



Giardini di Naxos - Taormina 15-18 May 2005


## BzzMath: an Object Oriented Numerical Project

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## The BzzMath project

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- **BzzMath** is a numerical library developed from scratch in C++.
- Main C++ features:
  - Masking;
  - Encapsulation;
  - Polymorphism;
  - Inheritance.
- One-man-development-team, about 16 years of coding.
- At present **BzzMath** comprises:
  - Single and double precision arithmetic;
  - 234 classes;
  - 171 source files and 143 example files + tutorial + on-line user manual;
  - 2 libraries (Basic, Advanced);
  - .cpp and .hpp files sum up to 13.7 MB with 442,932 lines of code.



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## BzzMath structure

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<b>BzzMathBasic</b> <ul style="list-style-type: none"><li>➤ <b>Utilities</b><ul style="list-style-type: none"><li>○ Printing and Messages</li><li>○ Quadratic Equation</li><li>○ Matrix Coefficients Existence</li><li>○ Matrix Symmetric Coeff. Existence</li><li>○ Matrices Existence</li><li>○ Statistical Functions</li></ul></li><li>➤ <b>Interpolation</b></li><li>➤ <b>Cubic Interpolation</b><ul style="list-style-type: none"><li>○ Hermite</li><li>○ Smooth</li><li>○ Spline</li></ul></li><li>➤ <b>Bicubic Interpolation</b><ul style="list-style-type: none"><li>○ Hermite</li><li>○ Smooth</li><li>○ Spline</li></ul></li><li>➤ <b>Complex Algebra</b></li><li>➤ <b>Integer Algebra</b><ul style="list-style-type: none"><li>○ Vectors &amp; Matrices</li></ul></li><li>➤ <b>Linear Algebra</b><ul style="list-style-type: none"><li>○ Vectors</li><li>○ Matrices</li><li>○ Diagonal Matrices</li><li>○ Band Matrices</li><li>○ Left Matrices</li><li>○ Right Matrices</li><li>○ Sparse Matrices</li><li>○ Diagonal Block Matrices</li><li>○ Triagonal Block Matrices</li><li>○ Block Matrices</li><li>○ Rectangle Band Matrices</li><li>○ Symmetric Matrices</li><li>○ Band Symmetric Matrices</li><li>○ Sparse Symmetric Matrices</li></ul></li><li>➤ <b>Eigenvalues</b><ul style="list-style-type: none"><li>○ Symmetric Matrices</li></ul></li></ul>	<ul style="list-style-type: none"><li>➤ <b>Linear Systems</b><ul style="list-style-type: none"><li>○ Factored Gauss</li><li>○ Factored Band Gauss</li><li>○ Factored Triagonal Gauss</li><li>○ Factored Sparse Gauss</li><li>○ Factored Diagonal Block Gauss</li><li>○ Factored Triagonal Block Gauss</li><li>○ Factored LQ</li><li>○ Factored Sparse LQ</li><li>○ Factored QR</li><li>○ Factored Sparse QR</li><li>○ Factored SVD</li></ul></li></ul> <b>BzzMathAdvanced</b> <ul style="list-style-type: none"><li>➤ <b>Utilities</b><ul style="list-style-type: none"><li>○ Save &amp; Load</li><li>○ BzzPlot.exe &amp; BzzPlotSparse.exe</li></ul></li><li>➤ <b>Numerical Differentiation</b></li><li>➤ <b>Root finding</b></li><li>➤ <b>Non Linear Systems</b></li><li>➤ <b>Mono &amp; Multidimensional Minimization</b></li><li>➤ <b>Definite Integrals</b><ul style="list-style-type: none"><li>○ Integral</li><li>○ Integral Gauss</li></ul></li><li>➤ <b>ODE</b><ul style="list-style-type: none"><li>○ Multi Value Methods Ode Non Stiff</li><li>○ Runge-Kutta Methods Ode Non Stiff</li><li>○ Multi Value Methods Ode Stiff</li><li>○ Multi Value Methods Ode Stiff Sparse</li></ul></li><li>➤ <b>DAE</b><ul style="list-style-type: none"><li>○ Dae</li><li>○ Dae Sparse</li></ul></li><li>➤ <b>Regressions</b><ul style="list-style-type: none"><li>○ BzzLinearRegression.exe</li><li>○ Linear Regression</li><li>○ Linear Regression Experiments Search</li><li>○ Non Linear Regression</li></ul></li></ul>
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## Mixed language

