

# Biology through the Mathematics microscope: new exciting directions of research

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Prospects in Mathematics, 10 January 2009, Durham

## What is Mathematical Biology?

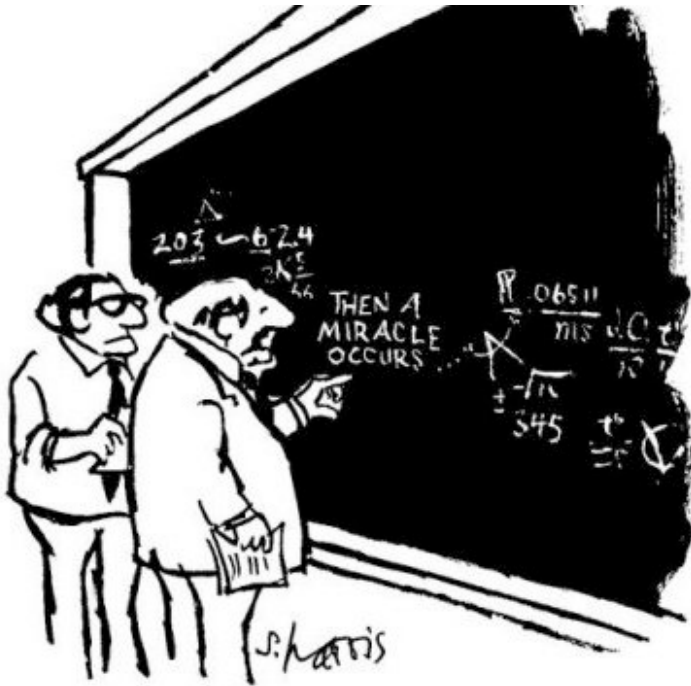
- Application of mathematical modelling to solve problems in biology
- One of the fastest growing research areas in mathematics
- Contributes significantly to our understanding of the biological world
- Produces new mathematical questions

## Biologists...

- deal with 'single problems'
- have intuitive approach to problems
- have excellent technology at their disposal
- can be intimidated by mathematicians

## Mathematicians...

- look for generalisations
- use 'noddy' approaches bearing little relevance to the real situation in Biology
- use very brushstroke approaches not specific enough for Biology



"I THINK YOU SHOULD BE MORE EXPLICIT HERE IN STEP TWO."

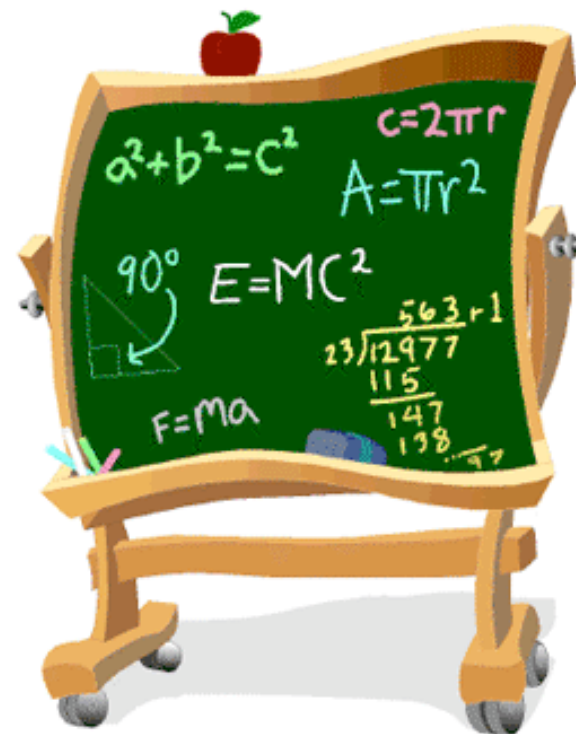
## Some specific biological problems where new mathematical approaches are needed:

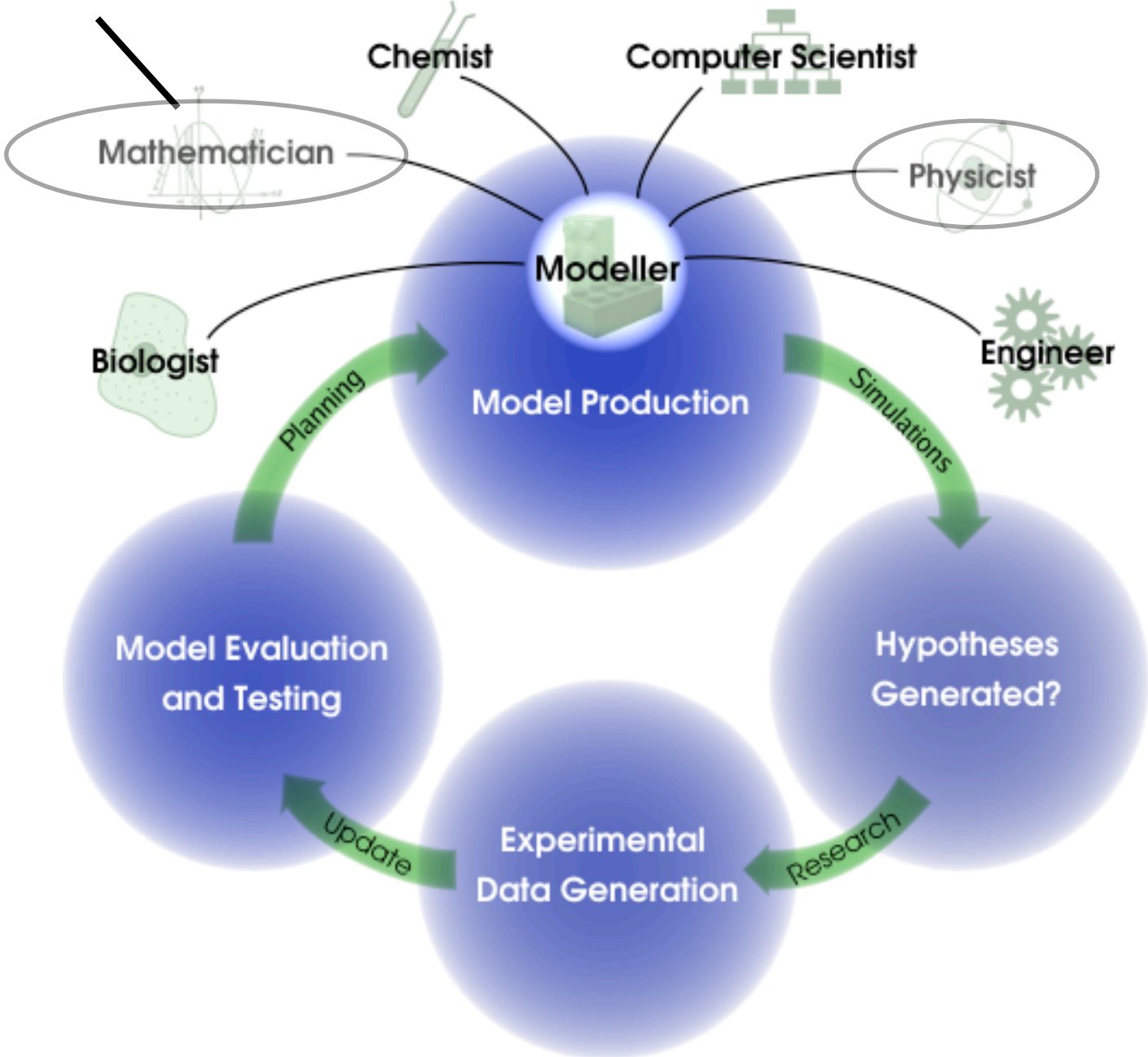
- Cell Signalling
- Reaction - diffusion in cells
- Modelling kinetics
- Spatio-temporal issues in cells
- Self-assembly
- Hierarchy of scales, deterministic vs stochastic
- Cell processes e.g. dynamics of microtubules
- Huge amounts of messy biological data which needs very good statistical methods (data integration that you can have confidence in)
- Neural networks
- Protein structure and folding - conformational changes in viruses
- Mapping phenotype to genotype

