

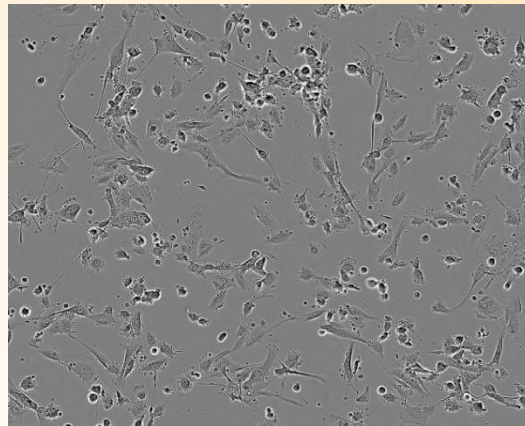
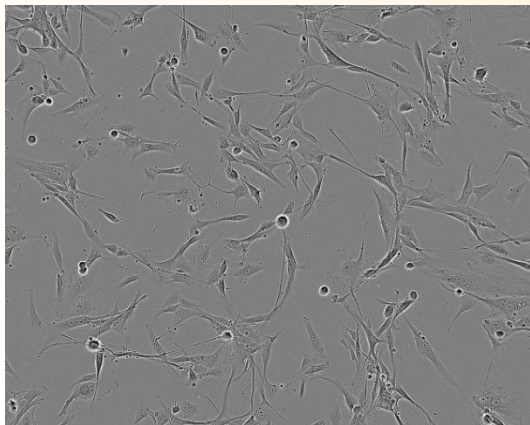
Reducing Nanotoxicity With Nano-Combinatorial Chemistry

Approach: The Case Of Carbon Nanotube

Bing Yan. PhD

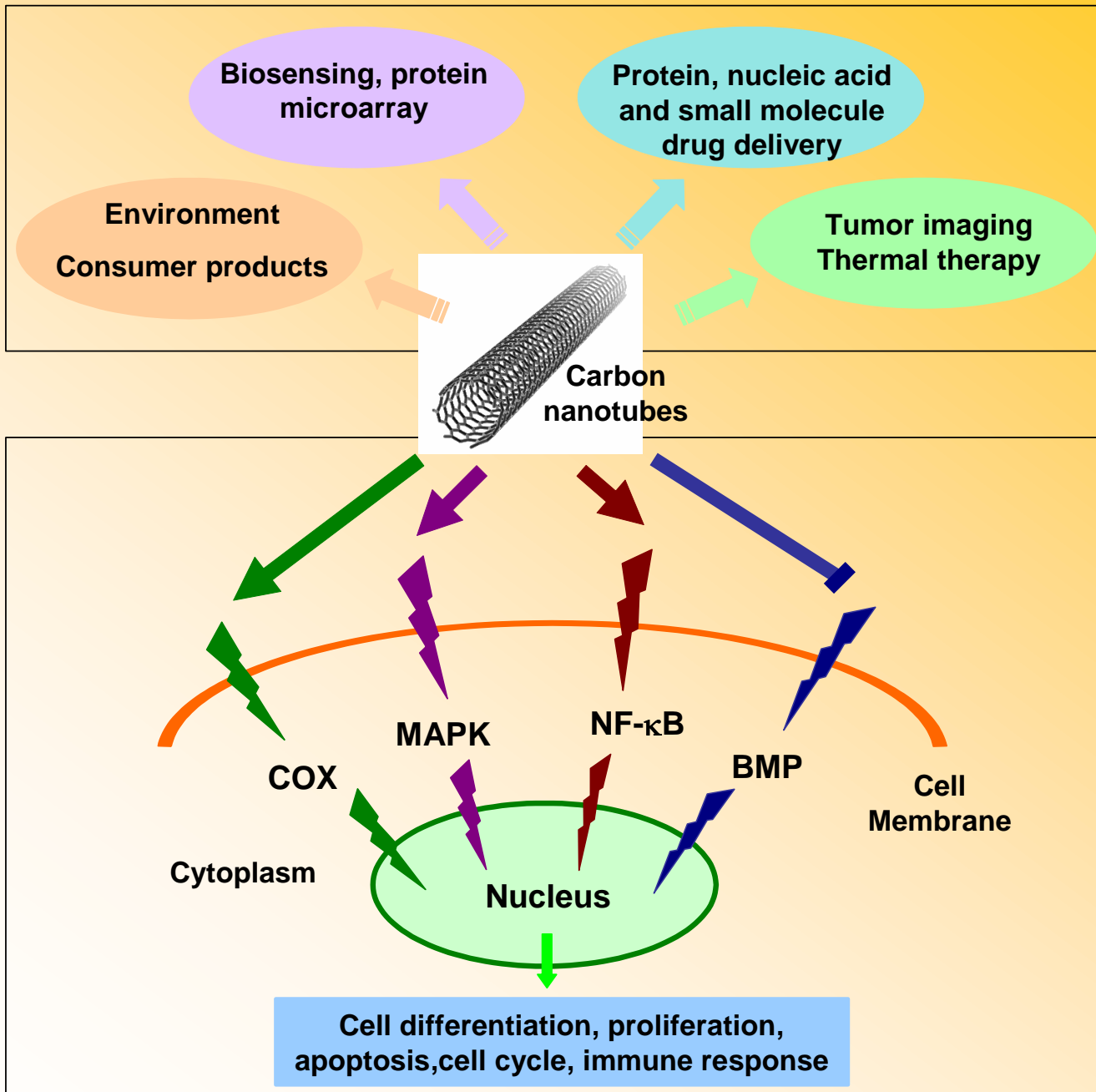
Member

**Department of Chemical Biology and Therapeutics
St. Jude Children's Research Hospital
(with additional contributions from Tropsha's Group)**



Carbon Nanotube Is Scaling Up!

- Hyperion (U.S.)
- Bayer (Germany) **3000 ton/year for 2012**
- Arkema (France) **hundreds ton/year**
- Nanocyl (Belgium) **35 ton/year now**
- Pyrograf (U.S.)
- Ahwahnee (U.S.)
- Carbon- Nano-Material Technology (Korea)
- Iljin Nanotech (Korea)



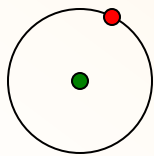
Public concerns on nanosafety

Protesting Eddie Bauer stain resistant “Nanopants”



Outline

- **Nanotoxicity**
- Reduce toxicity



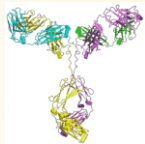
Hydrogen

10^{-1}



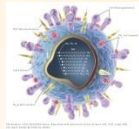
Glucose

1



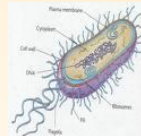
Antibody

10



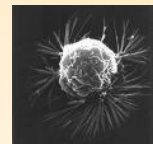
Virus

10^2



Bacteria

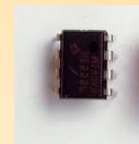
10^3



Breast cancer cell

10^4

10^5



Integrated circuit

10^6

10^7



Tennis ball

10^8

5

nm

CNT/Protein Interactions

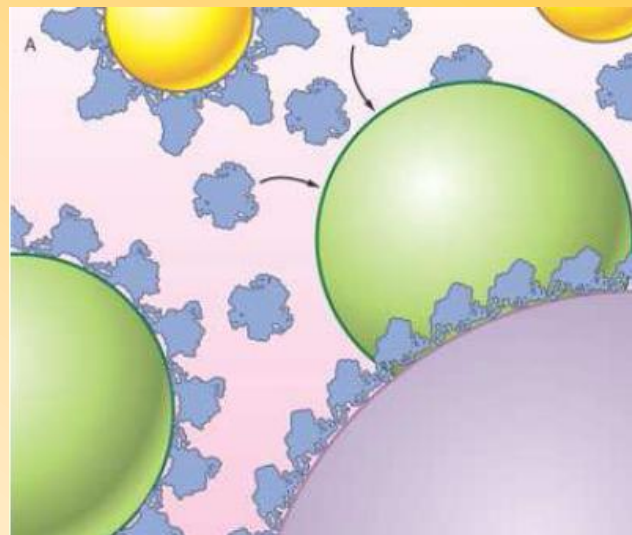
Gel electrophoresis

Mass spectrometry

Fluorescence quenching

Zeta potential

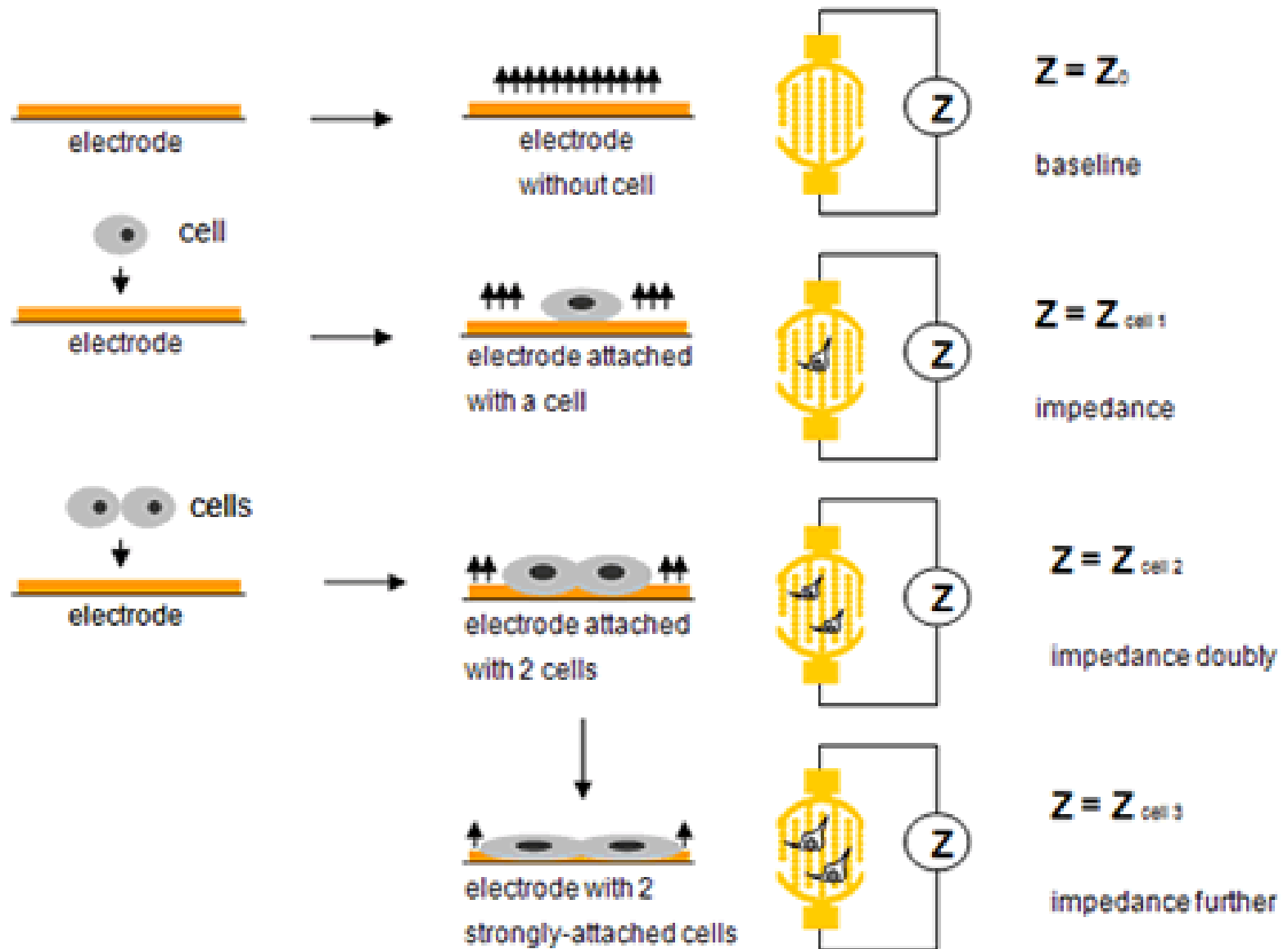
Enzyme activity



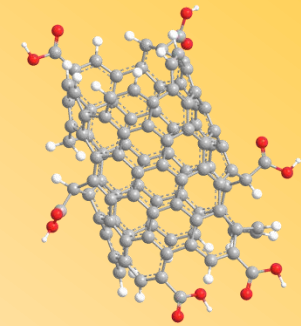
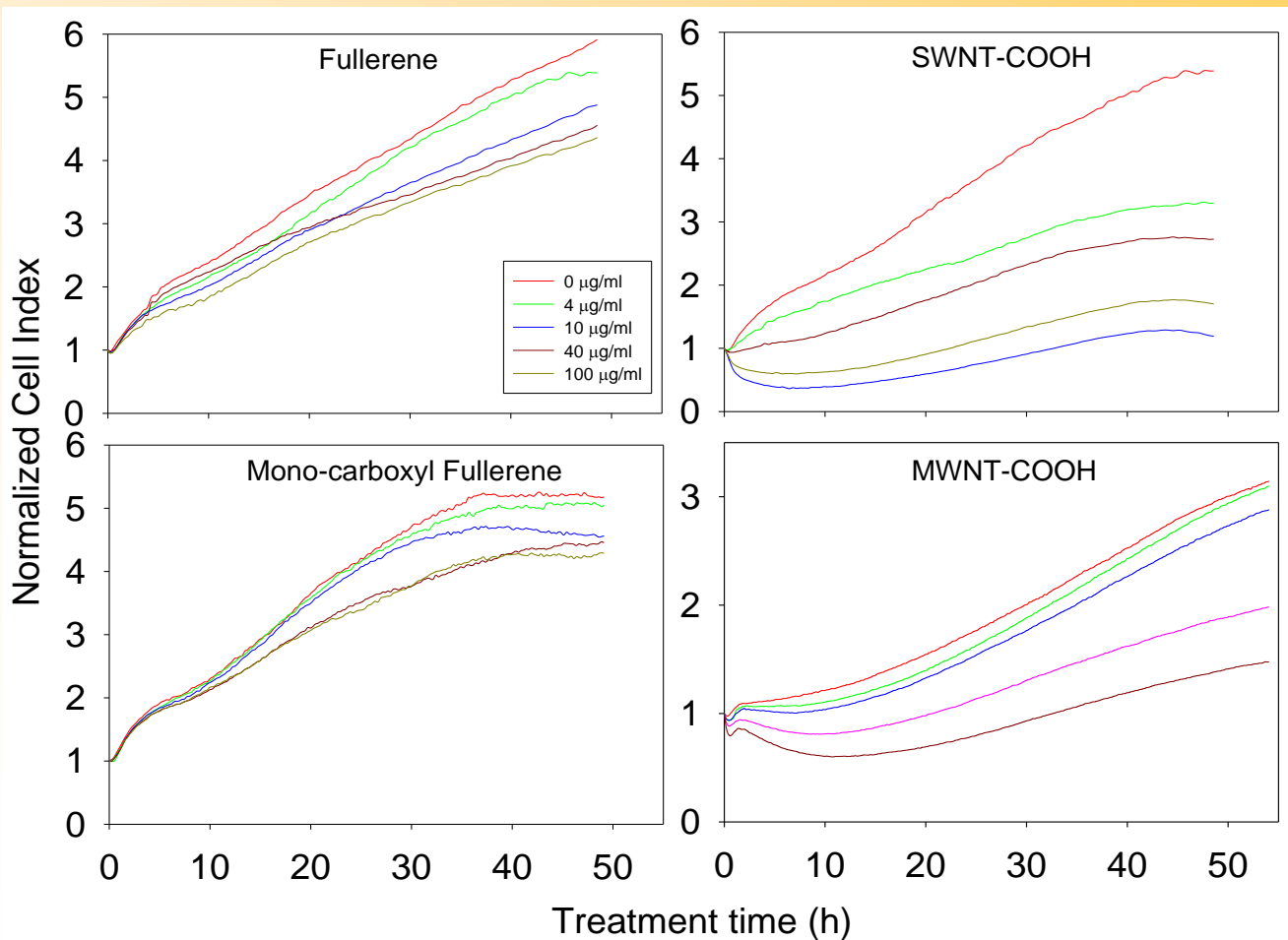
Mu, Liu, Xing, Zhou, Li, Zhang, Ji, Wang, Si, Zhang, Yan*. *J Phys Chem C* **2008**, 112(9), 3300-3307.

