













# Hands on session: Cantera

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## Hands on session: Cantera

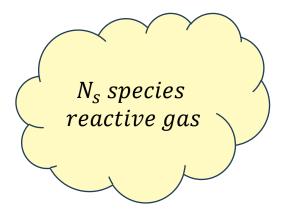
- A review of premixed one-dimensional flames theory
  - Setup
  - Solving
- Using Cantera to solve the premixed flame
  - Aided by some code blocks
  - Scripts for H2 flames that you can run during the presentation
  - Exercise to complete from scratch



## **One-dimensional laminar flame**

• Goal: Solve transport equations for  $N_S$  reactive gas in a 1D domain

Pump fully premixed at  $\phi_{mix}$ 

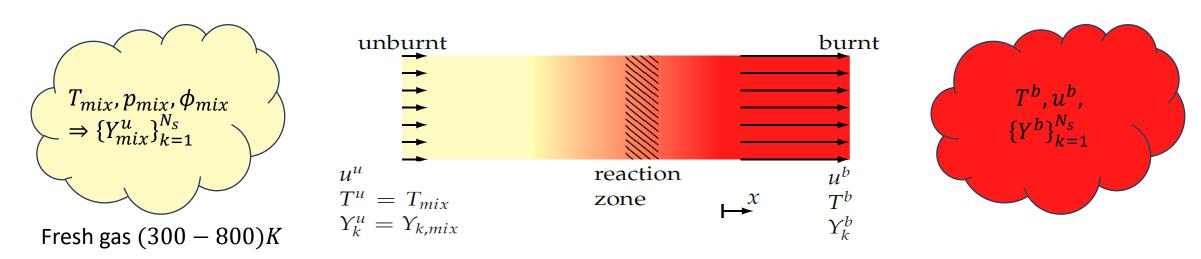


$$x = 0$$
 Dirichlet BC

$$x = L$$
 null Neumann BC

$$\begin{cases} \frac{\partial \rho}{\partial t} + \nabla \cdot (\rho \mathbf{u}) = 0 \\ \frac{\partial (\rho Y_k)}{\partial t} + \nabla \cdot (\rho \mathbf{u} Y_k) + \nabla \cdot \underbrace{(\rho \mathbf{V}_k Y_k)}_{j_k} = \dot{\omega}_k \\ \frac{\partial (\rho \mathbf{u})}{\partial t} + \nabla \cdot (\rho \mathbf{u} \otimes \mathbf{u}) = -\nabla p + \nabla \cdot \boldsymbol{\tau}, \\ \frac{\partial (\rho h)}{\partial t} + \nabla \cdot (\rho \mathbf{u} h) + \nabla \cdot \underbrace{(-\lambda \nabla T + \rho \sum_{k=1}^{N_s} (\mathbf{V}_k + \mathbf{V}_c) Y_k h_k)}_{j_h} = 0 \end{cases}$$

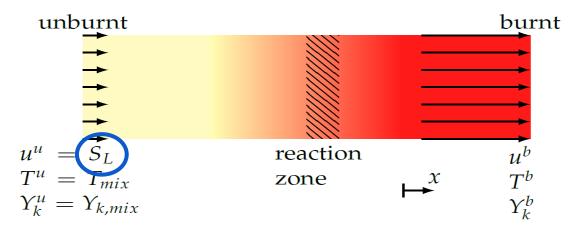
## **One-dimensional laminar flame**



- Seen from reaction zone heat, reaction products, and radicals diffuse towards unburnt mixture
- ullet Through this process, at certain point of the reaction zone T becomes sufficiently high and radicals sufficiently abundant
- Strong reactions occur, consuming the fuel and oxidizer.
- At some time: Steady state; Unburnt gases velocity =  $s_L$
- Two ways of solving the problem

# One-dimensional laminar flame (steady)

Solving the problem in the steady state



$$\frac{\partial \rho}{\partial t} + \frac{\partial}{\partial x}(\rho u) = 0 \implies \rho u = \rho^{u} s_{L} = cst$$
Laminar flame speed

Characteristic value of the problem: dependent only of the inlet mixture state



$$\forall k: \quad \frac{\partial}{\partial x} \left( \rho u Y_k \right) + \frac{\partial}{\partial x} \left( \rho V_k Y_k \right) = \dot{\omega}_k$$

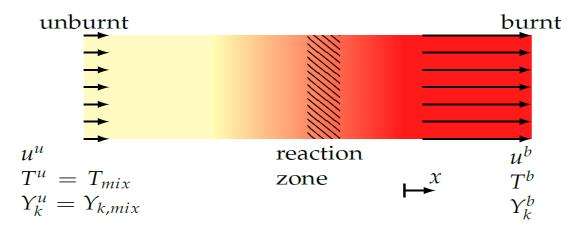
$$\frac{\partial}{\partial x} (\rho u h) - \frac{\partial}{\partial x} \left( \lambda \frac{\partial T}{\partial x} + \rho \sum_{k=1}^{N_s} (V_k + V_c) h_k Y_k \right) = 0$$