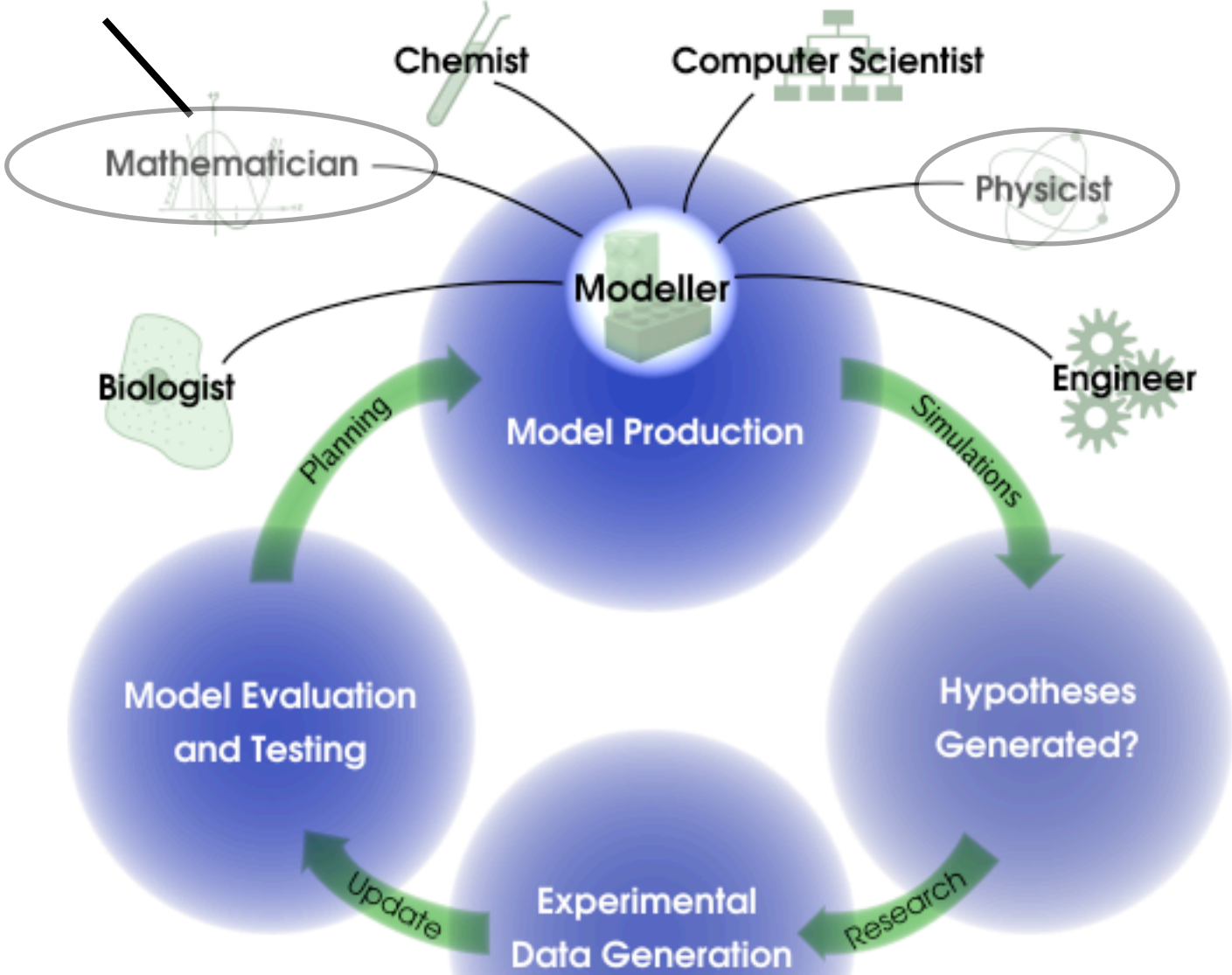
# New Mathematics?



