

# Computational Fluid Dynamics of Catalytic Reactors

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# Computational Fluid Dynamics of Catalytic Reactors

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## 1 Introduction

Catalytic reactors are generally characterized by the complex interaction of various physical and chemical processes. Monolithic reactors can serve as example, in which partial oxidation and reforming of hydrocarbons, combustion of natural gas, and the reduction of pollutant emissions from automobiles are frequently carried out. Figure 1 illustrates the physics and chemistry in a catalytic combustion monolith that glows at a temperature of about 1300 K due to the exothermic oxidation reactions. In each channel of the monolith, the transport of momentum, energy, and chemical species occurs not only in flow (axial) direction, but also in radial direction. The reactants diffuse to the inner channel wall, which is coated with the catalytic material, where the gaseous species adsorb and react on the surface. The products and intermediates desorb and diffuse back into the bulk flow. Due to the high temperatures, the chemical species may also react homogeneously in the gas phase. In catalytic reactors, the catalyst material is often dispersed in porous structures like washcoats or pellets. Mass transport in the fluid phase and chemical reactions are then superimposed by diffusion of the species to the active catalytic centers in the pores. The temperature distribution depends on the interaction of heat convection and conduction in the fluid, heat release due to chemical reactions, heat transport in the solid material, and thermal radiation. If the feed conditions vary in time and space and/or heat transfer occurs between the reactor and the ambience, a non-uniform temperature distribution over the entire monolith will result, and the behavior will differ from channel to channel.

Today, the challenge in catalysis is not only the development of new catalysts to synthesize a desired product, but also the understanding of the interaction of the catalyst with the surrounding reactive flow field. Sometimes, the exploitation of these interactions can lead to the desired product selectivity and yield. Hence, a better understanding of gas-solid flows in chemical reactors is understood as a critical need in chemical technology calling for the development of reliable simulation tools that integrate detailed models of reaction chemistry and computational fluid dynamics (CFD) modeling of macro-scale flow structures.

Computational fluid dynamics is able to predict very complex flow fields, even combined with heat transport, due to the recently developed numerical algorithms and the availability of faster and bigger (memory) computer hardware. The consideration of detailed models for chemical reactions, in particular for heterogeneous reactions, however, is still very challenging due to the large number of species mass conservation equations, their highly non-linear coupling, and the wide range of time scales introduced by the complex reaction networks.

This chapter introduces the application of CFD simulations to obtain a better understanding of the interactions between mass and heat transport and chemical reactions in catalytic reactors. Concepts for modeling and numerical simulation of catalytic reactors are presented, which describe the coupling of the physical and chemical processes in detail. The elementary kinetics and dynamics as well as ways for modeling the intrinsic chemical reactions rates (microkinetics) by various approaches such as Monte Carlo (MC), Mean Field Approximation (MF), and lumped kinetics are discussed in the first chapters of this book. In this chapter, it is assumed that models exist that can compute the local heterogeneous but also homogeneous reaction rate as function of the local conditions such as temperature and species concentration in the gas-phase and of the local and temporal state of the catalyst. These

chemical source terms are here coupled with the fluid flow and used to numerically simulate the catalytic reactor.

The ultimate objective of CFD simulations of catalytic reactors is (1) to understand the interactions of physics (mass and heat transport) and chemistry in the reactor, (2) to support reactor design and engineering, and (3) eventually, to find optimized operating conditions for the maximization of the yield of the desired product and minimization of undesired side-products or pollutants. Though computational fluid dynamics covers a wide range of problems, reaching from the simulation of the flow around airplanes to laminarization of turbulent flows entering a micro channel, this chapter focuses on the principal ideas and the potential applications of CFD in heterogeneous catalysis; textbooks<sup>[1, 2]</sup> and specific literature are frequently referenced for more details. Specific examples taken from literature and our own work will be used for illustration of the state-of-the-art CFD simulation of chemical reactors with heterogeneously catalyzed reactions. The next chapters of the book will cover some specific topics of numerical simulation of catalytic reactors in more detail.

## 2 Modeling of reactive flows

### 2.1 Governing equations of multi-component flows

As long as a fluid can be treated as a continuum, the most accurate description of the flow field of multi-component mixtures is given by the transient three-dimensional (3D) Navier-Stokes equations coupled with the energy and species governing equations, which will be summarized in this section. More detailed introductions into fluid dynamics and transport phenomena can be found in a number of textbooks <sup>[1-5]</sup>. Other alternative concepts such as Lattice-Boltzmann models have also been discussed for simulation of catalytic reactors as introduced in Section 5.1.

Governing equations, which are based on conservation principles, can be derived by consideration of the flow within a certain spatial region, which is called the *control volume*.

The principle of mass conservation leads to the mass continuity equation

$$\frac{\partial \rho}{\partial t} + \frac{\partial(\rho v_i)}{\partial x_i} = S_m, \quad (1)$$

with  $\rho$  being the mass density,  $t$  the time,  $x_i$  ( $i=1,2,3$ ) are the Cartesian coordinates, and  $v_i$  the velocity components. The source term  $S_m$  vanishes unless mass is either deposited on or ablated from the solid surfaces. The Einstein convention is used here, i.e., whenever the same index appears twice in any term, summation over that index is implied, except if the index refers to a chemical species. The principle of momentum conservation for Newtonian fluids leads to three scalar equations for the momentum components  $\rho v_i$

$$\frac{\partial(\rho v_i)}{\partial t} + \frac{\partial(\rho v_i v_j)}{\partial x_j} + \frac{\partial p}{\partial x_i} + \frac{\partial \tau_{ij}}{\partial x_j} = \rho g_i, \quad (2)$$

where  $p$  is the static pressure,  $\tau_{ij}$  is the stress tensor,  $g_i$  are the components of the gravitational acceleration. The above equation is written for Cartesian coordinates. Gravity, the only body

force taken into account, can often be neglected when modeling catalytic reactors. The stress tensor is given as

$$\tau_{ij} = -\mu \left( \frac{\partial v_i}{\partial x_j} + \frac{\partial v_j}{\partial x_i} \right) + \left( \frac{2}{3} \mu - \kappa \right) \delta_{ij} \frac{\partial v_k}{\partial x_k}. \quad (3)$$

Here,  $\kappa$  and  $\mu$  are the bulk viscosity and mixture viscosity, respectively, and  $\delta_{ij}$  is the Kronecker delta, which is unity for  $i=j$ , else zero. The bulk viscosity vanishes for low density mono-atomic gases and is also commonly neglected for dense gases and liquids<sup>[1]</sup>. The coupled mass continuity and momentum governing equations have to be solved for the description of the flow field.

In multi-component mixtures, not only the flow field is of interest but also mixing of the chemical species and reactions among them, which can be described by an additional set of partial differential equations. Here, the mass  $m_i$  of each of the  $N_g$  gas-phase species obeys a conservation law that leads to

$$\frac{\partial(\rho Y_i)}{\partial t} + \frac{\partial(\rho v_j Y_i)}{\partial x_j} + \frac{\partial(j_{i,j})}{\partial x_j} = R_i^{\text{hom}}, \quad (4)$$

with  $Y_i$  is the mass fraction of species  $i$  in the mixture ( $Y_i = m_i/m$ ) with  $m$  as total mass,  $R_i^{\text{hom}}$  is the net rate of production due to homogeneous chemical reactions. The components  $j_{i,j}$  of the diffusion mass flux caused by concentration and temperature gradients are often modeled by the mixture-average formulation<sup>[6]</sup>:

$$j_{i,j} = -\rho \frac{Y_i}{X_i} D_i^{\text{M}} \frac{\partial X_i}{\partial x_j} - \frac{D_i^{\text{T}}}{T} \frac{\partial T}{\partial x_j}. \quad (5)$$

$D_i^{\text{M}}$  is the effective diffusion coefficient of species  $i$  in the mixture,  $D_i^{\text{T}}$  is the thermal diffusion coefficient, which is significant only for light species, and  $T$  is the temperature. The molar fraction  $X_i$  is related to the mass fraction  $Y_i$  using the species molar masses  $M_i$  by

$$X_i = \frac{1}{\sum_{j=1}^{Ng} \frac{Y_j}{M_j}} \frac{Y_i}{M_i}. \quad (6)$$

Heat transport and heat release due to chemical reactions lead to spatial and temporal temperature distributions in catalytic reactors. The corresponding governing equation for energy conservation is commonly expressed in terms of the specific enthalpy  $h$ :

$$\frac{\partial(\rho h)}{\partial t} + \frac{\partial(\rho v_j h)}{\partial x_j} + \frac{\partial j_{q,j}}{\partial x_j} = \frac{\partial p}{\partial t} + v_j \frac{\partial p}{\partial x_j} - \tau_{jk} \frac{\partial v_j}{\partial x_k} + S_h, \quad (7)$$

with  $S_h$  being the heat source, for instance due to thermal radiation. In multi-component mixtures, diffusive heat transport is significant due to heat conduction and mass diffusion, hence

$$j_{q,j} = -\lambda \frac{\partial T}{\partial x_j} + \sum_{i=1}^{Ng} h_i j_{i,j}. \quad (8)$$

$\lambda$  is the thermal conductivity of the mixture. The temperature is then related to the enthalpy by the definition of the mixture specific enthalpy

$$h = \sum_{i=1}^{Ng} Y_i h_i(T), \quad (9)$$

with  $h_i$  being the specific enthalpy of species  $i$ , which is a monotonic increasing function of temperature. The temperature is then commonly derived from Eq. (9) for known  $h$  and  $Y_i$ .

Heat transport in solids such as reactor walls and catalyst materials can also be modeled by an enthalpy equation, for instance in the form of

$$\frac{\partial(\rho h)}{\partial t} - \frac{\partial}{\partial x_j} \left( \lambda \frac{\partial T}{\partial x_j} \right) = S_h, \quad (10)$$

where  $h$  is the specific enthalpy and  $\lambda$  the thermal conductivity of the solid material.  $S_h$  accounts for heat sources, for instance due to heat release by chemical reactions and electric or radiative heating of the solid.

This system of governing equations is closed by the equation of state to relate the thermodynamic variables density  $\rho$ , pressure  $p$ , and temperature  $T$ . The simplest model of this relation for gaseous flows is the ideal gas equation

$$p = \frac{\rho RT}{\sum_{i=1}^{N_g} X_i M_i}, \quad (11)$$

with the universal gas constant  $R = 8.314 \text{ J mol}^{-1} \text{ K}^{-1}$ .

The transport coefficients  $\mu$ ,  $D_i^M$ ,  $D_i^T$ , and  $\lambda$  appearing in Eqs. (3, 5, 8) depend on temperature and mixture composition. They are derived from the transport coefficients of the individual species and the mixture composition by applying empirical approximations [1, 2, 4], which eventually lead to two physical parameters for each species, a characteristic diameter (the Lennard-Jones collision diameter),  $\sigma_i$ , and a characteristic energy (the Lennard-Jones potential well depth),  $\varepsilon_i$ , which can be taken from data bases [7].

The specific enthalpy  $h_i$  is a function of temperature and can be expressed in terms of the heat capacity

$$h_i = h_i(T_{\text{ref}}) + \int_{T_{\text{ref}}}^T c_{p,i}(T') dT', \quad (12)$$

where  $c_{p,i}$  is the specific heat capacity at constant pressure. The specific standard enthalpy of formation  $\Delta h_{f,298,i}^0$  can be used as integration constant  $h_i(T_{\text{ref}} = 298.15 \text{ K}, p_0 = 1 \text{ bar})$ . Experimentally determined and estimated standard enthalpies of formation, standard entropies, and temperature dependent heat capacities can be found in data bases [8-10] or estimated by Benson's additivity rules [11].

## 2.2 Turbulent flows

Turbulent flows are characterized by continuous fluctuations of velocity, which can lead to fluctuations in scalars such as density, temperature, and mixture composition. Turbulence can be desired in catalytic reactors to enhance mixing and reduce mass transfer limitations but is also unwanted due to the increased pressure drop and energy dissipation. An adequate understanding of all facets of turbulent flows is still missing <sup>[4, 12, 13]</sup>. In the area of catalytic systems, some progress has recently been made in turbulent flow modeling, e.g. in catalytically stabilized combustion <sup>[14, 15]</sup>. The Navier-Stokes equations as presented above are in principle able to model turbulent flows (Direct Numerical Simulation). However in practice, the solutions of the Navier-Stokes equations for turbulent flows in technical reactors demand a prohibitive amount of computational time due to the huge number of grid points needed to resolve the small scales of turbulence. Therefore, several concepts were developed to model turbulent flows by the solution of averaged governing equations. However, the equation system is not closed, that means a model has to be set up to describe the so-called Reynold stresses that are the correlations between the velocity fluctuations and the fluctuations of all the quantities of the flow (velocity, enthalpy, mass fractions). The  $k - \varepsilon$ -model <sup>[16]</sup> is one of the most widely used concept for modeling the Reynold stresses at high Reynolds numbers, which adds two additional partial differential equations for the description of the turbulent kinetic energy,  $k$ , and the dissipation rate,  $\varepsilon$ , to the governing equations. Although the model has well-known deficiencies, it is today implemented in most commercial CFD codes and also widely used for the simulation of catalytic reactors. Recently, turbulent flow field simulations are often based on Large-Eddy-Simulation (LES), which combines DNS for the larger scales with a turbulence model, e.g.  $k - \varepsilon$ - model, for the unresolved smaller scales.

Aside from this closure problem, one still has to specify the averaged chemical reaction rates <sup>[4, 12]</sup>. Because of the strong non-linearity of the rate coefficients due to the exponential

dependence on temperature and the power-law dependence on partial pressure, the source terms of chemical reactions in turbulent flows cannot be computed using average concentrations and temperature. Here, probability density functions (PDFs)<sup>[4]</sup>, either derived by transport equations<sup>[13]</sup> or empirically constructed<sup>[17]</sup>, are used to take the turbulent fluctuations into account when calculating the chemical source terms. For the simulation of reactions on catalysts, it is important to use appropriate models for the flow laminarization at the solid surface.