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- It is possible to seamlessly mix C++ and Fortran code into one executable:
  - Fortran main calls C++ source code and C++ libraries;
  - Fortran main calls C++ libraries;
  - C++ main calls Fortran subroutines and functions;
  - C++ main calls Fortran obj-files or libraries;
- Fortran 77 or higher source code required;
- Only a Fortran compiler may be sufficient when adding C++ libraries.

**EXAMPLE:** call the **BzzMath** ODE solver from a Fortran program:

```
call BzzOde(iState, nEq, tIn, tOut, y)
```

Or with more options (lower and upper bounds on the integration variables, absolute and relative tolerances, critical integration points):

```
call BzzOde(iState, nEq, tIn, tOut, y, iMinMax, yMin, yMax,  
           iTol, aTol, rTol, iCrit, tCrit)
```

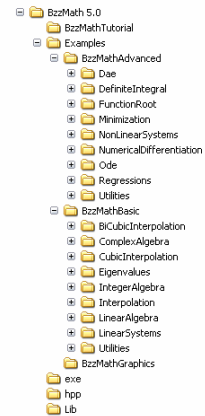
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## BzzMath availability

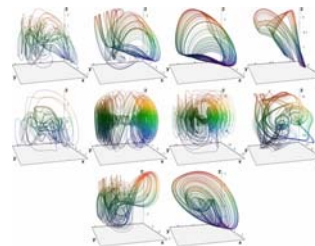
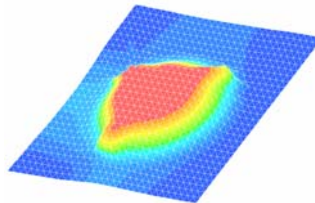
- **BzzMath** is available on the Internet:
  - [www.chem.polimi.it/homes/gbuzzi/](http://www.chem.polimi.it/homes/gbuzzi/)
- **BzzMath** is free for non-commercial use.
- The user can download the last version of **BzzMath 5.0**
- A zipped file of about 20 MB comprises all the libraries, examples, tutorials and on-line manuals.

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## Applied numerical examples

- Some of the **BzzMath** features will be presented through applied numerical examples:
  - Robust root finding;
  - Robust minimization;
  - Robust multidimensional minimization;
  - ODE and DAE solvers;
  - Customized solver for nonlinear algebraic equations.



## Robust root finding

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- **PROBLEM:** Find the roots of a nonlinear algebraic equation  $y(x) = 0$
- **CONDITIONS:** If the numerical problem is characterized by one or more of the following features:
  - We do not know the two points  $x_A, x_B$  where  $y(x_A)y(x_B) < 0$
  - The problem has several roots;
  - The function is not defined in some intervals or points;
  - The function does not change sign within the user-defined interval.

- **SOLUTION**

**BzzFunctionRootDoubleRobust** is the suggested class.



## Robust root finding

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- **EXAMPLE:** Find the roots of the following function

$$y = \left| \log \left[ 720 + x \left( -720 + (x-1) \left( 360 + (x-2) \left( -120 + (x-3) \left( 30 + (x-4) (-11+x) \right) \right) \right) \right) \right] - 1 \right|$$