Zhang, Xing, Li, Mu, Zhou, Yan*. *Nano Lett.* **2009**, 9(6), 2280-2284.

Real-Time Cell Electronic Sensing



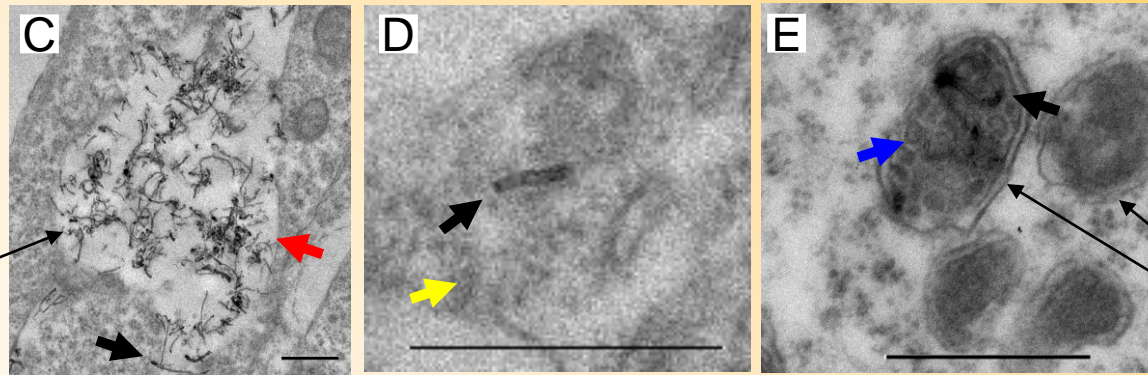
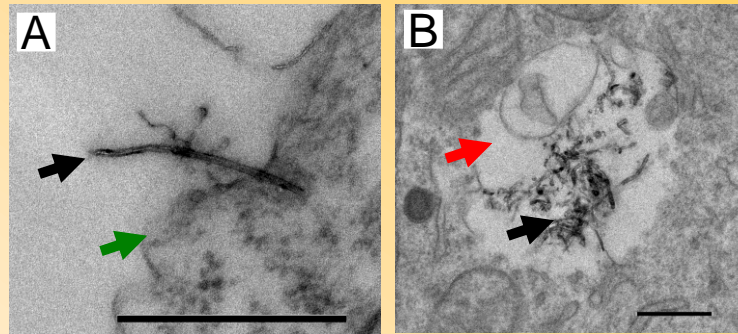
Inhibition of Cell Proliferation by Carbon Nanotubes



HEK293

Cellular Localization

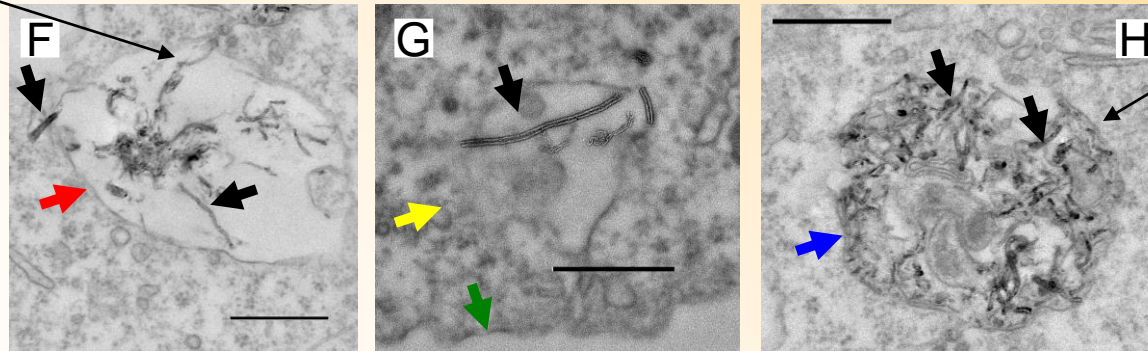
MWCNT-COOH, 1h incubation



endosome

lysosome

MWCNT-COOH, 48h incubation



→ Plasma membrane

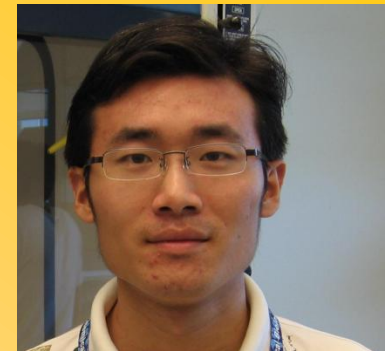
→ Cytoplasm

→ Endosome

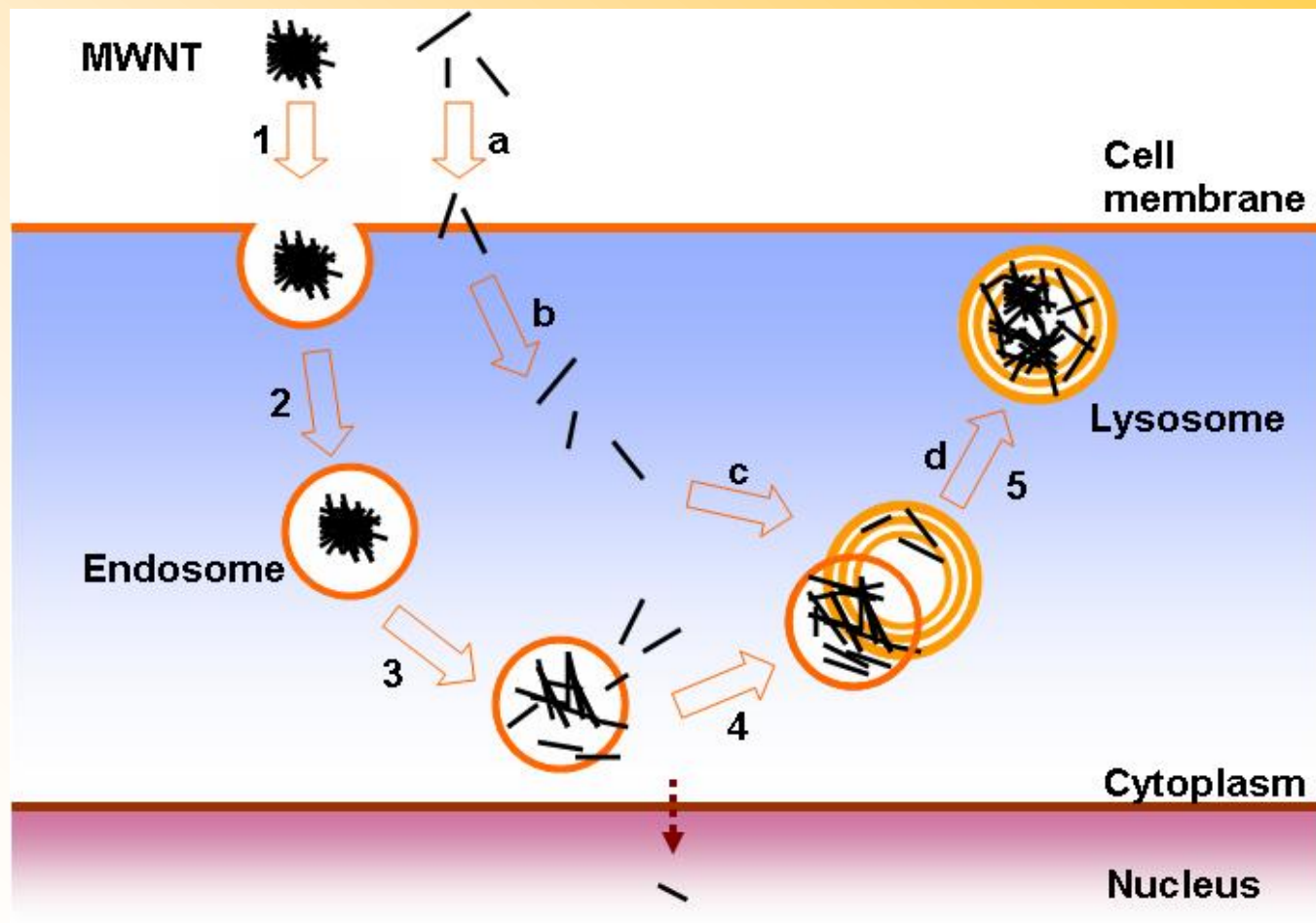
→ Lysosome

→ MWCNTs

A Model for MWNT Cell Uptake



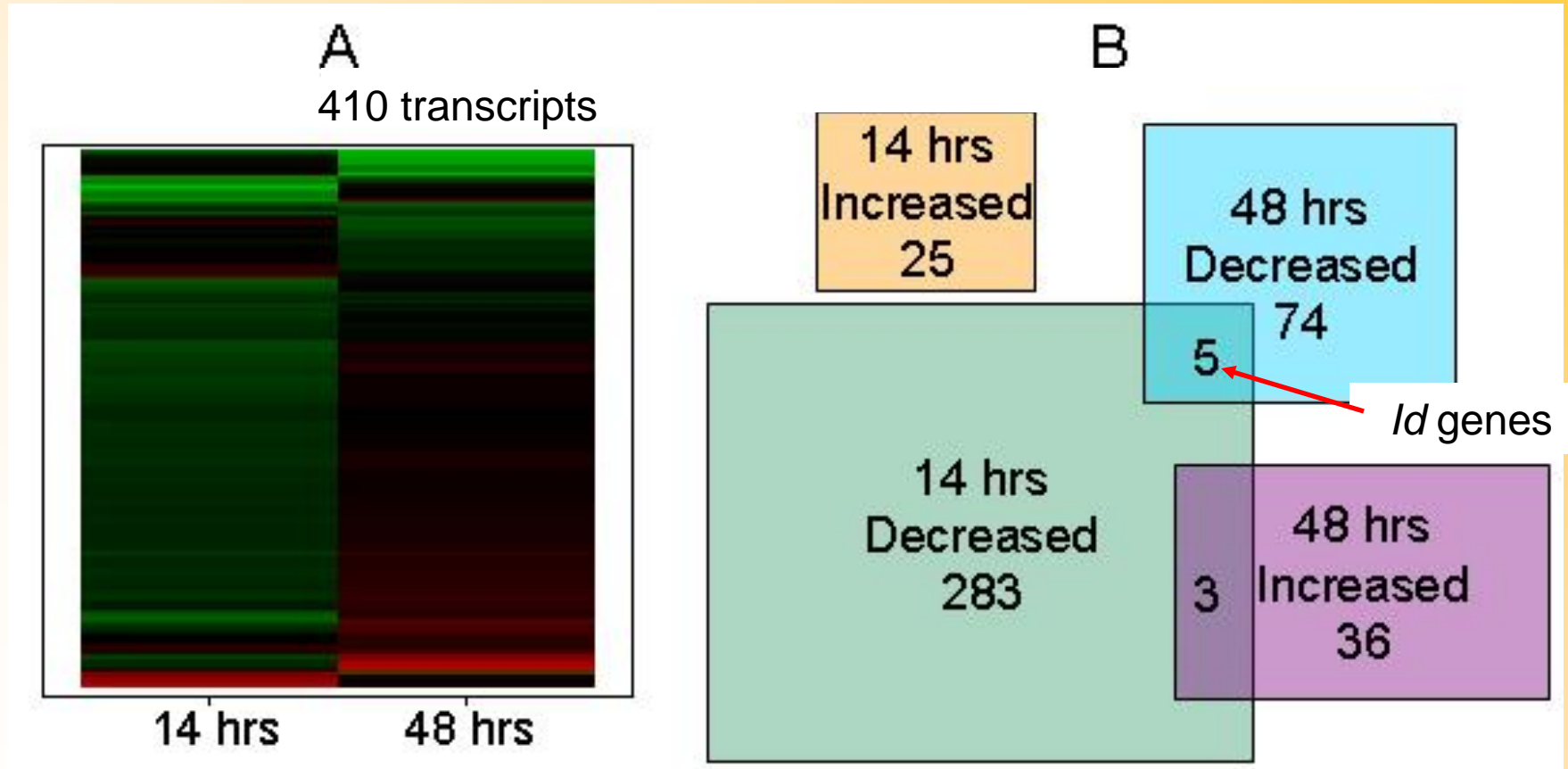
Qingxin Mu



Mu, Broughton, Yan*, *Nano Lett.* 2009, 9(12), 4370-4375.

