# Part 0: A gentle introduction to nonlinear optimization

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minimize f(x) subject to  $c_{\mathcal{E}}(x) = 0$  and  $c_{\mathcal{I}}(x) \ge 0$   $x \in \mathbb{R}^n$ 

Part C course on continuoue optimization

# WHAT IS NONLINEAR PROGRAMMING?

# Nonlinear optimization = nonlinear programming

minimize 
$$f(x)$$
 subject to  $c_{\mathcal{E}}(x) = 0$  and  $c_{\mathcal{I}}(x) \ge 0$ 

where

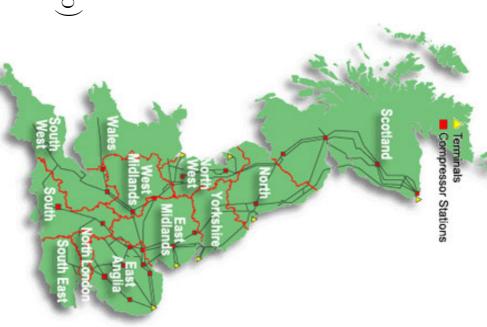
objective function 
$$f: \mathbb{R}^n \longrightarrow \mathbb{R}$$

constraints 
$$c_{\mathcal{E}}: \mathbb{R}^n \longrightarrow \mathbb{R}^{m_e} \ (m_e \leq n)$$
 and  $c_{\mathcal{I}}: \mathbb{R}^n \longrightarrow \mathbb{R}^{m_i}$ 

• there may also be integrality restrictions

#### AN EXAMPLE

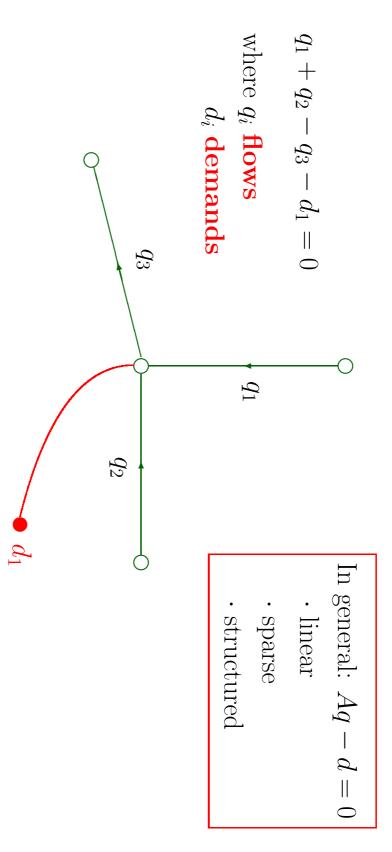
Optimization of a high-pressure gas network



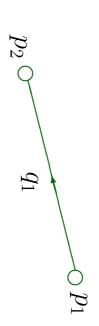
Transco National Transmission System

British Gas (Transco) Oxford University RAL

### NODE EQUATIONS



### PIPE EQUATIONS



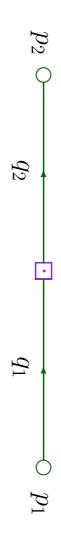
$$p_2^2 - p_1^2 + k_1 q_1^{2.8359} = 0$$

where  $p_i$  pressures  $q_i$  flows  $k_i$  constants

In general: 
$$A^T p^2 + Kq^{2.8359} = 0$$

- · non-linear
- · sparse
- · structured

# COMPRESSOR CONSTRAINTS



$$q_1 - q_2 + z_1 \cdot c_1(p_1, q_1, p_2, q_2) = 0$$

where  $p_i$  pressures  $q_i$  flows

 $z_i$  0–1 variables

= 1 if machine is on

 $c_i$  nonlinear functions

## In general: $A_2^T q + z \cdot c(p, q) = 0$

- · non-linear
- · sparse
- · structured
- · 0–1 variables

## OTHER CONSTRAINTS

## Bounds on pressures and flows

$$p_{\min} \le p \le p_{\max}$$
 $q_{\min} \le q \le q_{\max}$ 

• simple bounds on variables

#### **OBJECTIVES**

Many possible objectives

- maximize / minimize sum of pressures
- minimize compressor fuel costs
- ⊙ minimize supply
- + combinations of these

#### STATISTICS

British Gas National Transmission System

- $\circ$  199 nodes
- $\circ$  196 pipes
- ⊙ 21 machines

Steady state problem  $\sim 400$  variables

24-hour variable demand problem with 10 minute discretization  $\sim$ 58,000 variables

Challenge: Solve this in real time

## TYPICAL PROBLEM

This problem is typical of real-world, large-scale applications

- simple bounds
- ⊙ linear constraints
- $\odot$  nonlinear constraints
- o structure
- global solution "required"
- $\circ$  integer variables
- discretization

# (SOME) OTHER APPLICATION AREAS

- o minimum energy problems
- gas production models
- hydro-electric power scheduling
- o structural design problems
- portfolio selection
- o parameter determination in financial markets
- $\circ$  production scheduling problems
- o computer tomography (image reconstruction)
- efficient models of alternative energy sources
- traffic equilibrium models

# CLASSIFICATION OF OPTIMIZATION PROBLEMS

### DISCRETE (COMBINATORIAL)

x takes discrete (integer) values

PROGR-AMMING

LINEAR

Enumeration - sometimes trivial often HARD

### CONTINUOUS

x takes any values

Calculus Taylor's theorem