

# Modelling of aerosol synthesis of silica nanoparticles in laminar and turbulent flames

UKCTRF Annual Meeting 2022

Presenter: **Malamas Tsagkaridis** (mt6018@ic.ac.uk)  
Supervisors: Dr Stelios Rigopoulos and Prof George Papadakis

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## *Application and background*

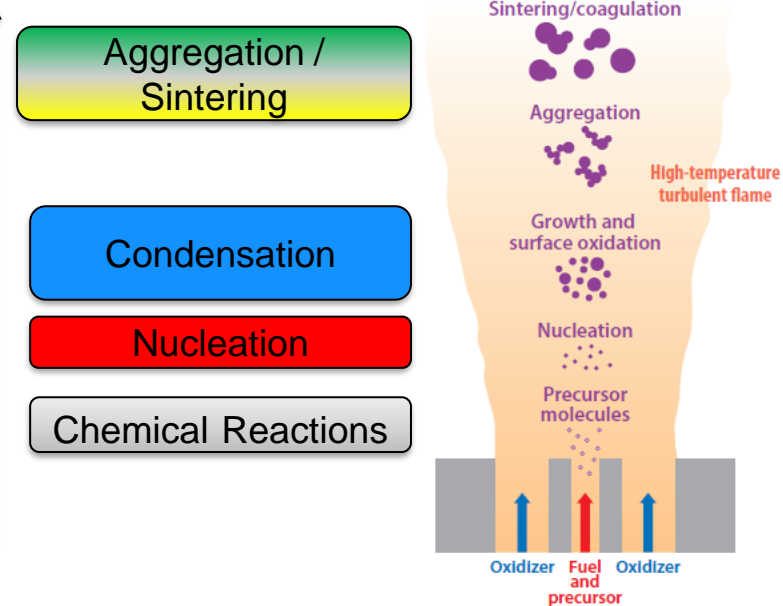
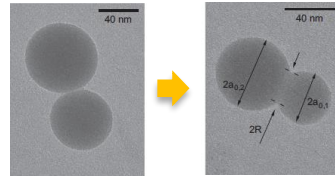
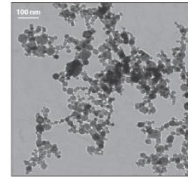
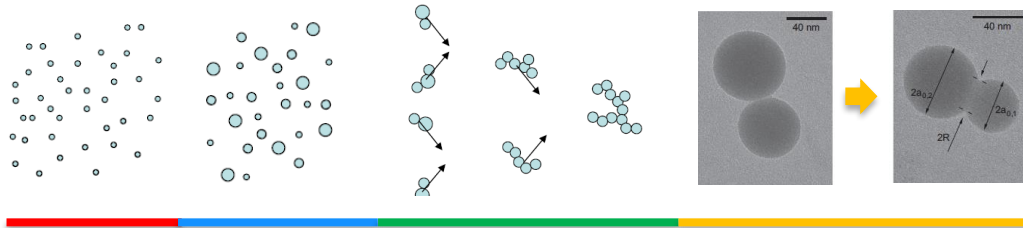
- The flame is the reactor
- carbon black,  $\text{TiO}_2$ ,  $\text{SiO}_2$
- Size between 1 - 100 nm
- Wide range of applications
- Manufacturing of materials with enhanced properties
  - Nanocomposites
  - Gas sensors / Catalysts
  - Biomaterials / Photonics



Picture borrowed from Dr. Frank Ernst's lecture notes

# Flame synthesis of nanoparticles

- All these processes take place at different scales!
- **Prediction of particle morphology is a challenge**



Schematic borrowed from  
(Raman & Fox, 2016)

## Objectives of the study

- Propose a novel **extended one-PBE model** for aggregation and sintering
- Couple the PBE model with CFD
- Use the same model to simulate flame synthesis of silica nanoparticles in both **laminar** and **turbulent** flows
  - Simulate “**S2**” and “**S10**” flames of Camenzind et al. (2008)
- Compare with available experimental ***in-situ*** SAXS data
- Identify main sources of **uncertainties**


## Extended one-PBE model

### Unknowns

- ❖  $n(v)$  = number density of aggregates of volume  $v$
- ❖  $N_p$  = number concentration of primary particles