- Solving the steady state needs dedicated care
  - A "cold flow" solution exists, where species mass fractions are practically constant
  - 1D solvers take dedicated care in forcing the reacting solution (i.e. Cantera)



# One-dimensional laminar flame (unsteady)

Solving the problem in the unsteady state



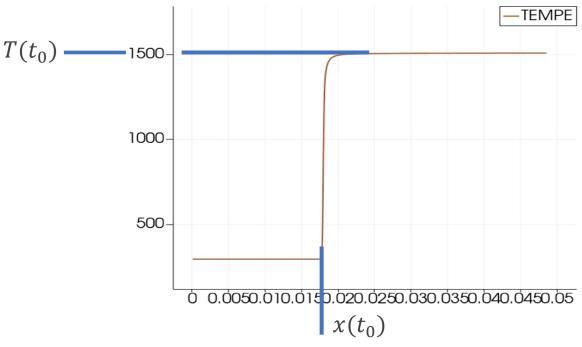
- Inlet velocity  $u^u$  is not an unknown
- The reaction zone moves (unless  $u^u = s_L$ )
- After initial transient state, fluid reaches a moving flame front (if the reacting zone is sufficiently far from boundaries)

Choose reference frame fixed to the flame front:

$$u_{RF} = u - (u^{u} - s_{L})$$

$$\rho u_{RF} = constant = \rho^{u} u_{RF}^{u} = \rho^{b} u_{RF}^{b}$$

$$\Rightarrow s_{L} = \frac{u^{b} - u^{u}}{(\rho^{u}/\rho^{b}) - 1}$$





# Hands-on session: Practice



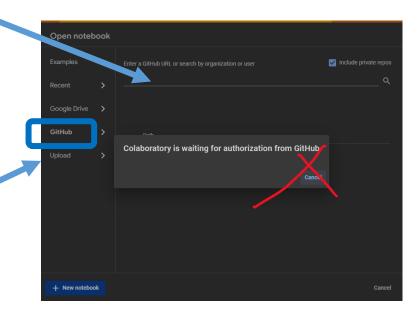
## **Material**

- Material <a href="https://github.com/burn-research/ercoftac2023-workshop">https://github.com/burn-research/ercoftac2023-workshop</a>
- Option 1 (RECOMMENDED Fully remote with google colab)
  - https://colab.research.google.com/

- Option 2 (Mixed remote with google colab)
  - Download material from 'Cantera' directory of Git
  - Upload scripts using the Upload function

- Option 3 (Local installation of python)
  - Requirements: cantera, jupyter, matplotlib, numpy, pandas, tqdm







Cantera is an open-source suite of tools for problems involving chemical kinetics, thermodynamics, and transport processes

- Multiple interfaces: Python, Matlab, C/C++, Fortran
- User friendly: Object-oriented with easy custom inputs
- Broad range of applications:
  - Combustion
  - Detonation
  - Electrochemical energy conversion and storage
  - Fuel cells
  - Batteries
  - Aqueous electrolyte solutions
  - Plasmas
  - Thin flame deposition



Cantera defines mixtures as Solution objects (A class for chemically-reacting solutions) (0\_mixtures.ipynb)

```
import cantera as ct
mechanism = "gri30.yaml"
gas = ct.Solution(mechanism)
# Can epresent any type of solution, i.e. -
# mixture of gases, a liquid solution, or a solid
# solution.
print(gas())
```

- gri30.yaml (GRI-Mech 3.0)
  - Comes installed with Cantera
  - 325 reactions that involve 53 species.
  - Thermochemical properties of species
  - Kinetic reactions



300 K

1.0133e+05 Pa

density 0.081894 kg/m^3

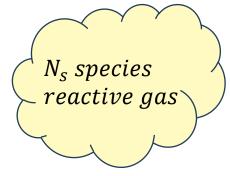
2.016 kg/kmol

1 kσ

phase of matter gas

pressure

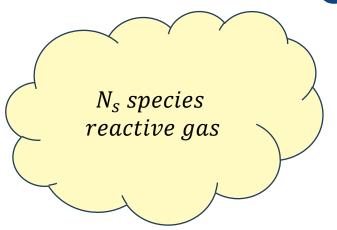
mean mol. weight



	ı kg	I KIIIOI	
enthalpy	26469	53361	J
internal energy	-1.2108e+06	-2.441e+06	J
entropy	64910	1.3086e+05	J/K
Gibbs function	-1.9447e+07	-3.9204e+07	J
heat capacity c_p	14311	28851	J/K
heat capacity c_v	10187	20536	J/K
	mass frac. Y	mole frac. X	chem. pot. / RT
H2	1	1	-15.717
[ +52 minor]	0	0	