### **2.3 Three-phase flow**

Three-phase flows involve the participation of solid, liquid, and gaseous phases. In certain cases the solid phase will be a porous medium, and the fluids will flow through the pore networks. In certain other cases all phases will be mobile and these flows are usually characterized by various regimes such as particle-laden flow, fluidized bed flow, slug flow, bubbly flow etc. Examples for three-phase flow device with chemical reaction are fluidized bed reactors. They are one of the most important classes of multi-phase reactors used in chemical, petrochemical, and biochemical processing. Simulating multi-phase reactors is a challenge due to the numerous physico-chemical processes occurring in the reactor. For example, one has to account for interactions between and among various phases, lift, buoyancy, virtual mass forces, particle agglomeration, and bubble coalescence<sup>[18]</sup>.

Either the Euler-Lagrange model or Euler-Euler model can be used to solve the three-phase flow problem. The former adopts a continuum description for the liquid phase and tracks the discrete phases using Lagrangian particle trajectory analysis. The Euler-Euler model is based on the concept of interpenetrating continua. Here all the phases are treated as continua with properties analogous to those of a fluid. That is conservation equations are derived for each of the phases and constitutive relations that are empirical in nature closes the equation set.

Therefore, the accuracy of this method heavily relies on the empirical constitutive relations used. Furthermore, this approach has limitation in predicting certain characteristics of discrete flow. For instance, the method can not account for particle size effect, particle agglomeration, bubble coalescence, and bubble breakage. On the other hand, the Euler-Lagrange model has empirical equations and can provide detailed information of discrete phases. However, it is computationally more expensive. A detailed description of three-phase flow modeling is beyond the scope of this chapter and interested readers can refer to textbooks<sup>[19-21]</sup>.

## 2.4 Momentum and energy equations for porous media

Porous media are present everywhere in catalytic reactors<sup>[22, 23]</sup>, for instance fixed-bed reactors, catalytic filters, washcoat layers, perforated plates, flow distributors, tube banks, membranes, electrodes, fiber materials etc. Modeling the transport and reactions in the actual tortuous structure on the microscopic level is a rather formidable task<sup>[23, 24]</sup>. Chapter 5 of this book deals in detail with this topic. Due to this complexity, it is often necessary to work with small representative volume elements where the porous medium and other properties are assumed to be homogenized. Several methods have been developed to include porous media and reactions in CFD simulations.

Most porous media models in CFD codes incorporate an empirically determined flow resistance accounting for the pressure drop, which is a sink in the governing momentum equation (2). In case of simple homogeneous porous media a source term is added to the right side of Eq. (2),

$$S_i = -\left(\frac{\mu}{\alpha} v_i + \frac{C}{2} \rho |\vec{v}| v_i\right) \quad (13)$$

where  $\alpha$  is the permeability (Darcy's law) and  $C$  is the inertial resistance, which can be viewed as a loss per unit length along the flow direction. Concerning the temperature profile

in porous media, the enthalpy equations (7) and (10) have to be adapted. The total enthalpy is now a sum of the enthalpies of the fluid and the solid. Their partition is defined by the porosity. An effective thermal conductivity is used based on the porosity and the thermal conductivities of the fluid and the solid. This continuum approach has to be used carefully, for instance the effect of the porous medium on turbulent flows can barely be approximated within this concept. The approach, which assumes constant unidirectional flow, also breaks down for fixed bed reactors with reactor diameter being less than ten times the particle size. Thus the model cannot predict the velocity maximum in the vicinity of the wall observed experimentally for those reactors <sup>[25]</sup>. An averaged velocity with a radial varying axial component can be provided by a further modification of the momentum balance <sup>[25-27]</sup> as improvement of the classical model.

### **3 Coupling of the flow field with heterogeneous chemical reactions**

Depending on the spatial resolution of the different catalyst structures, e.g. flat surface, gauzes, pellets, embedded in porous media, the species mass fluxes due to catalytic reactions at these structures are differently coupled with the flow field.

#### **3.1. Given spatial resolution of catalyst structure**

In the first case considered, the catalytic layer is resolved in space, i.e., the surface of the catalyst is directly exposed to the fluid flow. Examples are thin catalytically coated walls in honeycomb structures, disks, plates, and well-defined porous media (fixed bed reactors, foams, washcoats), in which the shape of the individual pellet or channel is spatially resolved in the CFD simulation. The chemical processes at the surface are then coupled with the surrounding flow field by boundary conditions for the species-continuity equations, Eqs. (4), at the gas-surface interface <sup>[2, 28]</sup>.

$$\vec{n}(\vec{j}_i + \rho \vec{v}_{\text{Stef}} Y_i) = R_i^{\text{het}} \quad (14)$$

Here  $\vec{n}$  is the outward-pointing unit vector normal to the surface,  $\vec{j}_i$  is the diffusion mass flux of species  $i$  as discussed in Eqs. (4), and  $R_i^{\text{het}}$  is the heterogeneous surface reaction rate, which is given per unit geometric surface area, corresponding to the reactor geometry, in  $\text{kg m}^{-2} \text{s}^{-1}$ . Approaches to model the heterogeneous reaction  $R_i^{\text{het}}$  are discussed in Chapter 4 of this book.

The Stefan velocity  $\vec{v}_{\text{Stef}}$  occurs at the surface if there is a net mass flux between the surface and the gas phase:

$$\vec{n} \vec{v}_{\text{Stef}} = \frac{1}{\rho} \sum_{i=1}^{N_g} R_i^{\text{het}}. \quad (15)$$

At steady-state conditions, this mass flux vanishes unless mass is deposited on the surface, e.g. chemical vapor deposition, or ablated, e.g. material etching. Equation (14) basically means that for  $\vec{v}_{\text{Stef}} = 0$  the amount of gas-phase molecules of species  $i$ , which are consumed/produced at the catalyst by adsorption/desorption, have to diffuse to/from the catalytic wall (Eq. 5). Only for fast transient ( $< 10^{-4}$  s) adsorption/desorption processes, e.g. during ignition of catalytic oxidation, Eq. (14) breaks down and special treatment of the coupling is needed<sup>[29, 30]</sup>. In that case, accumulation of species in the near-catalyst zone has to be considered, e.g. through<sup>[29]</sup>

$$\int \rho \frac{\partial Y_i}{\partial t} dV = - \int (\vec{j}_i + \rho \vec{v}_{\text{Stef}} Y_i) \vec{n} dA + \int R_i^{\text{het}} dA \quad (16)$$

In that case, special care has to be taken in the spatial discretization procedure<sup>[2]</sup>. Furthermore, those fast transient processes may lead to heat accumulation terms<sup>[29]</sup> and also to additional convective transport and associated pressure gradients in the fluid phase above the catalyst<sup>[30]</sup>.

The calculation of  $R_i^{\text{het}}$  is straightforward if the catalytic surface corresponds to the geometrical surface of the fluid-solid interphase of the flow field simulation, e.g., wires, flate plates without any porosity. In that case,  $R_i^{\text{het}}$  is the production rate of species  $i$  per *catalyst surface area* due to catalytic reactions (Chapter 4). It should be noted that the *catalyst surface area* is the surface area (layer on which we find adsorbed species) of the catalytic particle exposed to the ambient gas (fluid) phase, which can be measured e.g. by chemisorptions with sample molecules such as CO and hydrogen. The catalyst surface area should not be confused with the BET surface area.

### 3.2 Simple approach for modeling the catalyst structure

Most catalysts however exhibit a certain structure, for instance, they may occur as dispersed particles on a flat or in a porous substrate. The simplest way to account for that structure and the active catalytic surface area consists in scaling the intrinsic reaction rate at the fluid-solid interphase by two parameters. The first parameter represents the amount of catalytically active surface area in relation to the geometric surface area of the fluid-solid interphase, here denoted by  $F_{\text{cat/geo}}$  :

$$R_i^{\text{het}} = \eta F_{\text{cat/geo}} M_i \dot{s}_i \quad (17)$$

Here,  $\dot{s}_i$  is the molar net production rate of gas phase species  $i$ , given in  $\text{mol m}^{-2} \text{s}^{-1}$ ; the area now refers to the actual catalytically active surface area.  $F_{\text{cat/geo}}$  can consequently be determined experimentally, e.g. by chemisorption measurements. Recently, it was shown that this ratio ( $F_{\text{cat/geo}}$ ) can also serve as parameter to describe the dependence of the overall reaction rate of catalyst loadings and effects of hydro-thermal aging for structure-insensitive catalysts<sup>[31]</sup>. This concept was even applied to model the variation in performance of on-road aged three-way catalysts<sup>[32]</sup>.

The simplest model to include the effect of internal mass transfer resistance for catalyst dispersed in a porous media is the effectiveness factor  $\eta$  based on the Thiele modulus<sup>[5, 33]</sup>.

The effectiveness factor of species  $i$ ,  $\eta_i$ , is defined as

$$\eta_i = \frac{\dot{S}_{i,mean}}{\dot{S}_i} \quad (18)$$

with  $\dot{S}_{i,mean}$  as mean surface reaction rate in the porous structure. Assuming a homogeneous porous medium, time-independent concentration profiles, and a rate law of first order, the effectiveness factor can be analytically calculated in terms of

$$\eta_i = \frac{\tanh(\Phi_i)}{\Phi_i} \quad (19)$$

with  $\Phi_i$  as Thiele module defined as

$$\Phi_i = L \sqrt{\frac{\dot{S}_i \gamma}{D_{eff,i} c_{i,0}}} \quad (20)$$

Here,  $L$  is the thickness of the porous medium (washcoat),  $\gamma$  is the ratio of catalytic active surface area to washcoat volume, and  $c_{i,0}$  are the species concentrations at the fluid/porous media interface. The Thiele module is a dimensionless number. The value in the root term of Eq. (20) represents the ratio of intrinsic reaction rate to diffusive mass transport in the porous structure. Since mass conservation has to be obeyed (Eq. 17), the same effectiveness factor has to be applied for all chemical species. Therefore, this simple model can only be applied at conditions, at which the reaction rate of one species determines overall reactivity. Furthermore, this model then implies that mass diffusion inside the porous media can be described by the same diffusion coefficient for all species.

In most fixed bed reactors with large numbers of catalytic pellets, for non-trivial shapes of the catalysts, and for catalyst dispersed in porous media, the structure of the catalyst cannot be resolved geometrically. In those cases, the catalytic reaction rate is expressed per volumetric

unit, that means  $R_i^{\text{het}}$  is now given in  $\text{kg m}^{-3} \text{ s}^{-1}$ ; the volume here refers to the volume of a computational cell in the geometrical domain of fluid flow. Then  $R_i^{\text{het}}$  simply represents an additional source term on the right side of the species-continuity equation, Eq. (4), and is computed by

$$R_i^{\text{het}} = \eta S_v M_i \dot{s}_i \quad , \quad (21)$$

where  $S_v$  is the active catalytic surface area per volumetric unit, given in  $\text{m}^{-1}$ , determined experimentally or estimated.  $F_{\text{cat/geo}}$  as well as  $S_v$  can be expressed as function of the reactor position and time to account for in-homogeneously distributed catalysts and loss of activity, respectively. In reactors with more than one catalytic material, a different value for  $F_{\text{cat/geo}}$  or  $S_v$  can be given for every individual active material or phase, respectively.

### 3.3 Reaction-diffusion equations

The dispersion of the catalyst material in porous layers or pellets easily leads to a reduced overall reaction rate due to finite diffusion of the reactants to and products from the active sites. The simplest model to account for this mass transport limitation is the effectiveness factor  $\eta$  as introduced above. However, this model fails at conditions under which the reaction rate and diffusion coefficient of more than a single species determines overall reactivity. Like in this case, the interaction of diffusion and reaction demands more adequate models if mass transport in the porous media is dominated rather by diffusion than by convection.

Concentration gradients inside the porous media result in spatial variations of the surface reaction rates  $\dot{s}_i$ . In thin catalyst layers (washcoats), these are primarily significant in normal direction to the fluid/washcoat boundary. Therefore, one-dimensional reaction-diffusion

equations are applied with their spatial coordinate in that direction. Each chemical species leads to one reaction-diffusion equation, which is written in steady state as

$$\frac{\partial}{\partial r} \left( -D_i^{\text{eff}} \frac{\partial c_i^{\text{W}}}{\partial r} \right) - S_{\text{V}} \dot{s}_i = 0. \quad (22)$$

Here,  $c_i^{\text{W}}$  denotes the species concentration in the washcoat in normal direction to the boundary fluid/washcoat.  $D_i^{\text{eff}}$  is the effective diffusion coefficient, which can account for the different diffusion processes in macro and micro pores and can be derived from the binary diffusion coefficients <sup>[23, 34]</sup>. In addition to Eq. (22), the surface coverages can be calculated, assuming a *microkinetics* model is available, according to

$$\frac{d\theta_i}{dt} = \frac{\dot{s}_i \sigma_i}{\Gamma} \quad (23)$$

A heat balance, in which Eqs. (7) and (10) are combined, may be added to the model to account for temperature variations in the porous media. Since Eq. (22) is only applicable for thin catalytic layers or small pellets without net mass fluxes (ablation, deposition etc.) and internal pressure driven flows, temperature variations can generally be neglected. Eq. (22) is coupled with the surrounding flow field, Eq. (5), at the interface between open fluid and catalytic layer/pellet, where the diffusion fluxes normal to this interface must compensate. In this model the species concentrations, catalytic reaction rates, and surface coverages do not only depend on the position of the catalytic layer/pellet in the reactor, but also vary inside the catalyst layer/particle leading to CPU-time consuming computations.