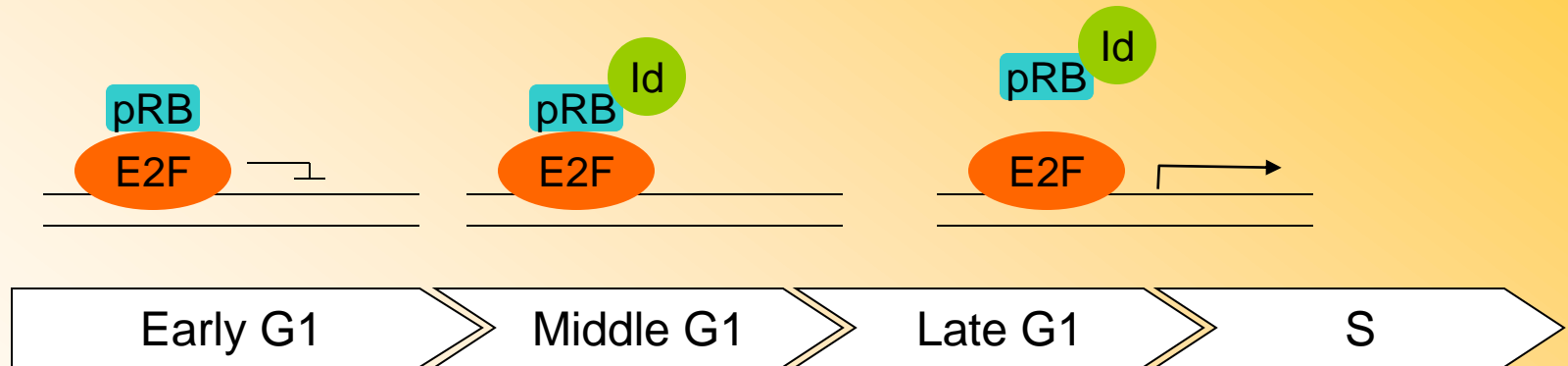
SWNT-COOH Affects Globe Gene Expression

Using Affimetrix U133v2 human genome chip (54,600 probesets)



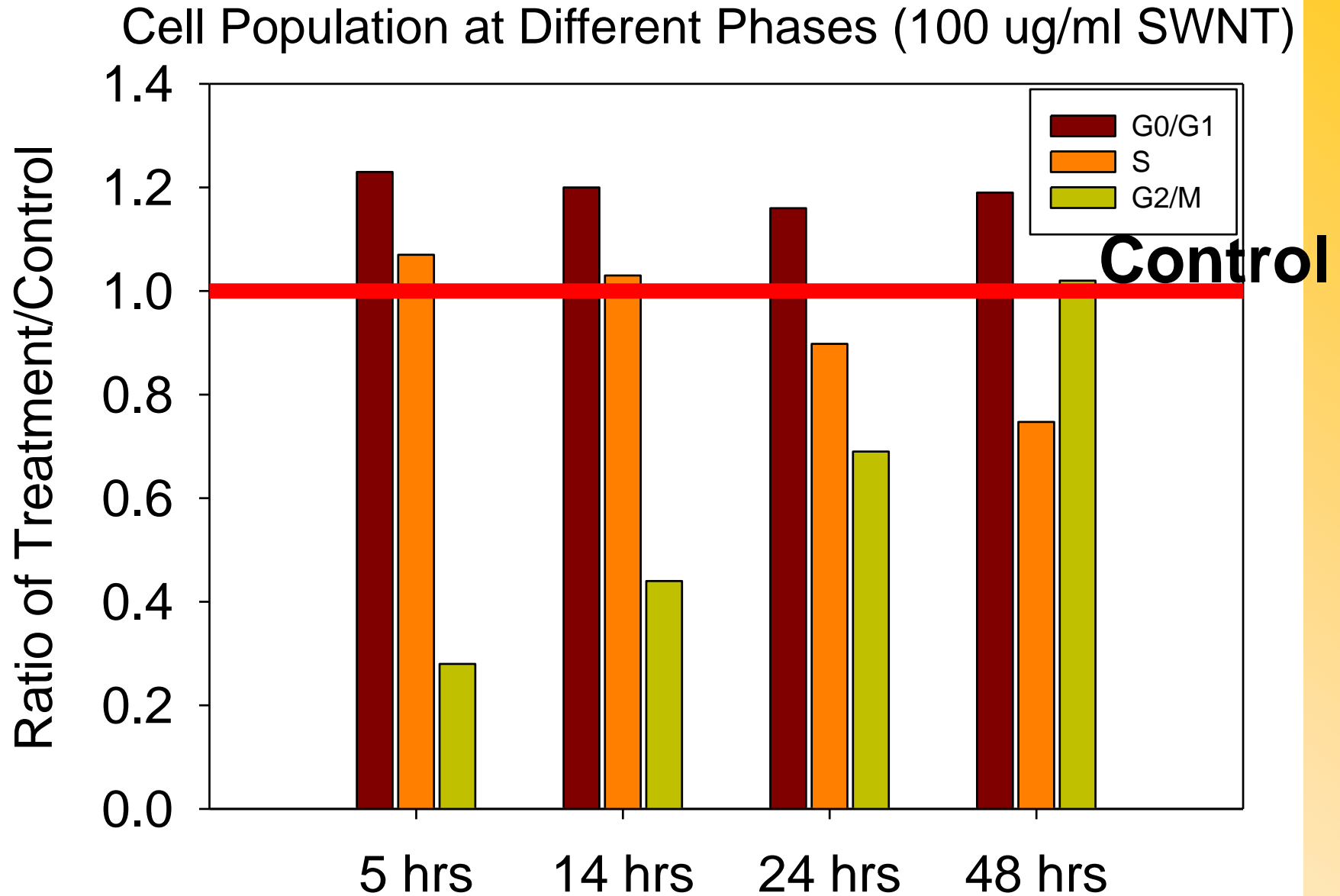
HEK293 cells, 100 $\mu\text{g}/\text{mL}$

ID Proteins Regulate Cell Cycle



Zoe Zebedee, Eiji Hara. *Oncogene*. (2001) 20, 8317-8325

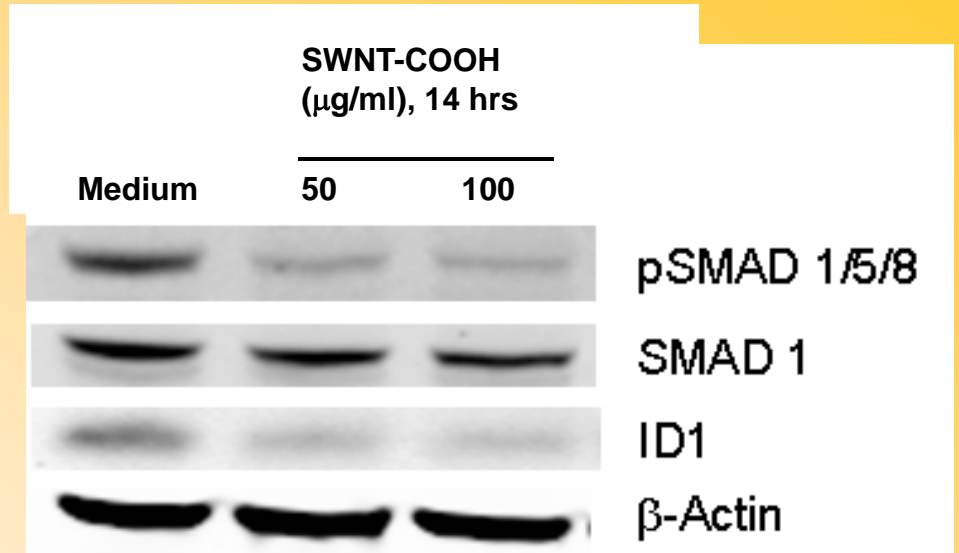
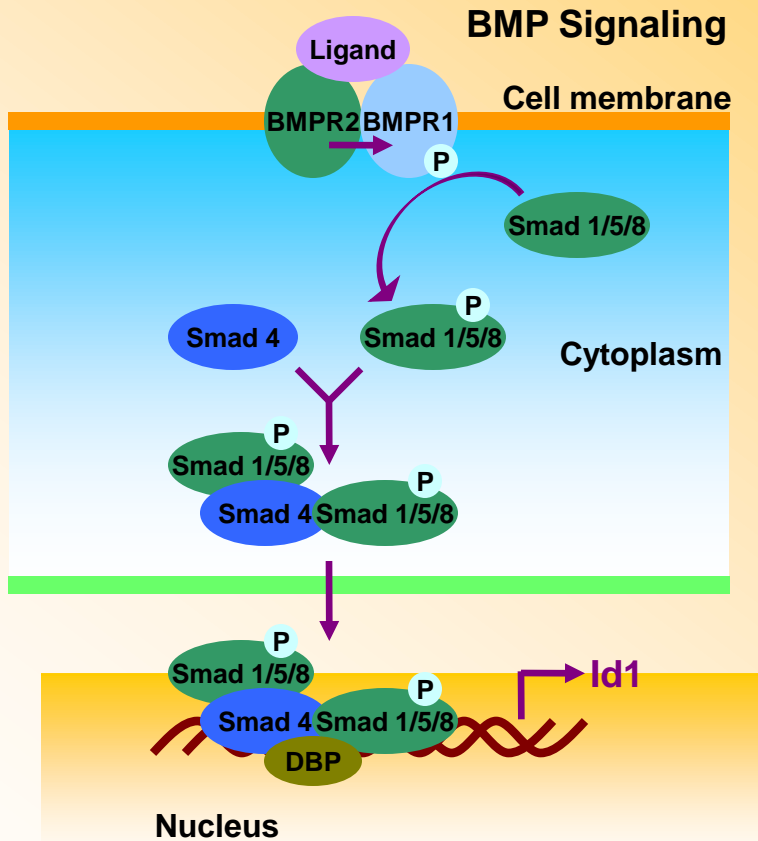
Cell Cycle Analysis



Signaling Pathways Significantly Effected

14 hours treatment		48 hours treatment	
Pathway name	$p < 0.05$	Pathway name	$p < 0.05$
Starch and sucrose metabolism	6.80E-05	Adherens junction	0.000332
Tight junction	0.004099	TGF-beta/BMP signaling pathway	0.000528
Long-term depression	0.016265	Tight junction	0.001647
Adherens junction	0.016989	Glycan structures - biosynthesis 2	0.028914
Taste transduction	0.019684	Glycosphingolipid biosynthesis - lactoseries	0.041922
Notch signaling pathway	0.020863		14
Amyotrophic lateral sclerosis (ALS)	0.024071		
TGF-beta/BMP signaling pathway	0.02534		
Gap junction	0.02726		

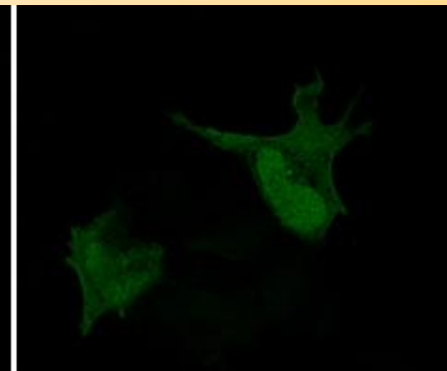
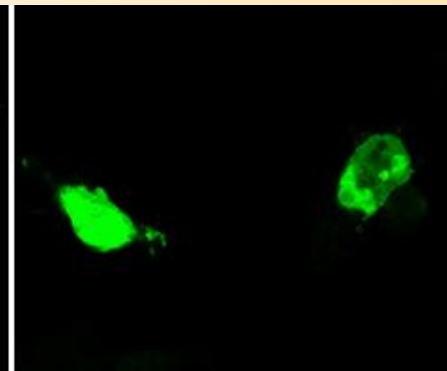
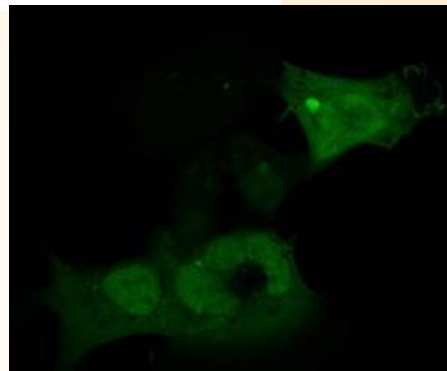
Possible Mechanisms



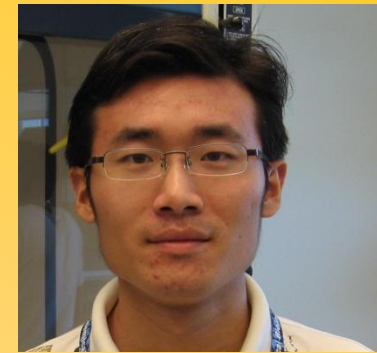
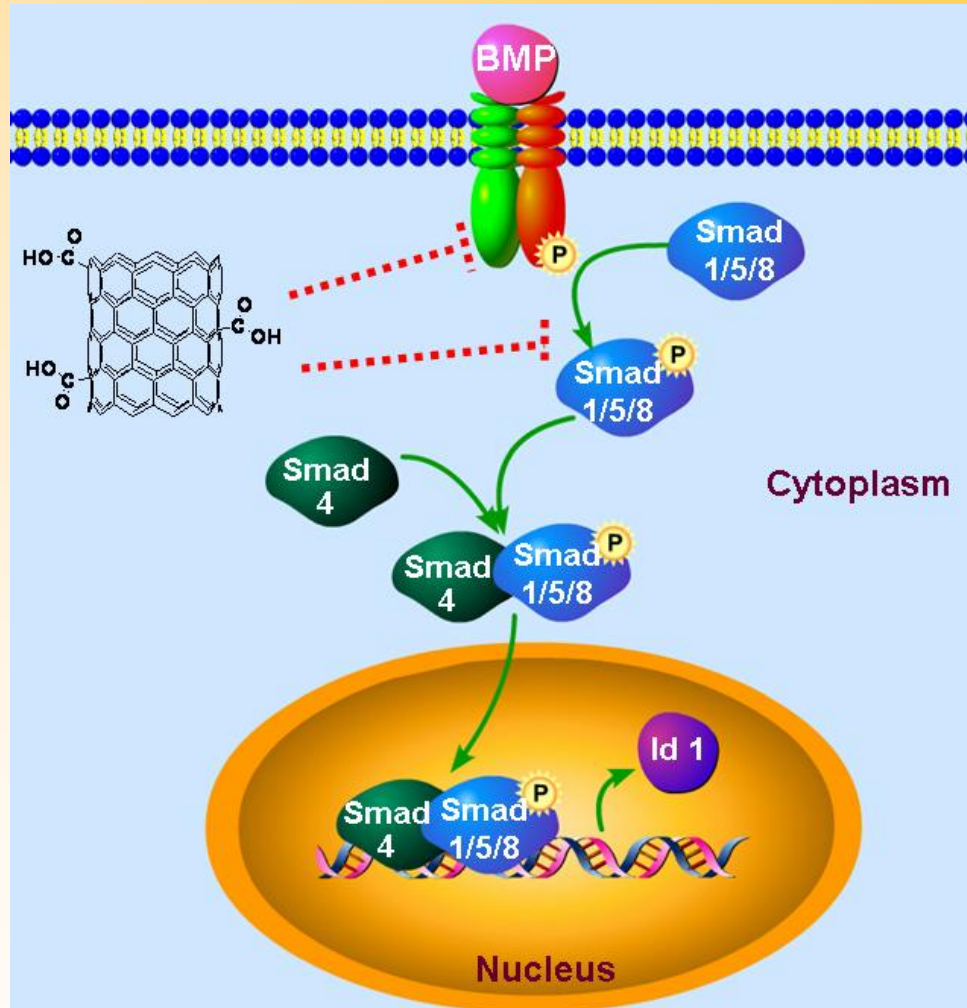
Smad 1-GFP HEK293