1 kmol





 $T_{mix}, p_{mix}, \phi_{mix} (Z_{mix}) \Rightarrow \{Y_{mix}^u\}_{k=1}^{N_S}$ 

• Fuel: H2

• Oxidizer: Air

```
# Define gas properties

T_mix = 300.0 # K

p_mix = ct.one_atm

phi_mix = 0.5

X_fuel = {"H2": 1.0}

X_oxidizer = {"O2": 1.0, "N2": 3.76}
```

```
# Setting gas state method 1
gas.TP = T_mix, p_mix
gas.set_equivalence_ratio(phi_mix, X_fuel, X_oxidizer, basis="mole")
DEFAULT MOLE
```

```
# Setting gas state method 2

X_mix = {"H2": 0.17361, "O2": 0.17361, "N2": 0.65278}

gas.TPX = T_mix, p_mix, X_mix
```

```
# Setting gas state DANGEROUS
gas.TP = T_mix, p_mix
gas.X = X_mix
```



#### (0\_mixtures.ipynb)

- h2o2.yaml
  - Comes installed with Cantera
  - Hydrogen-Oxygen submechanism extracted from GRI-Mech 3.0.
  - Reduced to 10 species (much faster than gri30)
  - Modified from the original to include N2.

<u>https://www.cerfacs.fr/cantera/mechanisms/hydro.php</u> (More mechanisms and better details)

https://cantera.org/tutorials/input-files.html
(Converting mechanism formats)

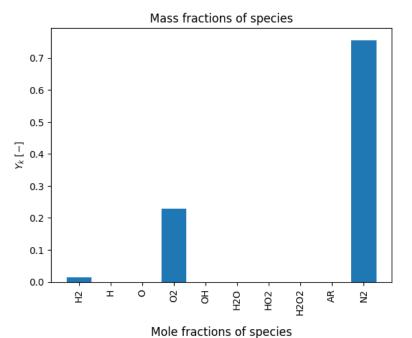
```
T mix = 300.0
p_mix = ct.one_atm
phi mix = 0.5
X_{fuel} = {"H2": 1.0}
X_oxidizer = {"O2": 1.0, "N2": 3.76}
mechanism = "h2o2.yaml"
gas = ct.Solution(mechanism)
gas.TP = T_mix, p_mix
gas.set_equivalence_ratio(phi_mix, X_fuel,
X_oxidizer)
print(gas())
```

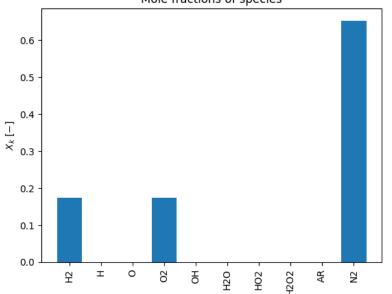


#### ohmech:

density mean mol. weight	300 K 1.0133e+05 Pa 0.98273 kg/m^3 24.192 kg/kmol gas		
	1 kg	1 kmol	
enthalpy	2262.9	54745	J
internal energy	-1.0084e+05	-2.4396e+06	J
entropy	7889.7	1.9087e+05	J/K
Gibbs function	-2.3646e+06	-5.7206e+07	J
heat capacity c_p	1202.5	29091	J/K
heat capacity c_v	858.8	20776	J/K
	mass frac. Y	mole frac. X	chem. pot. / RT
H2	0.014468	0.17361	-17.468
02	0.22963	0.17361	-26.425
N2	0.7559	0.65278	-23.46
[ +7 minor]	0	0	
Barcelona Supercomputing			

Centro Nacional de Supercomputación





## **Cantera: Flames**

- Cantera defines flames as Flame objects which NEED a Solution objects
- This tutorial: Premixed flames

```
# Define gas properties

T = 300.0

p = ct.one_atm

phi = 0.5

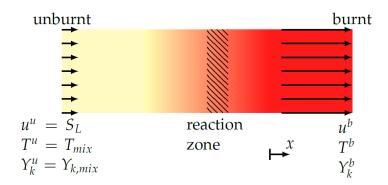
X_fuel = {"H2": 1.0}

X_ox = {"O2": 1.0, "N2": 3.76}
```

```
# Setting gas state
gas.TP = T, p gas.set_equivalence_ratio(phi, X_fuel, X_ox)
```