### Processes

- ❖ **Nucleation**
- ❖ **Condensation**
- ❖ **Aggregation**
- ❖ **Sintering**

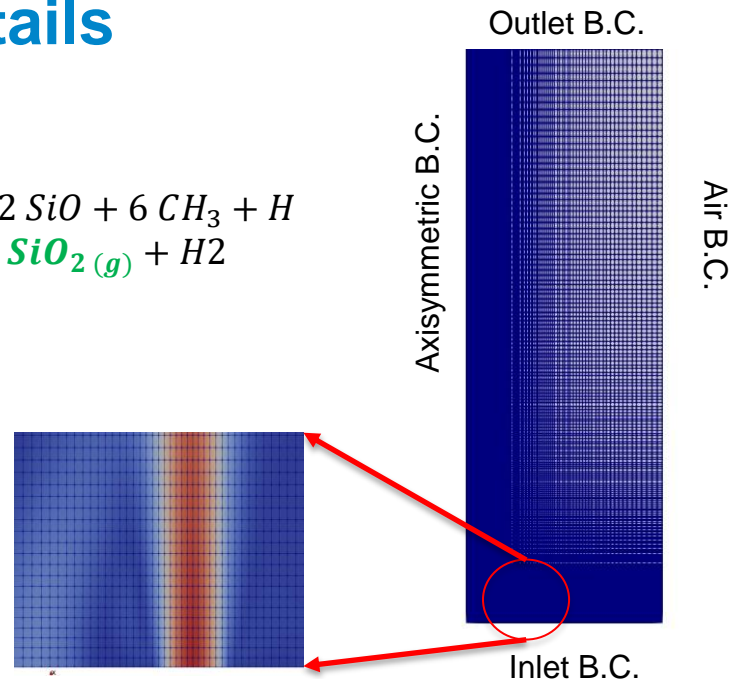
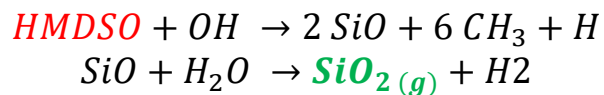
$v_p = \frac{V}{N_p}$		$n_p = \frac{N_p}{N}$	$d_g = d_p n_p^{\frac{1}{Df}}$
Primary Particle Volume		Number of Primary Particles per aggregate	Collision diameter

$$\frac{\partial n}{\partial t} + u_j \frac{\partial n}{\partial x_j} = \frac{\partial}{\partial x_j} \left( D_p \frac{\partial n}{\partial x_j} \right) + \mathbf{B} \delta(v - v_{nuc}) + \mathbf{C}(Y, v) + \frac{1}{2} \int_0^v \beta(w, v-w) n(w) n(v-w) dw - \int_0^\infty \beta(v, w) n(v) n(w) dw$$

$$\frac{\partial N_p}{\partial t} + \frac{\partial(u_j N_p)}{\partial x_j} - \frac{\partial}{\partial x_j} \left( D_p \frac{\partial N_p}{\partial x_j} \right) = \mathbf{J} - \frac{3}{\tau_s} \left( \frac{V}{v_p} - \frac{M_{23}}{v_p^{2/3}} \right)$$

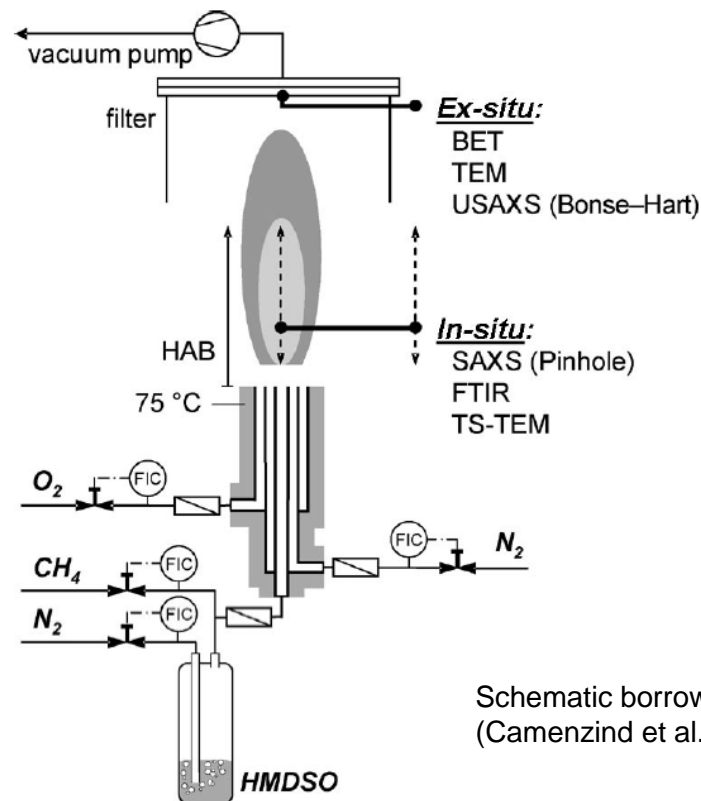
## Model summary and numerical details

- Our in-house CFD code **BOFFIN**
- GRI 1.2 + 2-step mechanism\*
- Aerosol kinetics
  - Formation of dimers (Shekar et al., 2012)
  - Condensation (free molecular)
  - Coagulation (Pratsinis, 1988)
  - Sintering (Tsantilis et al, 2001)
- Radiation from gas species and particles
- Turbulent flow: PBE-PDF stochastic fields
- Laminar flow: 2-D domain (# Cells = 43000)



## Reactor

- HMDSO + CH<sub>4</sub>
- By changing the O<sub>2</sub> flow rate we change the flow regime!
- Laminar case ( $Re \approx 1430$ )
- Turbulent case ( $Re = 4461$ )
- Same set of models for gas-phase chemistry and aerosol dynamics
- We aim to shed light on the nature of discrepancies between predictions and experimental results