+BMP

+BMP+SWCNT-COOH



Suppression of BMP Signaling by SWCNT-COOH



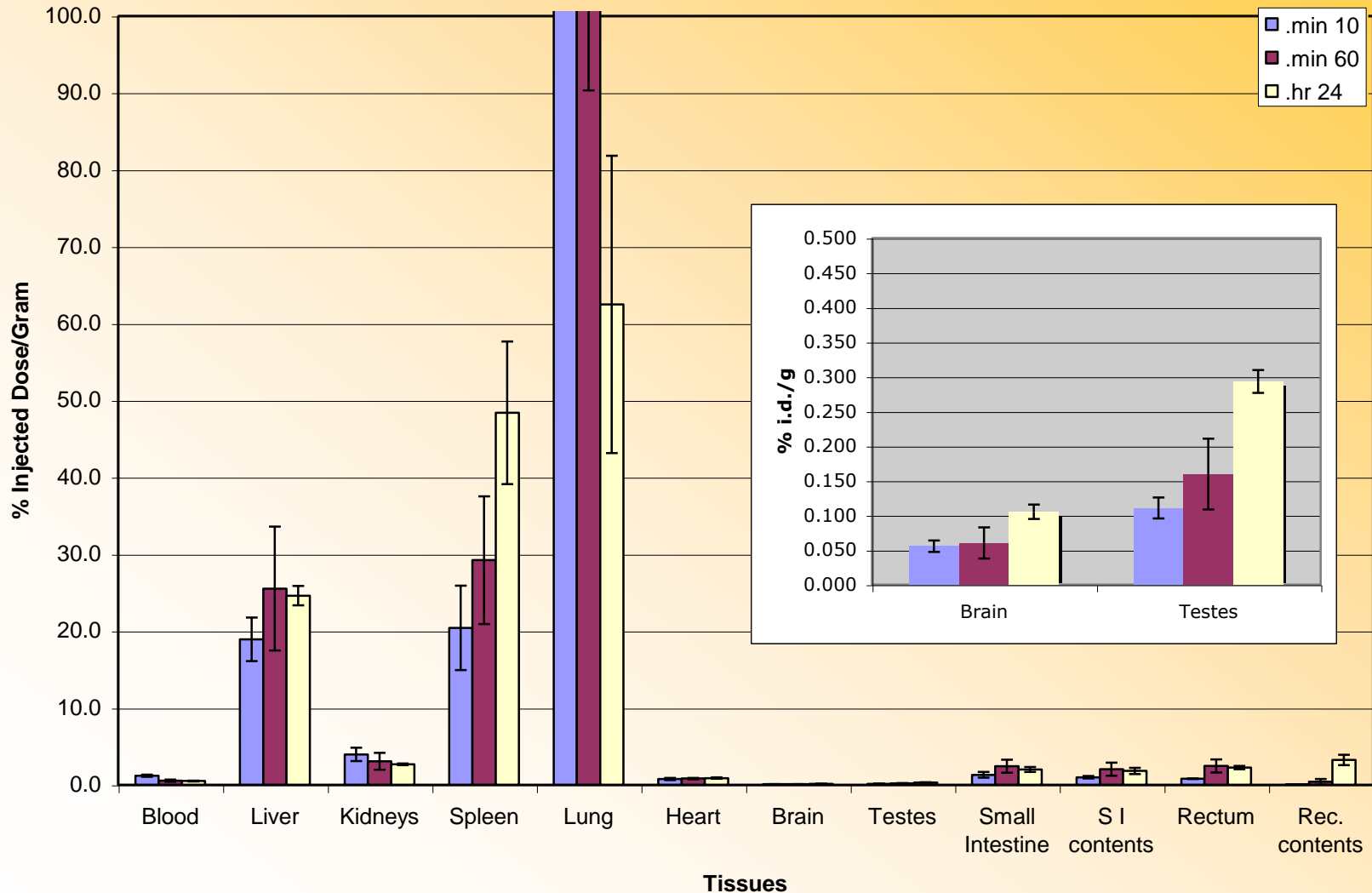
Qingxin Mu

Mu, Du, Chen, Zhang, Yan*. **ACS Nano** 2009, 3, 1139-1144.

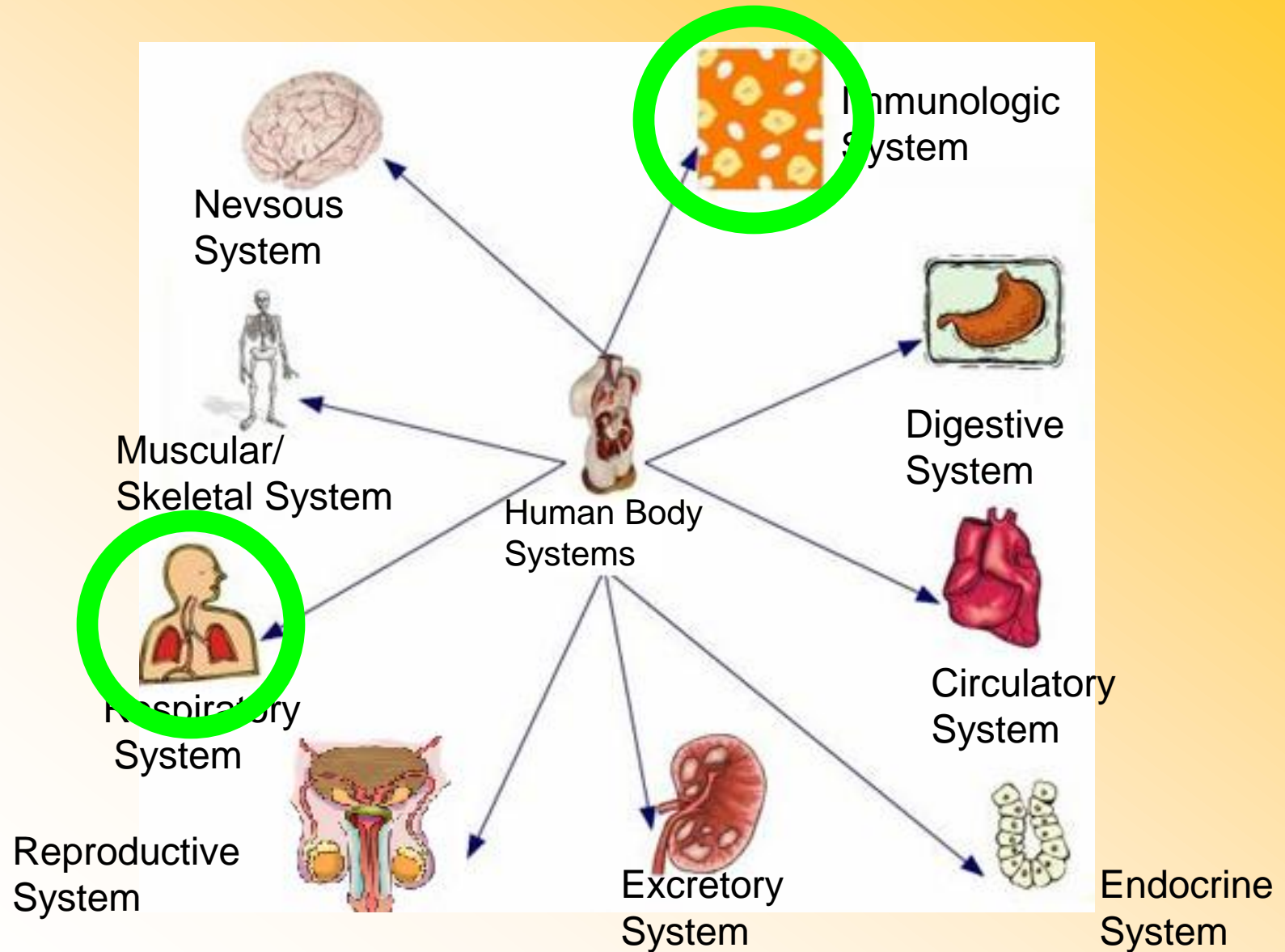
Distribution of Carbon Nanotubes in Mice



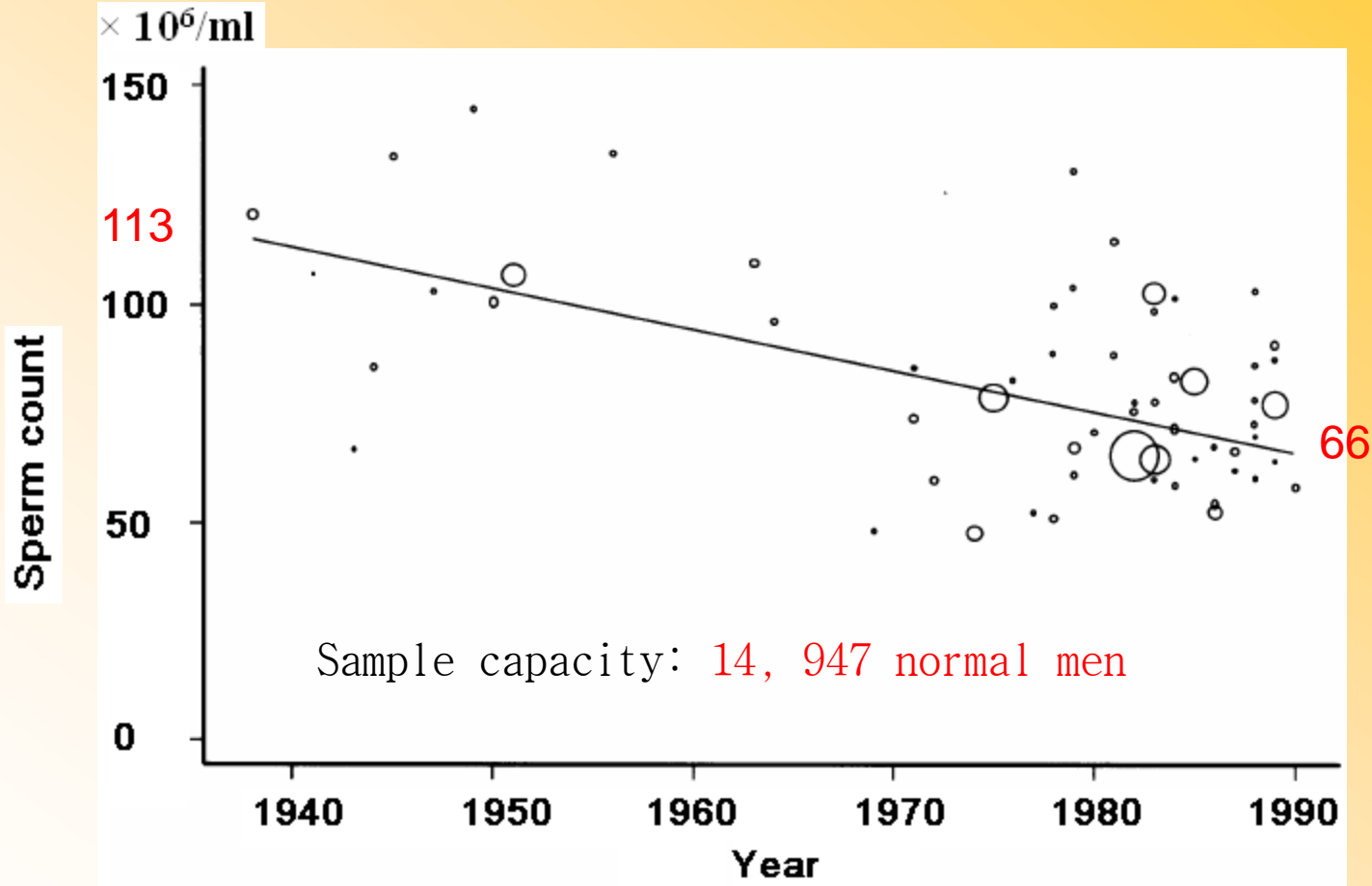
Scott Snyder



Lack reproductive nanotoxicity research

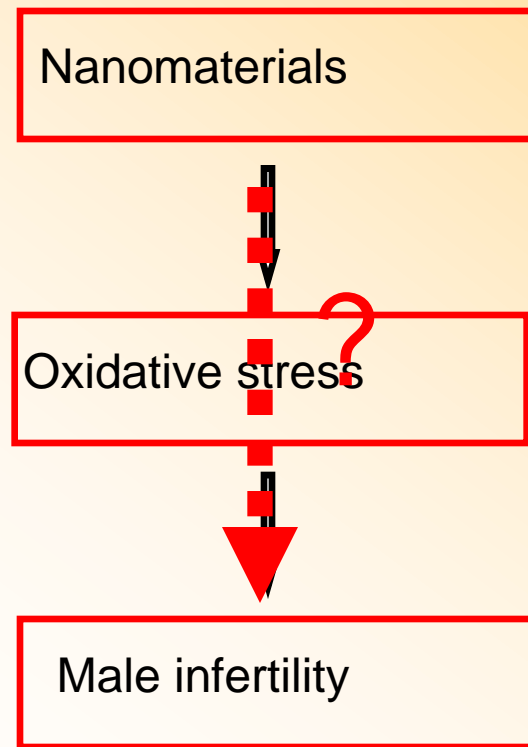


Sperm count keeps decreasing

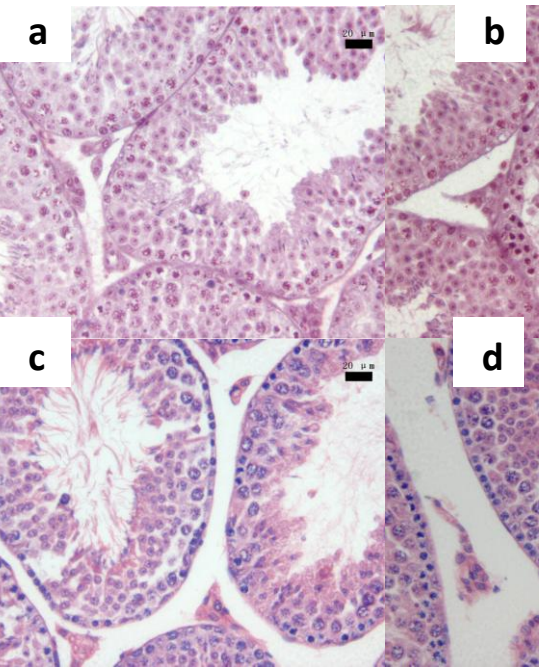


Carlsen E, Giwercman A, Keiding N, Skakkebaek NE. Evidence for decreasing quality of semen during past 50 years. *Br Med J* 305:609–613 (1992).

