

Environmental Multimedia Distribution of Nanomaerials

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Models of ENM Toxicity





Fate & Transport Analysis

http://www.nanoinfo.org

Environmental Impact Assessment

Environmental Impact Assessment

Dose- Response Hazard Thresholds

Is this Engineered Nanomaterial Environmentally Safe?



Outline

Engineered nanomaterials (ENMs) do not respect environmental phase boundaries

Range of exposure concentrations and releases of ENMs

Fate & transport (F&T) analysis (estimate environmental exposure concentrations):

- Single medium models
- Is the particle size distribution important?

Deterministic F&T models specific to ENMs

F&T exposure model selection: Complexity vs Uncertainty

Model validation

Environmental Intermedia Transport in a Multimedia System



Intermedia Transport of ENMs is Governed by their PSD



Intermedia Transport of ENMs is Governed by their PSD



Nanoparticles:

- Transport processes are not constrained by phase equilibria
- Intermedia transport is affected
 - by particle size
- Possible interfacial/interphase accumulation?

Aerosolization

Exposure Concentrations: Modeling and

Measurements (Review of State-of-the-Art in 2013) <u>Review</u>: Gottschalk et al., Env. Poll., 181 (2013) 287-300

Concentrations in sur face water



Two Current Approaches:

Material flow analysis to track ENM emissions & assess exposure concentration ranges

Heuristic estimates of transport rates

Deterministic Fate & Transport Models



Gottschalk et al.,Env. Sci. Technol, 2009, 43, 9216-9222; ibid, Int.J.Env.Res. Public Health, 2015, 12, 5581-5602. (nine ENMs)

Lifecycle Environmental Assessment of the Releases of ENMs (LearNano Simulation Tool)



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Contribution of various ENMs use applications to environmental mass distribution in Los Angeles



Liu, et al., Beilstein J. Nanotech., 6, 930-951 (2015); ibid, Environ. Sci. Tech. , 48, 3281-3292 (2014). Contribution of various ENMs use applications to environmental mass distribution in Los Angeles



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Environmental Fate & Transport Analysis: Single-Medium Models

Atmospheric dispersion

 Extensive collection of models (analytical and numerical from box models to 3-D (some consider deposition)

Sediment transport in flowing streams

• Analytical and numerical models (typically consider a single size or a few size bins; recent models consider both homoaggregation, heteroaggregation and sedimentation)



$$\frac{\partial C_{i}}{\partial t} + \boldsymbol{u} \boldsymbol{\nabla} C_{i} = \boldsymbol{\nabla} \left(K_{ij} \left(\boldsymbol{\nabla} C_{i} \right) \right) - R_{i} + S_{i}$$



 $\frac{\partial C_i}{\partial t} + u_j \frac{\partial C_i}{\partial x_j} = \frac{\partial}{\partial x_j} \left[D_{E,i} \frac{\partial C_i}{\partial x_j} \right] + \frac{\partial}{\partial x_i} \left[(\delta_{j3} \mathbf{v}_{s,i}) C_i \right]$

Single-Medium F & T Models

Contaminant transport in lakes

 Mostly numerical models (consider the impact of currents and waves, typically do not consider the complete PSD)

Colloidal/particle transport in soil

 Analytical and numerical models of colloidal filtration theories (bed/porous filter, colloid deposition/filtration)

Dispersion and Sedimentation in a Flowing Stream (Continuous Discharge: A Simple 1-D model for a single species)



Spatial Explicit F&T Modeling of Nanoparticles in a Flowing Stream

- Quik, de Klein and Koelmans, Water Research, 80, 200-208 (2015):
 - Integration of the Smoluchowski Coagulation Equation with the DUFLOW Modeling Studio for 1-D simulation of hydrology + solute F&T in an open channel.
 Simulations : River Dommel



Aquatic Stream Model for ENMs (Water, Sediment, NPs, SPM)

river flow I

bed load

transport

Rhine river model: TiO₂ Case study

- Series of linked aquatic compartments (approximates finite-difference approach)
- Considers NP particle size distribution (PSD)
- Suspended particulate matter (SPM) PSD: log-normal distribution
- Use of attachment efficiency $(\alpha_{het-agg})$