within the user-defined interval  $x_{low} = 0$   $x_{up} = 7$

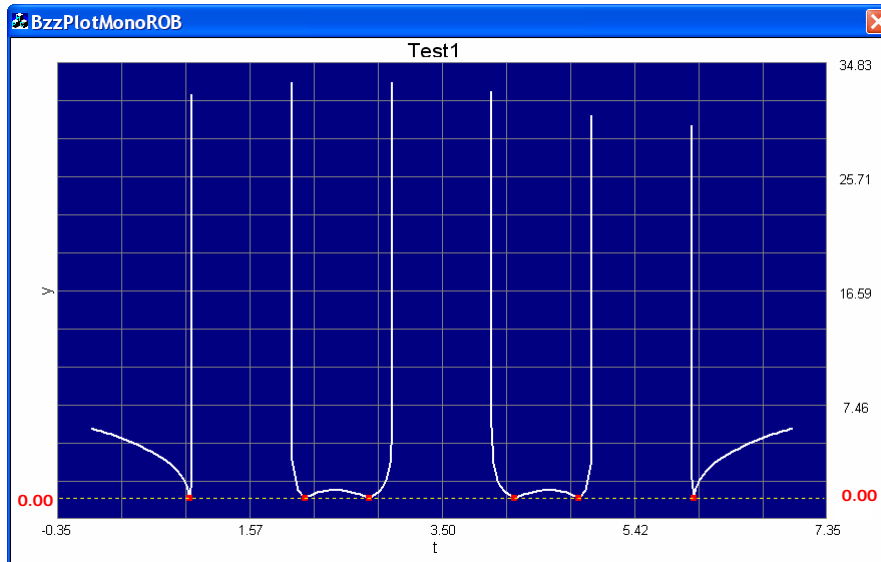
- **REMARK:** the function is **not defined** if

$$\left[ 720 + x \left( -720 + (x-1) \left( 360 + (x-2) \left( -120 + (x-3) \left( 30 + (x-4) (-11+x) \right) \right) \right) \right) \right] \leq 0$$

- **SOLUTION:** the function has **six roots** in the user-defined interval.

## Robust root finding

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## Robust monodim. minimization

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- **PROBLEM:** minimization of a monodimensional function  $\text{Min}_x F(x)$
- **CONDITIONS:** If the numerical problem is characterized by one or more of the following features:
  - We do not know the/an interval where the function is unimodal;
  - The problem has several minima;
  - The function is not defined in some intervals or points;
  - The function and/or its derivatives are discontinuous in some intervals or points;
  - The function is not parabolic near the minimum.

- **SOLUTION**

**BzzMiniMiniZati onDoubleRobust** is the suggested class.



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## Robust monodim. minimization

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- **EXAMPLE:** Find the minima of the following function

$$F = 10|x - 6| + \sqrt{\left(-945 + x\left(1689 + x\left(-950 + x\left(230 + x(-25 + x)\right)\right)\right)\right)} + \exp(-x)$$

within the user-defined interval  $x_{low} = 0$   $x_{up} = 9.1$

- **REMARK:** the function is **not defined** if

$$\left[\left(-945 + x\left(1689 + x\left(-950 + x\left(230 + x(-25 + x)\right)\right)\right)\right)\right] + \exp(-x) < 0$$

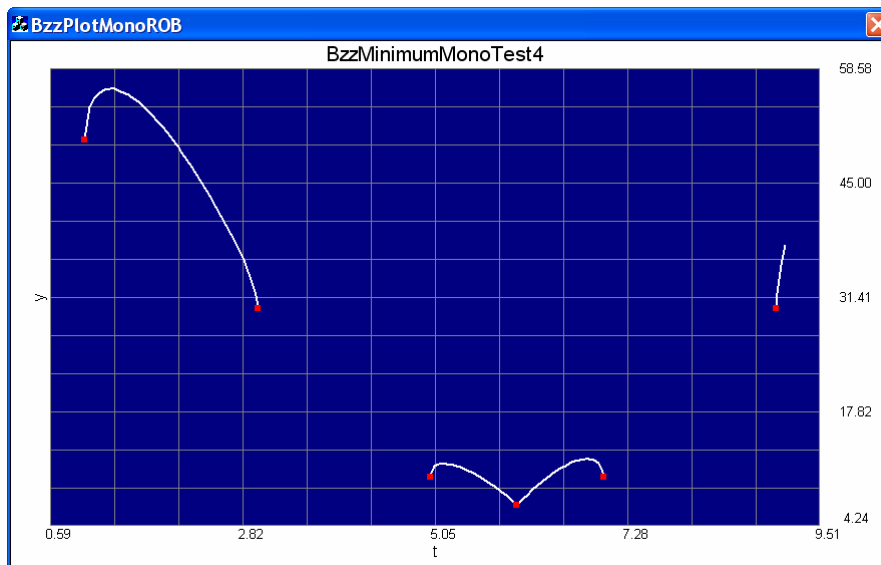
- **REMARK:** the first derivative is discontinuous in  $x = 6$
- **SOLUTION:** the function has **six minima** in the user-defined interval.