### 3.4 Dusty-Gas Model

Fluxes within porous media which are driven by gradients in concentration and pressure, i.e. diffusion and convection, can be described by the Dusty Gas Model (DGM) <sup>[23, 34]</sup>. This model, which is also applicable for three-dimensional and larger porous media, is superior to

the ones discussed in the two previous sections but also leads to more sophisticated computational efforts. The conservation equation (4) for reactive porous-media species transport at steady state is now written as

$$\frac{\partial(j_{i,j})}{\partial x_j} = R_i^{\text{hom}} + R_i^{\text{het}} = R_i^{\text{hom}} + S_V M_i \dot{s}_i. \quad (24)$$

The components  $j$  of the gas-phase mass fluxes,  $j_{i,j}$ , of species  $i$  are evaluated by an implicit relationship among the molar concentrations, concentration gradients, and pressure gradients [23, 34].

$$j_{i,j} = \left[ - \sum_{l=1}^{N_g} D_{il}^{\text{DGM}} \frac{\partial c_l}{\partial x_j} - \left( \sum_{l=1}^{N_g} D_{il}^{\text{DGM}} \frac{c_l}{D_{l,\text{Kn}}^{\text{eff}}} \right) \frac{\alpha}{\mu} \frac{\partial p}{\partial x_j} \right] M_i. \quad (25)$$

Here  $D_{il}^{\text{DGM}}$  are the DGM diffusion coefficients and  $D_{i,\text{Kn}}^{\text{eff}}$  are the effective Knudsen diffusion coefficients. The first term on the right hand side of Eq. (25) represents the diffusive flux and the second the viscous flux. The DGM diffusion coefficients can be represented as a matrix inverse  $D_{il}^{\text{DGM}} = H^{-1}$ , where the elements of the  $H$  matrix are given by

$$h_{il} = \left[ \frac{1}{D_{i,\text{Kn}}^{\text{eff}}} + \sum_{j \neq i} \frac{X_j}{D_{ij}^{\text{eff}}} \right] \delta_{il} + (\delta_{il} - 1) \frac{X_j}{D_{il}^{\text{eff}}}. \quad (26)$$

The effective binary diffusion coefficients  $D_{il}^{\text{eff}}$  in the porous media are related to the ordinary binary diffusion coefficient  $D_{il}$  by

$$D_{il}^{\text{eff}} = \frac{\Phi_g}{\tau_g} D_{il}, \quad (27)$$

with  $\Phi_g$  = porosity and  $\tau_g$  = tortuosity. The effective Knudsen diffusion coefficient can be expressed as

$$D_{i,\text{Kn}}^{\text{eff}} = \frac{2}{3} \frac{\Phi_g}{\tau_g} r_p \sqrt{\frac{8RT}{\pi M_i}}, \quad (28)$$

where  $r_p$  is the average pore radius.

A critical evaluation of transport models including DGM and the development of a more general concept have been proposed by Kerkhof <sup>[35, 36]</sup>. For more transport in porous media in interaction with catalytic reactions, the reader is referred to Chapters 5 and 6.

## **4 Numerical methods and computational tools**

There are a variety of methods to solve the coupled system of partial differential and algebraic equations (PDE), which were presented in the previous sections for modeling catalytic reactors. Very often, the transient three-dimensional governing equations are simplified (no time dependence, symmetry, preferential flow direction, infinite diffusion etc.) as much as possible, but still taking care of all significant processes in the reactor. Simplifications often are not straight-forward and need to be conducted with care. Special algorithms were developed for special types of reactors to achieve a converged solution or to speed up the computation solution.

### **4.1 Numerical methods for the solution of the governing equations**

An analytic solution of the PDE system is only possible in very limited special cases; for all practical cases, a numerical solution is needed. Numerical solution means that algebraic equations are derived that approximate the solution of the PDE system at discrete points of the geometrical space of the reactor. The way of selection of these grid points and the derivation of algebraic equations, which are finally solved by the computer, is called discretization. Since the solution of the discretized equations is only an approximation of the solution of the PDE system, an error analysis is an essential feature of the interpretation of every CFD simulation.

The three major methods of discretization <sup>[37]</sup> are the methods of Finite Differences (FDM), Finite Volumes (FVM), and Finite Elements (FEM). The simplest method is FDM, which is

based on a Taylor series expansion of the solution vector between neighboring grid points and applied for well-structured grids. The chosen number of terms of the Taylor series determines the accuracy. In contrast to FDM, the Finite Volume method can be applied for unstructured grids so that for regions with larger gradients more grid points can be chosen, well-adapted to the reactor behavior. FVM calculates the dependent variables not for certain points but for certain volumes. Source terms within cells and fluxes through the boundaries of these cells are considered to derive the local values, which makes this method very physically descriptive and also allows simple error estimation.

The most universal method from a mathematical point of view is FEM <sup>[38, 39]</sup>; FDM and FVM can be considered as special cases of FEM. FEM originates from structural mechanics and has meanwhile found increased use in CFD. FEM generates the computational grid in a very adaptive way and is therefore ideal for complex geometries. Furthermore, FEM based codes are suited for the application of parallel computers. The great flexibility of FEM regarding the description of the solution and its convergence comes at the cost of a higher complexity of the computer program. Today, all commercial CFD codes are based on the methods FVM or FEM.

Very different from those three methods are the Lattice-Boltzmann methods (LBM) <sup>[40]</sup>, which have become popular in particular for the simulation of complex flow structures found in fixed beds <sup>[41-43]</sup>. The LBM may be considered as a finite difference method for a discrete Boltzmann equation. The method simulates hydrodynamic or mass transport phenomena by tracking the time evolution of particle distribution functions confined to a lattice moving with discrete velocity during discrete advances in time. Each time step is subdivided into separate streaming and collision steps. It could be shown that correctly chosen particle distribution functions recover the Navier–Stokes equations. LBM for reaction engineering applications is

still under development; in particular the implementation of heat transport and complex reaction schemes seems to be difficult. There is no commercial code based on LBM available yet.

## **4.2 CFD software**

Currently available multi-purpose commercial CFD codes can simulate very complex flow configurations including turbulence and multi component transport based on FVM and FEM. However, CFD codes still have difficulties to implement complex models for the chemical processes. One problem is the insufficient number of reactions and species the codes can handle. An area of recent development is the implementation of detailed models for heterogeneous reactions.

Several software packages have been developed for modeling complex reaction kinetics in CFD such as CHEMKIN <sup>[44]</sup>, CANTERA <sup>[45]</sup>, DETCHEM <sup>[46]</sup>, which also offer CFD codes for special reactor configurations such as channel flows and monolithic reactors. These kinetic packages and also a variety of user written subroutines for modeling complex reaction kinetics have meanwhile been coupled to several commercial CFD codes. Aside from the commercially wide-spread multi-purpose CFD software packages such as FLUENT <sup>[47]</sup>, STAR-CD <sup>[48]</sup>, FIRE <sup>[49]</sup>, CFD-ACE+ <sup>[50]</sup>, CFX <sup>[51]</sup>, a variety of multi-purpose and specialized CFD codes have been developed in academia and at research facilities such as MP-SALSA <sup>[52]</sup>. The latter ones are often customized for special reactor types and therefore more efficient. Another tool for the solution of PDE systems based on the finite element method is the FEMLAB software package <sup>[53]</sup>, which has been applied for CFD simulations of catalytic reactors as well.

## **4.3 Solvers for stiff ODE and DAE systems**

Model simplification and numerical algorithms make it possible to convert the PDE system of the governing equations to an ordinary differential equation (ODE) system or a coupled system of ODEs and algebraic equations called differential-algebraic equation (DAE) system. In those equation systems, time or one spatial component is the independent variable. Several computer codes have been developed to solve ODE and DAE systems. In particular suitable for reactive flows are DASSL<sup>[54]</sup>, LSODE<sup>[55]</sup>, LIMEX<sup>[56, 57]</sup>, and VODE<sup>[58]</sup> which are written in FORTRAN language. *The Trilinos Project*<sup>[59]</sup> offers ODE and DAE solvers written in C programming language. For the underlying theory of the numerical solution of DAE systems and software implementation it is referred to the textbook by Ascher and Petzold<sup>[60]</sup>.

## **5 Reactor simulations**

In the remainder of this Chapter, recent and challenging CFD simulations of catalytic reactors will be discussed according to the type of reactor.

### **5.1 Flow through channels**

There are wide varieties of chemical reactors, in which the reactive mixtures flow through channel-like devices such as tubular chemical reactors, automotive catalytic converters, and catalytic-combustion monoliths.

Pipes with diameters ranging from a few centimeters up to meters are one class of those reactors. The flow field here is in most cases turbulent, guaranteeing good mixing of the reactants. A fine resolution of flow field details is rarely of interest, and, aside from that, such a task exceeds today's computer capacities. Therefore, averaged equations and turbulence models are applied as discussed above.

Mantzaras et al. <sup>[15]</sup> applied the  $k$ - $\varepsilon$  model, a presumed (Gaussian) probability density function for gaseous reactions, and a laminar-like closure for surface reactions to study turbulent catalytically stabilized combustion of lean hydrogen-air mixtures in plane platinum-coated channels. They also examined different low-Reynolds number near-wall turbulence models and compared the numerically predicted results with data derived from planar laser-induced fluorescence measurements of OH radicals, Raman measurements of major species and laser doppler velocimetry measurements of local velocities and turbulence <sup>[61]</sup>. They found that discrepancies between predictions and measurements are ascribed to the capacity of the various turbulence models to capture the strong flow laminarization induced by the heat transfer from the hot catalytic surfaces. A more details discussion on laminar and turbulent flows in catalytically coated channels can be found in Chapter 7.

Another class of tube-like reactors is the monolith or honeycomb structure, which consists of numerous passageways with diameters reaching from a tenth of a millimeter to few millimeters. The flow field in the thin channels of this reactor type is usually laminar. The catalytic material is mostly dispersed in a washcoat on the inner channel wall. Monolith channels are manufactured with various cross-sectional shapes, e.g., circular, hexagonal, square or sinusoidal. Several recent CFD studies were conducted to understand the impact of the real washcoat shape on transport and overall reaction rate <sup>[33, 62, 63]</sup>. Hayes et al. <sup>[63]</sup> recently showed for a catalytic structure used for exhaust-gas clean-up in automobiles that the internal diffusion resistance, expressed in terms of an effectiveness factor, cannot be represented in terms of a unique curve using the generalized Thiele modulus approach to model diffusion and reaction in the washcoat of a catalytic monolith reactor. The most significant deviation occurs when the washcoat has the greatest variation in thickness. As shown in Figure 2, only a thin layer of the washcoat in the corners of the channel is needed for conversion, which implies that the corners can be coated with a catalyst free layer to

reduce the amount of expensive noble metals. Mladenov et al. recently coupled the three-dimensional Navier-Stokes equations with washcoat diffusion models and an elementary-step-like heterogeneous reaction mechanism consisting of 74 reactions among 11 gas-phase and 22 adsorbed surface species to study mass transfer in single channels of a honeycomb-type automotive catalytic converter operated under direct oxidation conditions<sup>[64]</sup>. The resulting concentration profiles (Fig. 3) at constant temperature were compared with 17 different numerical models with increasingly simplifying models concerning channel cross-section and external and internal diffusion. Again, internal diffusion in the washcoat determines overall activity. Even heat balances also accounting for heat conducting channel walls and external heat loss were coupled with the three-dimensional Navier-Stokes equations including detailed reaction mechanisms for the simulation of partial oxidation of methane to synthesis gas on rhodium coated monoliths with a rectangular channel cross-section<sup>[65]</sup>. On this level, computing time easily increases to several hours.

Since those 3D simulations require long computing times, the single channel is often approximated by a perfect cylindrical geometry, even for non-circular cross-sections. Furthermore, the inlet flow pattern is assumed to follow this geometry. Hence, the flow through the single channel can be treated as the flow through a tubular reactor that means two-dimensional (2D) with the axial and radial position as independent variables. The resulting 2D Navier-Stokes equations still describe an elliptic flow; that means, information in the channel may not only travel downstream, but also upstream, which makes the numerical solution still expensive. As the flow rate in the channel increases (i.e., high Reynolds number but still laminar), the axial diffusive transport is diminished in comparison to the radial diffusion and the convective transport. Hence, only downstream processes matter, and all the second derivatives in axial direction can be eliminated in Eqs. (2, 4, 7)<sup>[2, 66, 67]</sup>. Mathematically, the character of the equations is changed from elliptic to parabolic – a huge simplification,

leading to a much more efficient computational solution. This well-known simplification is generally known as the boundary-layer approximation, which is widely used in fluid mechanics. The boundary-layer equations form a system of differential-algebraic equations (DAE), with the time-like direction being the axial coordinate. These simplifications now permit the coupling of the flow field simulation with even very large reaction mechanisms. In terms of those assumptions, the catalytic partial oxidation of the gasoline surrogate iso-octane over a Rh coated monolith was studied in terms of complex reaction mechanisms consisting of 7193 homogeneous and 58 heterogeneous reactions among 857 gas phase and 17 surface species<sup>[68]</sup>. This detailed description only led to the explanation of the experimentally observed coke formation in the downstream section of the catalyst. As Figure 4 reveals the formation of hydrogen is mass transfer limited in the first section of the catalyst, the diffusion of oxygen being the rate-limiting process. The very low oxygen concentration at the catalyst entrance leads to some formation of hydrogen in a region, where the oxygen concentration in the gaseous bulk phase is still sufficiently high to promote total oxidation. In general, the reaction sequence is very similar to the behavior observed for light hydrocarbons by many groups<sup>[69-73]</sup>: after a short initial total oxidation zone leading to steam and CO<sub>2</sub>, the oxygen deficiency at the catalytic surface leads to the formation of hydrogen by steam reforming and partial oxidation. Due to the high temperature of approximately 1000°C, some remaining fuel is pyrolyzed by gas-phase reactions to form the coke precursors ethylene and propylene (Fig. 4), a relatively slow process that is kinetically controlled but presenting a threat for any downstream system such as fuel cell devices<sup>[74-76]</sup>.

A further simplification for modeling channel flows consists of the assumption of infinite radial mass transport or at least very fast radial mass transport, leading to vanishing gradients of radial concentration and temperature. There is a large amount of literature discussing this so-called plug-flow-reactor (PFR) model<sup>[5]</sup>, which has been the model of choice until

recently, including a variety of extensions such as mass transfer coefficients <sup>[77]</sup> or two-phase approaches <sup>[78]</sup>. The application of the PFR model becomes unreliable for systems in which fast catalytic reactions <sup>[67]</sup> and/or homogeneous gas-phase reactions occur <sup>[79]</sup>.