Process affecting free TiO₂ NPs only
 Process affecting SPM-bound TiO₂ NPs only
 Process affecting both free and SPM-bound TiO₂ NPs
 box j-1
 box j-1
 box j
 box j

exchange

sedimentation

burial

sedimentation

sedimentation

with SPM

sedimentation

with SPM

river flow

bed load

transport

w2

sed

Approach can in principle be extended to include additional compartment and transport processes

resuspension

Praetorius et al., 2012, 46 (12), 6705–67132012

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Stream Dynamics Fate & Transport Model for Silver and ZnO NPs (James River Basin, Virginia) Dale et al., Env.Sci. Technol., (2015), 49, 7285-7293)

"Coupled the James River Basin (VA) portion of the Phase 5.3.2 Chesapeake Bay Watershed Model (WSM) to the USEPA's water quality modeling suite WASP"

(a) "Agricultural runoff accounted for 23% of total metal stream loads from NPs."

(b) "Average NP-derived metal concentrations in the sediment varied spatially up to 9 orders of magnitude, highlighting the need for high-resolution models."

Examples of single Medium & Multimedia Model Equations for Particulate Matter

Convection-Diffusion-Reaction with Surface Collection

$$\frac{\partial C_{i}}{\partial t} + u \nabla C_{i} = \nabla \left(D_{E,i} \left(\nabla C_{i} \right) \right) - \nabla \left(\frac{D_{E,i} \cdot F_{i}}{k_{B}T} C_{i} \right)^{\text{Degradation}}_{-R_{i} + S_{i}} \text{Source}$$
• Transport of suspended solids (in water)

$$\frac{\partial C_{i}}{\partial t} + u_{j} \frac{\partial C_{i}}{\partial x_{j}} = \frac{\partial}{\partial x_{j}} \left[D_{E,i} \frac{\partial C_{i}}{\partial x_{j}} \right] + \frac{\partial}{\partial x_{j}} \left[\left(\delta_{j3} \nabla_{s,i} \right) C_{i} \right] + R_{i} + S_{i} \text{Increased Complexity}}$$
• Compartmental Model:

$$\frac{d}{dt} [V_{i}C_{i,k}] = \underbrace{\left(Q_{i}^{in} C_{i,k}^{in} - Q_{i}^{out} C_{i,k}^{out} \right)}_{\text{Intermedia transport}} + \underbrace{\sum_{j \neq l}^{N} \sum_{l=1}^{P} I_{i,j,k}^{l}}_{\text{Source release}} + \underbrace{\sum_{j \neq l}^{N} \sum_{l=1}^{P} I_{i,j,k}^{l}}_{\text{Intermedia transport}} + \underbrace{\sum_{l=1}^{N} \sum_{l=1}^{P} I_{l,l}^{l}}_{\text{Intermedia transport}} + \underbrace{\sum_{l=1}^{P} I_{l,l}^{l}}_{\text{Intermedia transport}} + \underbrace{\sum_{l=1}^{P$$

Homoaggregation and Heteroaggregation

Smoluchowski Coagulation Theory

 $\frac{\partial n_k}{\partial t} = \frac{1}{2} \sum_{\substack{i=1\\j=k-1}}^{i=k-1} K_{ij} n_i n_j - n_k \sum_{i=1}^{\infty} K_{ik} n_i$

Classical DLVO Theory + Extensions

$$\Phi_{\text{Total}} = \Phi_{\text{vdW}} + \Phi_{\text{EDL}} + \Phi_{\text{HR}} + \Phi_{\text{ST}}$$

- *n* particle number conc.
- K_{ij} agglomeration frequency
- $\Phi^{'}$ interaction energy

$$K_{ij} = \frac{\beta_{ij}}{W_{ij}} = \alpha_{ij}\beta_{ij}$$



 β_{ij} - collision frequency =f(particle sizes) α_{ij} - sticking coefficient (attachment efficiency) W_{ij} - stability ratio = $1/\alpha_{ij}$ =f(interaction energy)

The Smoluchowski equation can in principle be used to model both homoaggregation and heteroaggregation by tracking the population balance.

Direct time dependency. Suitable for integration with F&T models (time scales?)

Dynamic MC requiring time step calibration. Difficult to integrate with F&T models α_{ij} - the attachment efficiency is a function of particle size; however, studies that solve the Smoluchowski equations directly are forced to assume a constant value for α (data-derived)

Solution of the coagulation equation without having to assume constant α can be accomplished via a Constant-Number Direct Simulation Monte Carlo (DSMC) Method.