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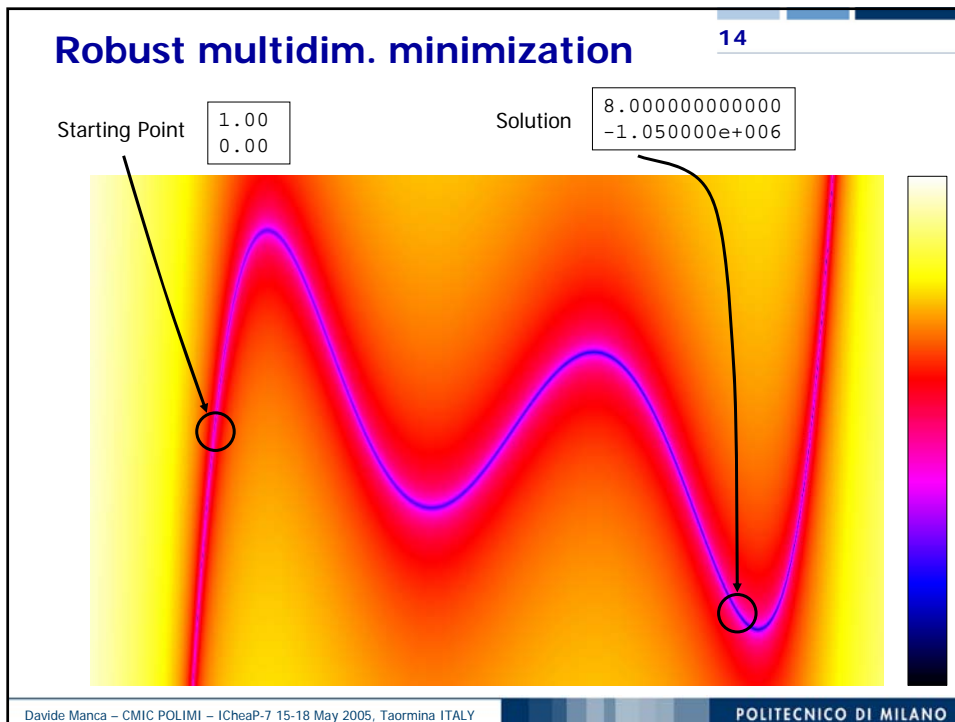
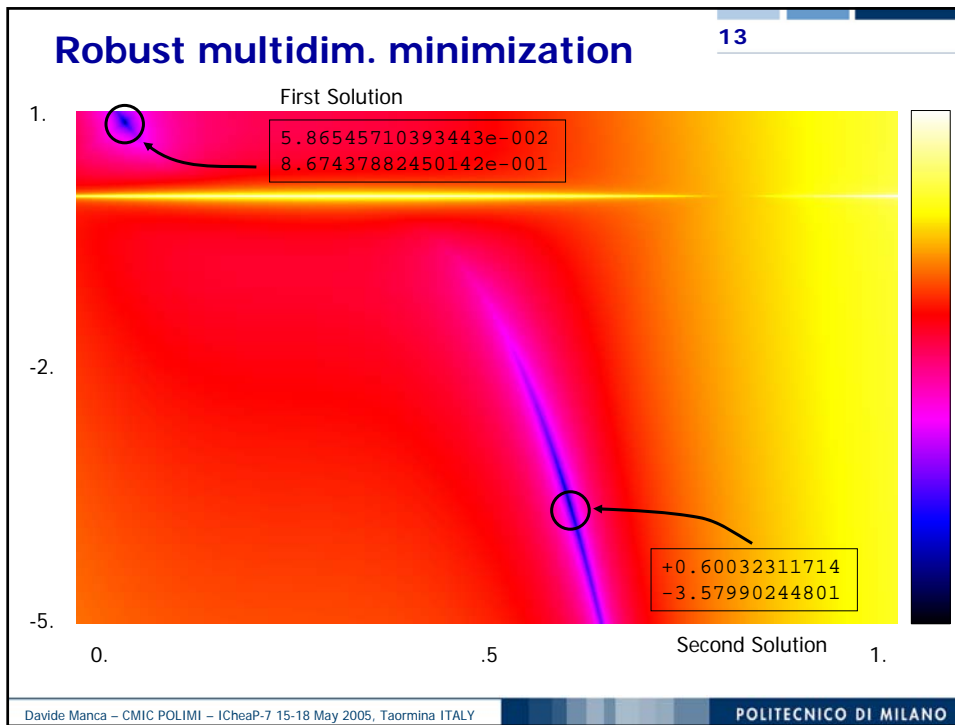
## Robust monodim. minimization