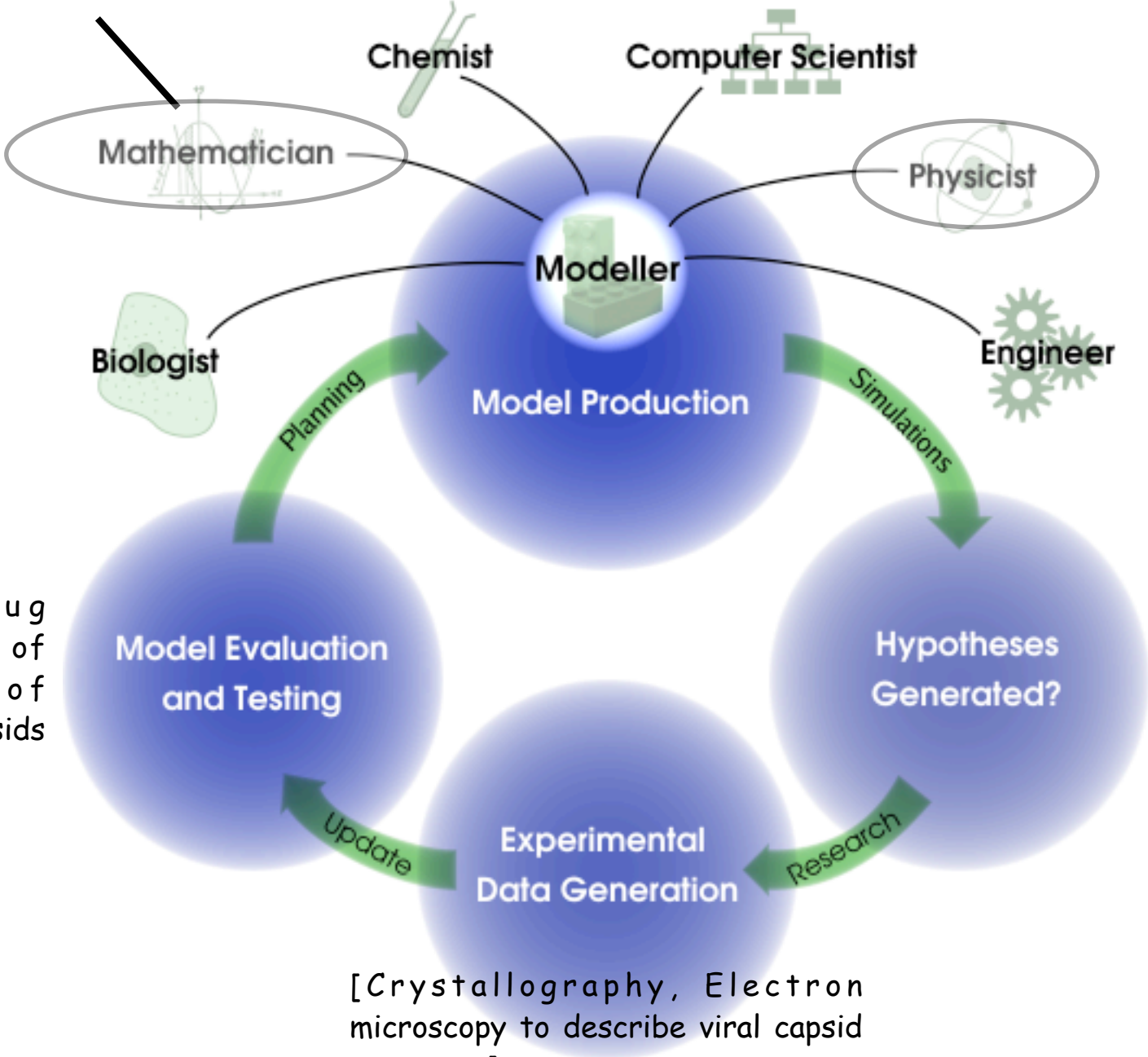
- **Brand new** maths inspired by a biological problem
- **Surprising maths** - using existing maths techniques you would never expect to be appropriate or relevant, or adapting maths techniques to the scales involved in biology.