Create object: ct.FreeFlame





## **Cantera: Flames**

- Cantera defines flames as Flame objects which NEED a Solution objects
- This tutorial: Premixed flames (1\_first\_flame.ipynb)

```
width = 0.03 # m
npoints = 19 # grid points - 1
initial_grid = [x * width / npoints for x in range(npoints+1)]

gas1 = ct.Solution(mechanism)
gas1.TP = T, p
gas1.set_equivalence_ratio(phi_mix, X_fuel, X_ox)

flame1 = ct.FreeFlame(gas1, grid=initial_grid)
flame1.solve(loglevel=1)
```

```
# Define gas properties
T = 300.0
p = ct.one_atm
phi = 0.5
X_fuel = {"H2": 1.0}
X_ox = {"O2": 1.0, "N2": 3.76}
mechanism = "h2o2.yaml"
```

```
width = 0.03 # m

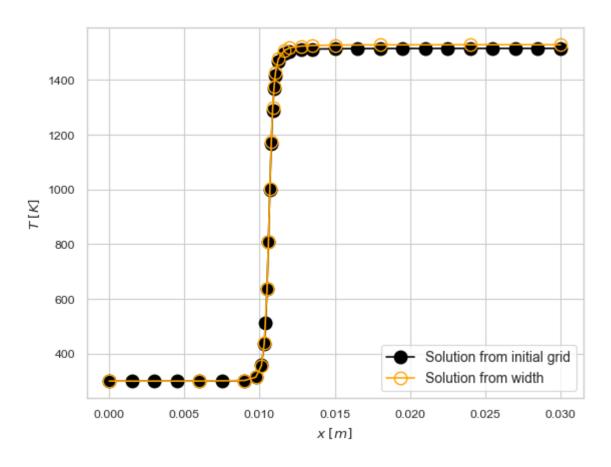
gas2 = ct.Solution(mechanism)
gas2.TP = T, p
gas2.set_equivalence_ratio(phi, X_fuel, X_ox)

flame2 = ct.FreeFlame(gas2, width=width)
flame2.solve(loglevel=1)
```

CAREFUL: After solving, Cantera changes gas object thermochemical state



## **Cantera: Flames**



- Plot flame.grid vs flame.T
- Adaptive mesh refinement



# **Disgression: Transport models**

#### Diffusive term of species

$$\frac{\partial(\rho Y_k)}{\partial t} + \nabla \cdot (\rho \boldsymbol{u} Y_k) + \nabla \cdot \underbrace{(\rho \boldsymbol{V}_k Y_k)}_{j_k} = \dot{\omega}_k$$

Multicomponent species diffusion

To determine  $V_k$ :  $\forall p = 1, N_s$ :

$$\nabla X_{p} = \sum_{k=1}^{N_{s}} \frac{X_{p} X_{k}}{\mathcal{D}_{pk}} (V_{k} - V_{p}) + (Y_{p} - X_{p}) \frac{\nabla P}{P} + \frac{\rho}{p} \sum_{k=1}^{N_{s}} Y_{p} Y_{k} (f_{p} - f_{k})$$

- Complex and costful
  - Linear system of size  $N_s^2$
  - Solve at every time
  - Solve at every physical space point

#### Mixture-averaged approximation

Hirschfelder and Curtiss approximation: best first-order approximation to the exact resolution

$$V_k X_k = -D_k \nabla X_k,$$
  $D_k = \frac{1 - Y_k}{\sum_{j \neq k} X_j / \mathcal{D}_{jk}}$ 

$$\Rightarrow \frac{\partial \rho Y_k}{\partial t} + \frac{\partial \rho u_i Y_k}{\partial x_i} = \frac{\partial}{\partial x_i} \left( \rho D_k \frac{W_k}{W} \frac{\partial X_k}{\partial x_i} \right) + \dot{\omega}_k$$

Similar but different to Fick's Law  $\left(\rho D_k \frac{\partial Y_k}{\partial x_i}\right)$ 

Unity-Lewis approximation

Ratio of thermal diffusivity and mass difussivity

$$Le_k = \frac{\lambda}{\rho c_p D_k}$$
  $\forall k: 1, N_s: Le_k = 1 \Rightarrow D_k = \frac{\lambda}{\rho c_p}$ 



# **Cantera: Transport models**

- Cantera offers the three options
  - Setting up transport model (Before 3.0)
    - "mixture-averaged" ("Mix")
    - "multicomponent" ("Multi")
    - "unity-Lewis-number" ("UnityLewis")
- By default, cantera selects mixture average approximation

gas = ct.Solution(mechanism)
print(gas.transport\_model)

'mixture-averaged'

