinement approach used to improve the accuracy and efficiency of optimization problems by iteratively refining the solution in three stages.



# Model (Approach 1)



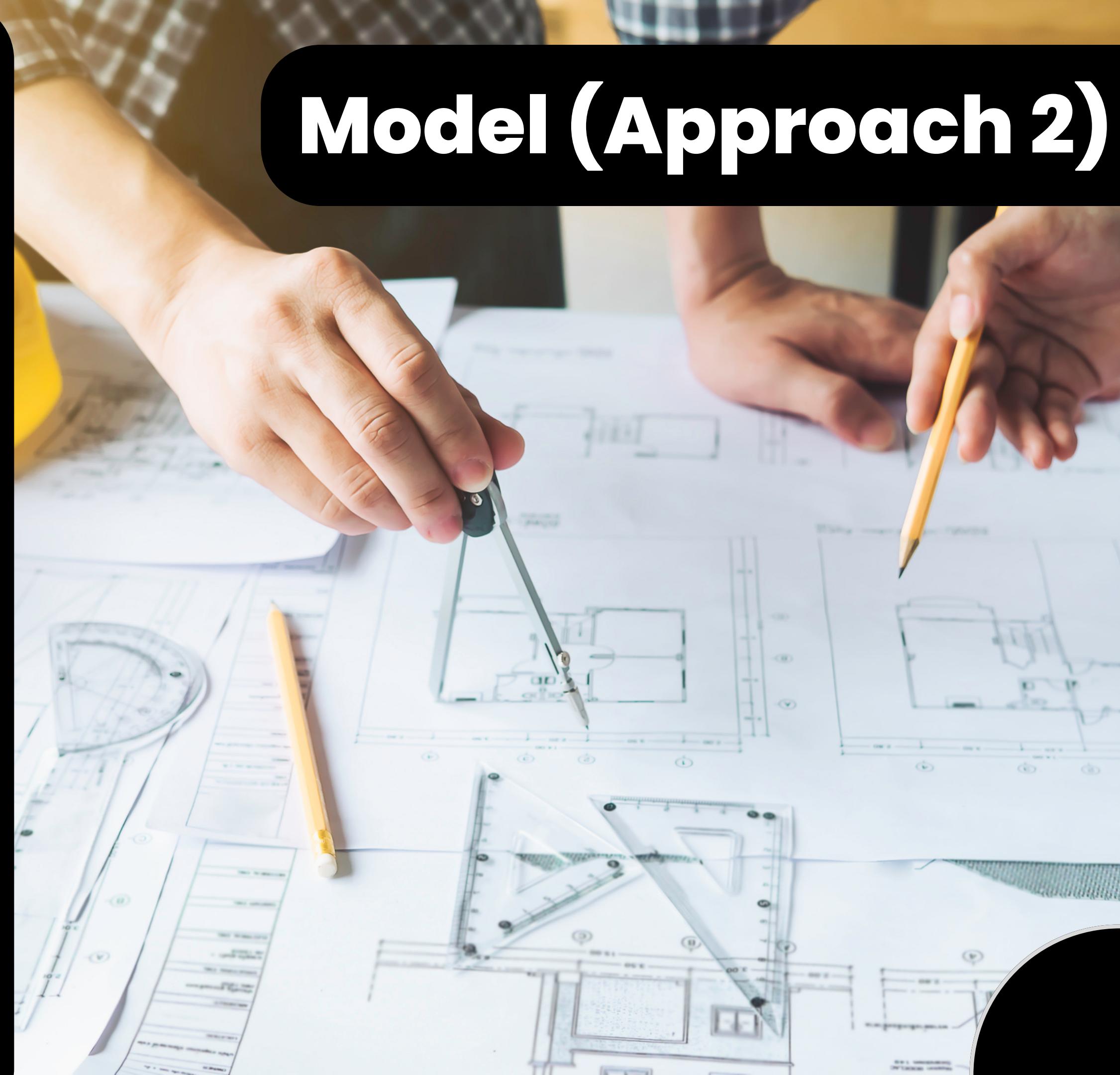
- Model natural gas transmission as a mixed-integer linear programming problem with piecewise linear approximation for small-sized networks.
- Satisfactory results for small problems, but issues arose for large-scale problems.
- Inconsistent optimal values between algorithms in IBM ILOG CPLEX.
- Computation time exceeded the set criterion for large problems.