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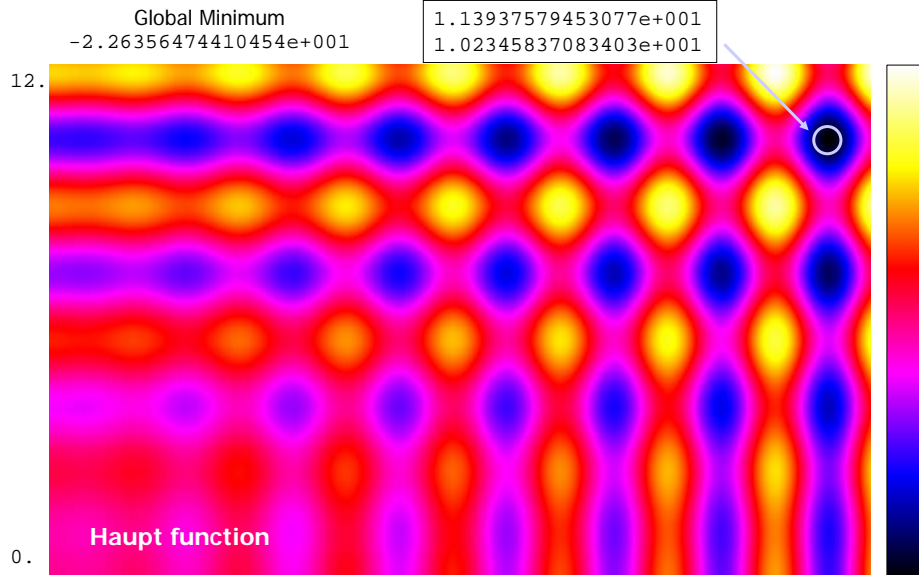
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## Robust multidim. minimization

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## ODE and DAE systems

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- **PROBLEM:** Integration of stiff/non stiff **ODE** systems with initial conditions

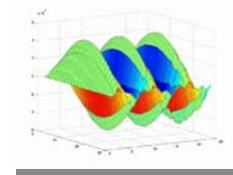
$$\mathbf{y}' = \mathbf{f}(\mathbf{y}, t) \quad \mathbf{y}(t_0) = \mathbf{y}_0$$

Integration of **DAE** systems with initial conditions

$$\begin{cases} \mathbf{y}' = \mathbf{f}(\mathbf{y}, t) & \mathbf{y}(t_0) = \mathbf{y}_0 \\ \mathbf{g}(\mathbf{y}, t) = \mathbf{0} \end{cases}$$

- **FEATURES:**

- Robustness and efficiency;
- Highly oscillating problems;
- Problems with large discontinuities in the derivatives;
- Lower/upper bounds for the integration variables;
- Structured and non-structured Jacobians (banded, sparse, block, tridiagonal, ...)



- **SOLUTION:** **BzzOde** and **BzzDae** are the suggested classes.