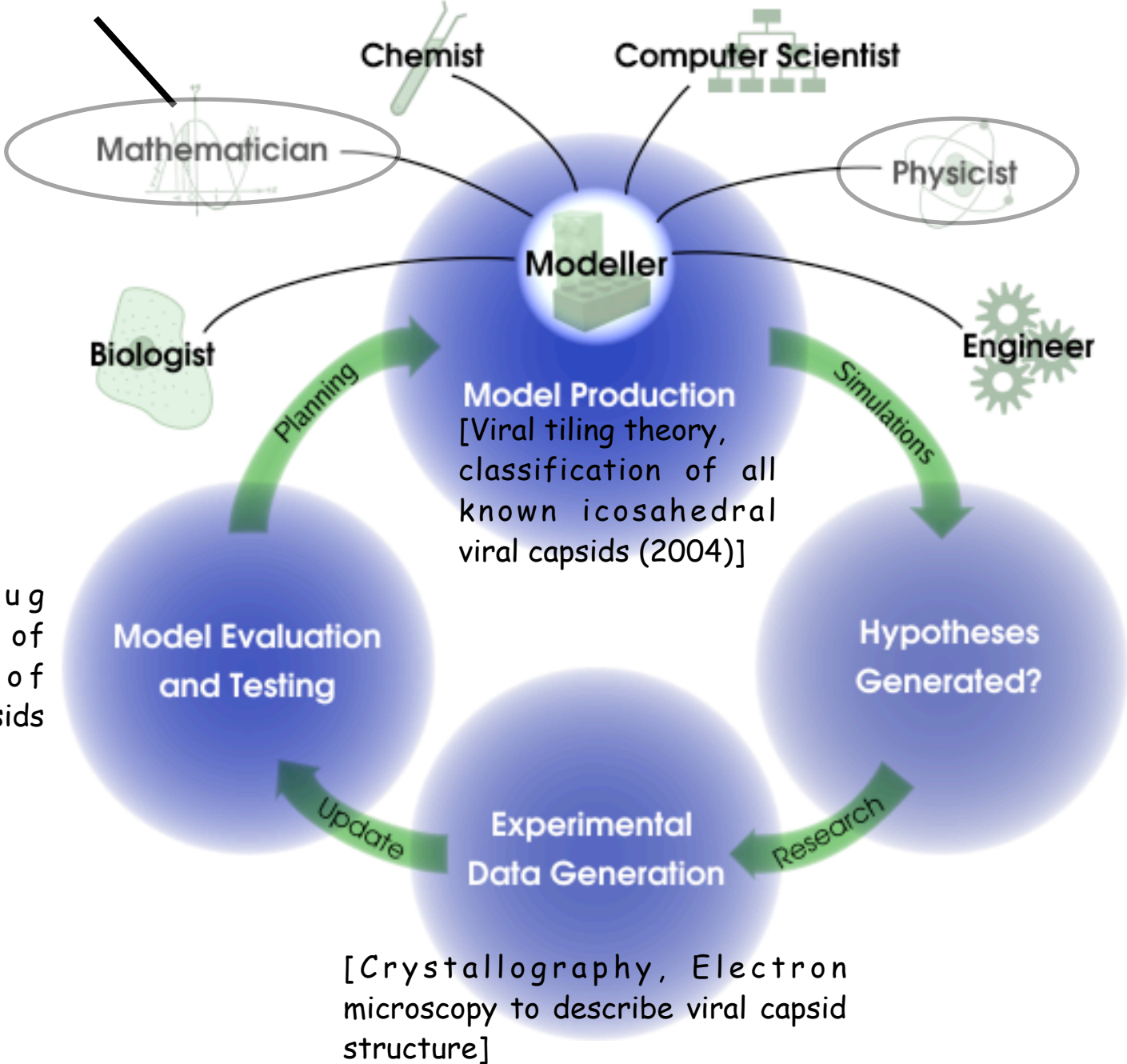
[Crystallography, Electron microscopy to describe viral capsid structure]



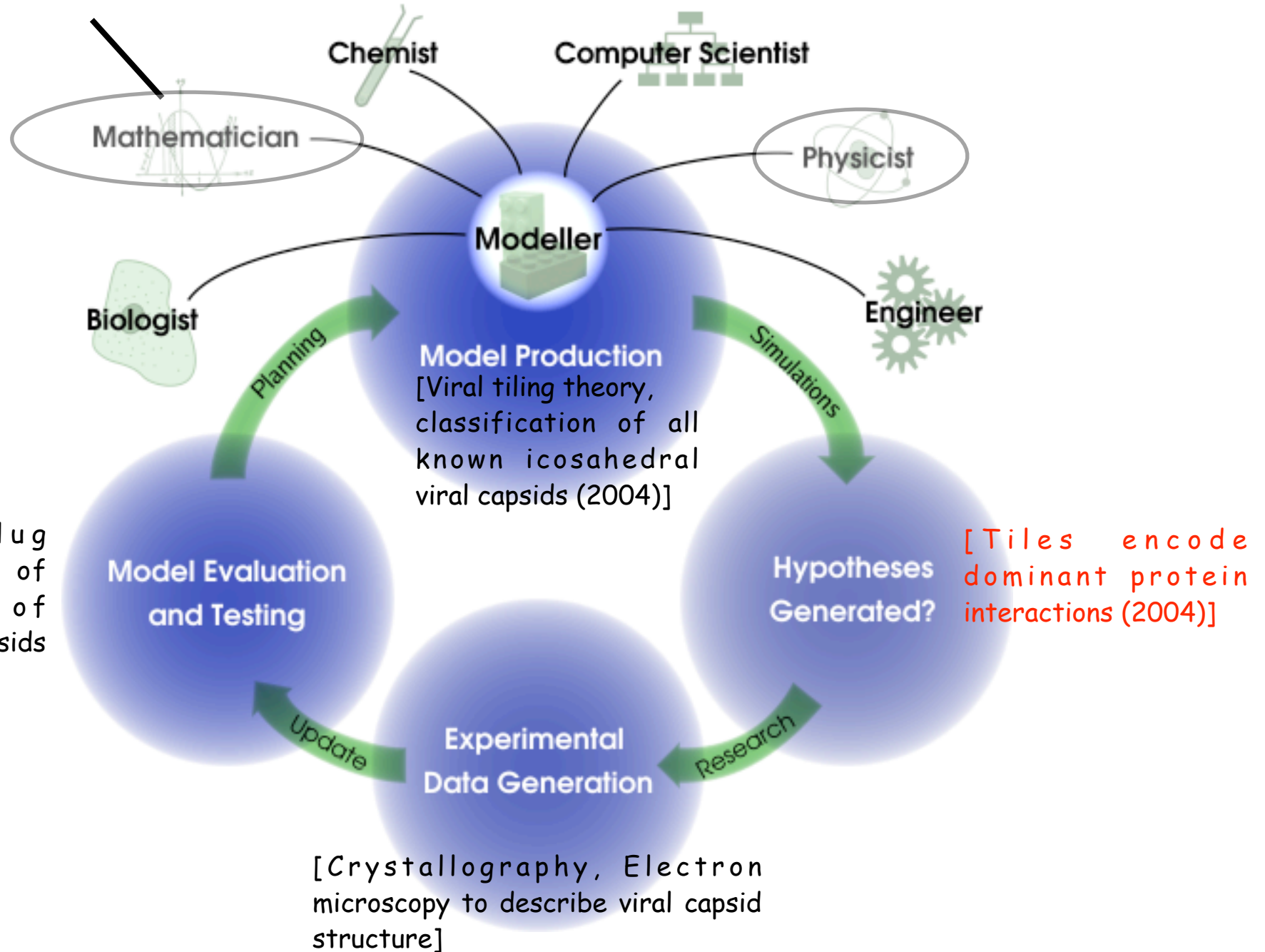
[Kaspar-Klug classification of main class of icosahedral capsids (1962)]