Two ways of setting it up

# 1) Directly to the mixture object
gas.transport\_model = "multicomponent"

#2) Set the flame object

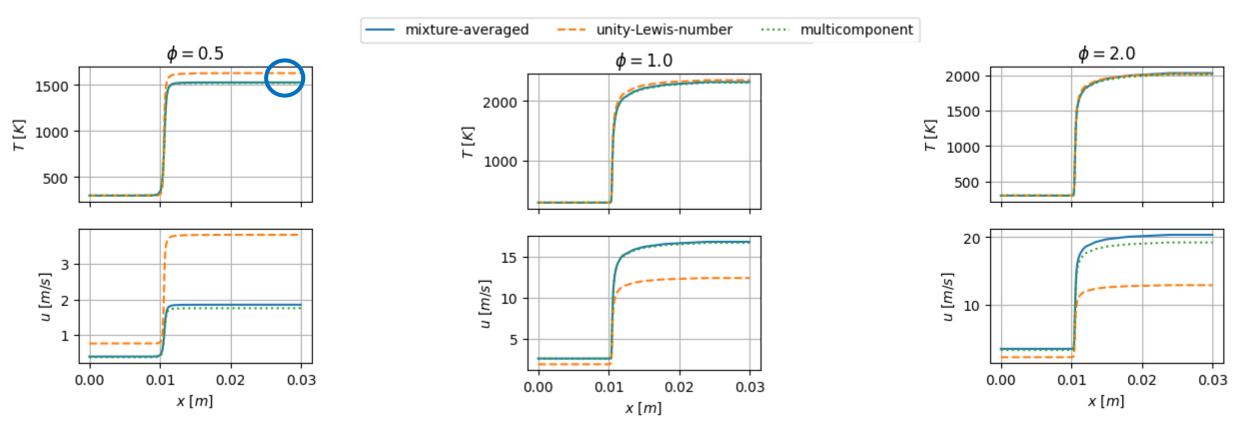
gas = ct.Solution(mechanism)
flame = ct.FreeFlame(gas, width=0.3)
flame.transport\_model = "multicomponent"
print(gas.transport\_model)

'multicomponent'



# **Cantera: Transport models**

- (2\_flame\_vs\_transport\_model.py)
- Part 1) Play around with parameters  $T, p, \phi$





## **Cantera: Numerics**

Summary of (2 flame vs transport model.py)

transport\_models = ["mixture-averaged", "unity-Lewis-number", "multicomponent"]

```
flames = {}
properties = {}
for transport_model in transport_models:
    gas = ct.Solution(mechanism)
    gas.TP = T, p gas.set_equivalence_ratio(phi, X_fuel, X_ox)

flame = ct.FreeFlame(gas, width=width)
    flame.transport_model = transport_model
    flame.solve(loglevel=1)
    flames[transport_model] = flame
```

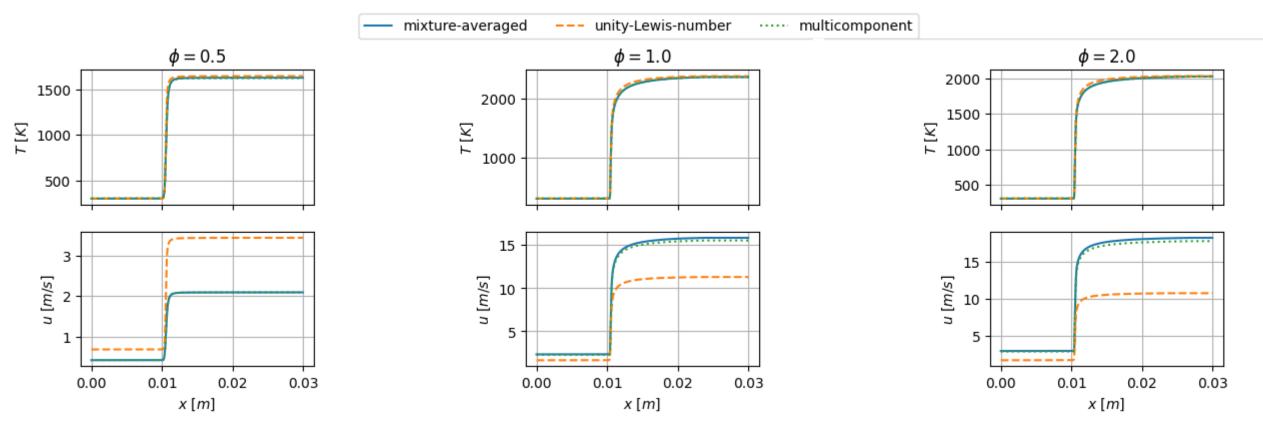
```
flame.energy_enabled = True # Solve T equation
# Number of times reusing Jacobian before recalculation
flame.set_max_jac_age(10, 10)
# Try 10 steps of 1e-8 s, then if it fails try 20 steps ...
flame.set time step(1e-8, [10, 20, 40, 80, 100, 100, 150])
# [rtol, atoll] for steady-state problem
flame.flame.set_steady_tolerances(default=[1.0e-5, 1.0e-9])
flame.flame.set_transient_tolerances(default=[1.0e-5, 1.0e-9])
# Max timestep
flame.max_time_step_count = 5000
flame.set_refine_criteria(ratio=2, slope=0.05, curve=0.05,
prune=0.01) # Grid refinement criteria
```