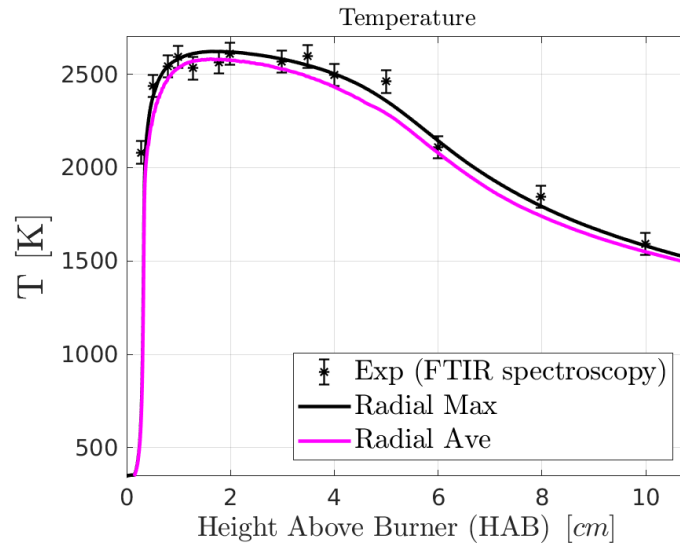
Schematic borrowed from  
(Camenzind et al., 2008)

# Laminar Flame

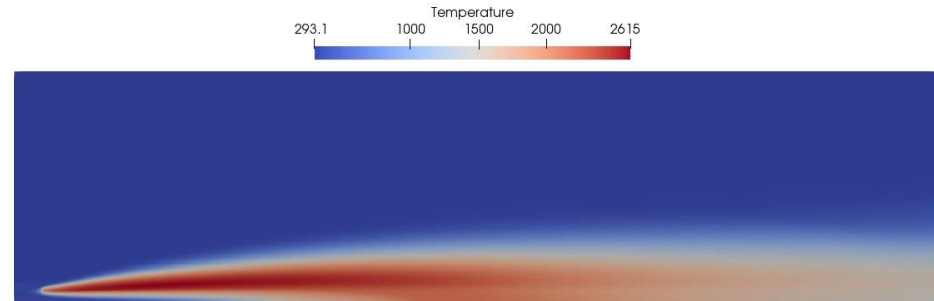
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## Comparison of temperature with FTIR data



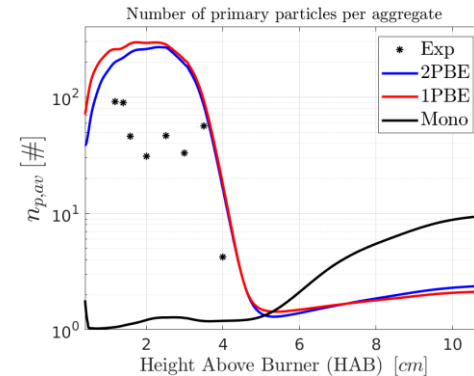
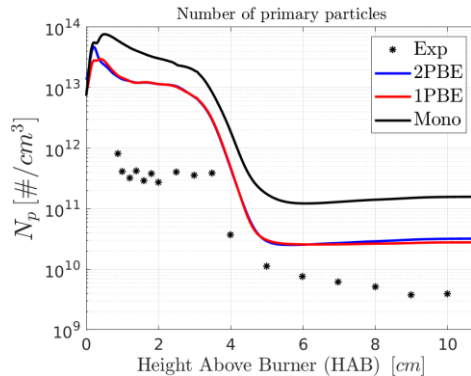
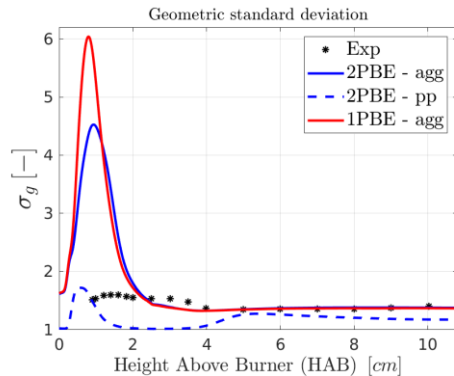
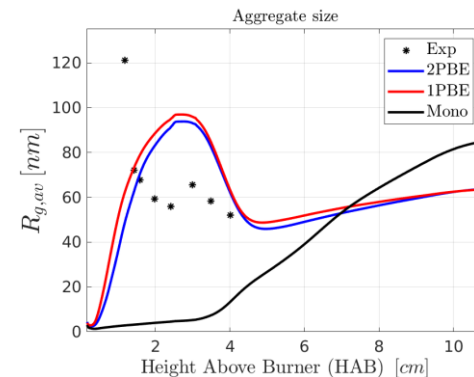
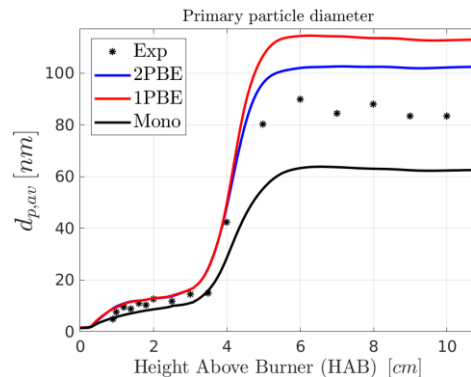
- Centreline data  $\neq$  Exp data
- FTIR\*  $\Rightarrow$  line-of-sight technique
- Radial Averaging ( $C_{CO_2} > 0.8 C_{CO_2,max}$ )
- Error bars ( $\pm 60K$ )