[Crystallography, Electron microscopy to describe viral capsid structure]





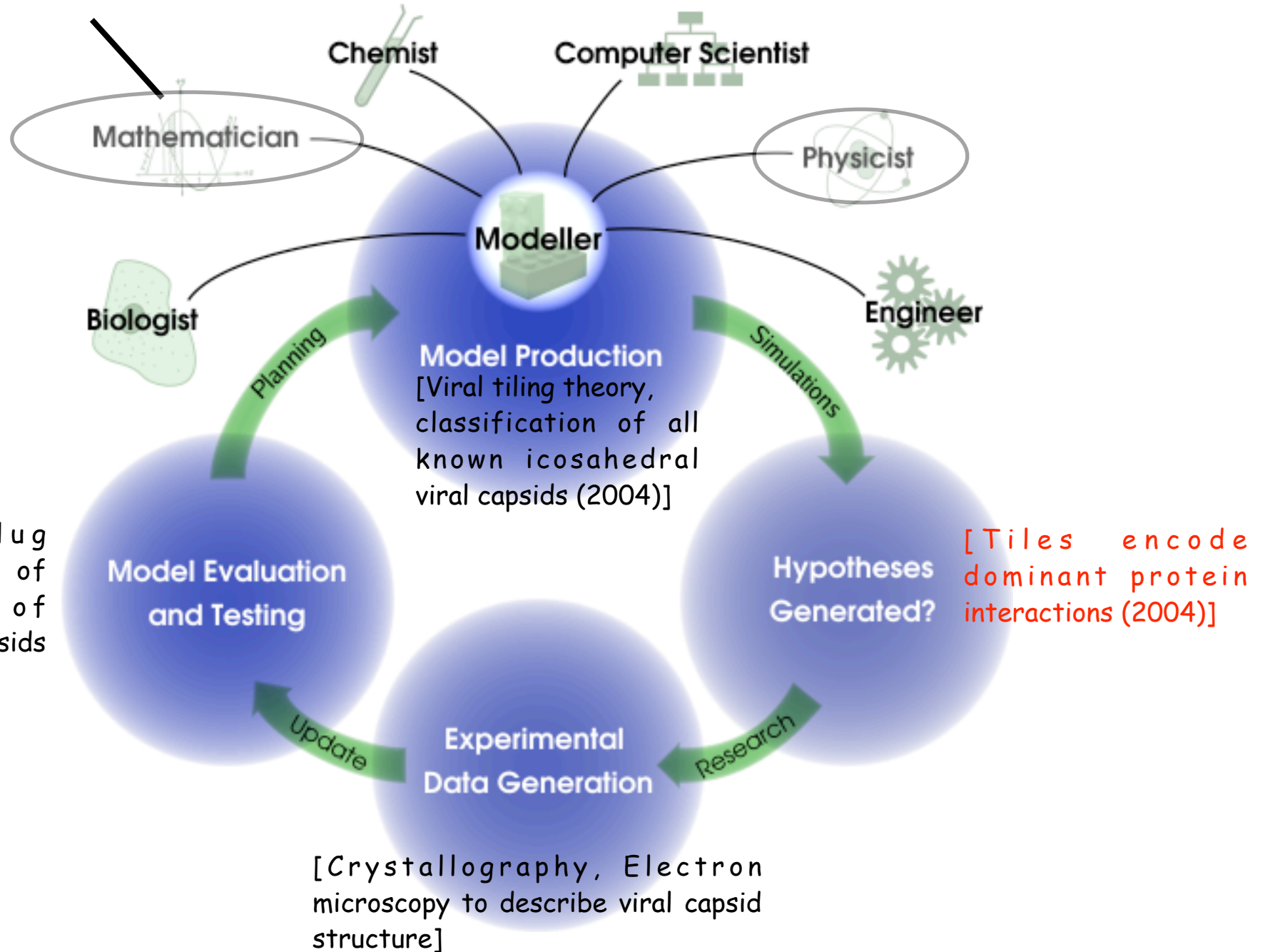




# New Maths

[Affine non-crystallographic Coxeter groups]