Further detailed simulations were for instance carried out by Hayes et al. <sup>[80]</sup>, who developed a 2D finite-element model for the simulation of a single channel of honeycomb type monolith catalytic reactor; and Wanker et al. <sup>[81]</sup> conducted transient two-dimensional simulations of a single channel of a catalytic combustor, taking into account the effects occurring in the gas phase, in the washcoat layer as well as in the substrate. They also apply their model to simulate a wood-fired domestic boiler <sup>[82]</sup>.

## 5.2 Monolithic reactors

The simplest way to model honeycomb-like structures, as shown in Figure 1, is based on the assumptions that all channels behave essentially alike, and therefore only one channel needs to be analyzed. If upstream heat conduction does not matter, parabolic approaches as the boundary layer approximation may be used <sup>[67]</sup>, otherwise an elliptic ansatz is needed <sup>[65, 79]</sup>; both approaches are discussed above. Heat transfer at the outer boundary of the monolith, spatially varying inlet conditions at the front face of the monolith, and different catalyst coatings will demand models that consider the entire monolithic structure. Since the detailed simulation of every individual channel is usually not tractable, simplifying algorithms are needed <sup>[83]</sup>. Catalytic monoliths for instance have been treated as porous media <sup>[84]</sup>, which can save computational time but could yield unreliable results if the interaction of transport and reactions in the individual channels matters.

Another approach combines the simulation of a representative number of channels with the simulation of the temperature profiles of the solid structure treating the latter one as

continuum<sup>[85-88]</sup>. This approach is the basis for the computer code DETCHEM<sup>MONOLITH</sup><sup>[46]</sup>, which has been applied to model the transient behavior of catalytic monoliths. The code combines a transient three-dimensional simulation of a catalytic monolith with a 2D model of the single-channel flow field based on the boundary layer approximation. It uses detailed models for homogeneous gas-phase chemistry, heterogeneous surface chemistry, and contains models for the description of pore diffusion in washcoats. The numerical structure of the code as sketched in Fig. 5 is based on the following ideas: The residence time of the reactive gas in the monolith channels is much smaller than the unsteadiness of the inlet conditions and the thermal response of the solid monolith structure. Under these assumptions, the time scales of the channel flow are decoupled from the temporal temperature variations of the solid, and the following procedure can be applied: A transient multi-dimensional heat balance is solved for the monolithic structure including the thermal insulation and reactor walls, which are treated as porous continuum. This simulation of the heat balance provides the temperature profiles along the channel walls. At each time step the reactive flow through a representative number of single channels is simulated including detailed transport and chemistry models. These single-channel simulations also calculate the heat flux from the fluid flow to the channel wall due to convective and conductive heat transport in the gaseous flow and heat released by chemical reactions. Thus, at each time step, the single-channel simulations provide the source terms for the heat balance of the monolith structure while the simulation of the heat balance provides the boundary condition (wall temperature) for the single-channel simulations. At each time step, the inlet conditions may vary. This very efficient iterative procedure enables a transient simulation of the entire monolith without sacrificing the details of the transport and chemistry models, as long as the prerequisites for the time scales remain valid. Furthermore, reactors with alternating channel properties such as flow directions, catalyst materials, and loadings can be treated. The code has been applied to model transient behavior of automotive

catalytic converters, catalytic combustion monoliths for gas-turbine applications, and high temperature catalysis. Exemplarily, two recently discussed cases are presented:

In Figure 6, the impact of flow rate on the temperature distribution in the monolithic sections of a short contact time reactor for reforming of iso-octane to hydrogen-rich synthesis gas reveals that higher flow rates lead to an increase in temperature, conversion and consequently higher hydrogen yields<sup>[89]</sup>. This counter-intuitive increase in fuel conversion with decreasing residence time (increasing flow rate) can be explained by analyzing the ratio of chemical heat release to heat loss in the reactor<sup>[90]</sup>.

The second example is the simulation of driving cycles to be used by legislation to test automotive catalytic converters. These cycles last about 20 minutes and cover a very wide range of conditions. Due to spatially varying inlet conditions and radial temperature profiles over the monolithic catalyst structure, a rather larger number of channels need to be considered in the simulations<sup>[91]</sup>. Furthermore, the continuously temporarily varying inlet temperature, exhaust-gas composition and mass flows make such a simulation a formidable task. The code DTECEM<sup>MONOLITH</sup> can handle this challenge quite well due to the approach discussed above<sup>[92-94]</sup>. Figure 7 presents a comparison of the experimental and computed time-resolved CO emission in a realistic automobile driving cycle.

### **5.3 Fixed bed reactors**

The understanding of fluid dynamics and their impact on conversion and selectivity in fixed bed reactors is still very challenging<sup>[95, 96]</sup>. For large ratios of reactor width to pellet diameter, simple porous media models are usually applicable<sup>[97]</sup>. This simple approach becomes questionable as this ratio decreases<sup>[25, 98]</sup>. At small ratios the individual local arrangement of the particles and the corresponding flow field are significant for mass and heat transfer, and,

hence, the overall product yields. Therefore, several attempts have recently been made to resolve the flow field in the actual configuration, i.e. by a direct numerical simulation (DNS). Even though the governing equations are relatively simple for laminar flows, this approach can usually be applied for small and periodic regions of the reactor only, which is caused by the huge number of computational cells needed to resolve all existing boundary layers <sup>[99-105]</sup>. Ideally, for the simulation of fixed bed reactors one should account for the transport of chemical species from the bulk of the gas-phase to the pellet surface, and then the diffusion and reaction of the species within the catalyst pellets, which may be made up of micro-porous materials.

Exemplarily, two DNS studies of the group of Dixon will be presented, in which the actual structure of the catalytic fixed bed reactors was taken into account<sup>[106-110]</sup>. Having spheres as catalyst particles, the modeled turbulent flow and heat transport in a periodic test cell with a tube-to-particle diameter ratio of 4 was simulated<sup>[111]</sup>. The turbulence was modeled by the Renormalization Group (RNG)  $k$ - $\varepsilon$  model <sup>[112]</sup>, and two different wall functions (standard <sup>[113]</sup> and non-equilibrium) were applied to model the flow field near solid surfaces. Attempts to correlate the local wall heat flux with local properties of the flow field, such as velocity components, velocity gradients, and components of vorticity, led to the conclusion that local heat transfer rates do not correlate statistically with the local flow field. Instead, a conceptual analysis was used to suggest that local patterns of wall heat flux are related to larger-scale flow structures in the bed. Recently, the same group studied the interplay of 3D transport and reaction occurring inside cylindrical pellets and in the gas flow around the pellets used for propane dehydrogenation to better understand catalyst deactivation by carbon deposition (Fig. 8)<sup>[114]</sup>.

Lattice-Boltzmann-methods (LBM) have also been applied for a better understanding of fluid flow in complex reactor configurations <sup>[42, 43, 115]</sup>. The packing of spheres in cylindrical columns can be created either from experimental observations, such as magnetic resonance imaging (MRI), or by computer simulations. The created topology is then divided into a Cartesian grid, where individual elements are labeled as solid or fluid regions. A high resolution of the grid leads to accurate flow profiles. Zeiser et al. <sup>[43]</sup> generated the geometrical structures of the fixed bed with a Monte-Carlo method. This allowed to efficiently simulate the placement of randomly packed spheres in a cylinder and to obtain detailed information of statistical properties, such as the distribution of the void fraction. This geometrical information was the basis for subsequent numerical flow simulation using LBM. This approach allowed the prediction of the local fluid velocity distribution in the bed as well as the transport and rate of simple chemical reactions. Yuen et al. <sup>[115]</sup> studied correlations between local conversion and hydrodynamics in a 3D fixed-bed esterification process by applying a LBM and comparing its results with data from in situ magnetic resonance visualization techniques.

#### **5.4 Wire gauzes**

Wire gauze reactors have been applied for high temperature catalytic reactions in industry for quite a long time. For example, ammonia is oxidized over Pt/Rh wire gauzes to produce NO (Ostwald process), and similar, HCN is synthesized by ammoxidation of methane (Andrussov process). Due to the complex 3D geometry, wire gauze reactors have been frequently treated by simpler two dimensional simulations <sup>[116, 117]</sup>. However, since mass and heat transport are the dominating processes in wire gauze reactors, simplifications of the flow field are risky. Therefore, CFD studies were performed using 3D simulations of the flow field. The 3D flow field through knitted gauzes applied for ammonia oxidation was simulated by Neumann et al. <sup>[118]</sup>. Catalytic partial oxidation (CPOX) of light alkanes was also studied in wire gauze

reactors. De Smet et al. <sup>[119]</sup> studied CPOX of methane with oxygen at atmospheric pressure in a continuous-flow reactor containing a single Pt metal gauze. They used 3D computations of simultaneous heat and mass transfer in case of a simple surface reaction on the gauze catalyst to derive intrinsic kinetics. This experiment was later simulated using even detailed surface and gas phase reaction schemes <sup>[120]</sup>. Figure 9 exemplarily shows the computed temperature profile around a Pt/Rh wire gauze used for ammonia oxidation, which was carried out with the commercial CFD code FLUENT<sup>[121]</sup> coupled with a multi-step surface reaction mechanism.

## **5.5 Catalytic reactors with multi-phase fluids**

CFD simulations have recently been applied to quite a number of catalytic reactor types with multi-phase flow fields such as fluidized bed reactors with and without circulation, slurry reactors, trickle-bed reactors, membrane reactors, electro-catalytic devices (e.g. fuel cells), and reactive distillation devices. These multi-phase reactors are of multi-scale structure, i.e. single particles, particle clusters/bubbles and reactor vessel, and of multiple physics, i.e. hydrodynamics, heat and mass transfer, and reaction kinetics. The formation of complex structures/patterns in each regime is a result of a compromise between dominant mechanisms at multiple scales. Coupling of hydrodynamics, heat and mass transfer, and reaction kinetics takes place at molecular and particle levels where conductive and convective transfer and diffusion within the internal pores of the catalyst are accompanied by the adsorption, surface reaction and desorption of reactant and product on the surface. Even though this complexity is challenging for CFD simulations, computations are a promising tool to achieve a better understanding of multi-phase reactors.

A detailed description of the fundamentals and modeling attempts of these multi-phase reactors is beyond the scope of this chapter, here it is referred to general textbooks<sup>[19-21]</sup>. Instead, few examples may serve as illustration of the potential of CFD simulations of reactors with multi-phase flow fields.

Heterogeneously catalyzed gas–liquid reactions, such as hydrogenations, oxidations, hydroformylations, and Fischer-Tropsch synthesis are frequently carried out in slurry reactors. The catalysts of typical diameter of 1 to 100 $\mu$ m are suspended in the liquid phase, the injecting gas providing the mixing and catalyst suspension. The advantages of bubble slurry reactors over fixed bed reactors are better temperature control and high reaction rates using small catalyst particles. The Khinast group studied heterogeneously catalyzed reactions close to bubbles using advanced CFD tools<sup>[122]</sup>. Their study revealed the influence of bubble size and shape and particle properties on selectivity of fast heterogeneously catalyzed gas–liquid reactions. The reaction was shown to occur primarily in the wake of the bubble for fast gas–liquid–solid reactions (Fig. 10), and is thus dependent only on the mixing in this region.

Recently, Fischer-Tropsch syntheses slurry bubble column reactors have been the objective of several modeling studies<sup>[123-125]</sup>. Troshko and Zdravistch recently conducted a CFD study based on a Eulerian multi-fluid formulation with both the liquid–catalyst slurry and syngas bubbles phases<sup>[125]</sup>. The model includes variable gas bubble size, effects of the catalyst suspended in the liquid phase and chemical reactions. Findings of this study are that the highly localized FT reaction rate appears next to the gas injection region leading to heat release maxima in that region.

The mass and heat transfer in three-phase flow is not only determined by the transport through the interphases but also by convective transport within the bubbles and the liquid

structure (Fig. 11)<sup>[126]</sup>. Based on a volume-of-fluid method with interface reconstruction computation, bubble shapes were recently computed and experimentally validated in Taylor flows in a viscous liquid within a square channel of 1 mm hydraulic diameter (Fig. 12) by Wörner et al. <sup>[127]</sup>. These simulations are of great interest for gas-liquid-solid reactions in micro structures, in which the catalyst is dispersed on the solid wall.

## 5.6 Materials synthesis

Chemical reactors for material synthesis are often characterized by interactions between more than one phase, e.g. gas-phase and solid phase. Chemical vapor deposition (CVD) and chemical vapor infiltration (CVI) are two commonly used methods for material synthesis. The methodology to treat those systems is very close to the one discussed in this book for heterogeneous catalytic reactions, and, therefore, a few remarks shall be made.

CVD is widely used for the manufacturing of thin solid films in semiconductor industry. The complex interactions of a large number of chemical species with flow and heat transport prohibited early CFD models to include detailed chemistry into the reactor models. Nevertheless, for simple configurations such as stagnation flow configuration, codes were developed in the early stage of modeling heterogeneous reactive flows, when Kee et al. developed the first tools for CFD modeling of heterogeneous reactions <sup>[28, 128, 129]</sup>. These tools were applied for catalysis and materials synthesis <sup>[28, 128, 130, 131]</sup>. With increasing computer performance, it became possible to include more detailed descriptions of transport phenomena and reaction chemistry into CFD models. Kleijn<sup>[132]</sup>, for instance, carried out a full 2D simulation of rotating disk/stagnation flow CVD reactor using CFD models with detailed surface chemistry and could show that properties at the outer edges of the reactor can vary significantly from that of the centerline, especially in the case of stagnation flow.

Modeling CVI is more challenging compared to CVD due to the temporal densification of the porous substrate and hence the changing surface area. These changes significantly influence the interaction between the gas-phase and the surface kinetics. Therefore, one has to incorporate additional model equations that describe the temporal changes in porosity and surface area into the CFD models. Li et al. modeled the chemical vapor infiltration (CVI) of hydrocarbons for the synthesis of carbon-carbon composites. They coupled the CVI model with COMSOL to simulate the densification of the porous substrate as a function of time<sup>[133, 134]</sup> and studied the densification of a porous carbon felt using CH<sub>4</sub> precursor. CFD simulations have also found their way into modeling of the synthesis of catalytic particles by flame synthesis<sup>[135]</sup>, carbon nanotubes<sup>[136]</sup>, and fibrous active materials<sup>[137, 138]</sup>, to name just few more examples related to catalysis.