\*FTIR = Fourier Transform Infrared Spectroscopy

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# Comparison with experimental *in-situ* SAXS data



## CPU times

- Coagulation kernel is tabulated for computational speed up
- The extended 1PBE model is **only two times slower** than the Monodisperse model

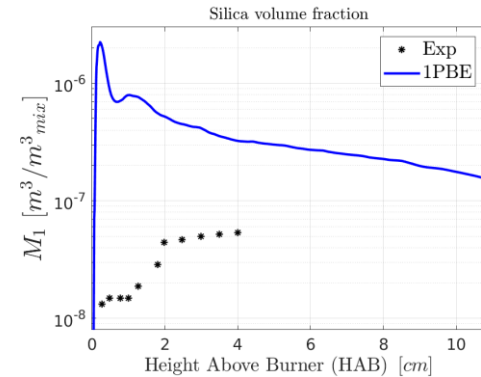
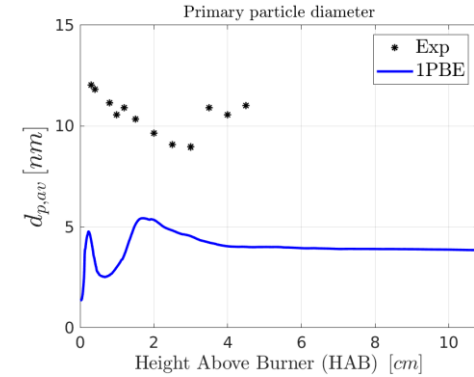
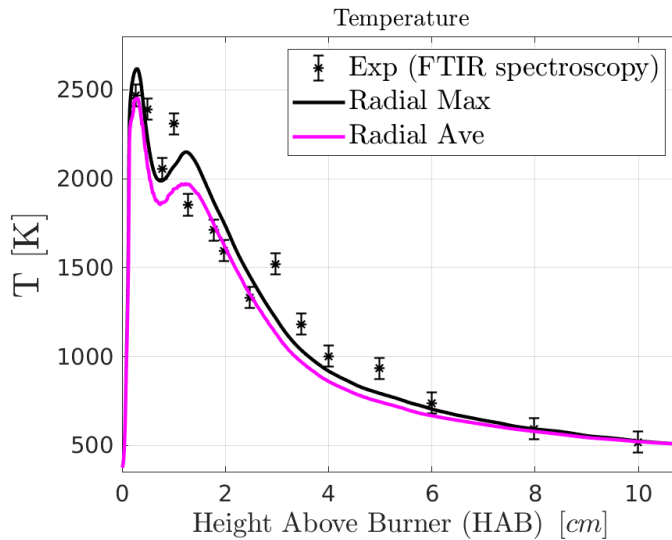
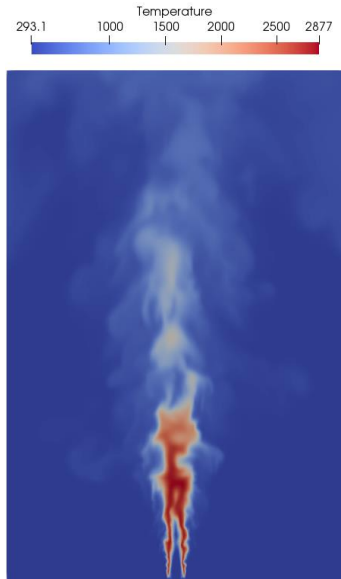
<i>Laminar Flow</i>	Mono	2PBE	1PBE – tabulated
CPU time (s) / timestep	0.187	1.145	<b>0.32</b>
No. of equations	3	114	<b>61</b>

# **Turbulent Flame**

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# Turbulent flame



## Conclusions

- An **extended one-PBE** model for aggregation and sintering was developed and validated
- Flame synthesis of silica nanoparticles in both **laminar** and **turbulent** flames was simulated.
- Results were compared with available *in-situ* SAXS data.
- Coupling of CFD with the extended one-PBE is **computationally feasible**
- Results summary:
  - Excellent agreement was found for temperature profiles.
  - The model is capable to reproduce trends
  - Good agreement was found between the one-PBE and two-PBE models.