- Developed an iterative two-stage framework for solution optimality and accuracy.
- Convex relaxation of nonconvex problem for fast iterations and highly accurate solutions.
- Achieved convergence error within 2% in one second for a Chinese network with 20+ nodes.
- Verified optimal solutions for small-scale networks (up to 100 nodes).
- Challenges in networks with many cycles, leading to potentially long computation times.

$$z^* = \sum_{i \in \mathcal{I}_s} c_i^s \cdot s_i^{1*} - \sum_{i \in \mathcal{I}_d} c_i^d \cdot (-s_i^{1*}).$$

Minimizing Energy

## Model (Approach 2)

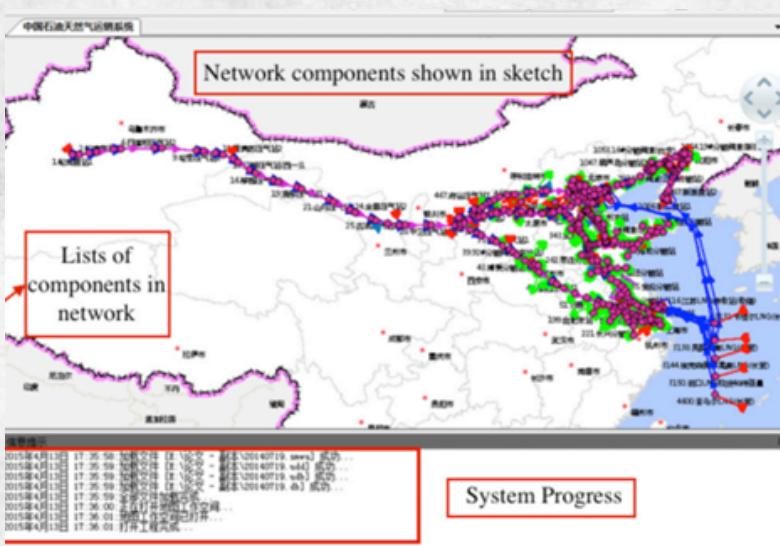
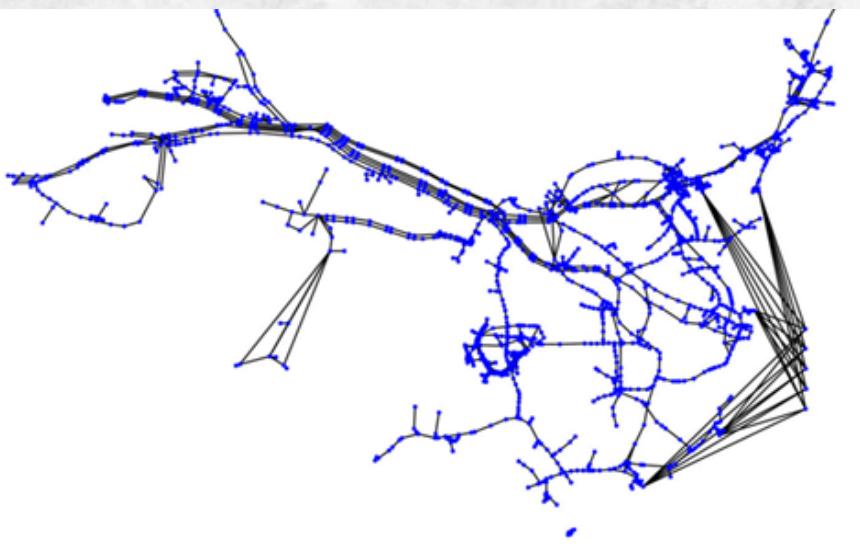


# Improved Approach (3SCR Algorithm)

- Proposed 3SCR algorithm as an enhancement to the iterative method.
- Extended convex relaxation to constraints on interconnected pipelines.
- Identified conditions where convex relaxation preserves optimality.
- Three-stage process:
  - Solve a convex relaxed model.
  - If feasible, the process concludes; otherwise, minimize energy in pipelines and update flow rates.
  - Determine node pressure and temperature based on updated flows.
- Achieves satisfactory accuracy for the largest Chinese network (1,285 nodes) when other methods fail to generate feasible solutions.



# Software Components



- 1. Data Input:** Importing data from the database and storing it in the system's memory.
- 2. Data Check:** Verifying the correctness of the input data.
- 3. Unit Conversion:** Converting arbitrary numerical data into standard units.
- 4. Optimization:** Solving the natural gas pipeline planning problem using the user-selected algorithm (3SCR or piecewise linear approximation) for efficiency and accuracy.
- 5. Data Output:** Converting and generating the calculation results into the required output formats.

# **Effect (Advantages)**

- Substantial economic impact with increased revenue and budget savings for CNPC.**
- Generated over \$530 million in additional profits for CNPC's natural gas transmission (2015–2017).**
- Optimized allocation of natural gas sales led to increased revenue of \$340.3 million.**
- Significant improvement in work efficiency, reducing planning time from days to minutes.**
- Environmental benefits by providing more accurate customer demand estimates based on improved production and transmission capacities.**



# References

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# THANK YOU