## **5.7 Electrocatalytic devices**

CFD simulations using heterogeneous reactions are extensively applied to fundamental research pertaining to electrochemical systems, as discussed in more detail for SOFC modeling in Chapter 6. Also battery dynamics studied using CFD techniques give insightful understanding of its discharge characteristics. Several one-dimensional models are reported in the literature that simulates the electrolyte transport and discharge characteristics<sup>[139, 140]</sup>. Although the one-dimensional models are simple and efficient in predicting the discharge characteristics of battery systems, multi-dimensional models without any ad hoc approximations can be very valuable in the fundamental understanding of processes that occur in battery systems. The ability to visualize flow patterns during operation of a device is a uniqueness of CFD, which is very difficult if not impossible to realize in pure experimentation. Gu et al., for instance, developed a CFD model to predict the transient behavior of electric-vehicle lead acid batteries during charge and discharge processes<sup>[141]</sup>. The growing interest in lithium ion batteries also lead to first CFD applications in this field<sup>[142]</sup>.

CFD simulation has also been used to understand experimentally observed phenomena in electro-catalytic flow cells, in which mass transport interacts with the electric and chemical processes leading to a complex dependence of the Faradaic current on the potential<sup>[143]</sup>.

## **6 Summary and outlook**

From a reaction engineering perspective, computational fluid dynamics simulations have matured into a powerful tool for understanding mass and heat transport in catalytic reactors. Initially, CFD calculations focused on a better understanding of mixing, mass transfer to enhance reaction rates, diffusion in porous media and heat transfer. Over the last decade, the flow field and heat transport models have also been coupled with models for heterogeneous chemical reactions. So far, most of these models are based on the mean field approximation, in which the local state of the surface is described by its coverage with adsorbed species averaged on a microscopic scale. The currently increasing research activities on surface reactions at practical conditions will certainly boost the application of CFD codes that combine fluid flow and chemistry. New insights into the complexity of heterogeneous catalysis, however, will also reveal the demand for more sophisticated chemistry models. Their implementation into CFD simulations will then require even more sophisticated numerical algorithms and computer hardware. Hence, CFD simulations of reactive systems will remain a very active field and the implementation of more adequate and complex models will continue.

The simulation results will always remain a reflection of the models and physical parameters applied. The careful choice of the sub models (geometry, turbulence, diffusion, species, and reactions involved, etc.) and the physical parameters (inlet and boundary conditions,

conductivity, permeability, viscosity, etc.) is a precondition for reliable simulation results. Therefore, only the use of appropriate models and parameters, which describe all significant processes in the reactor, can lead to reliable results. Furthermore, numerical algorithms never give the accurate solution of the model equations but only an approximated solution. Hence, error estimation is needed. Having these crucial issues in mind, CFD can really serve as a powerful tool in understanding the behavior in catalytic reactors and in supporting the design and optimization of reactors and processes.

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## References

- [1] R. B. Bird, W. E. Stewart, E. N. Lightfoot, *Transport Phenomena*, 2nd ed., John Wiley & Sons, Inc., New York, **2001**.
- [2] R. J. Kee, M. E. Coltrin, P. Glarborg, *Chemically Reacting Flow*, Wiley-Interscience, **2003**.
- [3] S. V. Patankar, *Numerical Heat Transfer and Fluid Flow*, McGraw-Hill, New York, **1980**.
- [4] J. Warnatz, R. W. Dibble, U. Maas, *Combustion, Physical and Chemical Fundamentals, Modeling and Simulation, Experiments, Pollutant Formation*, Springer-Verlag, New York, **1996**.
- [5] R. E. Hayes, S. T. Kolaczkowski, *Introduction to Catalytic Combustion*, Gordon and Breach Science Publ., Amsterdam, **1997**.
- [6] J. O. Hirschfelder, C. F. Curtiss, R. B. Bird, *Molecular Theory of Gases and Liquids*, rev. ed., Wiley, New York, **1964**.
- [7] R. J. Kee, G. Dixon-Lewis, J. Warnatz, M. E. Coltrin, J. A. Miller, *A Fortran Computer Code Package for the Evaluation of Gas-Phase Multicomponent Transport Properties*, SAND86-8246, Sandia National Laboratories, **1986**.
- [8] M. W. Chase Jr., C. A. Davis, J. R. Downey Jr., D. J. Frurip, R. A. McDonald, A. N. Syverud, *Journal of Physical and Chemical Reference Data* **1985**, *14*, 1.
- [9] R. J. Kee, F. M. Rupley, J. A. Miller, *The Chemkin Thermodynamic Database*, SAND87-8215, Sandia National Laboratories, Livermore, **1987**.
- [10] A. Burcat, in *Combustion chemistry* (Ed.: W. C. Gardiner), Springer, New York, **1984**, p. 455.
- [11] S. W. Benson, *Thermochemical Kinetics*, John Wiley & Sons, New York, **1976**.
- [12] P. A. Libby, F. A. Williams, *Turbulent Reactive Flow*, Academic Press, London, **1993**.
- [13] S. B. Pope, *Progress in Energy and Combustion Science* **1985**, *11*, 119.
- [14] C. Appel, J. Mantzaras, R. Schaeren, R. Bombach, A. Inauen, *Combustion and Flame* **2005**, *140*, 70.
- [15] J. Mantzaras, C. Appel, P. Benz, U. Dogwiler, *Catalysis Today* **2000**, *59*, 3.
- [16] B. E. Launder, D. B. Spalding, *Mathematical models of turbulence*, Academic Press, London/New York, **1972**.
- [17] E. Gutheil, H. Bockhorn, *Physicochemical Hydrodynamics* **1987**, *9*, 525.
- [18] X. Y. Zhang, G. Ahmadi, *Chemical Engineering Science* **2005**, *60*, 5089.
- [19] H. A. Jakobsen, *Chemical Reactor Modeling: Multiphase Reactive Flows* Springer-Verlag, Heidelberg, **2008**.
- [20] C. T. Crowe, J. D. Schwarzkopf, M. Sommerfeld, Y. Tsuji, *Multiphase Flows with Droplets and Particles*, CRC Press, **1998**.
- [21] M. Ishii, T. Hibiki, *Thermo-fluid Dynamics of Two-Phase Flow*, Springer, **2006**.
- [22] R. Aris, *The Mathematical Theory of Diffusion and Reaction in Permeable Catalysts*, Clarendon Press, Oxford, **1975**.
- [23] F. Keil, *Diffusion und Chemische Reaktionen in der Gas-Feststoff-Katalyse*, Springer-Verlag, Berlin, **1999**.
- [24] F. J. Keil, *Catalysis Today* **2000**, *53*, 245.
- [25] O. Bey, G. Eigenberger, *Chemical Engineering Science* **1997**, *52*, 1365.
- [26] M. Giese, K. Rottschäfer, D. Vortmeyer, *American Institute of Chemical Engineering Journal* **1998**, *44*, 484.
- [27] M. Winterberg, E. Tsotsas, A. Krischke, D. Vortmeyer, *Chemical Engineering Science* **2000**, *55*, 967.

- [28] M. E. Coltrin, R. J. Kee, F. M. Rupley, *SURFACE CHEMKIN (Version 4.0): A Fortran Package for Analyzing Heterogeneous Chemical Kinetics at a Solid-Surface - Gas-Phase Interface*, SAND91-8003B, Sandia National Laboratories, **1991**.
- [29] O. Deutschmann, R. Schmidt, F. Behrendt, J. Warnatz, *Proceedings of the Combustion Institute* **1996**, 26, 1747.
- [30] L. L. Raja, R. J. Kee, L. R. Petzold, *Proceedings of the Combustion Institute* **1998**, 27, 2249.
- [31] W. Boll, S. Tischer, O. Deutschmann, *Industrial & Engineering Chemistry Research* **2010**, 49, 10303.
- [32] S. B. Kang, H. J. Kwon, I. S. Nam, Y. I. Song, S. Oh, *Industrial & Engineering Chemistry Research* **2011**, accepted for publication.
- [33] D. Papadias, L. Edsberg, P. H. Björnbohm, *Catalysis Today* **2000**, 60, 11.
- [34] E. Mason, A. Malinauskas, *Gas Transport in Porous Media: The Dusty-Gas Model*, American Elsevier, New York, **1983**.
- [35] P. Kerkhof, M. A. M. Geboers, *American Institute of Chemical Engineering Journal* **2005**, 51, 79.
- [36] P. Kerkhof, *Chemical Engineering Journal* **1996**, 64, 319.
- [37] V. V. Ranade, *Computational Flow Modeling for Chemical Reactor Engineering*, Academic Press, **2002**.
- [38] R. E. Hayes, S. T. Kolaczowski, W. J. Thomas, *Computers & Chemical Engineering* **1997**, 16, 654.
- [39] D. S. Burnett, *Finite Element Analysis*, Addison-Wesley Publ. Comp., Reading, **1987**.
- [40] S. Succi, *The Lattice Boltzmann Equation for Fluid Dynamics and Beyond*, Oxford University Press, **2001**.
- [41] S. P. Sullivan, F. M. Sani, M. L. Johns, L. F. Gladden, *Chemical Engineering Science* **2005**, 60, 3405.
- [42] H. Freund, T. Zeiser, F. Huber, E. Klemm, G. Brenner, F. Durst, G. Emig, *Chemical Engineering Science* **2003**, 58, 903.
- [43] T. Zeiser, P. Lammers, E. Klemm, Y. W. Li, J. Bernsdorf, G. Brenner, *Chemical Engineering Science* **2001**, 56, 1697.
- [44] R. J. Kee, F. M. Rupley, J. A. Miller, M. E. Coltrin, J. F. Grcar, E. Meeks, H. K. Moffat, A. E. Lutz, G. Dixon-Lewis, M. D. Smooke, J. Warnatz, G. H. Evans, R. S. Larson, R. E. Mitchell, L. R. Petzold, W. C. Reynolds, M. Caracotsios, W. E. Stewart, P. Glarborg, C. Wang, O. Adigun, *CHEMKIN*, 3.6 ed., Reaction Design, Inc., [www.chemkin.com](http://www.chemkin.com), San Diego, **2000**.
- [45] D. G. Goodwin, *CANTERA. An open-source, extensible software suite for CVD process simulation*, [www.cantera.org](http://www.cantera.org), **2003**.
- [46] O. Deutschmann, S. Tischer, C. Correa, D. Chatterjee, S. Kleditzsch, V. M. Janardhanan, *DETCHEM software package*, 2.0 ed., [www.detchem.com](http://www.detchem.com), Karlsruhe, **2004**.
- [47] *Fluent*, Fluent Incorporated, [www.fluent.com](http://www.fluent.com), Lebanon, NH, **2005**.
- [48] in *CD-adapco*, London Office, 200 Shepherds Bush Road, London, W6 7NY, United Kingdom, [www.cd-adapco.com](http://www.cd-adapco.com).
- [49] *FIRE*, AVL LIST GmbH, [www.avl.com](http://www.avl.com), Graz, Austria, **2005**.
- [50] *CFD-AC+*, CFD Research Corporation, [www.cfdrc.com](http://www.cfdrc.com), Huntsville, AL, **2005**.
- [51] *CFX*, [www-waterloo.ansys.com](http://www-waterloo.ansys.com), **2005**.
- [52] J. Shadid, S. Hutchinson, G. Hennigan, H. Moffat, K. Devine, A. G. Salinger, *Parallel Computing* **1997**, 23, 1307.
- [53] *FEMLAB*, [www.comsol.com](http://www.comsol.com), **2005**.

- [54] K. E. Brenan, S. L. Campbell, L. R. Petzold, *Numerical Solution of Initial-Value Problems in Differential-Algebraic Equations*, 2nd ed., SIAM, Philadelphia, PA, **1996**.
- [55] A. C. Hindmarsh, in *Scientific Computing* (Ed.: R. S. Stepleman), North Holland Publishing Co., Amsterdam, **1983**, pp. 55.
- [56] P. Deuffhardt, E. Hairer, J. Zugk, *Numerische Mathematik* **1987**, 51, 501.
- [57] P. Deuffhard, U. Nowak, *Progress in Scientific Computing* **1987**, 7, 37.
- [58] P. N. Brown, G. D. Byrne, A. C. Hindmarsh, *SIAM Journal on Scientific and Statistical Computing* **1989**, 10, 1038.
- [59] *The Trilinos Project*, Sandia National Laboratories, <http://trilinos.sandia.gov/>, **2011**.
- [60] U. M. Ascher, L. R. Petzold, *Computer Methods for Ordinary Differential Equations and Differential-Algebraic Equations*, SIAM, Philadelphia, PA, **1998**.
- [61] C. Appel, J. Mantzaras, R. Schaeren, R. Bombach, B. Kaeppli, A. Inauen, *Proceedings of the Combustion Institute* **2003**, 29, 1031.
- [62] R. E. Hayes, B. Liu, M. Votsmeier, *Chemical Engineering Science* **2005**, 60, 2037.
- [63] R. E. Hayes, B. Liu, R. Moxom, M. Votsmeier, *Chemical Engineering Science* **2004**, 59, 3169.
- [64] N. Mladenov, J. Koop, S. Tischer, O. Deutschmann, *Chemical Engineering Science* **2010**, 65, 812.
- [65] O. Deutschmann, R. Schwiedernoch, L. Maier, D. Chatterjee, in *Natural Gas Conversion VI, Studies in Surface Science and Catalysis, Vol. 136* (Eds.: E. Iglesia, J. J. Spivey, T. H. Fleisch), Elsevier, Alaska, **2001**, pp. 251.
- [66] H. Schlichting, K. Gersten, *Boundary-Layer Theory*, 8th ed., Springer-Verlag, Heidelberg, **1999**.
- [67] L. L. Raja, R. J. Kee, O. Deutschmann, J. Warnatz, L. D. Schmidt, *Catalysis Today* **2000**, 59, 47.
- [68] M. Hartmann, L. Maier, H. D. Minh, O. Deutschmann, *Combustion and Flame* **2010**, 157, 1771.
- [69] R. Schwiedernoch, S. Tischer, C. Correa, O. Deutschmann, *Chemical Engineering Science* **2003**, 58, 633.
- [70] S. Karagiannidis, J. Mantzaras, G. Jackson, K. Boulouchos, *Proceedings of the Combustion Institute* **2007**, 31, 3309.
- [71] M. Maestri, D. G. Vlachos, A. Beretta, P. Forzatti, G. Groppi, E. Tronconi, *Topics in Catalysis* **2009**, 52, 1983.
- [72] A. Beretta, G. Groppi, M. Lualdi, I. Tavazzi, P. Forzatti, *Industrial & Engineering Chemistry Research* **2009**, 48, 3825.
- [73] R. Horn, N. J. Degenstein, K. A. Williams, L. D. Schmidt, *Catalysis Letters* **2006**, 110, 169.
- [74] M. Hartmann, T. Kaltschmitt, O. Deutschmann, *Catalysis Today* **2009**, 147, S204.
- [75] N. Hebben, C. Diehm, O. Deutschmann, *Appl. Catalysis A: General* **2010**, doi:10.1016/j.apcata.2010.08.055.
- [76] T. Kaltschmitt, L. Maier, O. Deutschmann, *Proceedings of the Combustion Institute* **2010**, 33, doi: 10.1016/j.proci.2010.05.050
- [77] R. E. Hayes, S. T. Kolaczkowski, *Catalysis Today* **1999**, 47, 295.
- [78] G. Vesper, J. Frauhammer, *Chemical Engineering Science* **2000**, 55, 2271.
- [79] D. K. Zerkle, M. D. Allendorf, M. Wolf, O. Deutschmann, *Journal of Catalysis* **2000**, 196, 18.
- [80] R. E. Hayes, S. T. Kolaczkowski, W. J. Thomas, *Computers & Chemical Engineering* **1992**, 16, 645.