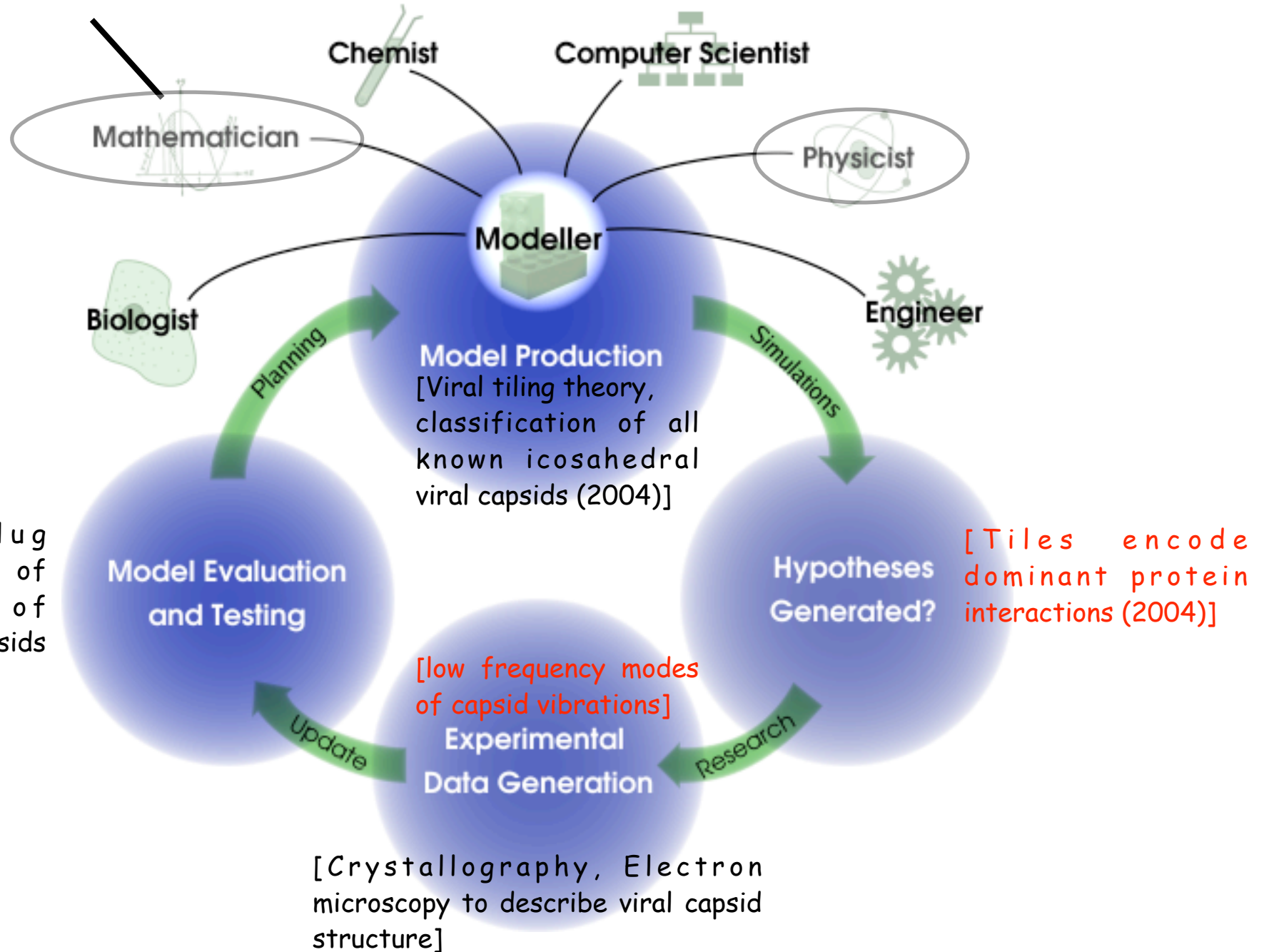
# Integrative biology



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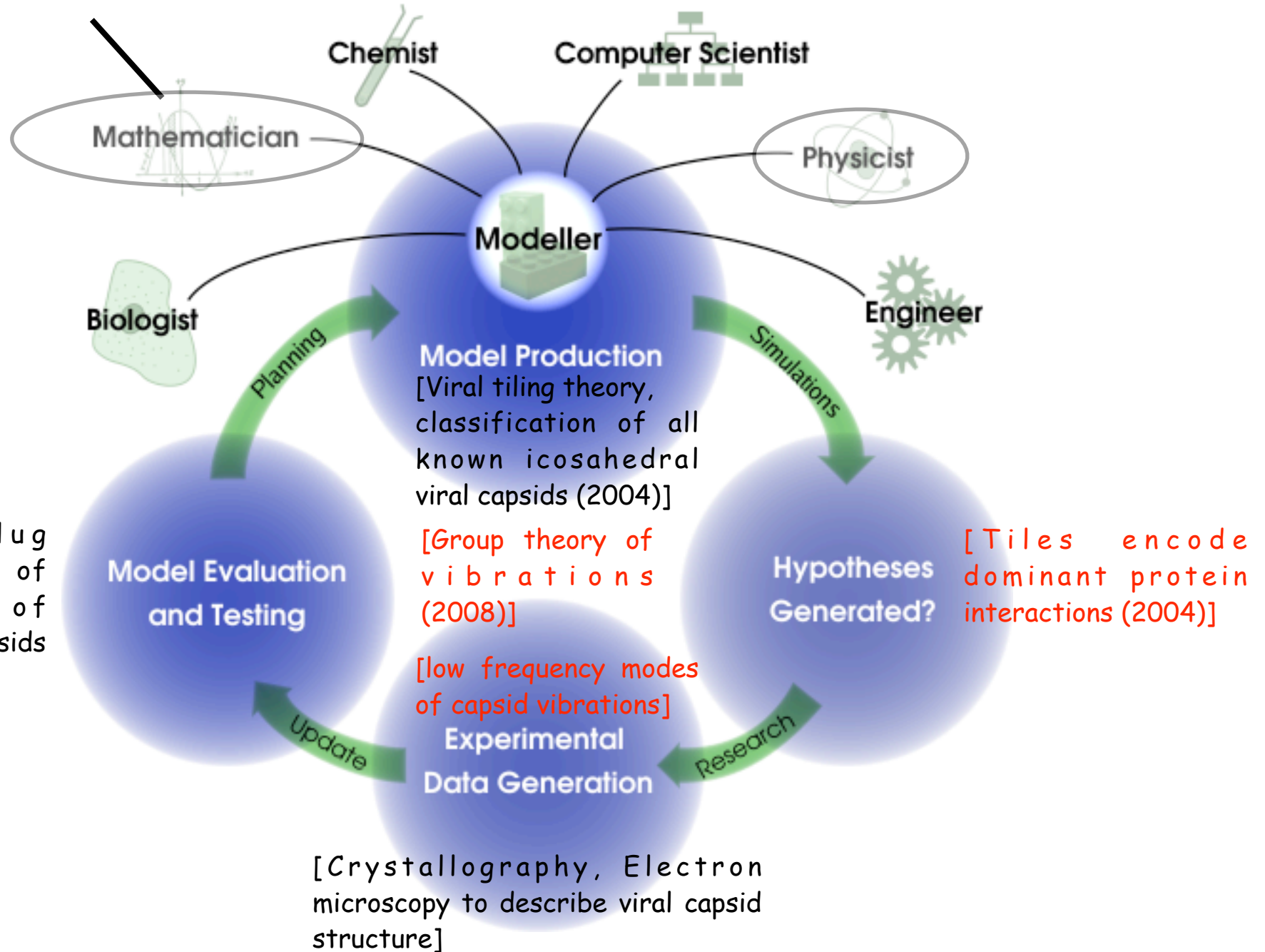
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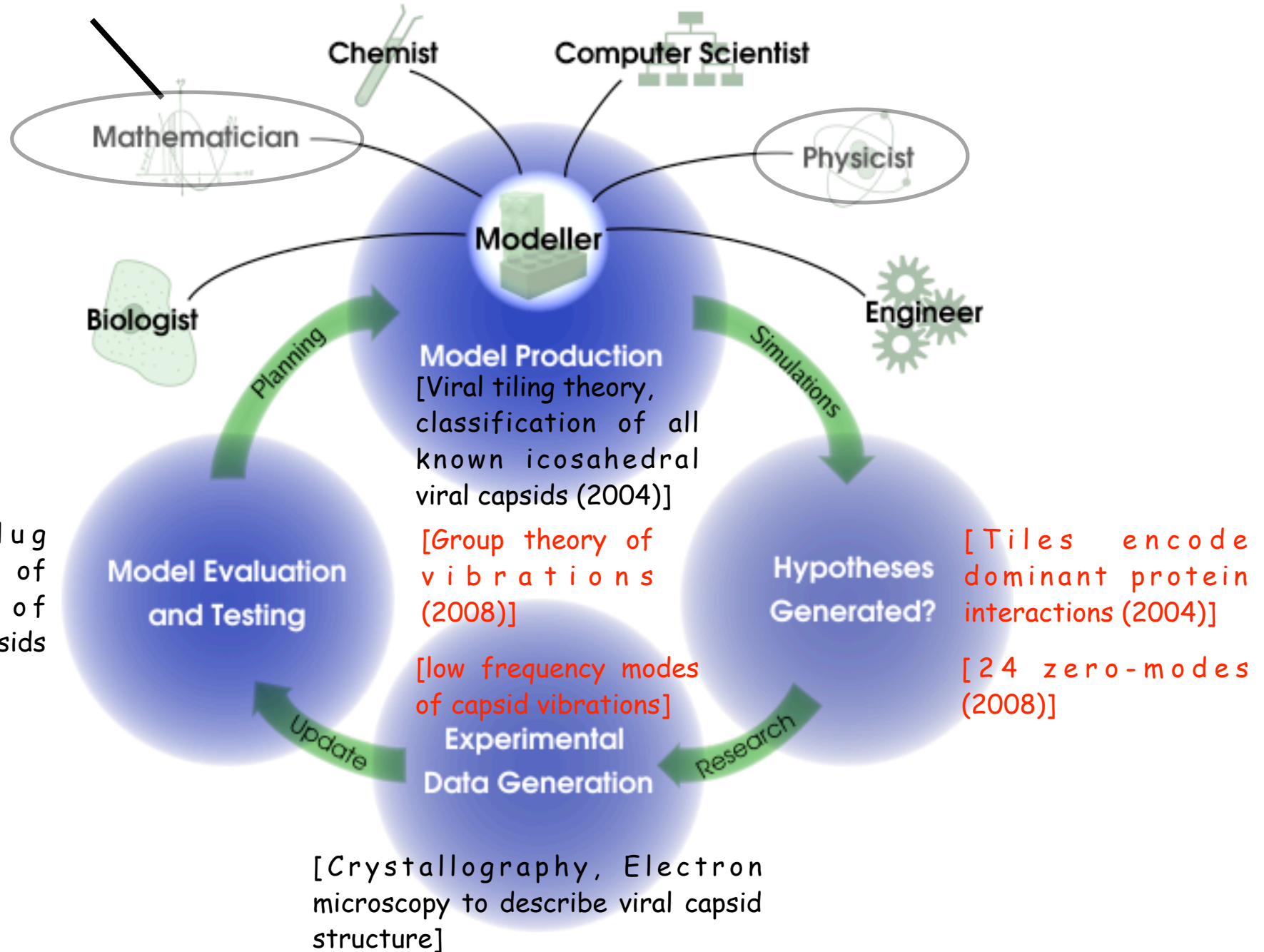