Details at <a href="https://coec-project.eu/training/ercoftac-course-understanding-and-predicting-hydrogen-combustion/">https://coec-project.eu/training/ercoftac-course-understanding-and-predicting-hydrogen-combustion/</a> (Hands-on 1 Hydrogen Flames With Cantera)

# **Cantera: Transport models**

- (3\_flame\_vs\_transport\_model\_better\_numerics.py)
- Part 1) Play around with parameters  $T, p, \phi$





## **Cantera: Mixture fraction**

- 1D Flames are the ideal fully premixed combustion setup
  - Completely characterized by equivalence ratio  $\phi$
  - Bilger, Stårner, and Kee (1990) introduced the local mixture fraction
  - Elements are not created/destroyed by chemical reactions (C, H, O)

#### From elemental mass fractions

$$Z_{mass,m} = \sum_{k}^{Ns} \frac{a_{m,k} W_m}{W_k} Y_k \implies b = 2 \frac{Z_{mass,C}}{W_C} + 0.5 \frac{Z_{mass,H}}{W_H} - \frac{Z_{mass,O}}{W_O},$$

number of atoms of element m in species k

# From mixture

Z\_H = gas.elemental\_mass\_fraction("H") # A unique value

# From the flame

Z\_H = flame.elemental\_mass\_fraction("H") # Across all points in grid

• Given any fuel + oxidizer, calculate  $b_{fuel}$  and  $b_{oxidizer}$ 

$$Z(\phi) = \frac{b(\phi) - b_{oxidizer}}{b_{fuel} - b_{oxidizer}}$$



## **Cantera: Mixture fraction**

$$Z(\phi) = \frac{b(\phi) - b_{oxidizer}}{b_{fuel} - b_{oxidizer}} = Z_{st} + \frac{1}{b_f - b_o} \sum_{k=1}^{N_C} b_k Y_k,$$

where

It follows that

$$b_k = \left(2\frac{a_{C,k}}{W_k} + 0.5\frac{a_{H,k}}{W_k} - \frac{a_{O,k}}{W_k}\right).$$

$$\phi = \frac{Z}{1 - Z} \frac{1 - Z_{\rm st}}{Z_{\rm st}}$$

Finally, using the fact that  $Z = \text{linear combination of } Y_k \Rightarrow \frac{\partial (\rho Z)}{\partial t} + \nabla \cdot (\rho u Z) + \nabla \cdot (\mathbf{j}_Z) = 0$ 

- Exercise at home  $Z_{in} = Z_{out}$
- The same argument holds for enthalpy  $h_{in}=h_{out}$



# **Cantera: Transport models**

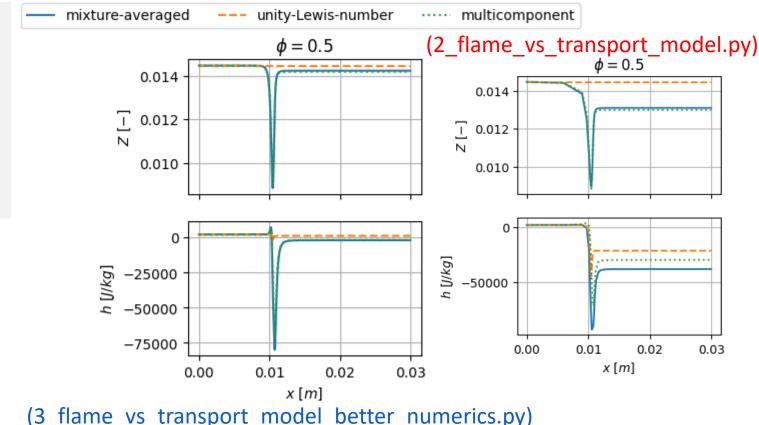
- (3\_flame\_vs\_transport\_model\_better\_numerics.py)
- Part 2) 1D Flames are the perfect setup to study preferential diffusion

$$\frac{\partial(\rho Z)}{\partial t} + \nabla \cdot (\rho u Z) + \nabla \cdot (\mathbf{j}_Z) = 0$$

