Leveraging *ab initio* modelling approaches to link phys-chem nanomaterial (NM) properties to descriptors of bio-nano interaction

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Pathway based approach

- We seek an explanation based on molecular level interactions between nanomaterials and membranes with a molecular initiating event (MIE) leading to an adverse outcome (toxic)
- Capture this in software that correlates nanomaterials properties and toxicity



Getting stuff in....

- Conventionally endocytosis is a cellular process in which substances are actively brought into the cell.
- BUT there are alternative routes: We assume passive diffusion across the membrane and that once inside nanomaterials will be taken up by the autophagic pathway – the cell clearance mechanism

Chem. Soc. Rev., 2017, 46, 4218



The (auto)lysosome is the primary organelle of the endocytic pathway





How to build a tractable model?

A tractable model: KIE is the penetration of the plasma membrane

Base model is Elastic Theory: All the complication of the real plasma membrane turned into a 2d infinitesimally thin elastic sheet The properties of which will be obtained from simulation of pure lipid membranes interacting with planar nanomaterial surfaces: we use a liposome/NP model of the plasma membrane



Three parameter theory



Predict wrapping (membrane disruption) if we know adhesion strength w or Kw (for planar surface) Elastic theory has the potential for fast screening of nanoparticles for toxicity using the inflammation pathway

Major Challenges



No data for adhesion strength w – find from simulation?



Assumes infinitesimally thin membrane: for nanoparticles membrane thickness (4nm) ~ NP radius



Assumes w, σ, κ independent of curvature

Atomistic molecular dynamics for *planar* interface $k_w = W$

The ribbon method: a novel way to predict free energies of adsorption



The 18 lipids at each end of the ribbon form 2 pull groups applying a force F. The pull groups are recalculated periodically (0.5 ns) to allow migration of lipids between leaflets: F resists the formation of new adsorbed bilayer

Adsorption free energy/adhesion strength $(mN.m^{-1})$

$$k_{w} = \Delta G_{\infty} = F \frac{dh}{dA} = -F \frac{a_{fm}(F)}{y_{b}a_{slb}}$$

We need to know the lipid specific area in the adsorbed bilayer and in the free membrane

M. Schneemilch, N. Quirke, Chemical Physics Letters 664 (2016) 199–204

Formula	Polymorph	M. index	% ion	k_w mN.m ⁻¹	∆ <i>H_{ad h}</i> mN.m ⁻¹	T∆ <i>S</i> mN.m ⁻¹	ApL nm	sep nm	thick nm
Au	Fcc	111	-	-42(2)	-118(7)	-76(9)	0.84	0.36	2.83
Au ^a	Fcc	111	-	-40.7(4)	-77.8(6)	-37(1)	0.85	0.47	2.83
Au ^b	Fcc	111	- (-21.6(6)	-93(10)	-71(11)	0.66	0.77	3.49
SiO ₂	quartz	100	0	-2.1(4)	2.1(12)	4.2(16)	0.65	0.76	3.15
SiO ₂	cristobalite	101	0	-3.2(4)	-2.8(17)	0.4(21)	0.67	0.54	3.08
SiO ₂	amorphous	-	0	-7.5(5)	-10.0(11)	-2.5(16)	0.71	0.52	2.98
SiO ₂ c	cristobalite	101	-	-2.0(3)	-3.4(21)	-1.4(24)	0.64	1.01	3.18
SiO ₂	quartz	100	9	-2.5(4)	3.0(16)	5.5(20)	0.65	0.76	3.17
SiO ₂	cristobalite	101	9	-4.4(7)	10.7(13)	15.1(19)	0.65	0.69	3.18
SiO ₂	amorphous	-	9	-5.3(4)	-4.4(11)	0.8(15)	0.66	0.93	3.14
SiO ₂	cristobalite	101	18	-2.4(1)	2.8(20)	5.2(2.1)	0.62	0.74	3.23
SiO ₂	amorphous	-	18	-4.3(2)	4.4(14)	8.7(16)	0.63	0.88	3.21
TiO ₂	Rutile	110	-	-1.8(2)	1.6(10)	3.5(12)	0.62	1.18	3.20
TiO ₂	Rutile	100	-	-3.6(5)	2.6(11)	6.1(16)	0.65	0.89	3.03
TiO ₂	Rutile	101	-	-4.0(5)	1.4(14)	5.4(20)	0.66	0.85	3.04
TiO ₂	Rutile	001	0	-0.3(1)	1.9(13)	2.2(15)	0.62	0.96	3.16
TiO ₂	Anatase	101	-	-1.0(4)	-6.5(14)	-5.5(18)	0.64	1.00	3.08
TiO ₂	Anatase	100	-	-1.1(7)	-3.7(12)	-2.6(18)	0.63	1.53	3.22
TiO ₂	Anatase	001	0	-0.6(2)	-1.7(15)	-1.2(16)	0.64	1.10	3.14
TiO ₂	Anatase	110	-	-4.0(3)	-13.8(23)	-9.8(25)	0.64	0.81	3.12

Table 1. Results from atomistic adhesion simulations using the ribbon geometry. Numbers in brackets denote the uncertainty expressed in terms of the least significant digit. Where no error is recorded the uncertainty is smaller than the least significant digit. ^a bilayer mixture with no cholesterol. ^b bilayer mixture with cholesterol. ^c Q⁴ surface silanols have been condensed to form siloxane bridges.