- [81] R. Wanker, H. Raupenstrauch, G. Staudinger, *Chemical Engineering Science* **2000**, 55, 4709.
- [82] R. Wanker, M. Berg, H. Raupenstrauch, G. Staudinger, *Chemical Engineering & Technology* **2000**, 23, 535.
- [83] S. T. Kolaczowski, *Catalysis Today* **1999**, 47, 209.
- [84] S. Mazumder, D. Sengupta, *Combustion and Flame* **2002**, 131, 85.
- [85] R. Jahn, D. Snita, M. Kubicek, M. Marek, *Catalysis Today* **1997**, 38, 39.
- [86] G. C. Koltsakis, P. A. Konstantinidis, A. M. Stamatelos, *Applied Catalysis B: Environmental* **1997**, 12, 161.
- [87] S. Tischer, C. Correa, O. Deutschmann, *Catalysis Today* **2001**, 69, 57.
- [88] S. Tischer, O. Deutschmann, *Catalysis Today* **2005**, 105, 407.
- [89] L. Maier, M. Hartmann, S. Tischer, O. Deutschmann, *Combustion and Flame* **2011**, 158, 796.
- [90] M. Hartmann, L. Maier, O. Deutschmann, *Appl. Catalysis A: General* **2010**, doi:10.1016/j.apcata.2010.08.051.
- [91] J. Windmann, J. Braun, P. Zacke, S. Tischer, O. Deutschmann, J. Warnatz, *SAE Technical Paper* **2003**, 2003-01-0937.
- [92] J. Braun, T. Hauber, H. Többen, J. Windmann, P. Zacke, D. Chatterjee, C. Correa, O. Deutschmann, L. Maier, S. Tischer, J. Warnatz, *SAE Technical Paper* **2002**, 2002-01-0065.
- [93] S. Tischer, Y. Jiang, K. W. Hughes, M. D. Patil, M. Murtagh, *SAE Technical paper* **2007**, 2007-01-1071.
- [94] J. Koop, O. Deutschmann, *Applied Catalysis B-Environmental* **2009**, 91, 47.
- [95] S. S. E. H. Elnashaie, S. S. Elnashaie, *Modelling, Simulation and Optimization of Industrial Fixed Bed Catalytic Reactors*, G+B Gordon and Breach, **1995**.
- [96] A. G. Dixon, M. Nijemeisland, *Industrial & Engineering Chemistry Research* **2001**, 40, 5246.
- [97] M. Bizzi, G. Saracco, R. Schwiedernoch, O. Deutschmann, *AIChE Journal* **2004**, 50, 1289.
- [98] M. Bauer, R. Adler, *Chemical Engineering & Technology* **2003**, 26, 545.
- [99] J. P. Sorensen, W. E. Stewart, *Chemical Engineering Science* **1974**, 29, 827.
- [100] M. T. Dalman, J. H. Merkin, C. McGreavy, *Computers & Fluids* **1986**, 14, 267.
- [101] B. Lloyd, R. Boehm, *Numerical Heat Transfer Part A - Applications* **1994**, 26, 237.
- [102] K. Debus, H. Nirschl, A. Delgado, V. Denk, *Chemie Ingenieur Technik* **1998**, 70, 415.
- [103] S. A. Logtenberg, M. Nijemeisland, A. G. Dixon, *Chemical Engineering Science* **1999**, 54, 2433.
- [104] H. P. A. Calis, J. Nijenhuis, B. C. Paikert, F. M. Dautzenberg, C. M. van den Bleek, *Chemical Engineering Science* **2001**, 56, 1713.
- [105] C. F. Petre, F. Larachi, I. Iliuta, B. P. A. Grandjean, *Chemical Engineering Science* **2003**, 58, 163.
- [106] A. G. Dixon, M. E. Taskin, M. Nijemeisland, E. H. Stitt, *Chemical Engineering Science* **2008**, 63, 2219.
- [107] E. Ranzi, et al., <http://www.chem.polimi.it/CRECKModeling/kinetic.html> **2007**.
- [108] A. G. Dixon, M. E. Taskin, E. H. Stitt, M. Nijemeisland, *Chemical Engineering Science* **2007**, 62, 4963.
- [109] A. G. Dixon, M. Nijemeisland, E. H. Stitt, *Industrial & Engineering Chemistry Research* **2005**, 44, 6342.
- [110] M. Behnam, A. G. Dixon, M. Nijemeisland, E. H. Stitt, *Industrial & Engineering Chemistry Research* **2005**, 49, 10641.
- [111] M. Nijemeisland, A. G. Dixon, *American Institute of Chemical Engineering Journal* **2004**, 50, 906.

- [112] V. Yakhot, S. A. Orszag, *Physical Review Letters* **1986**, 57, 1722.
- [113] B. E. Lauder, D. B. Spalding, *Computer Methods in Applied Mathematics and Engineering* **1974**, 3, 169.
- [114] M. Behnam, A. G. Dixon, M. Nijemeisland, E. H. Stitt, *Industrial & Engineering Chemistry Research*, 49, 10641.
- [115] E. H. L. Yuen, A. J. Sederman, F. Sani, P. Alexander, L. F. Gladden, *Chemical Engineering Science* **2003**, 58, 613.
- [116] V. P. Zakharov, I. A. Zolotarskii, V. A. Kuzmin, *Chemical Engineering Journal* **2003**, 91, 249.
- [117] R. P. O'Connor, L. D. Schmidt, O. Deutschmann, *American Institute of Chemical Engineering Journal* **2002**, 48, 1241.
- [118] J. Neumann, H. Golitzer, A. Heywood, I. Ticu, *Revista De Chimie* **2002**, 53, 721.
- [119] C. R. H. de Smet, M. H. J. M. de Croon, R. J. Berger, G. B. Marin, J. C. Schouten, *Applied Catalysis A: General* **1999**, 187, 33.
- [120] R. Quiceno, O. Deutschmann, J. Warnatz, *Applied Catalysis A: General* **2005**, submitted.
- [121] FLUENT, 4.4 ed., Fluent Inc. Lebanon, New Hampshire, **1997**.
- [122] J. A. Raffensberger, B. J. Glasser, J. G. Khinast, *Aiche Journal* **2005**, 51, 1482.
- [123] G. Lozano-Blanco, J. W. Thybaut, K. Surla, P. Galtier, G. B. Marin, *Aiche Journal* **2009**, 55, 2159.
- [124] J. M. van Baten, R. Krishna, *Industrial & Engineering Chemistry Research* **2004**, 43, 4483.
- [125] A. A. Troshko, F. Zdravistch, *Chemical Engineering Science* **2009**, 64, 892.
- [126] S. Kececi, M. Worner, A. Onea, H. S. Soyhan, *Catalysis Today* **2009**, 147, S125.
- [127] O. Keskin, M. Worner, H. S. Soyhan, T. Bauer, O. Deutschmann, R. Lange, *Aiche Journal*, 56, 1693.
- [128] M. E. Coltrin, R. J. Kee, G. H. Evans, E. Meeks, F. M. Rupley, J. F. Grear, Sandia National Laboratories, **1991**.
- [129] M. E. Coltrin, R. J. Kee, G. Evans, *Journal of Electrochemical Society* **1989**, 136, 819.
- [130] E. Meeks, R. J. Kee, D. S. Dandy, M. E. Coltrin, *Combustion and Flame* **1993**, 92, 144.
- [131] B. Ruf, F. Behrendt, O. Deutschmann, J. Warnatz, *Surface Science* **1996**, 352, 602.
- [132] C. R. Kleijn, *Thin Solid Films* **2000**, 365, 294.
- [133] A. Li, K. Norinaga, W. G. Zhang, O. Deutschmann, *Composites Science and Technology* **2008**, 68, 1097.
- [134] A. J. Li, O. Deutschmann, *Chemical Engineering Science* **2007**, 62, 4976.
- [135] H. K. Kammler, L. Madler, S. E. Pratsinis, *Chemical Engineering & Technology* **2001**, 24, 583.
- [136] H. Kim, K. S. Kim, J. Kang, Y. C. Park, K. Y. Chun, J. H. Boo, Y. J. Kim, B. H. Hong, J. B. Choi, *Nanotechnology*, 22, 5.
- [137] O. V. Chub, E. S. Borisova, O. P. Klenov, A. S. Noskov, A. Matveev, I. V. Koptyug, *Catalysis Today* **2005**, 105, 680.
- [138] J. De Greef, G. Desmet, G. Baron, *Catalysis Today* **2005**, 105, 331.
- [139] K. C. Tsaur, R. Pollard, *Journal of the Electrochemical Society* **1984**, 131, 975.
- [140] T. I. Evans, T. V. Nguyen, R. E. White, *Journal of the Electrochemical Society* **1989**, 136, 328.
- [141] W. B. Gu, C. Y. Wang, B. Y. Liaw, *Journal of the Electrochemical Society* **1997**, 144, 2053.
- [142] K. A. Smith, C. D. Rahn, C. Y. Wang, *Energy Conversion and Management* **2007**, 48, 2565.

- [143] D. Zhang, O. Deutschmann, Y. E. Seidel, R. J. Behm, *Journal of Physical Chemistry C*, *115*, 468.

## FIGURES

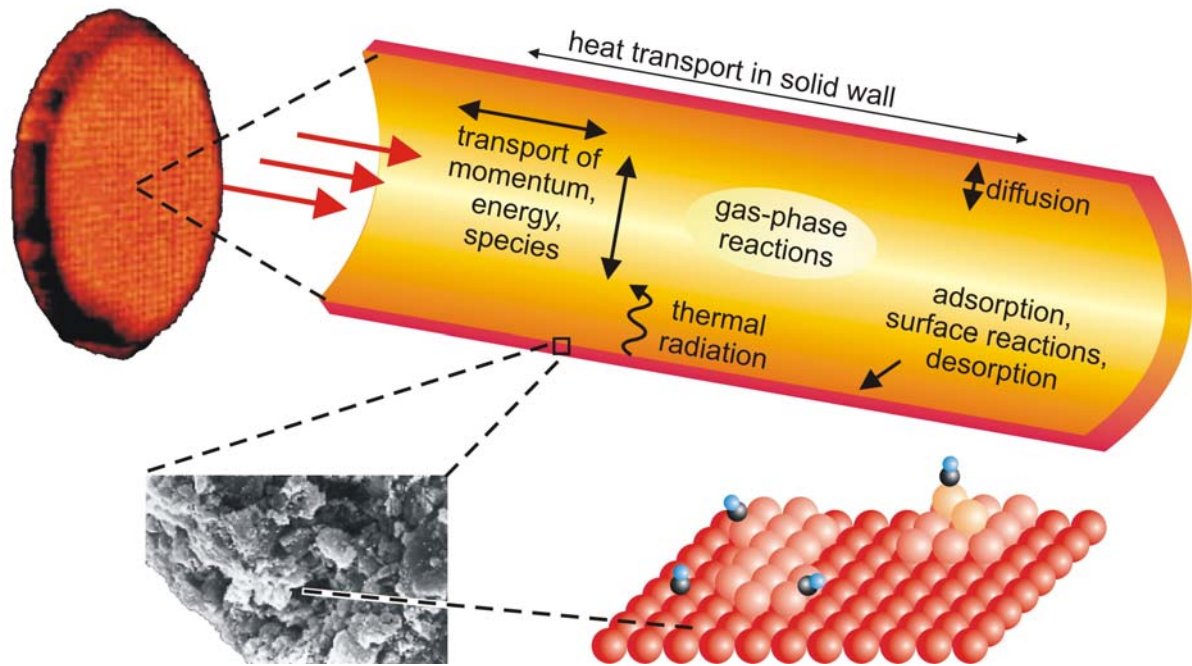


Figure 1: Catalytic combustion monolith and physical and chemical process occurring in the single monolith channel.