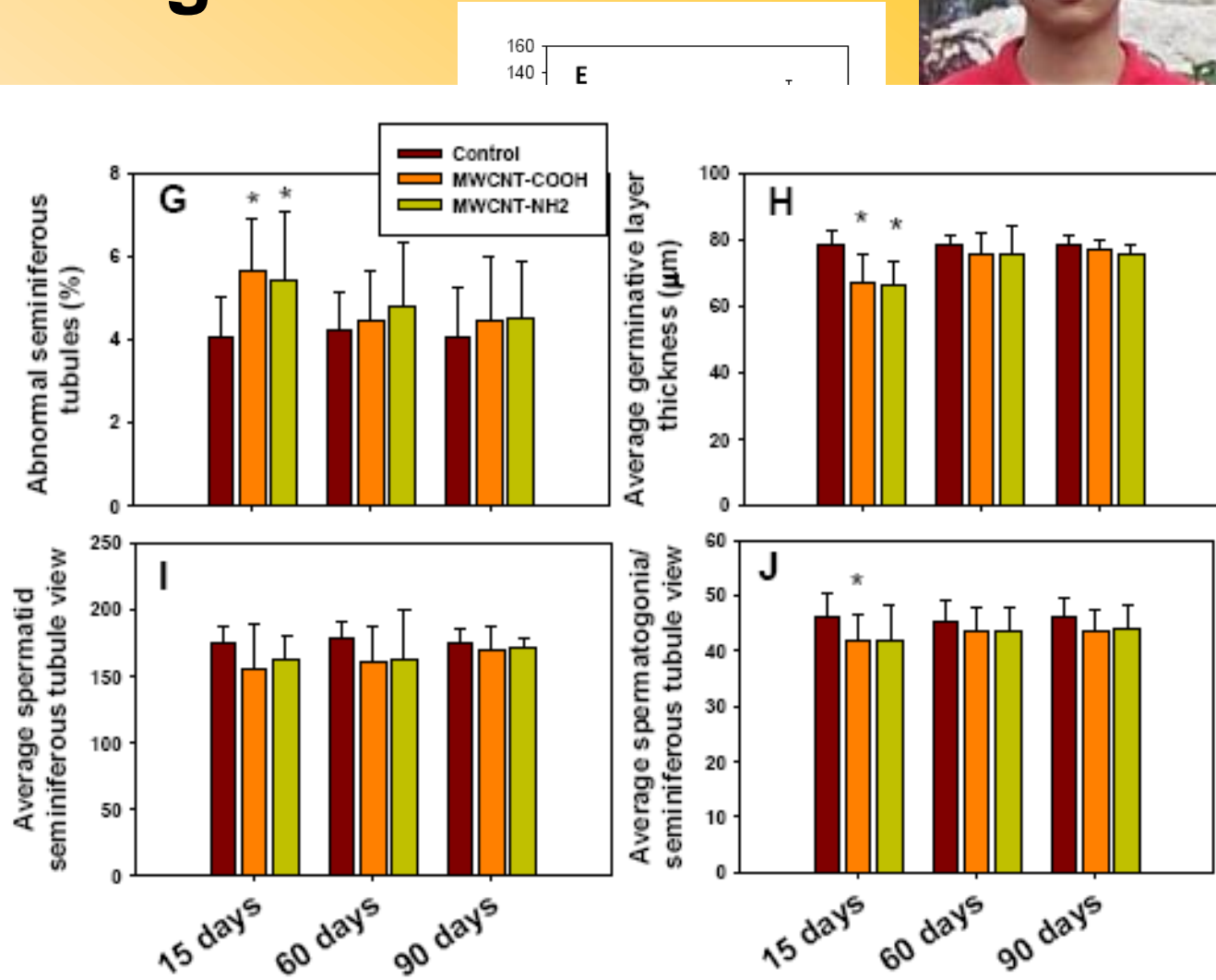
Oxidative stress, nanomaterials and male infertility



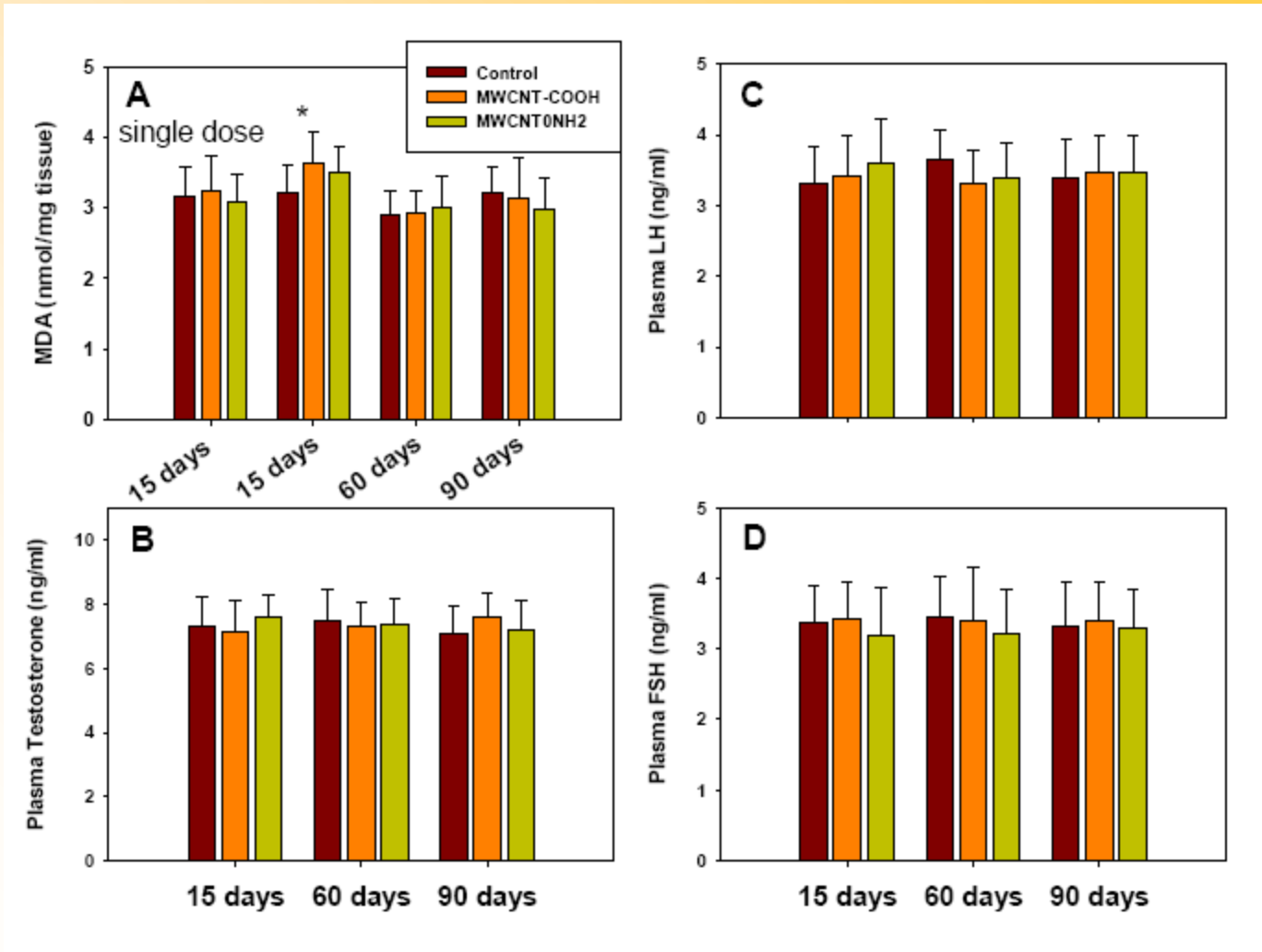
Carbon Nanotubes Cause Reversible Damage to Mouse Testis



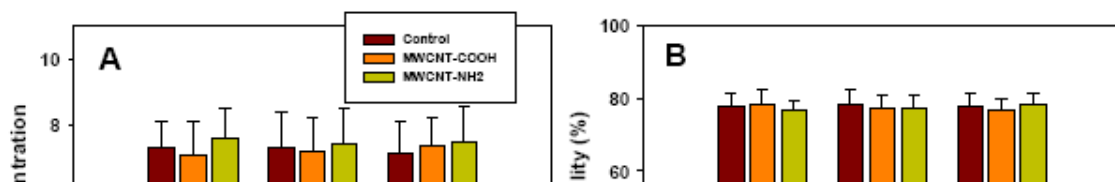
A: Control
 B: 15days
 C: 60days
 D: 90days



Oxidative Stress and Sex Hormone Levels



Sperm Health are Unaffected



Acrosome integrity

Male Fertility Mice 15- and 60-Day after Exposure (Exposure Scheme 2)

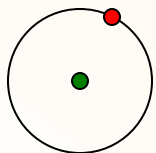
	Copulation Index(%) ^a	Fertility Index(%) ^b	Gestation Index (%) ^c	Average no. of live pups/pregnant female	Viability index PND4 ^d
Control	100.0	91.6	100	7.4	95.6%
MWCNT-COOH-15 days	100.0	91.7	100	7.8	97.7%
MWCNT-NH2-15 days	100.0	100.0	100	7.5	100.0%
MWCNT-COOH-60 days	100.0	83.3	100	7.2	95.8%
MWCNT-NH2-60 days	100.0	91.7	100	6.8	97.3%



Bai, Zhang, Zhang, Mu, Zhang, Butch, Snyder, Yan*, *Nature Nanotechnology*, 2010, Advanced online publication, August 7.