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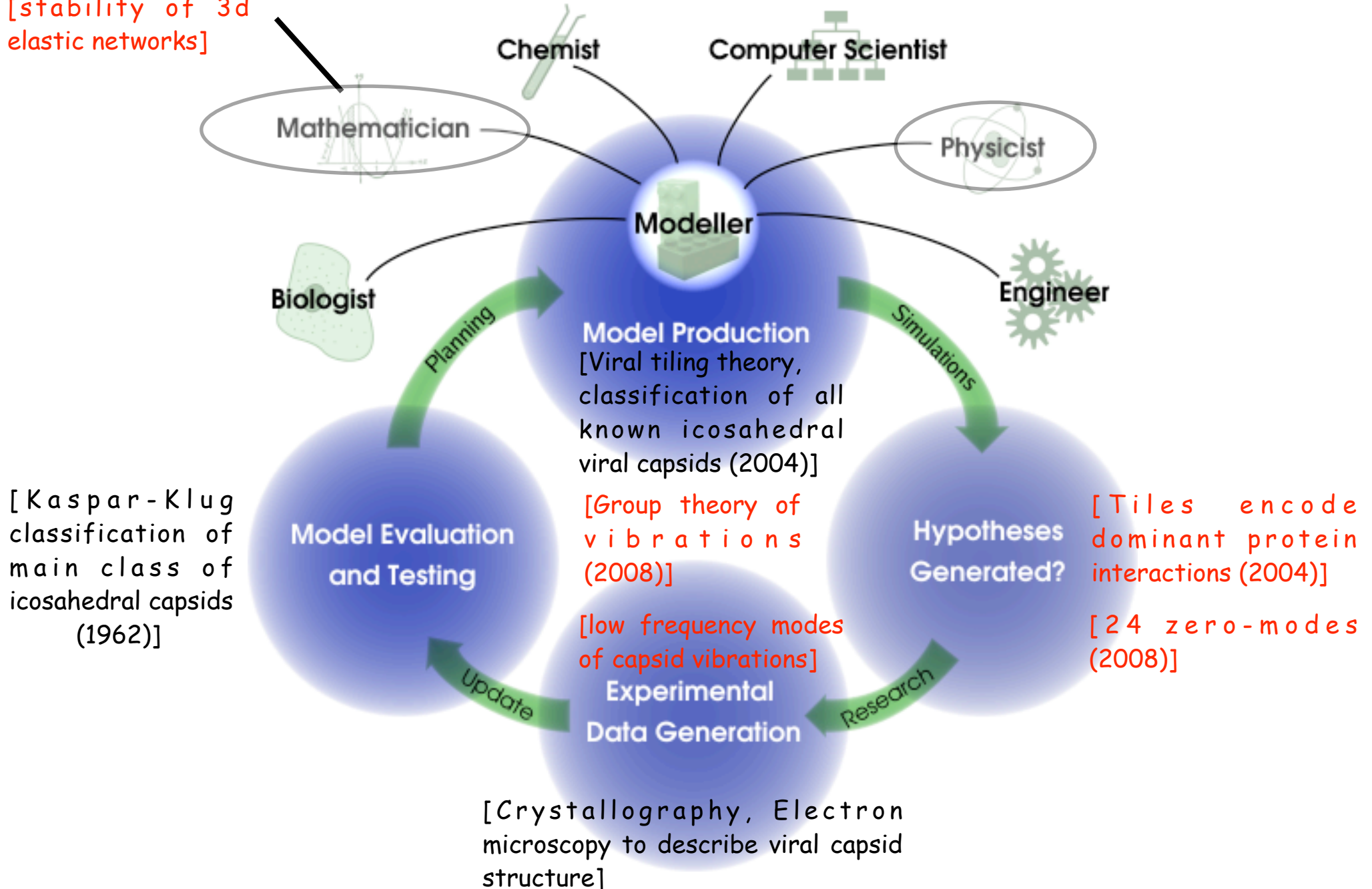