Exercise at home  $Z_{in}=Z_{out}$ , the same argument holds for enthalpy  $h_{in}=h_{out}$ 

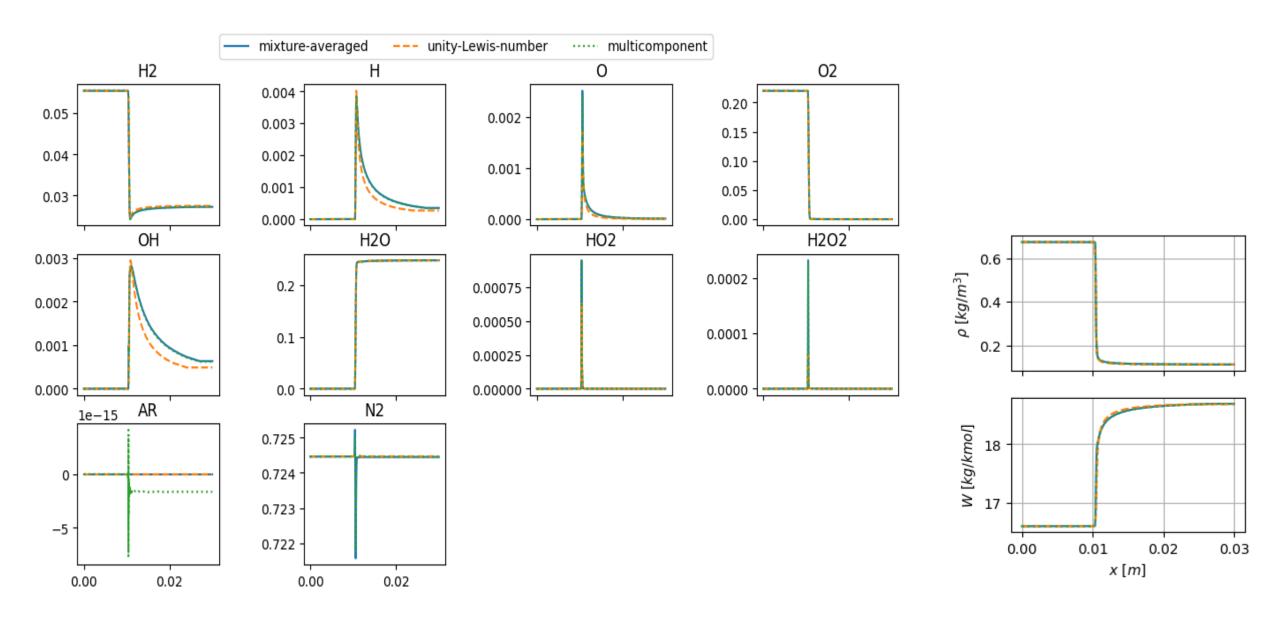
```
properties = {}
for transport_model in transport_models:
    previous_loop()

b = bilger_from_flame(flame, gas, bilger_weights)
Z = (b - b_ox) / (b_fuel - b_ox)
    phi_flame = phi_from_Z(Z, Z_st)
```





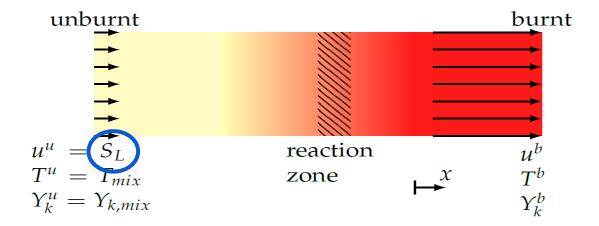
# **Cantera: Transport models**



# Cantera: Flame speed

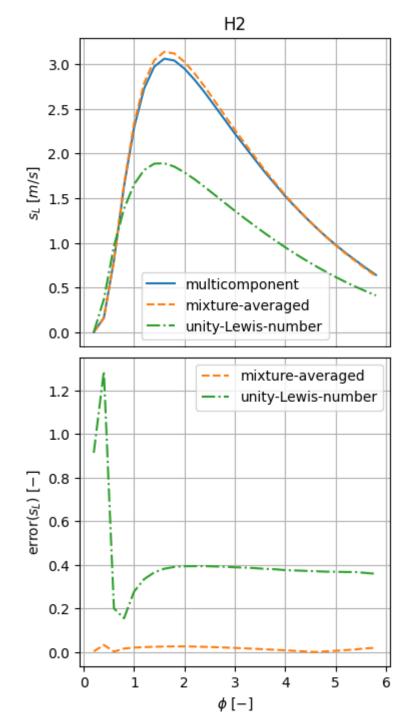
#### (4\_flame\_spped.py); take some time to run

- Transport comparison:
  - Loop through transport models
  - Loop through  $\phi \in [0.5, 6]$
- Where is the laminar flame speed in Cantera  $s_L$ ?