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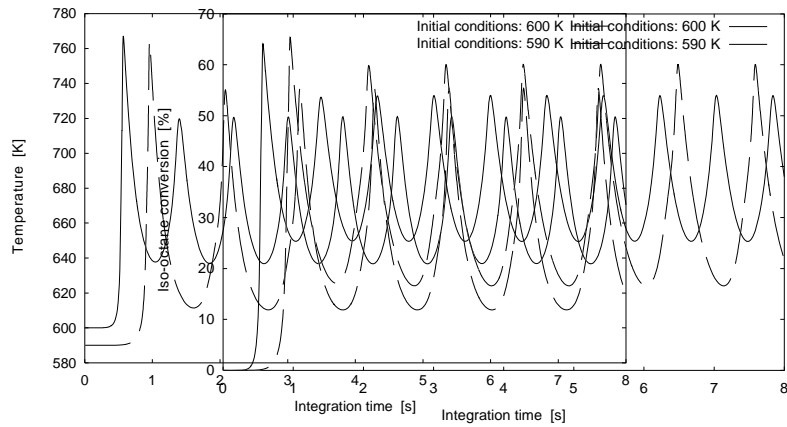
## ODE and DAE systems

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### Homogeneous combustion of iso-octane

Low temperature oxidation mechanisms and oscillating cool flames observed in a Jet Stirred Reactor

200 Ordinary differential equations



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## ODE and DAE systems

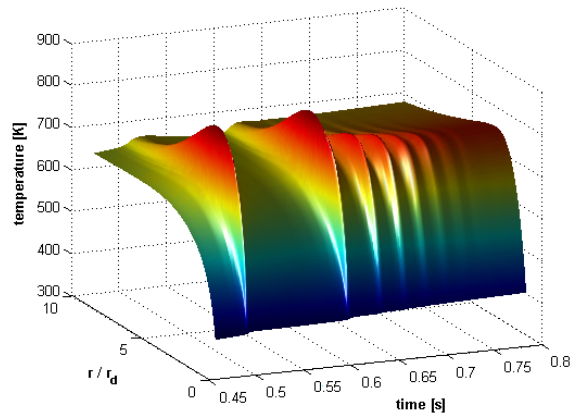
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### Evaporation and combustion of a fuel droplet

Kinetics: 200 species and over 5,000 reactions

Between 25,000 and 65,000 Differential and Algebraic Equations

About 2 days of CPU time on a Pentium IV @ 2.8 GHz

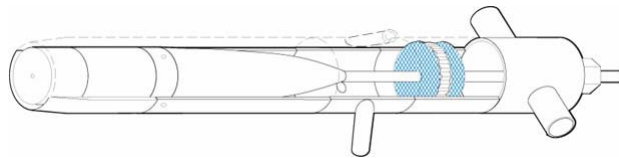


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## Large nonlinear algebraic systems <sup>19</sup>

- **PROBLEM:** Evaluation of the macro and micropollutant concentrations produced by a nonpremixed burner.
  - Case-study: Sidney University and Sandia National Laboratories;
  - Nonpremixed Flame:  $\text{CH}_4/\text{H}_2$  are premixed 50%-50% + air (lean).
- **TEMPERATURE PROFILE:** determined by Fluent 6.1
- **POSTPROCESSING AND DETAILED KINETICS:** **ReaNet** is a custom C++ program based on **BzzMath** Libraries.



## Large nonlinear algebraic systems <sup>20</sup>

- **OPERATING SEQUENCE**
  - **FLUENT INPUT:** axial-symmetric geometry, non-structured grid with 34632 cells, very simplified kinetic scheme: **5 species** ( $\text{CH}_4$ ,  $\text{O}_2$ ,  $\text{CO}$ ,  $\text{CO}_2$ ,  $\text{N}_2$ ) and **2-3 reactions**.
  - **FLUENT OUTPUT:** temperature, velocity and macro-species profiles.
  - **REANET INPUT:**
    - Assigned temperature and velocity profiles;
    - First guess macro-species profiles evaluated by Fluent.;
    - Detailed kinetic scheme: **105 species** and **1534 elementary reactions**.
  - **REANET OUTPUT:**
    - Detailed concentration profiles of macro and micro-pollutants;
    - Outlet concentrations of key components:  $\text{NO}_x$ ,  $\text{CO}$ ,  $\text{HCN}$ ,  $\text{C}_2\text{H}_2$ ,  $\text{CH}_2\text{O}$ ,  $\text{C}_2\text{H}_6$ , ...