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Illustration of Simulation Results for NP Agglomeration



Monte Carlo Simulations of NP Aggregation



For the relatively narrow primary size range (8-40 nm):

NP primary size $\uparrow \rightarrow$ PSD tail of small aggregates \uparrow

Average NP aggregate size (in suspension) \checkmark

Which exposure/dose metrics are most relevant?

• Number concentration (specific sizes), mass/volume, area/volume

Liu et al., ES&T, 2011, 45 (21): 9284-9292.

Deterministic F&T Models and their Resource Requirements

- Spatial Models [C=C(x,t)]
- Hybrid Compartmental-Spatial Models [C=C(x,t) and C=C(t)]
- Dependence of concentrations on position/location
 Site-specific scenarios

Compartmental Models
 [C=C(t)]

Steady-State Models [$C \neq C(t)$]

Dynamic Models [C=C(t)]

Deterministic F&T Models and their Resource Requirements

- Spatial Models [C=C(x,t)]
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- Compartmental Models
 [C=C(t)]

Steady-State Models [$C \neq C(t)$]

 Spatially averaged concentrations (primarily regional scale)

- First tier analysis
- Provide source input to mediaspecific spatial models
- Integrate with lifecycle analysis

Dynamic Models [C=C(t)]

Deterministic F&T Models and their Resource Requirements



Steady-State Models [$C \neq C(t)$]

Dynamic Models [C=C(t)]

Fundamental spatial transport models exist, but need to be adapted to account for NPs agglomeration, association with ambient matter and their potential unique physical, chemical and bio-transformations Modeling the Environmental Distribution of Manufactured Nanomaterials (MNM)



Compartmental Aquatic Model (NP Persistence)

USETox model adapted to NPs to estimate impact on aquatic environments

- Accounts for PSD
- Utilizes attachment efficiency
- Assess persistence of NPs
- Partially empirical
- Requires calibration for specific NPs



	n ^{TiO2} sizes class Radius	1 8 nm	2 106 nm	3 204 nm	4 302 nm	5 400 nm
Compartmental Residence Time (days)	FF _{w,w,i} FF _{w,sed,i} FF _{sed,w,i} FF _{sed,sed,i}	$5.9 \cdot 10^{-1} 4.5 \cdot 10^{-1} 8.0 \cdot 10^{3} 9.8 \cdot 10^{2}$	$\begin{array}{r} 5.3\cdot10^{-1}\\ 4.0\cdot10^{-1}\\ 1.0\cdot10^{3}\\ 1.8\cdot10^{3}\end{array}$	$3.6 \cdot 10^{-2}$ $2.7 \cdot 10^{-2}$ $1.8 \cdot 10^{3}$ $2.4 \cdot 10^{3}$	$\begin{array}{r} 4.7\cdot10^{-3}\\ 3.5\cdot10^{-3}\\ 1.7\cdot10^{3}\\ 2.3\cdot10^{3} \end{array}$	$\begin{array}{r} 1.1\cdot10^{-3}\\ 8.0\cdot10^{-4}\\ 1.6\cdot10^{3}\\ 2.1\cdot10^{3} \end{array}$

Salieri, Righi, Pasteris and Olsen, Sci. Total Env., (2015), 505, 494-502

Multimedia F&T Models for ENMs





MendNano/LearNano

- Considers SPM and complete PSD
- Self-preserving SPM PSD
- Unsteady-state
- Episodic processes (wet scavenging, windresuspension, runoff)
- Time-variable intermedia transport parameters
- Expandable web-based modeling platform (e.g., biota, vegetation) *Liu et al., 2013/2014*

SimpleBox4nano

- Considers SPM and coarse NP PSD
- Steady-state concentrations
- Episodic processes (i.e., rain scavenging) modeled as continuous processes
- Some intermedia parameters values are assumed constant

Meesters, et al., 2014

Comparison of MendNano Predictions with Field and Measurements of PAH Concentrations and PCB Fluxes



a) Ryan and Cohen, 1986; b) Harrison, et al., 1996; c) Yaffe, et al., 2001; d) Cohen and Cooter, 2002

Multimedia Analysis of Environmental Release & Distribution of ENMs



Nanotech., 6, 930-951 (2015)

Multimedia Analysis of Environmental Release & Distribution of ENMs



Nanotech., 6, 930-951 (2015)