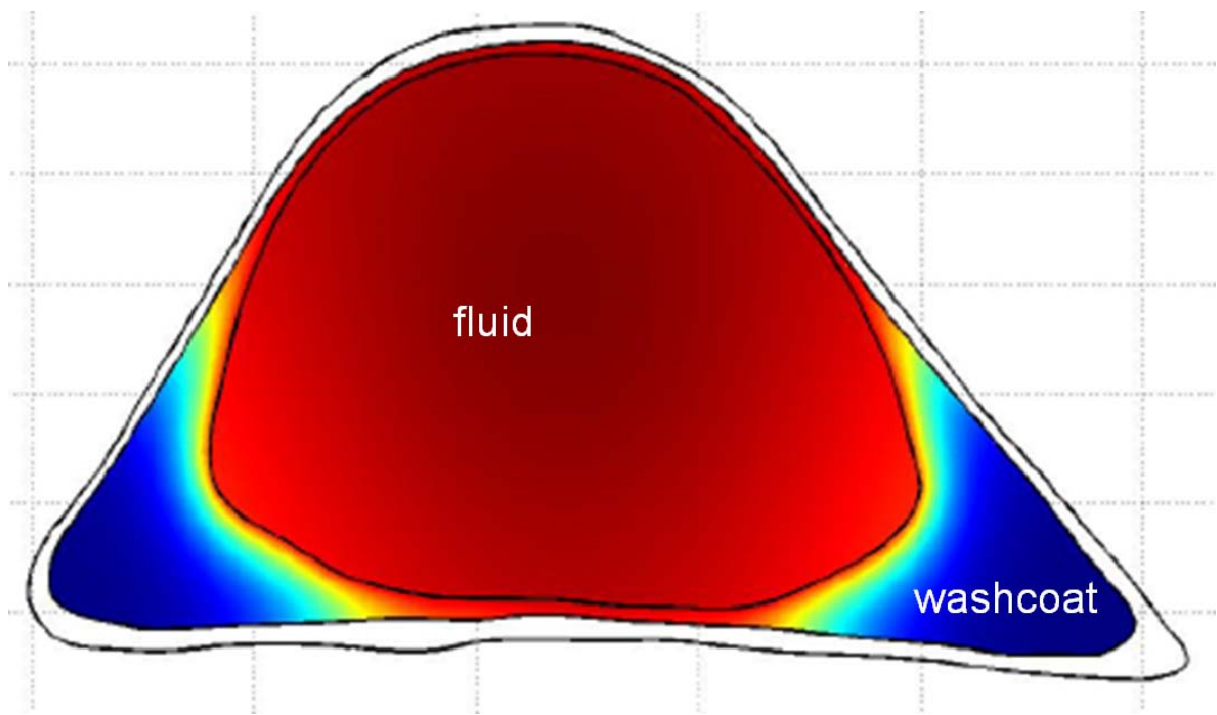


Figure 2: Concentrations distribution in the washcoat for a “sinusoidal” channel with highly non-uniform washcoat at 700 K. Adapted from Hayes et al.<sup>[63]</sup>.

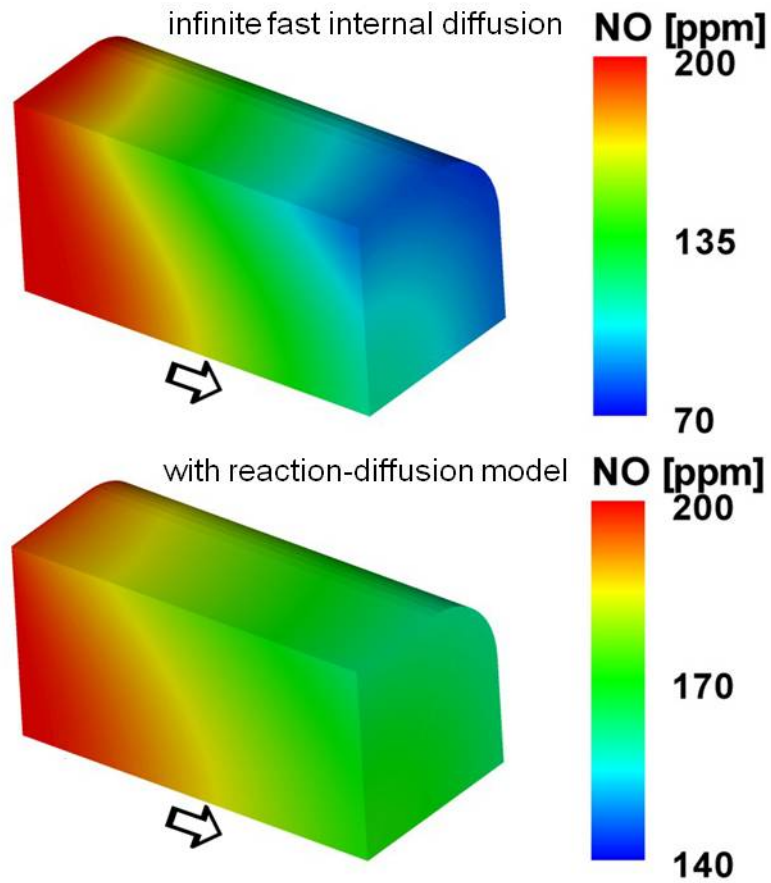


Figure 3: Comparison of the NO concentration profiles in a single channel of a honeycomb-type automotive catalytic converter operated under direct oxidation conditions at 250°C. 3D-Navier-Stokes simulation with infinite fast diffusion in the washcoat (top) and detailed reaction-diffusion model to describe the internal mass transport. The arrows at the symmetry axes show the main flow direction. Adapted from Mladenov et al.<sup>[64]</sup>.

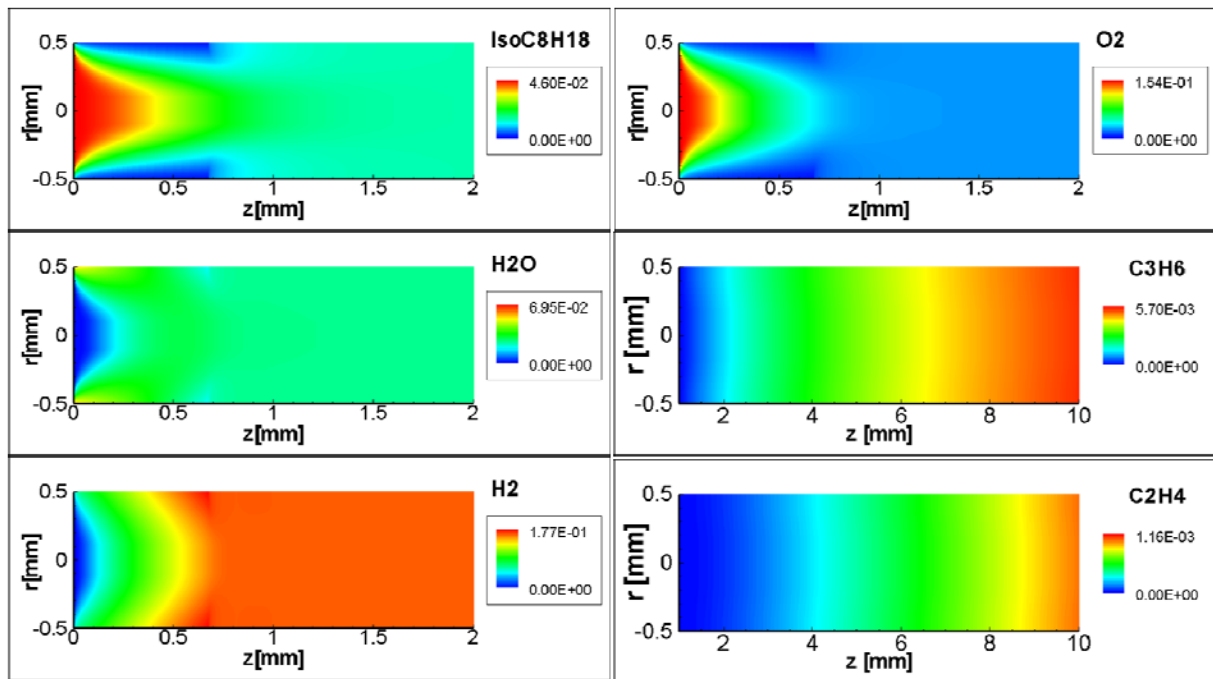


Figure 4: Catalytic partial oxidation of iso-octane in Rh coated monolithic channels at  $C/O = 1.2$  and  $800^\circ\text{C}$ . Numerically predicted molar fractions of reactants, hydrogen, water (all for the initial section of 2 mm) and the coke precursors propylene and ethylene (along the entire catalyst of 1 cm). Flow direction is from left to right. Adapted from Hartmann et al.<sup>[68]</sup>.

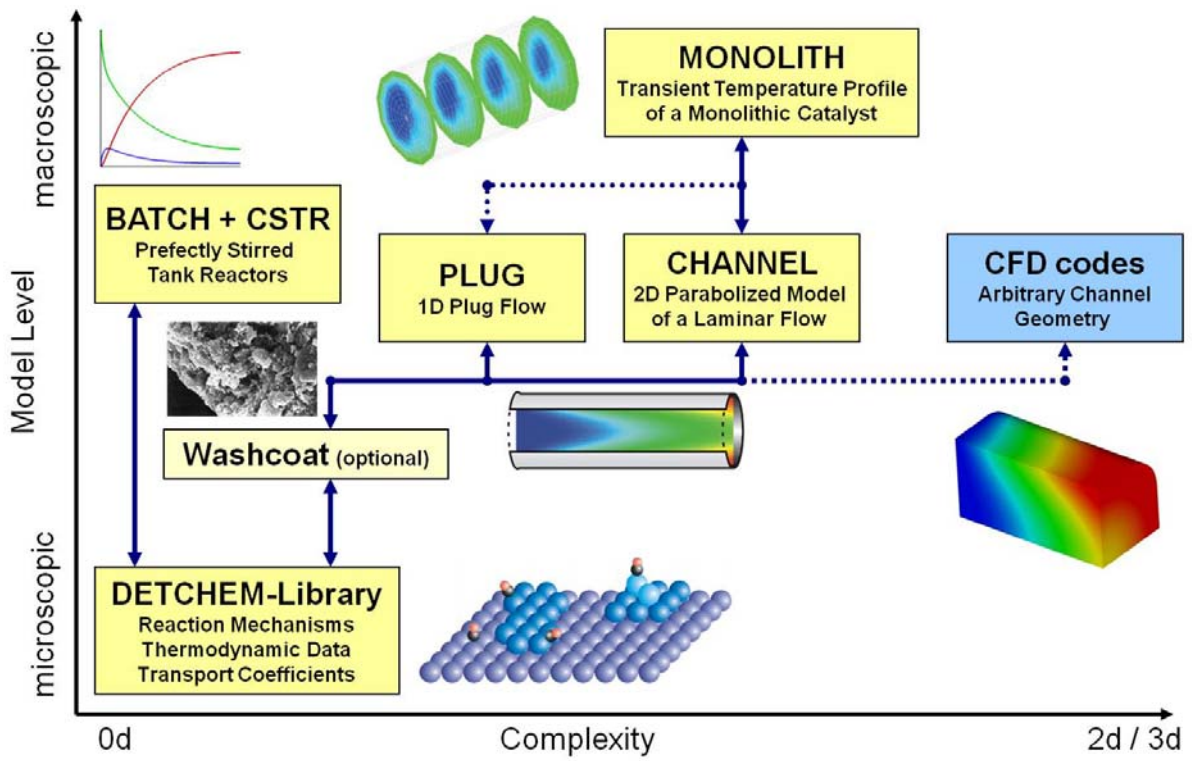


Figure 5: Structure of the computer code DETCHEM<sup>MONOLITH</sup> and some further modules of the software package DETCHEM<sup>TM</sup> [46].

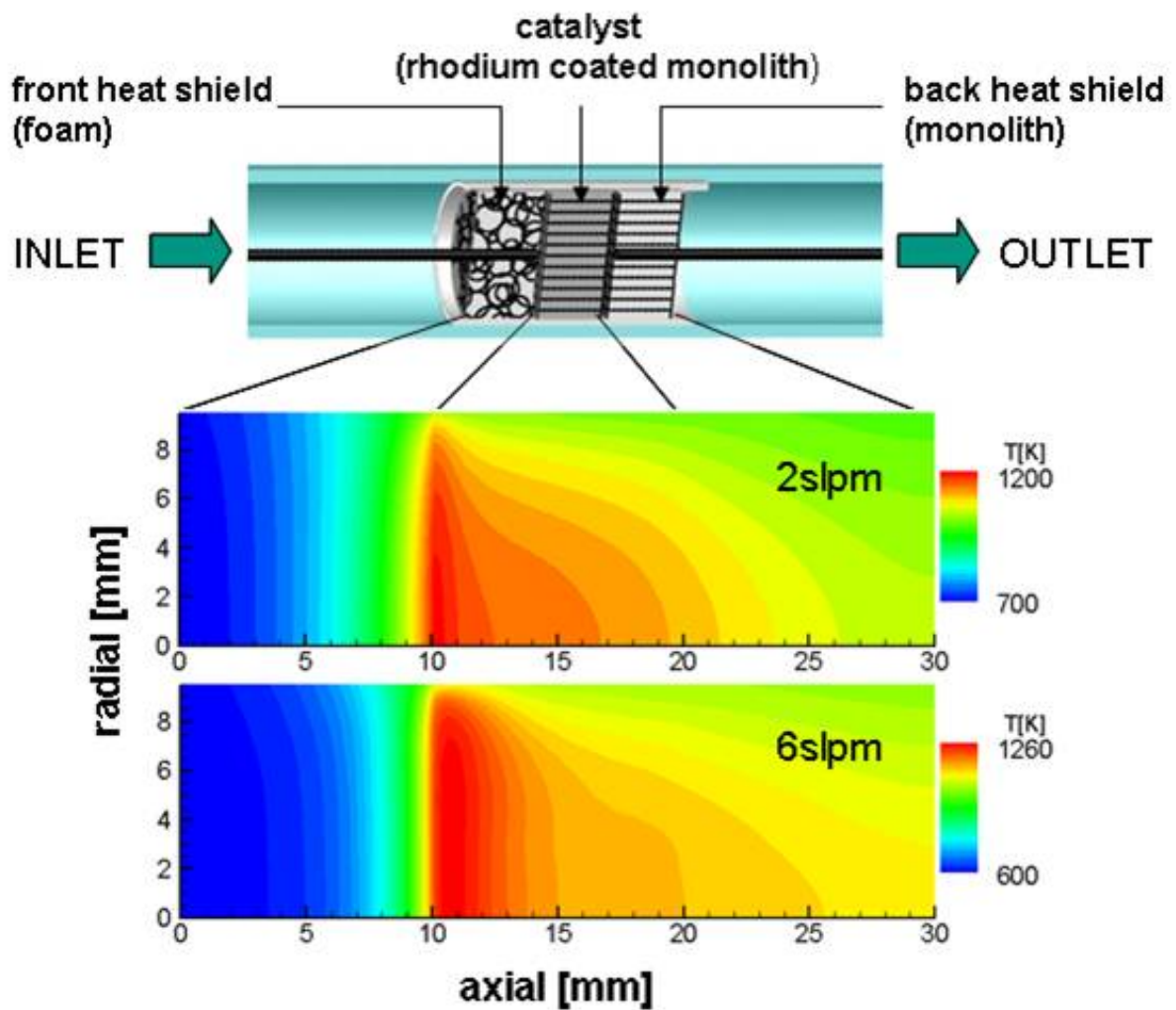


Figure 6: Sketch of the catalyst section of a reformer for logistic fuels (iso-octane as surrogate) with two heat shields (top) and numerically predicted steady-state monolith temperature at  $C/O = 1.0$  and at flow rates of 2 slpm (top) and 6 slpm (bottom). The symmetry axis of the monolith is at radial dimension of zero. Taken from Maier et al.<sup>[89]</sup>.