DMPC Bilayer on Au, SiO_2 , TiO_2 at 310K

Note mixed lipid layers and effect of Chol* Gold has highest Kw , followed by neutral amorphous silica, titania has weaker adsorption

*we have also simulated a mixed membrane containing 50% POPC, 25% DOPE, 15% BMP, and 10% SM (18) with and without cholesterol (in equal molar quantities to POPC when present)



Consistent with silica toxicology: disordered surfaces associated with inflammation • Our simulations suggest that disordered silica surfaces have a much stronger adsorption free energy w than ordered surfaces

• Kw = -7.5

C Pavan, and B Fubini, 'Unveiling the variability of 'quartz hazard' in light of recent toxicological findings', Tox, 30, 469, (2017)

Coarse graining the atomistic membrane/nanomaterial

From 118 site Slipids force field to 10 bead implicit solvent

Magic software



Figure 1. (a) Coarse-grained representation of a DMPC molecule. Blue bead—choline, yellow bead—phosphate group, red beads—ester groups, and cyan beads—hydrocarbon tails. Beads of the same color belong to same bead type. (b) Intramolecular bonds introduced in the CG model. Solid lines denote covalent bonds, dashed arrows denote angle bending interactions. Bonds of the same color are assumed to be identical. Positive and negative numbers indicate partial charges of the head-beads. [Color figure can be viewed in the online issue, which is available at wileyonlinelibrary.com.] **X-potential** : PMF for CG lipid interacting with a gold surface in water: Scale CG ε in Steele 10-4-3 potential: 60% = AMD













Membrane tension as a function of NP penetration

From the CG simulations and MET we are able to predict minimum diameters for complete wrapping/membrane penetration

$$w_{SLB}^{s} = -k_{w} + \frac{m}{a} - \frac{2\kappa_{SLB}}{a^{2}} \quad (15)$$
$$w_{SLB}^{c} = -k_{w} + \frac{m}{2a} - \frac{\kappa_{SLB}}{2a^{2}} \quad (16)$$

Critical sizes for complete wrapping using fitted w

					spnere	cylinder
formula	polymorph	M. index	% ion	k _w mN.m⁻¹	d^{s}_{crit} nm	d^c_{crit} nm
Au	Fcc	111	-	-42(2)	0	0
SiO ₂	quartz	100	0	-2.1(4)	41.2	18.6
SiO ₂	cristabolite	101	0	-3.2(4)	25.1	10.6
SiO ₂	amorphous	-	0	-7.5(5)	7.5	1.8
SiO ₂ *	cristabolite	101	-	-2.0(3)	43.5	19.8
SiO ₂	quartz	100	9	-2.5(4)	33.7	14.9
SiO ₂	cristabolite	101	9	-4.4(7)	16.8	6.4
SiO ₂	amorphous	-	9	-5.3(4)	13.0	4.5
SiO ₂	cristabolite	101	18	-2.4(1)	35.4	15.7
SiO ₂	amorphous	-	18	-4.3(2)	17.3	6.6
TiO ₂	Rutile	Sphere	-	-2.48	34.0	-
TiO ₂	Anatase	Sphere	-	-1.47	61.1	-
TiO ₂	Rutile	Cylinder	-	-2.89	-	12.2
TiO ₂	Anatase	Cylinder	-	-1.11	-	39.3

Table 1. Predicted critical diameters for a range of materials for both cylindrical and spherical particles. $d_{crit} = 2^{*}r$ m, κ fitting parameters

Amorphous silica binds more strongly in an acid environment: Cylinders wrap more easily

Not the only consideration!

If we consider a system of **liposomes** in a solution of particles it is possible to use these data to determine a maximum particle concentration for complete wrapping to occur (*cells may have lipid reservoirs, hence no tension change*)

At greater particle concentrations only partial wrapping will occur as the membrane deformation induced by the particles will increase the tension beyond the maximum before complete wrapping can occur.

sphere

Particles per square nm of the liposome surface:

ApL0=tensionless membrane

Each particle consumes $4\pi a^2$ at the max wrapping tension

After this concentration only no or partial wrapping can occur





complete wrapping is halted above these NP/Liposome concentrations Maximum spherical particle concentration, expressed in particles per square nm of liposome bilayer, for complete wrapping over a range of values of adhesion strengths

For larger particles , low concentrations stop wrapping completely

Experiment: no complete wrapping for larger gold NPs

Theory <d_{lipo} > ~200nm d_{np} =5nm, cmax~10-4 nm2, Complete wrapping d_{np} 25 nm, cmax ~10-6, no complete wrapping Larger, no wrapping

Smaller NPs prefer to form 'cylinders'





C. Contini, J. W. Hindley, J. T. Macdonald, O. Ces, N. Quirke, 'Size matters: Size dependency of gold nanoparticles interacting with model membranes', Nature Communications Chemistry (submitted, **2019**)



- New physical data (W) for empirical correlations
- New coarse grained simulation model for pure liposomes
- First steps in extending elastic theory to nanoscale systems
- First description of concentration effects and size effects(descriptors) on NP wrapping
- For cells need to correlate with expt data

All encapsulated in a code 'Nanolip' to be available soon

Nanolip

M Schneemilch, N Quirke, 'Predicting the fate of nanoparticles in contact with biological membranes', in preparation