Outline

- Nanotoxicity
- **Reduce toxicity**



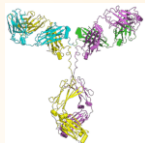
Hydrogen

10^{-1}



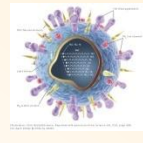
Glucose

1



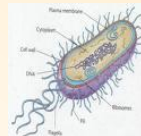
Antibody

10



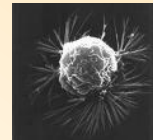
Virus

10^2



Bacteria

10^3



Breast cancer cell

10^4

10^5



Integrated circuit

10^6

10^7



Tennis ball

10^8

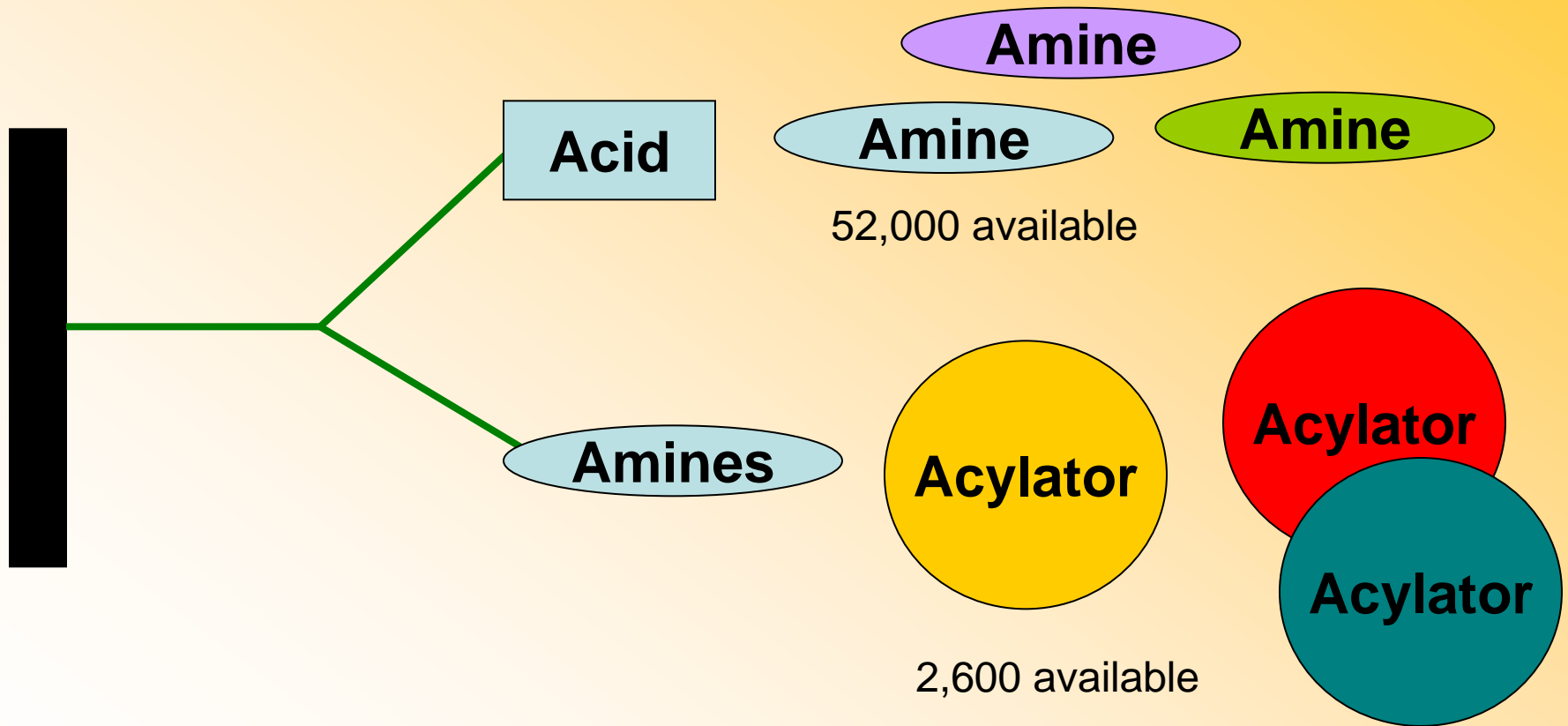
24

nm

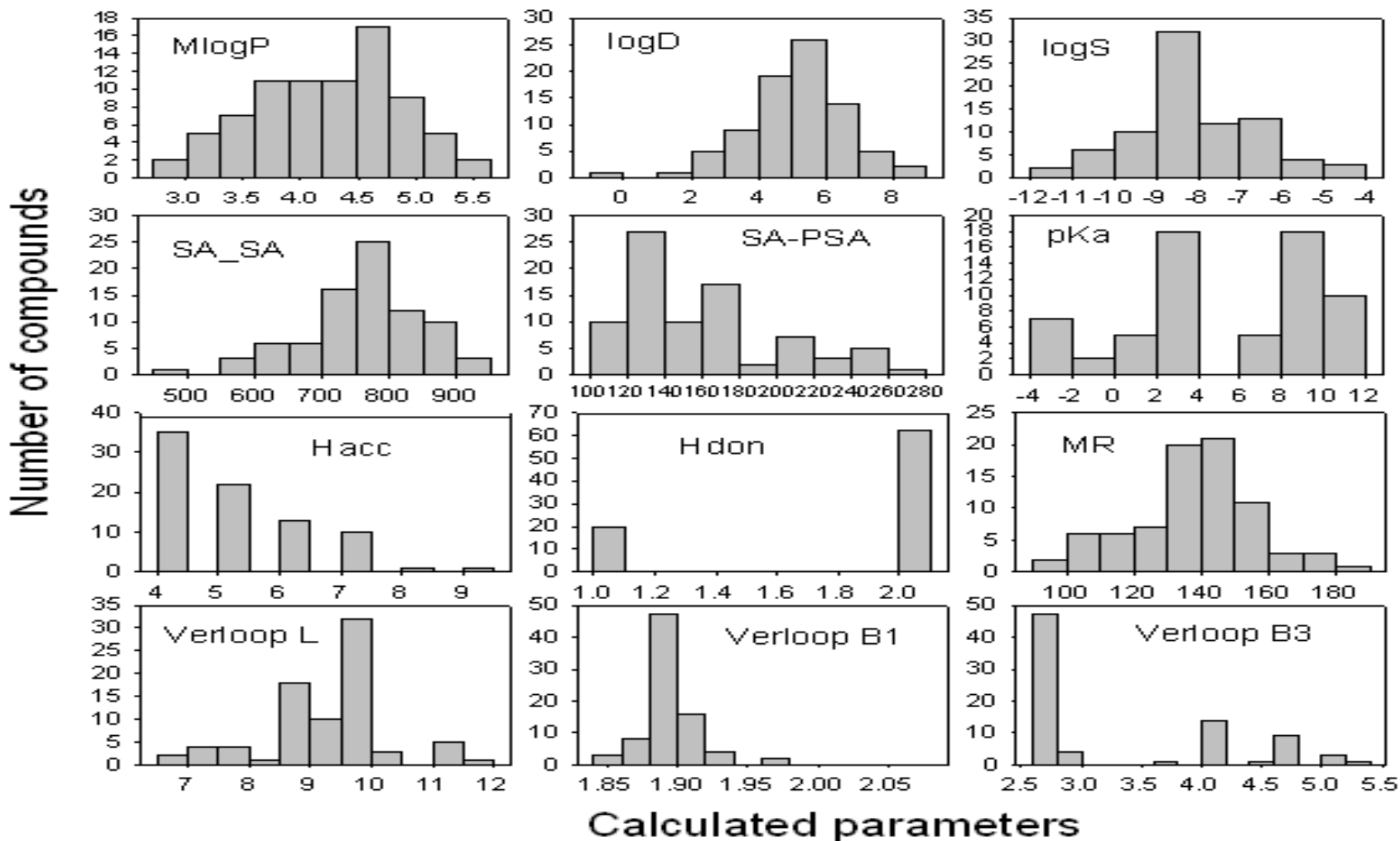
Rationales

- Nanoparticles have extremely high surface area. By modifying their surface chemistry, we may modulate their biological interactions.
- Compared with the linear method, nanocombinatorial library method (mapping chemical space) may be a much more effective approach

CNT Library Design

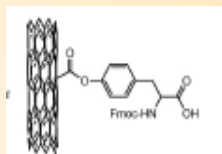


Selection of Building Blocks by Computation

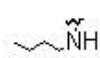





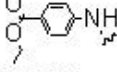
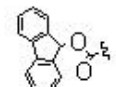




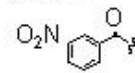
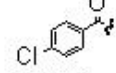


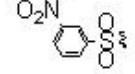


Diverse Carbon Nanotube Library

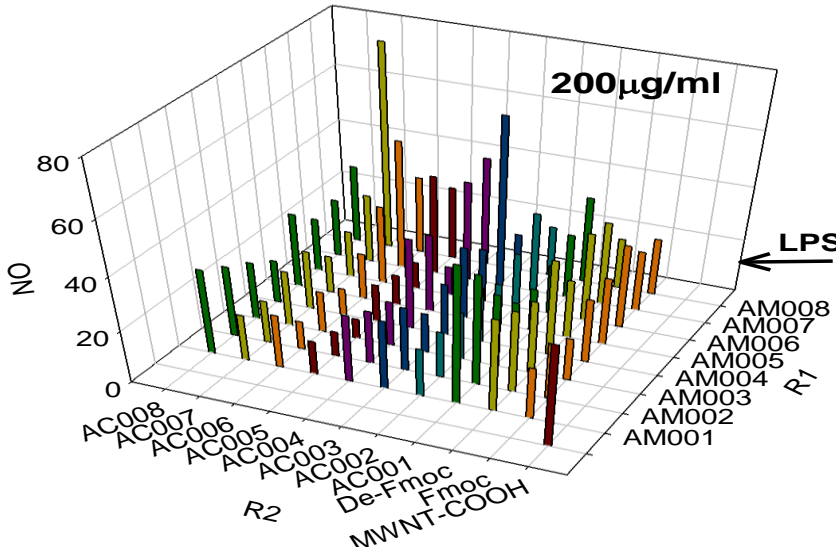
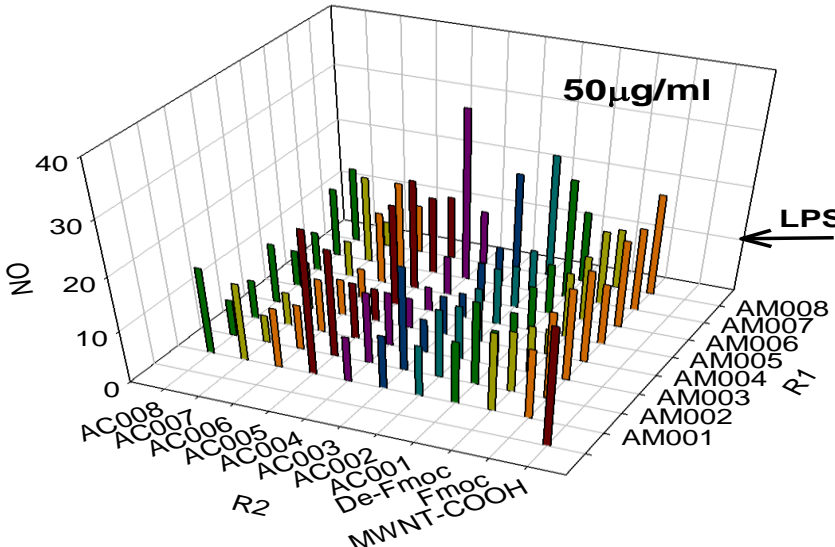
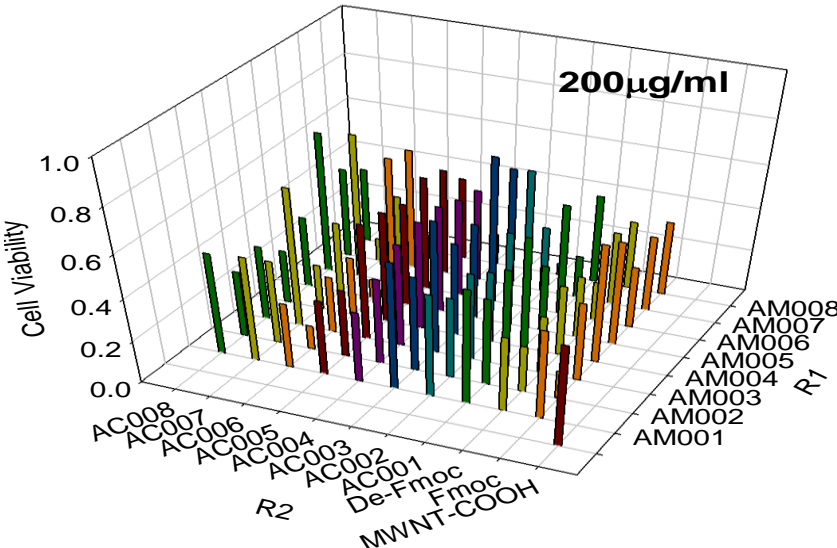
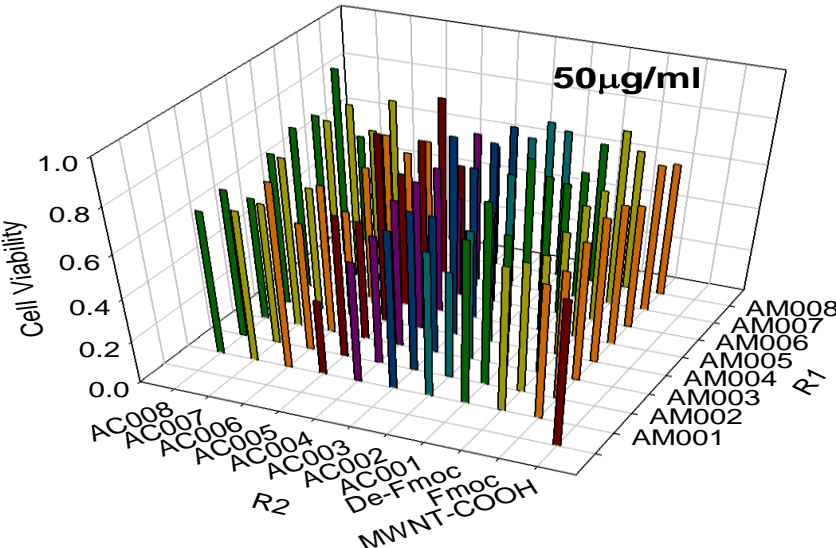
R1



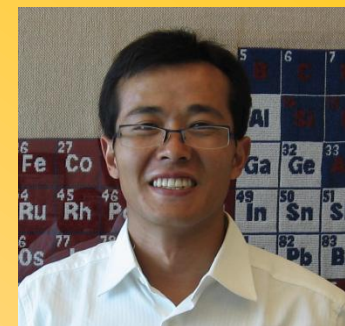
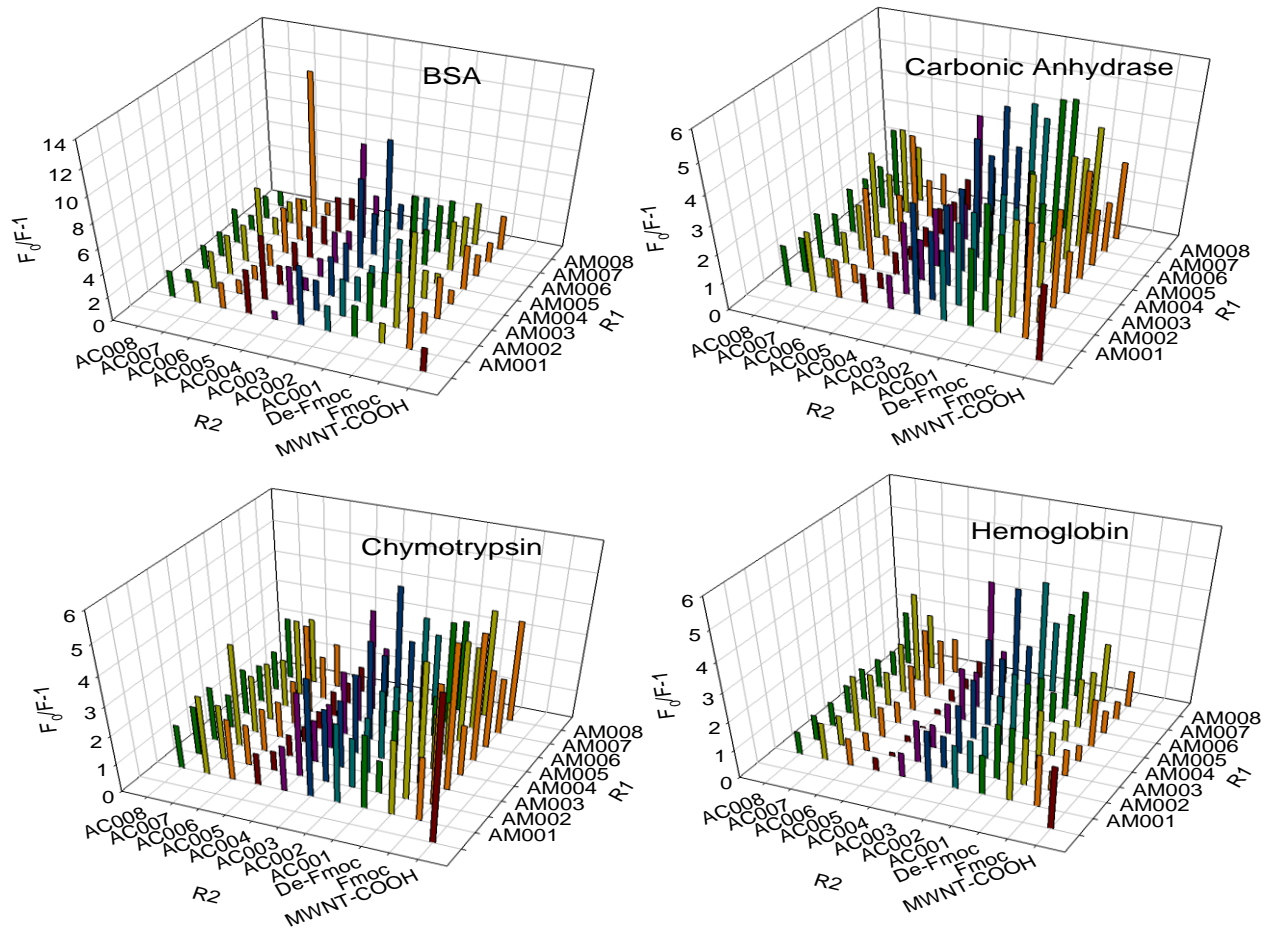
R2

	 AM001	 AM002	 AM003	 AM004	 AM005	 AM006	 AM007
 Fmoc	5	6	7	8	9	10	11
H- 	13	14	15	16	17	18	19
De-Fmoc							
 AC001	21	29	37	45	53	61	69
 AC002	22	30	38	46	54	62	70
 AC003	23	31	39	47	55	63	71
 AC004	24	32	<u>40</u>	<u>48</u>	56	<u>64</u>	72
 AC005	<u>25</u>	<u>33</u>	<u>41</u>	<u>49</u>	<u>57</u>	<u>65</u>	<u>73</u>
 AC006	26	<u>34</u>	<u>42</u>	<u>50</u>	58	66	74
 AC007	27	35	43	51	59	67	75
 AC008	<u>28</u>	<u>36</u>	<u>44</u>	<u>52</u>	<u>60</u>	<u>68</u>	76

Reduce Cytotoxicity and Immune Responses



Surface Ligand Modulates Protein Binding



Dr. Hongyu Zhou

Zhou, Mu, Gao, Liu, Xing, Gao, Zhang, Qu, Chen, Liu, Zhang, Yan*. *Nano Lett* 8(3), 859-865, 2008.