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## Acknowledgment

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- We are grateful to the UK Materials and Molecular Modelling Hub for computational resources, which is partially funded by EPSRC (EP/P020194/1 and EP/T022213/1).
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***Thank You!***

Malamas Tsagkaridis

✉ *mt6018@ic.ac.uk*

## Contributions

- ✓ Development and validation of an **extended one-PBE model** for aggregation and sintering
- ✓ Modelling of flame synthesis of silica nanoparticles in both **laminar** and **turbulent** flames
- ✓ Comparison with detailed in-situ SAXS data **for the first time**



# Appendix

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# Contents

1. Introduction
  2. Methodology
  3. Results
  4. Conclusions
-

## How are they made?

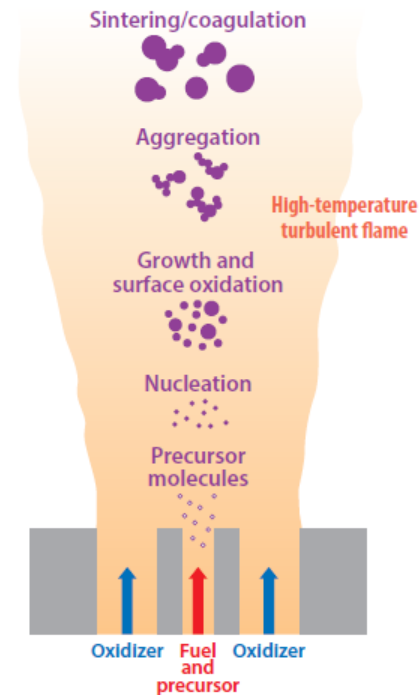
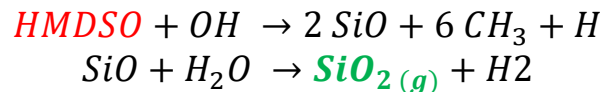
- The flame is the reactor!
- This route has received increased attention over the last few decades.
- Highly reactive environment. Rapid synthesis.  $O(100)$  msec
- Processes can easily be scaled-up (diffusion flames).
- Does not require the multiple steps and cleaning of liquid by-products like wet chemistry.
- Particle collection is easier from gas than liquid streams.

Objective => to increase the production rate of nanoparticles  
=> control their properties / **particle morphology**

# Flame synthesis of nanoparticles

## Chemical Reaction

- Gas phase chemical reactions
- Vapor product (**precursor**)
- Precursor decomposition to **monomer** species



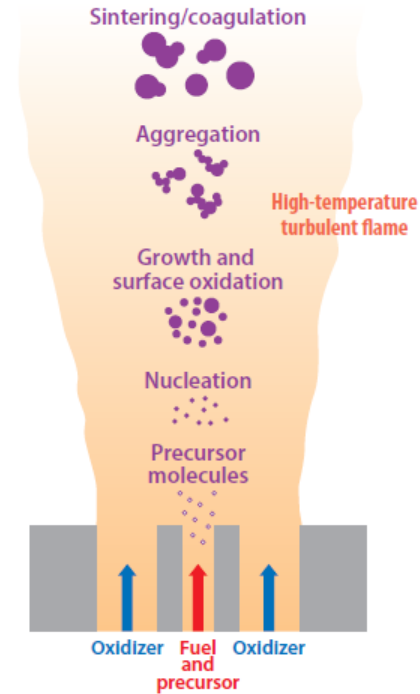
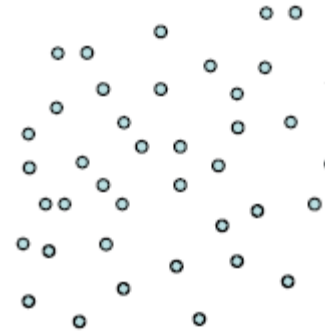
Schematic borrowed from  
(Raman & Fox, 2016)

# Flame synthesis of nanoparticles

Chemical  
Reaction

Nucleation

- **Nucleation** = Formation of initial clusters
- Three scenarios:
  1. *Classical Nucleation Theory (CNT)*
  2. *Instantaneous Nucleation Assumption*
  3. *Formation of dimers*



Schematic borrowed from  
(Raman & Fox, 2016)

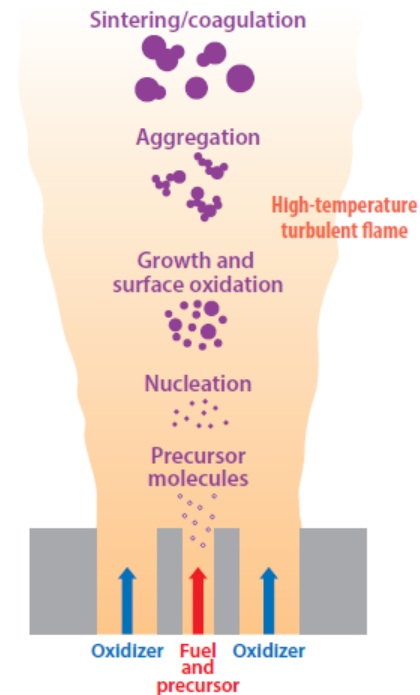
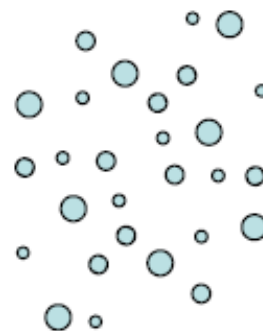
## Flame synthesis of nanoparticles