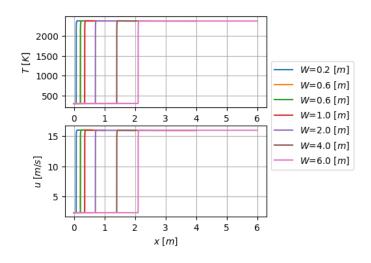
$$error(s_L) = \left| \frac{s_L^{transport} - s_L^{multicomponent}}{s_L^{multicomponent}} \right|$$

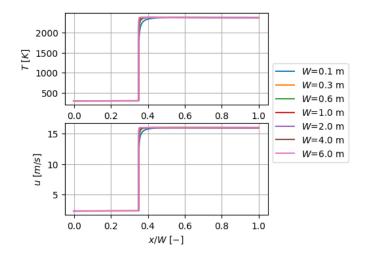


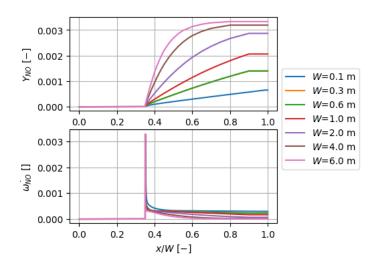
# **NOx production**

#### (5\_nox\_problem.py)

- Nitrogen-oxide (NOx) emissions are an unavoidable side-effect of combustion in air.
- Nitric oxide builds up with residence time in the premixed flamelet domain
- GRI mechanisms are not the best to compute NOx, still they highlight the fact that even if the NOx chemical
  pathways are known, uncertainty remains on their contributions.
- Better chemical description can be found in mechanisms from CRECK modeling group and NUI Galway for example
  - Detailed mechanisms (CRECK) are accurate but may be difficult to handle even in 1D flamelet solvers.



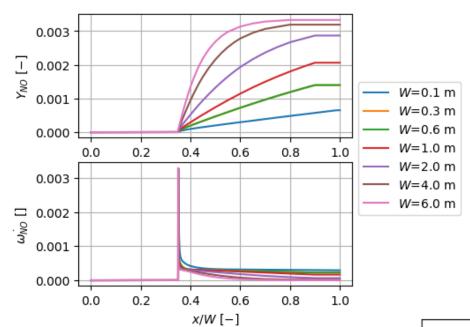




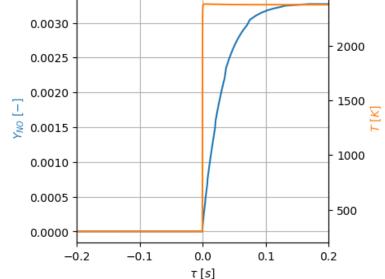


Macroscopic seems to match

# **NOx production**



- Higher equilibrium NO content at larger domains
- NOx formation must be disrupted before the equilibrium is reached!
- NO production is concentrated at the reacting layer, where unfavorable conditions coexist:
  - High temperature
  - Available O2
- Nitric oxide builds up with residence time in the premixed flamelet domain dt = dx/u





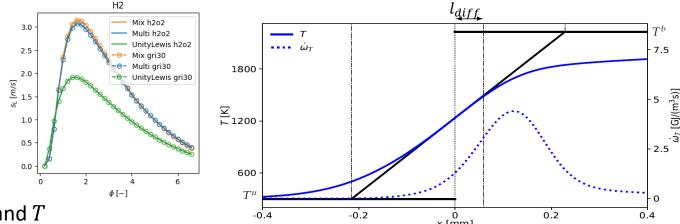
#### (6\_flame\_thickness.py)

## **Cantera: Other exercises**

• Calculate thermal flame thickness measures  $l_F$  (thermal flame thickness),  $l_{diff}$  (diffusive thickness)

$$l_F = \frac{T^b - T^u}{max(\frac{dT}{dx})}, \quad l_{diff} = \frac{D_t^u}{s_L} = \left(\frac{\lambda}{\rho c_p}\right)^u \frac{1}{s_L}$$

- Compare results with different transports
- Compare results vs  $\phi$  or Z



- Study flame speed and flame thickness vs p and T
- Study the flammability range by finding lower and upper limits of equivalence ratio of solutions
- Compare results of other fuels and compare the impact of preferential diffusion on results

(7\_transport\_vs\_time.py)

Compares average execution speed of flame solver using the different transports (Slow)

\_\_\_\_\_

- Slides last year: (https://coec-project.eu/training/ercoftac-course-understanding-and-predicting-hydrogen-combustion/)
  - Try out diffusion flames
  - Play around with solver parameters to improve accuracy of solutions