Part II. Molecular Modeling

Dataset Overview

- *Structures of MWNT*

NPs bearing the same core (carbon nanotube) but with different surface modifiers: 1 pristine NP, 3 intermediates and 80 modified NPs were tested

- *Endpoints*

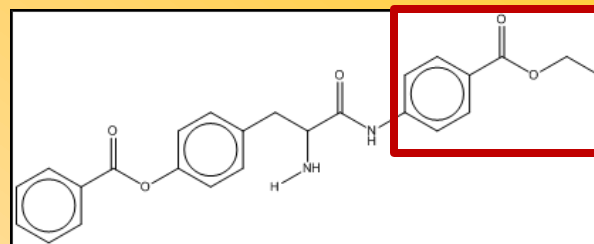
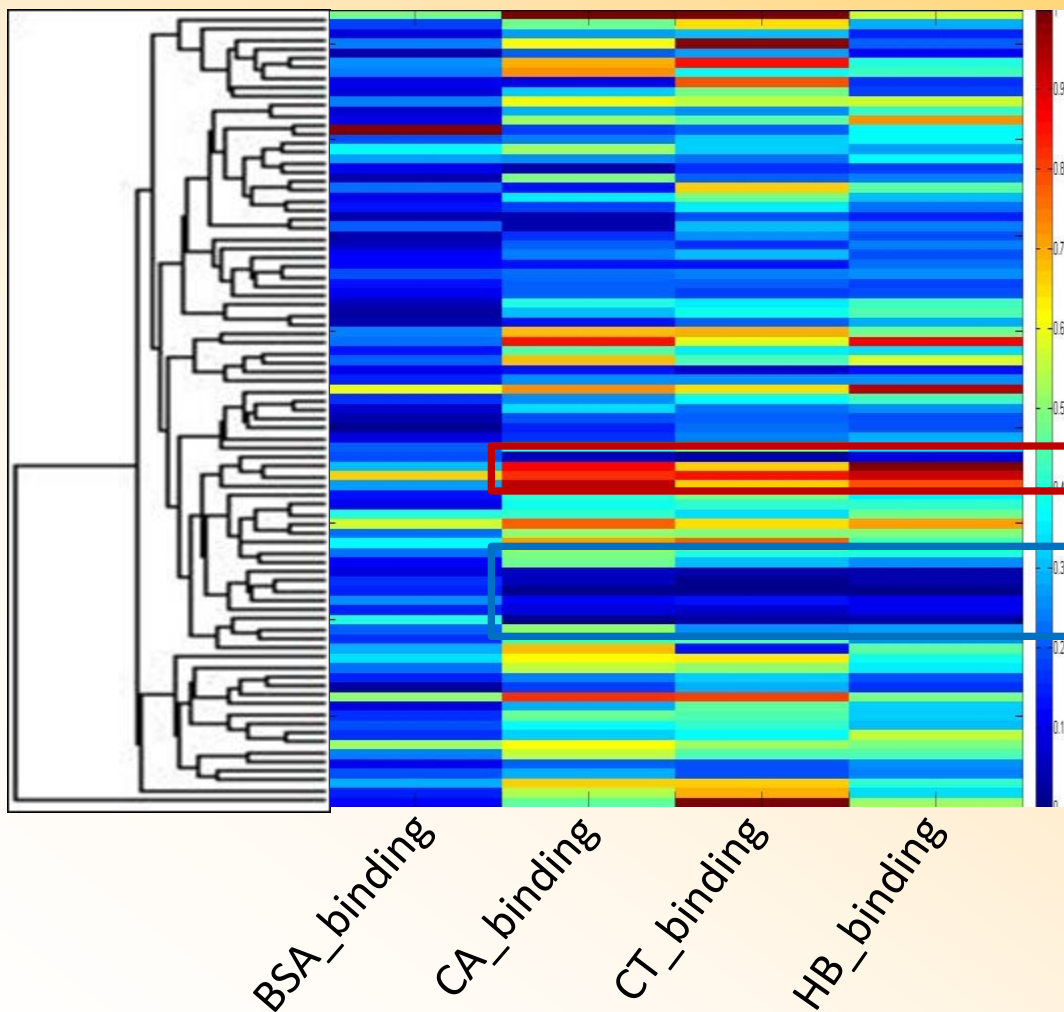
1) Protein Bindings (F_0/F_1 , tested in 15 and 7.5 ug/mL)

2) Acute toxicity (survival percentage, tested in 200 and 50 ug/mL)

3) Immune Toxicity (secretion of NO, tested in 200 and 50 ug/mL)

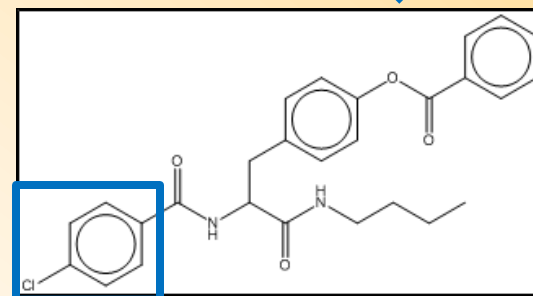
SAR study: Non-Supervised Hierarchical Clustering Analysis

83 compounds represented by Dragon descriptors

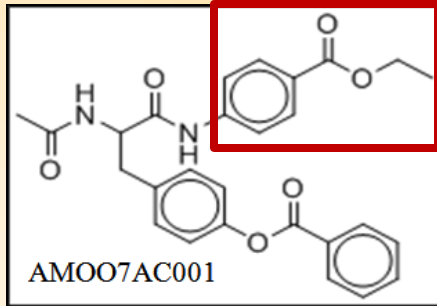


Cluster 1: strong protein binders

Cluster 2: weak protein binders

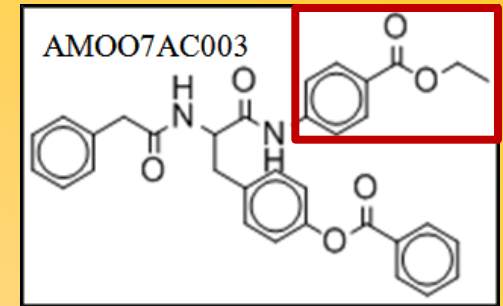


Cluster 1

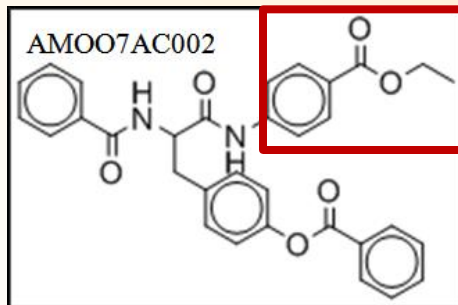
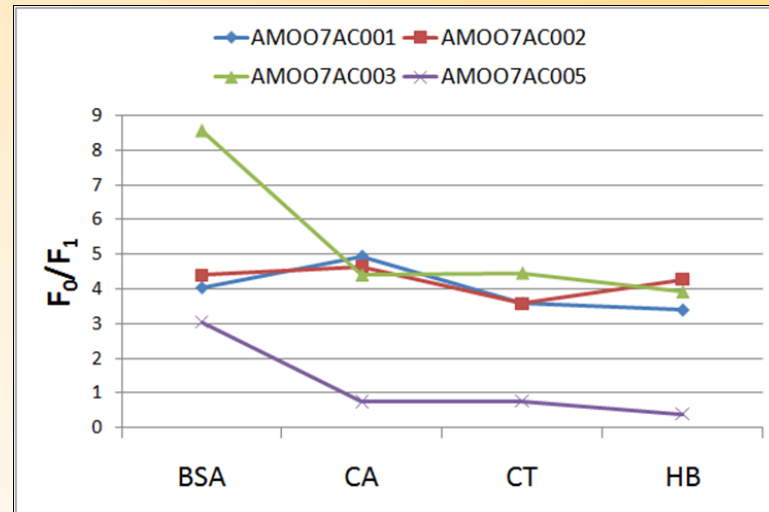


BSA Binding = 4.03
 CA Binding = 4.93
 CT Binding = 3.59
 HB Binding = 3.39

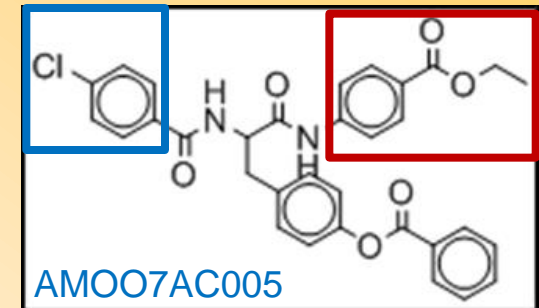
Similar surface modifiers have similar biological/toxicological effects



BSA Binding = 8.56
 CA Binding = 4.41
 CT Binding = 4.46
 HB Binding = 3.92



BSA Binding = 4.40
 CA Binding = 4.65
 CT Binding = 3.58
 HB Binding = 4.28

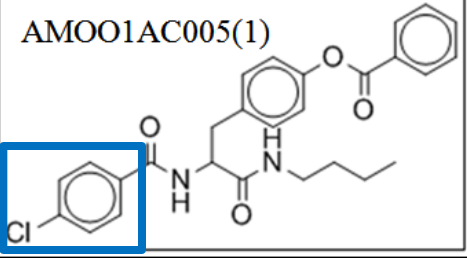


BSA Binding = 3.05
 CA Binding = 0.75
 CT Binding = 0.77
 HB Binding = 0.40

Cluster2

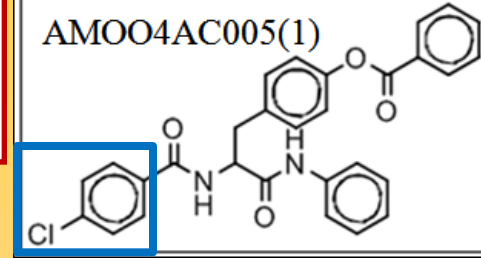
Similar surface modifiers have similar biological/toxicological effects

AMOO1AC005(1)



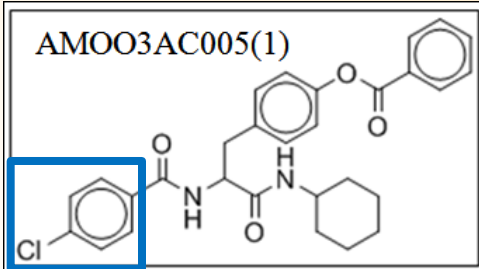
BSA Binding = 3.77
 CA Binding = 1.08
 CT Binding = 1.15
 HB Binding = 0.49

AMOO4AC005(1)



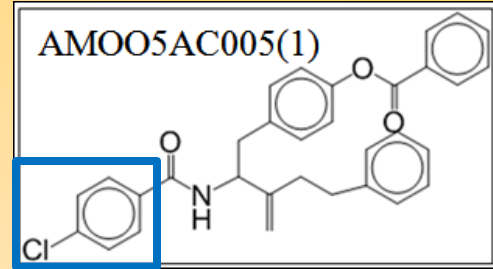
BSA Binding = 2.52
 CA Binding = 0.53
 CT Binding = 0.58
 HB Binding = 0.06

AMOO3AC005(1)

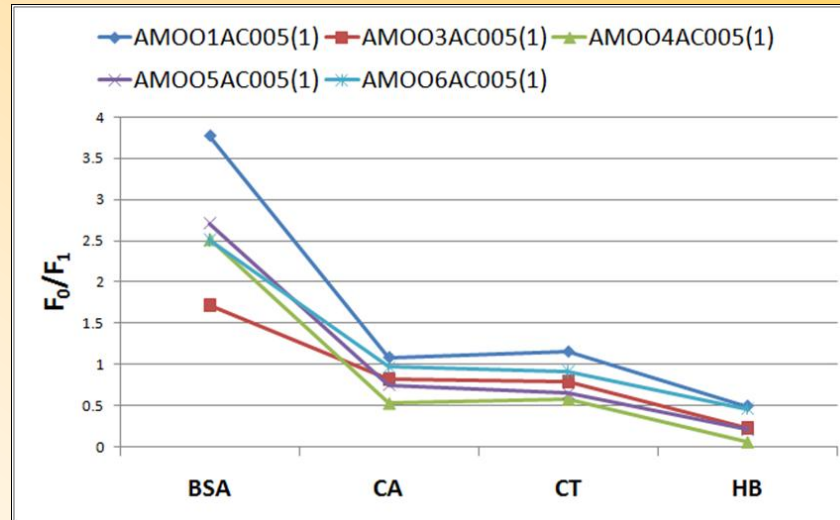


BSA Binding = 1.72
 CA Binding = 0.82
 CT Binding = 0.79
 HB Binding = 0.23

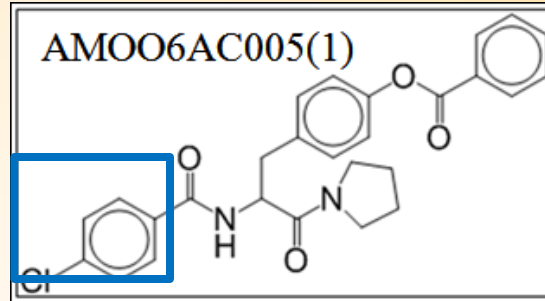
AMOO5AC005(1)



BSA Binding = 2.71
 CA Binding = 0.75
 CT Binding = 0.65
 HB Binding = 0.21



AMOO6AC005(1)



BSA Binding = 2.51
 CA Binding = 0.97
 CT Binding = 0.91
 HB Binding = 0.46

COMPOUNDS



Thousands of molecular descriptors are available for organic compounds
 constitutional, topological, structural, quantum mechanics based, fragmental, steric, pharmacophoric, geometrical, thermodynamical conformational, etc.