Chemical  
Reaction

Nucleation

Growth/Surface  
Reaction

- **Condensation** of monomers on particles!
- Particles grow in size.
- Number concentration is not affected
- Unlike soot, surface reaction is usually ignored in studies of flame synthesis of metal oxides



Schematic borrowed from  
(Raman & Fox, 2016)

# Flame synthesis of nanoparticles

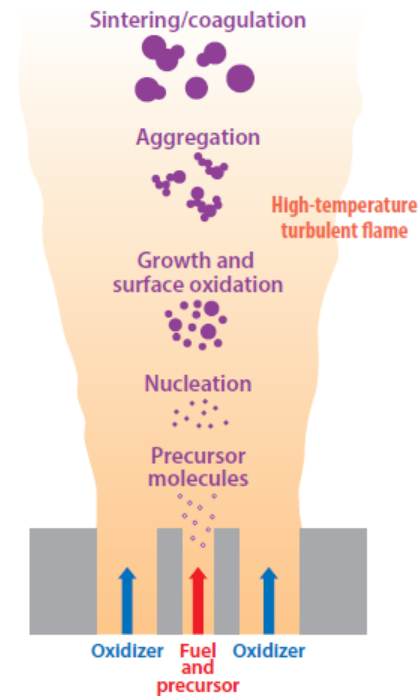
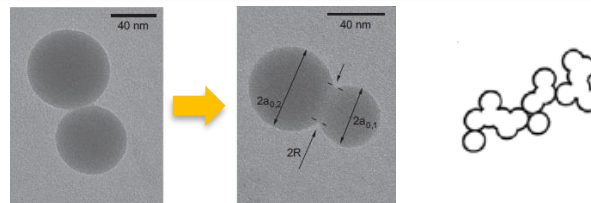
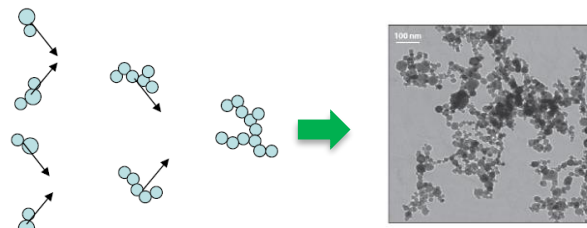
Chemical  
Reaction

Nucleation

Growth/Surface  
Reaction

Aggregation /  
Sintering

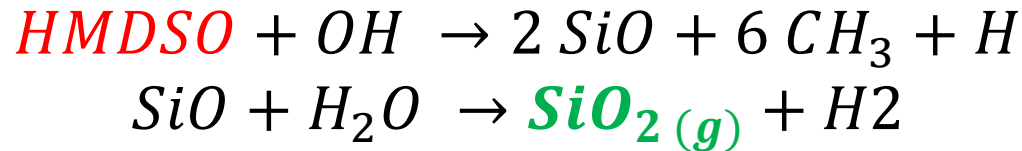
- **Aggregation** = collision of particles
- Number concentration is reduced
- **Sintering (Coalescence)** = particles partially coalesce
- sinter bonds and **neck formation**
- Surface area is reduced



Schematic borrowed from  
(Raman & Fox, 2016)

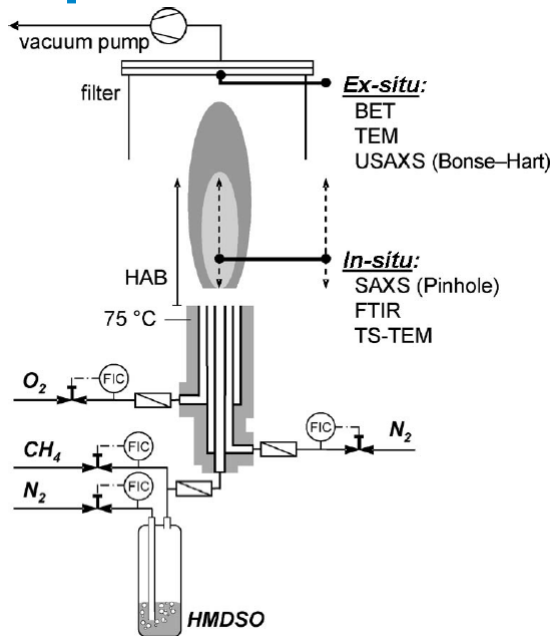
## Precursor kinetics

- Gas phase chemical reactions
- Vapor product (**precursor**)
- Precursor decomposition to **monomer** species
- Monomer diameter  $d_o = 0.44 \text{ nm}$
- Two step global mechanism (Chemkin format):





## Experimental set up



- (Camenzind et al., 2008)
- **SAXS** data (detectable sizes **1nm** -100nm)
- **$CH_4 / O_2$**  diffusion flame
- HMDSO => precursor (high enthalpy content)
- Silica production rate (4.8 g/h)
- Djet = **1.8 mm**! (D1 = 3.5, D2= 4.8 mm) Wall = 0.3 mm
- Vjet = 6.81 m/s (V1 = 2.08, V2 = 8.69 m/s)
- $Re \approx 1430$  for laminar case
- $Re \approx 4460$  for turbulent case
- No other simulations for this experiment!