Estimates of the Range of Potential CeO₂ Multimedia Concentrations in Different Countries



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Example of Ranking of Environmental Impact Based on Exposure Concentrations and Probability of Being Identified as Toxic

- Exposure concentrations obtained via MendNano
- Toxicity probability obtained via QSAR analysis



$$EI_i = \frac{\beta_i}{max(\beta)}$$
$$\beta_i = C_i \times P_i$$

 P_i – probability of having an adverse biological response





 $EI_{EC_{\lambda}}$

MendNano simulations based on regional parameters for the Los Angeles QSAR: R. Liu, et al., Nanoscale, 2013, 5, 5644

Selecting the Appropriate Fate & Transport Model



What is the purpose of the analysis? e.g., regulatory compliance, priority settings, industrial, research, material design



What are the questions that need to be answered?

What is the required model resolution?



- Spatial: Site-specific? Regional?
- Temporal: Unsteady state? Steady state? Episodic scenarios?



What is the required level of accuracy w.r.t estimated exposure concentrations?



Was the model validated? Calibrated?



Model Complexity Trade-Off Diagram

Complex



Model Validation Pyramid



Face validity

Comparison with other models

Applicability domain

Event validity

Comparison with data

Sensitivity analysis & statistical validation

Parameter validation & model sensitivity

Mechanistic/ empirical validity

Fundamental validity

Categories of Models and Validations

availability data ncreased

Empirical (Data-driven) Models

Statistical validation

Detailed Mechanistic/ Deterministic Models

Quantitative validation

Exploratory Models/ Theoretical Developments

Conceptual validation (partial validation of mechanisms) Theoretical / Deterministic Models

Qualitative validation (component validation)

Increased understanding

Exposure Modeling: Issues of Concern



Validation of models is a formidable task, particularly for multimedia assessment

Exposure Modeling: Issues of Concern

Are uncertainties in exposure estimates significant relative to uncertainties in toxicity information?

$$\frac{d}{dt} [V_i C_{i,k}] = \left(Q_i^{in} C_{i,k}^{in} - Q_i^{out} C_{i,k} \right) + \sum_{\substack{j=1\\j\neq i}}^{M} \sum_{l=1}^{P} I_{i,j,k}^l + \zeta_i K_{i,k}^r C_{i,k} V_{i,k} \qquad \dot{m}_{i,k} = \dot{m}_i \alpha(r_k, r_n) \frac{f(r_k) w(r_k)}{\int_0^\infty f(r) w(r) \, dr} \\ -K_{i,k}^s (C_s - C_{dis}) A_{i,k}^T + S_{i,k} \qquad v_s = \frac{(\rho_p - \rho_f)(1 - \phi_i) \cdot g \cdot d_i^2}{18\mu}$$







Michelle Romero



QUESTIONS?
$$\overline{U} \cdot \nabla C = \nabla \cdot D\nabla C$$
 $I_{i,adj} = I_i \cdot \overline{\Sigma}$



Dennis Bacsafra

$$\overline{U} \cdot \nabla C = \nabla \cdot D\nabla C \qquad I_{i,adj} = I_i \cdot \frac{R}{\sum_i t_i \cdot I_{-j}}$$
$$\overline{U} \cdot \nabla \left(\rho \overline{U}\right) = -\nabla p + \nabla \cdot \eta \nabla \overline{U}$$

 $D = 0.1 \cdot h_{mix}^{\frac{3}{4}} (-\kappa \cdot L_{MO})^{-\frac{1}{3}} \cdot u^*$



 $\frac{dm_i}{dt} = 12D(C_s - C_{dis}) \left(\frac{m_i}{\rho d_i^2}\right) \left(\frac{d_i}{d_{pri}}\right)^{\frac{a_f}{2}} \qquad \tau = \frac{(V+P)T}{(1-b)P + RT}$ Muhammad Bilal

$$\frac{d}{dt}m_s = \sum_k I_{a,s,k}^{dry} + \sum_k I_{a,s,k}^{wet} + I_{f,s}^{washoff} - I_{s,a}^{resusp} - I_{s,w}^{runoff} + \zeta_s K_s^r C_s m_s + S_s$$

 $\frac{d}{dt}m_{sed} = I_{w,sed}^{sedimentation} - I_{sed,w}^{sed \, resusp} + \zeta_{sed} K_{sed}^r C_{sed} m_{sed} + S_{sed}$