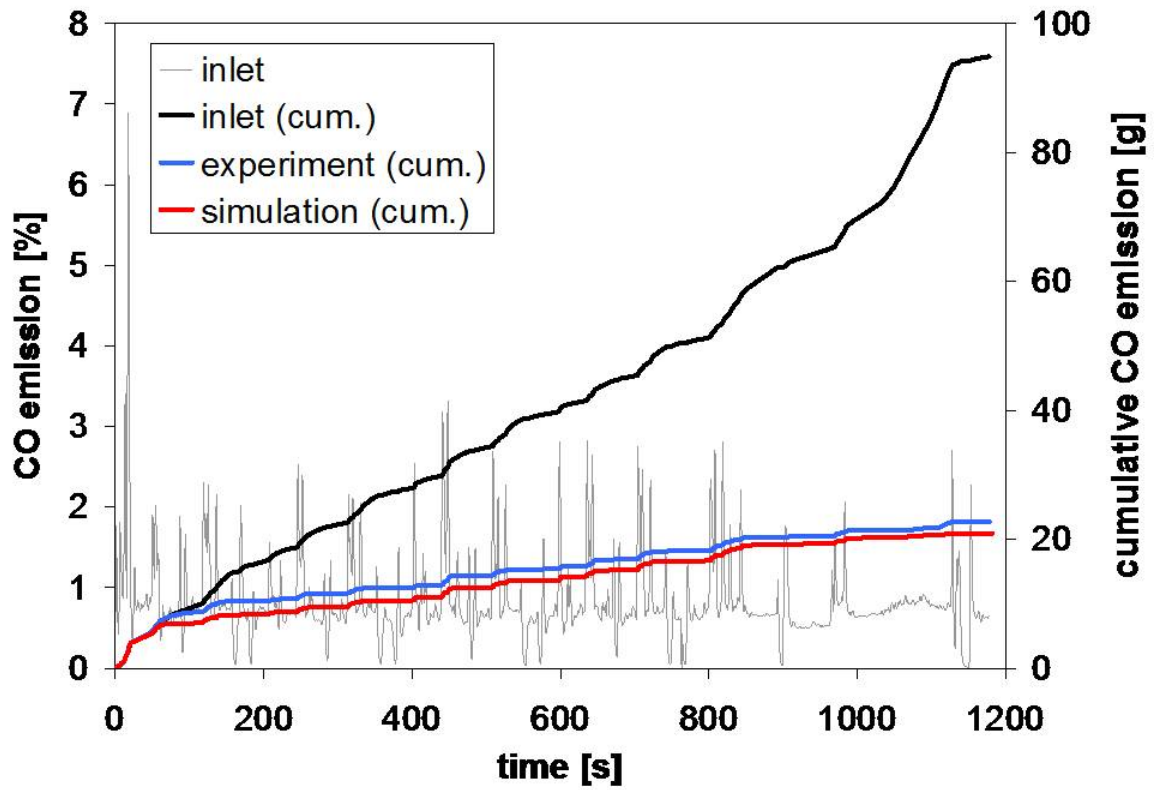


Figure 7: Cumulated CO emissions in MVEG driving cycle of an automotive catalytic converter, simulation versus experiment. The continuously varying raw emissions (inlet, grey color) shown in the background serve as inlet conditions for the simulation. Taken from Tischer et al.<sup>[93]</sup>.

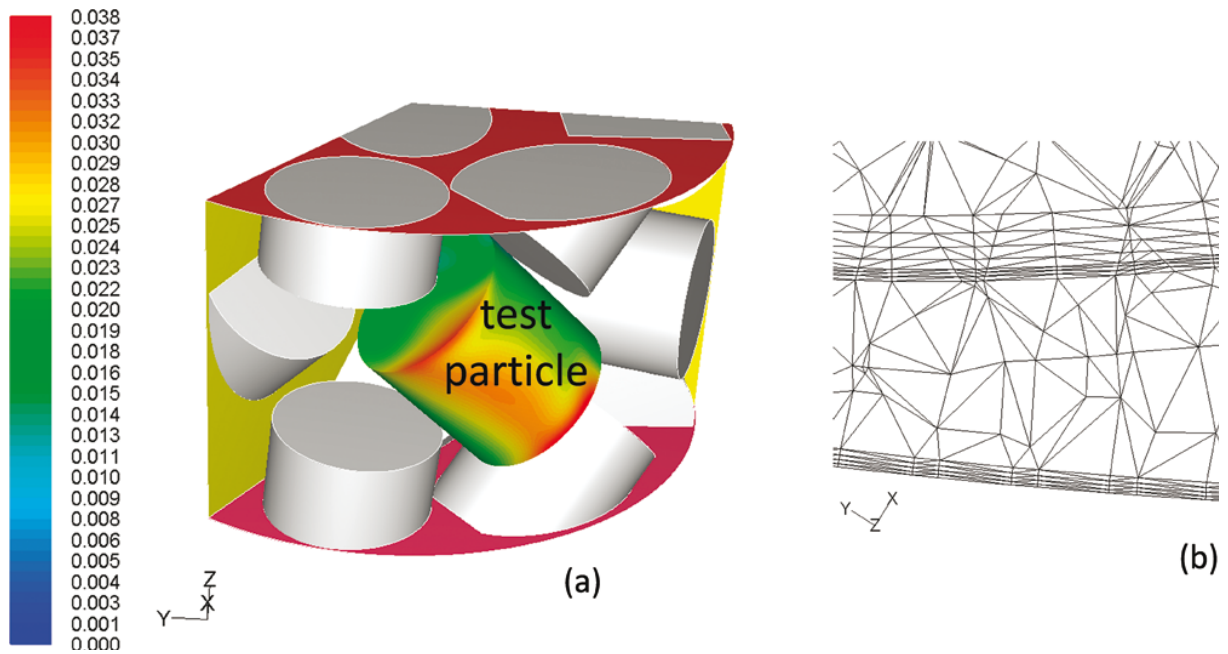


Figure 8: Example of a direct numerical simulation of a fixed bed reactor with cylindrical packings showing contours of propane dehydrogenation rate on fresh catalyst ( $\text{kmol/m}^3(\text{solid}) \cdot \text{s}$ ) (a) and details of mesh (b); taken from Dixon et al.<sup>[114]</sup>.

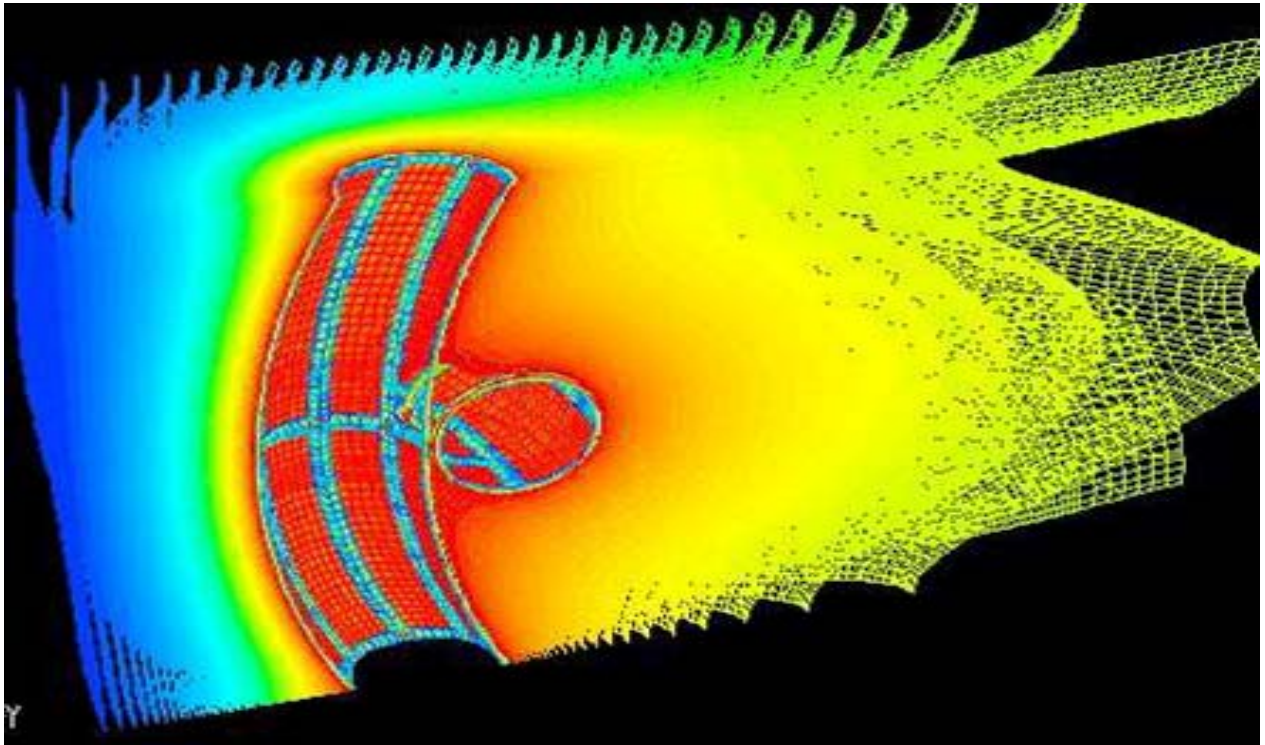


Figure 9: Computed temperature profile (max. 950°C) around a Pt/Rh wire gauze used for ammonia oxidation (Ostwald process).



Figure 10: Snapshots of the computed developing concentration of the product in the wake of a bubble in a gas-liquid-solid reaction; taken from Raffensberger et al.<sup>[122]</sup>.

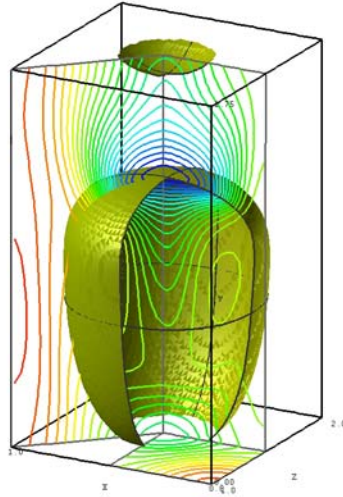


Figure 11: Numerical simulation of gas-liquid mass transfer in co-current downward Taylor flow; taken from Kececi et al.<sup>[126]</sup>.

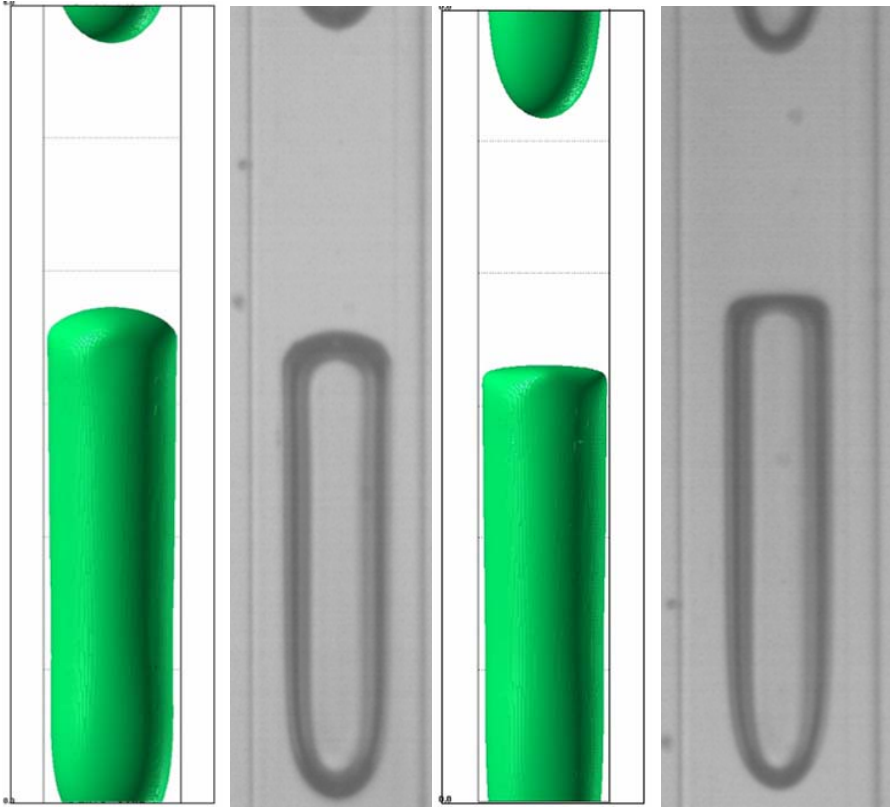


Figure 12: Comparison of bubble shape in experiment (left) and simulation (right) for viscous co-current downward Taylor flow in a square mini-channel, taken from Keskin et al.<sup>[127]</sup>.