## Literature Review (1/2) - Study of Silica formation via CFD

- Ji, Y., Sohn, H. Y., Jang, H. D., Wan, B., & Ring, T. A. (2007). Computational fluid dynamic modeling of a flame reaction process for silica nanopowder synthesis from tetraethylorthosilicate. *Journal of the American Ceramic Society*, 90(12), 3838-3845.
- Widiyastuti, W., Purwanto, A., Wang, W. N., Iskandar, F., Setyawan, H., & Okuyama, K. (2009). Nanoparticle formation through solid-fed flame synthesis: Experiment and modeling. *AIChE Journal*, 55(4), 885-895.
- Gröhn, Arto J., et al. "Design of turbulent flame aerosol reactors by mixing-limited fluid dynamics." *Industrial & engineering chemistry research* 50.6 (2011): 3159-3168.
- Buddhiraju, V. S., & Runkana, V. (2012). Simulation of nanoparticle synthesis in an aerosol flame reactor using a coupled flame dynamics–monodisperse population balance model. *Journal of aerosol science*, 43(1), 1-13.
- Shekar, Shraddha, et al. "Modelling the flame synthesis of silica nanoparticles from tetraethoxysilane." *Chemical Engineering Science* 70 (2012): 54-66. (No CFD here)
- Vo, S., et al. "Multiple mapping conditioning for silica nanoparticle nucleation in turbulent flows." *Proceedings of the Combustion Institute* 36.1 (2017): 1089-1097.
- Rittler, A., et al. "Large eddy simulations of nanoparticle synthesis from flame spray pyrolysis." *Proceedings of the Combustion Institute* 36.1 (2017): 1077-1087.

## Literature Review (2/2) - Study of Silica formation via CFD

- Feroughi, O. M., Deng, L., Kluge, S., Dreier, T., Wiggers, H., Wlokas, I., & Schulz, C. (2017). Experimental and numerical study of a HMDSO-seeded premixed laminar low-pressure flame for SiO<sub>2</sub> nanoparticle synthesis. *Proceedings of the Combustion Institute*, 36(1), 1045-1053.
  - Neuber, G., Garcia, C. E., Kronenburg, A., Williams, B. A., Beyrau, F., Stein, O. T., & Cleary, M. J. (2019). Joint experimental and numerical study of silica particulate synthesis in a turbulent reacting jet. *Proceedings of the Combustion Institute*, 37(1), 1213-1220.
  - Dasgupta, D., Pal, P., Torelli, R., Som, S., Paulson, N., Libera, J., & Stan, M. (2022). Computational fluid dynamics modeling and analysis of silica nanoparticle synthesis in a flame spray pyrolysis reactor. *Combustion and Flame*, 236, 111789.
- CFD studies for TiO<sub>2</sub> or other ceramics will not be presented here.
  - Most of the studies compared exp and sim data only for primary particle sizes!
  - Only Neuber et al., (2019) did laminar flow but focused on chemical precursor kinetics.
  - **Nobody has compared sim with detailed SAXS in-situ data along the centreline!**

## Aerosol kinetics – Nucleation models

- **Classical Nucleation Theory**

- (Girshick and Chiu, 1989)

- **Instantaneous Nucleation**

- $J = \frac{dC_{SiO_2}}{dt} \cdot N_A$
- Monomer:  $d_o = 0.44 \text{ nm}$

- **Nucleation of dimers**

- Similar to the approach in (Shekar et al., 2012)