## Large nonlinear algebraic systems <sup>21</sup>

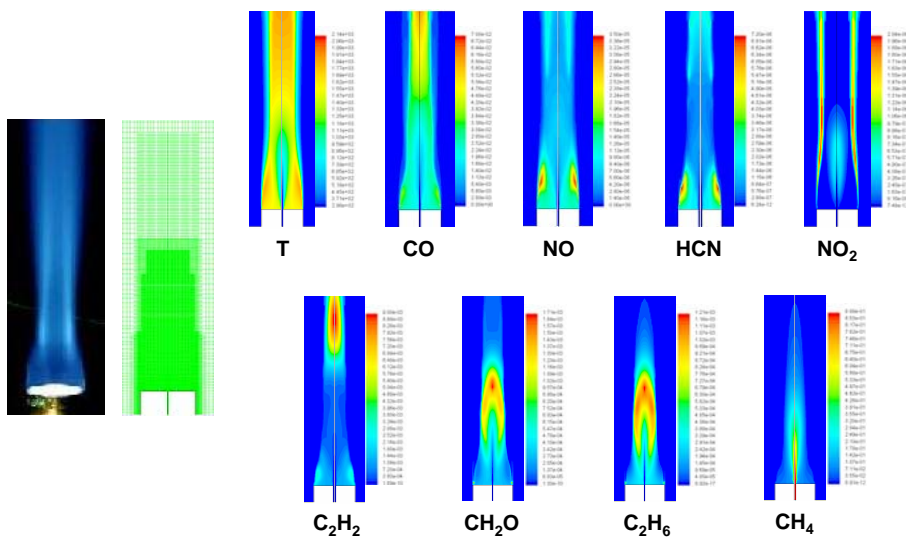
- **SOLUTION**

- **NUMERICAL MODELING:** the problem is described by a large system of nonlinear equations.
- **EQUATIONS COUNT:**
  - **34,632 cells \* 105 species** → **3,636,360** nonlinear equations.
- **NUMERICAL ALGORITHM:**
  - Local Newton method (on each reactor)
    - Continuation method through integration of an ODE system;
  - Iterative substitutions;
  - Global Newton method parametric continuation
    - Parametric continuation on the whole reactors network;
- **BZZMATH CLASS:** **BzzCSTRNetwork** derived from **BzzNLS**.
- **CPU TIME:** 20 hours of CPU on a Pentium IV @ 2.8 GHz with 2 GB di RAM.

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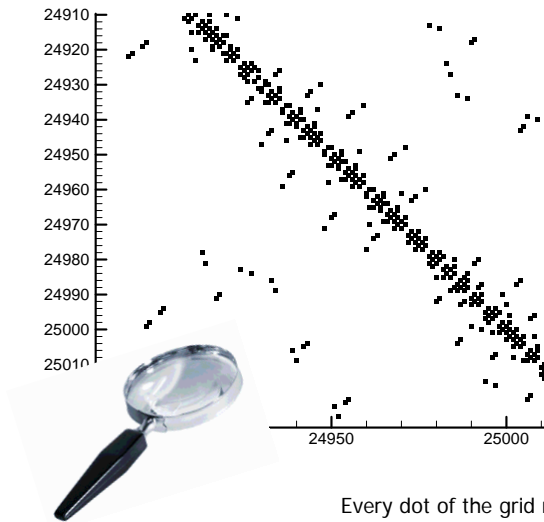
## Large nonlinear algebraic systems <sup>22</sup>



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## Large nonlinear algebraic systems 23



**Grid layout**

Every dot of the grid represents a physical interaction between two adjacent cells.  
Every dot is a  $105 \times 105$  matrix).