Quantitative Structure Activity Relationships

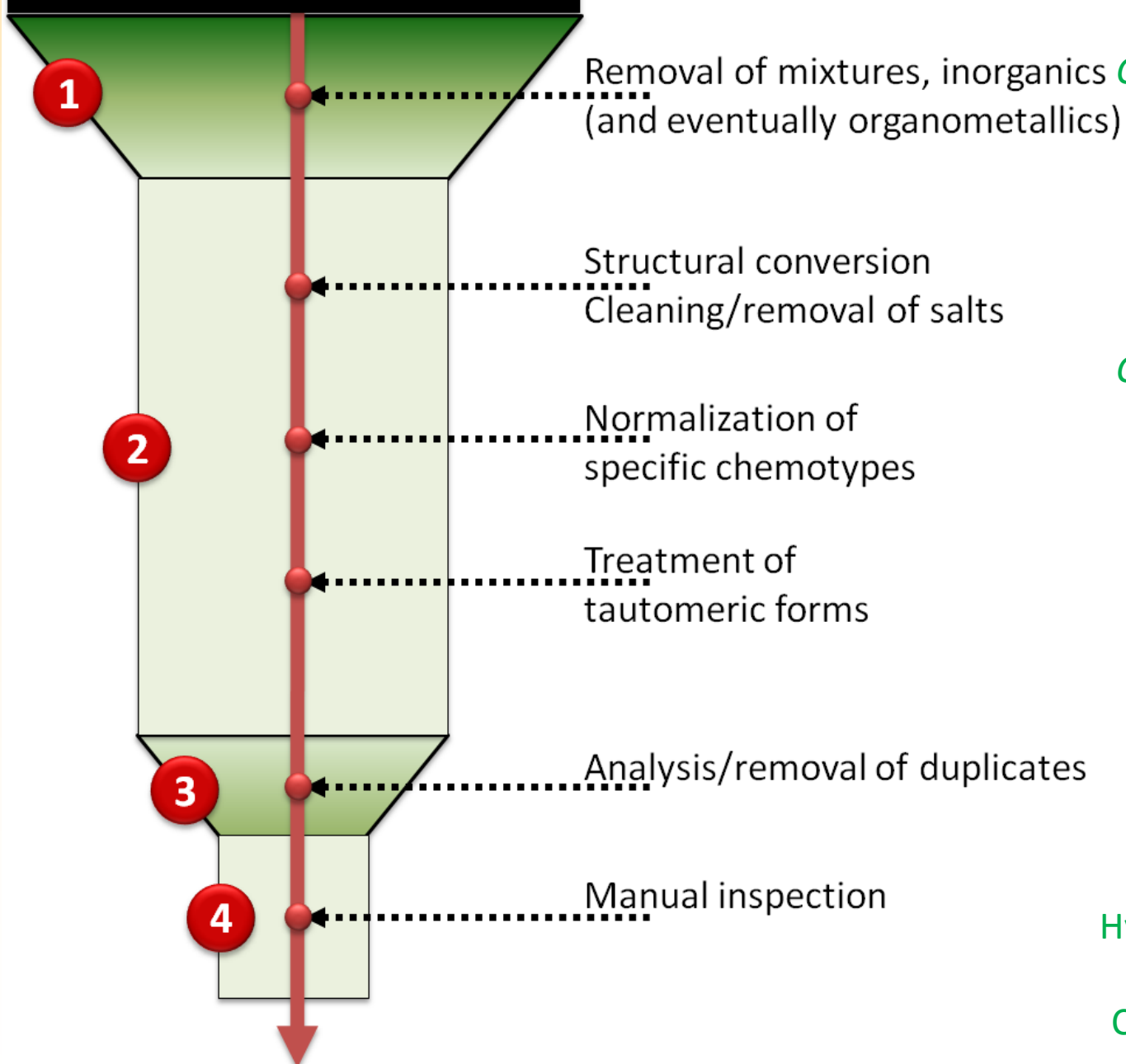
- **Building of models** using machine learning methods (NN, SVM etc.);
- **Validation of models** according to numerous statistical procedures, and their **applicability domains**.



0.613
 0.380
 -0.222
 0.708
 1.146
 0.491
 0.301
 0.141
 0.956
 0.256
 0.799
 1.195
 1.005

ACTIVITY

INITIAL LIST OF SMILES



SOFTWARE

ChemAxon - Standardizer
OpenEye - Filter

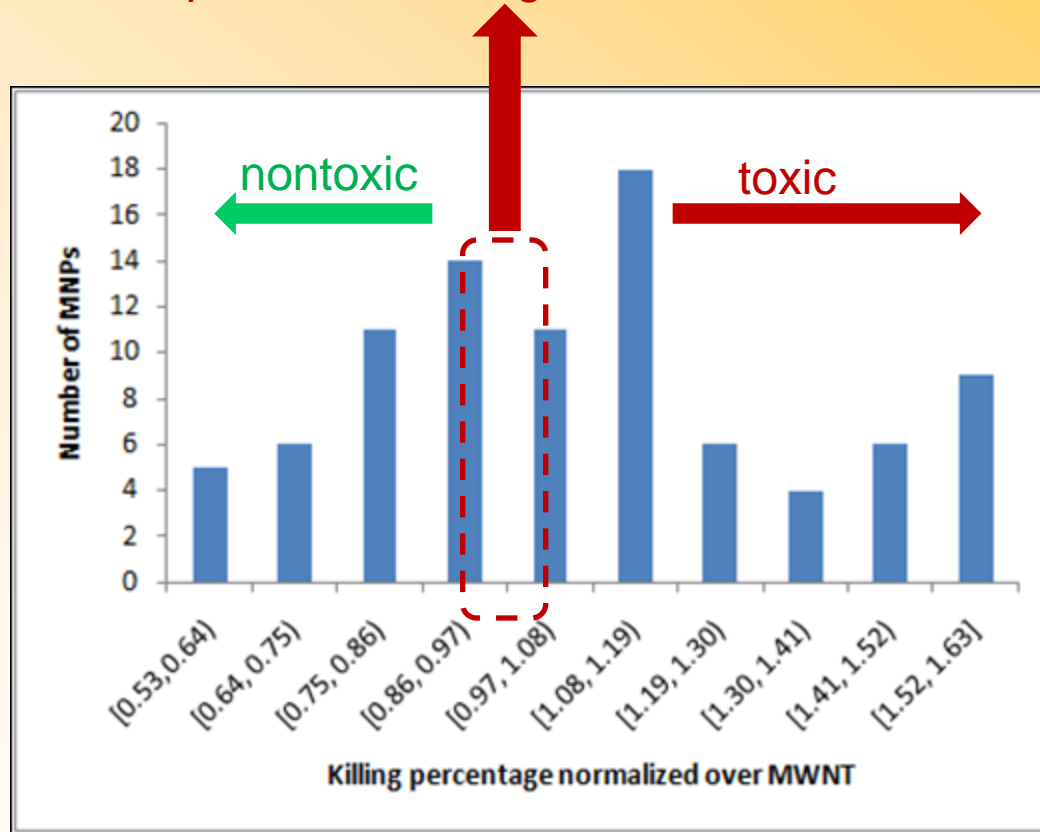
ChemAxon - Standardizer
OpenBabel
Molecular Networks - CHECK,TAUTOMER

ISIDA - Duplicates
HiT QSAR
CCG - MOE

ISIDA - EdiSDF
Hyleos - ChemFileBrowser
OpenBabel
ChemAxon - MarwinView

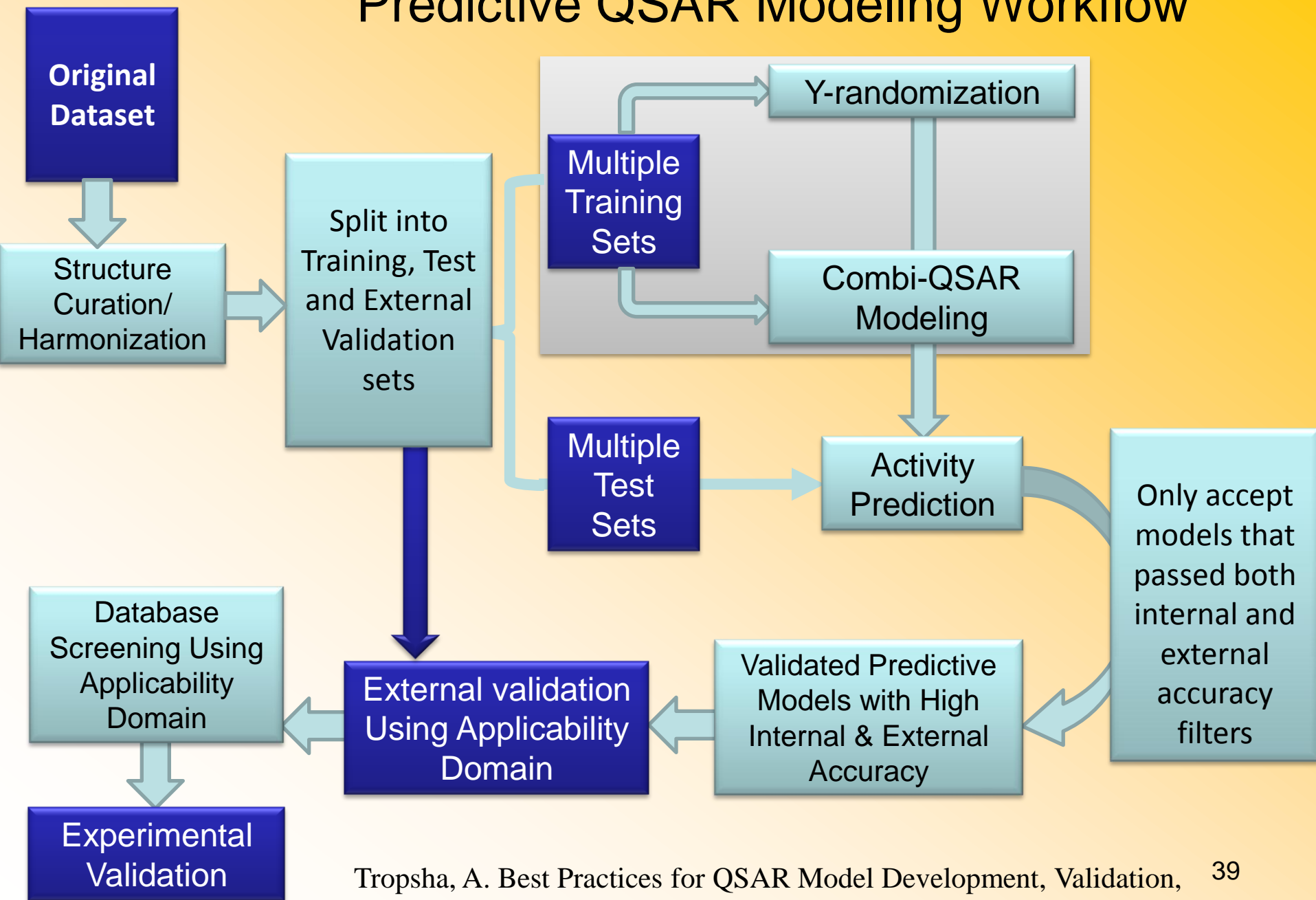
Data Pre-treatment

Carbon nanotubes with killing percentage between 0.95 and 1.05 were removed prior to modeling



38 toxic and 35 non-toxic nanoparticles were used to build models

Predictive QSAR Modeling Workflow*



Combinatorial QSAR Models

5-Fold External Cross-Validation

		kNN- Dragon	SVM- Dragon	RF-Dragon	kNN-MOE	SVM-MOE	RF-MOE
Fold0	Sens.(%)	88	88	88	88	88	88
	Spec.(%)	50	67	50	50	50	50
	CCR(%)	69	78	69	69	69	69
Fold1	Sens.(%)	80	80	100	80	80	80
	Spec.(%)	56	67	56	44	44	56
	CCR(%)	68	74	78	62	62	68
Fold2	Sens.(%)	71	71	71	57	57	57
	Spec.(%)	71	71	86	71	57	71
	CCR(%)	71	71	79	64	57	64
Fold3	Sens.(%)	78	89	100	78	67	60
	Spec.(%)	80	80	80	80	80	67
	CCR(%)	79	85	90	79	74	64
Fold4	Sens.(%)	44	67	44	44	33	33
	Spec.(%)	88	88	88	75	75	75
	CCR(%)	66	78	66	60	54	54
Cumulative	Sens.(%)	71	79	79	68	63	63
	Spec.(%)	69	74	69	63	63	63
	CCR(%)	70	77	74	66	63	63

Sens.: Sensitivity; Spec.: Specificity; CCR: Correct Classification Rate.

Summary

- ❖ Carbon nanotubes are bio-active entities. They can potentially activate cellular signaling pathways and cause in vivo toxicity.
- ❖ Surface nano-combinatorial chemistry modifications on NPs can effectively modulate its bio-activities to evade interactions with proteins or cells.
- ❖ QSAR modeling has been used to rationalize data. Models (with external predictive accuracy as high as 77%) will be used to guide the design of functional and non-toxic carbon nanotubes.