$$J = \frac{1}{2} K^{fm} N_A^2 C_{SiO_2}^2$$

$$K^{fm} = E_f 4 \sqrt{\frac{\pi k_B T}{m_{SiO_2}}} d_o^2$$

## Aerosol kinetics – Sintering

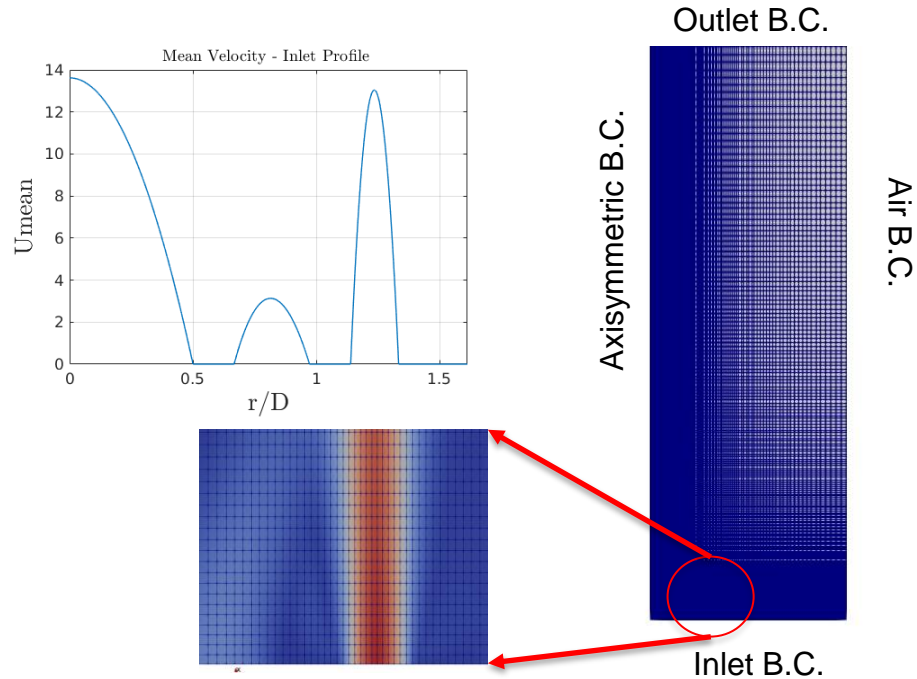
- Sintering Models summarised in (Goudeli et al. 2015)
  - (Tsantilis et al, 2001)  $\tau_s = 6.5 \cdot 10^{-13} d_p e^{\frac{8.3 \cdot 10^4}{T}} \left(1 - \frac{d_{p,min}}{d_p}\right)$
  - (Ehrman et al., 1998)  $\tau_s = 6.3 \cdot 10^{-8} d_p e^{\frac{6.1 \cdot 10^4}{T}} \left(1 - \frac{d_{p,min}}{d_p}\right)$
  - (Kirchhof et al., 2012)  $\tau_s = \frac{\left(1 - \frac{1}{e}\right) r_s^2}{2^{\frac{2}{3}} \left(3.5 \cdot 10^{-4} \frac{m^2}{s}\right)} e^{\frac{4.4 \cdot 10^4}{T}} \left(1 - \frac{d_{p,min}}{d_p}\right)$
- $d_{p,min} = ?$

## Aerosol kinetics

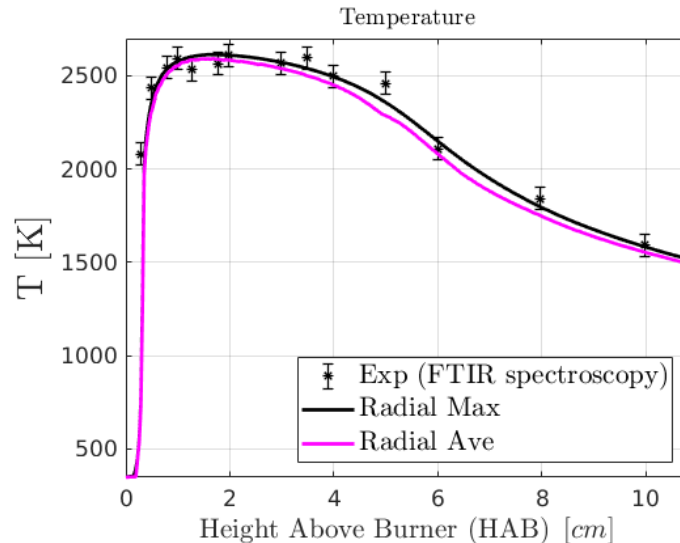
- **Coagulation** (Pratsinis, 1988) 
$$\beta^t(v, w) = \frac{\beta^{fm}(v, w) \cdot \beta^c(v, w)}{\beta^{fm}(v, w) + \beta^c(v, w)}$$
- **Condensation** (free molecular) 
$$\omega_{cond} = C_{SiO_2} N_A \int \beta^{fm}(v_o, w) n(w) dw$$
- **No Evaporation** /Growth /Oxidation
- **Particle Radiation Model** 
$$Q_{rad} = -\frac{4\sigma}{\rho} C_s f_v (T^5 - T_{amb}^5)$$
  - $C_s$  depends on the complex refractive index of particles

## Simulation details

- 2-D domain (60D x 15D)
- # Cells 264x162 = 42768 ( $dx_{min} = 0.026 \text{ mm}$ )
- Grid refinement (10 cells to capture the velocity profile)
- Grid stretching in the streamwise and radial direction
- $dt = 10^{-7} \text{ sec}$  (CFL = 0.2)
- Boundary conditions: Inlet / Axisymmetric / Outflow
- Entrainment velocity at inlet  $V_{air} = 0.4 \text{ m/s}$



## Comparison of temperature with FTIR data



- Centreline data  $\neq$  Exp data
- FTIR\*  $\Rightarrow$  **line-of-sight** technique
- Radial Averaging ( $C_{CO_2} > 0.8 C_{CO_2,max}$ )
- Error bars ( $\pm 60K$ )