# New Maths

[Affine non-crystallographic Coxeter groups]

[stability of 3d elastic networks]

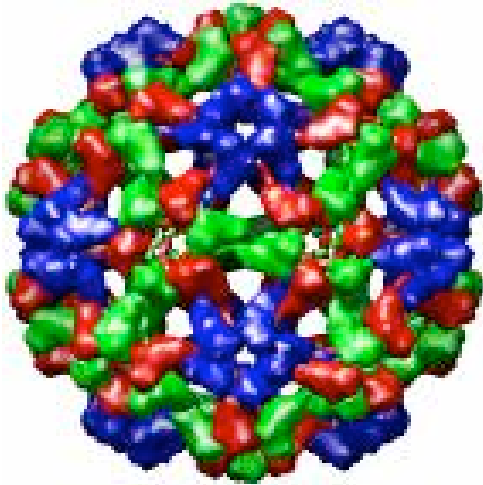
# Integrative biology





**Surprising Maths:** classification of icosahedral viral capsids

# Surprising maths: classification of icosahedral viral capsids



computer model based on crystallographic data

pentamer = cluster of 5 proteins (12)

hexamer = cluster of 6 proteins (3 + 3) (20)

chlorotic cowpea mottle virus  
(ccmv)

$$\text{number of proteins on capsid: } 5 \times 12 + 6 \times 20 = 180$$

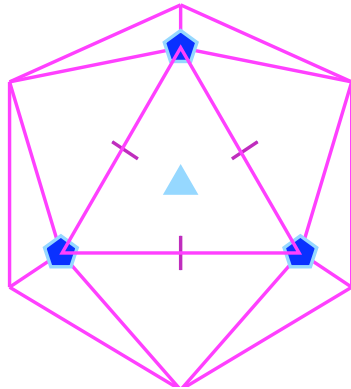


number of 'faces'

number of vertices

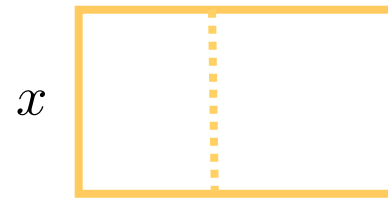
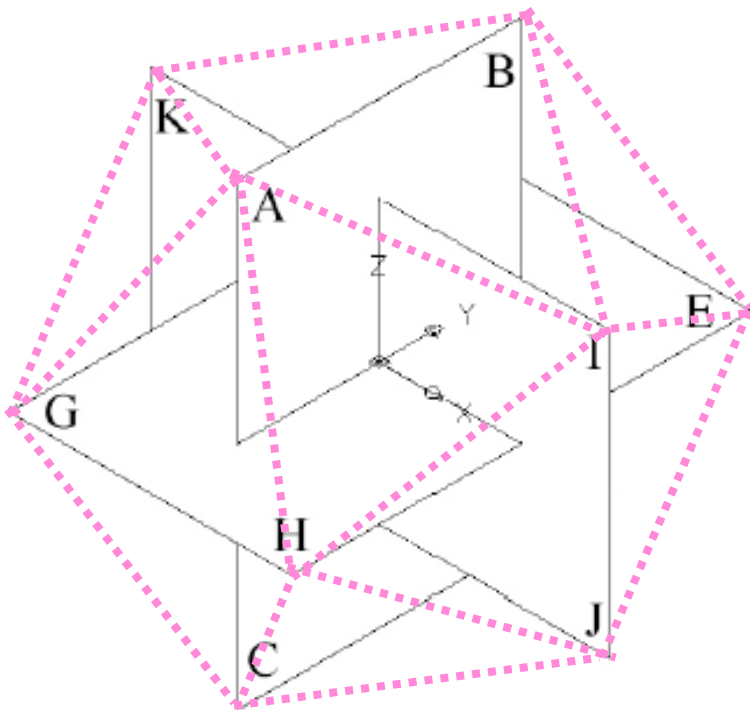
# Golden rectangles and icosahedra

The icosahedron is a Platonic solid with 20 triangular faces and 12 vertices



- 2-fold symmetry axis (15 axes)
- ▲ 3-fold symmetry axis (10 axes)
- ◆ 5-fold symmetry axis (6 axes)

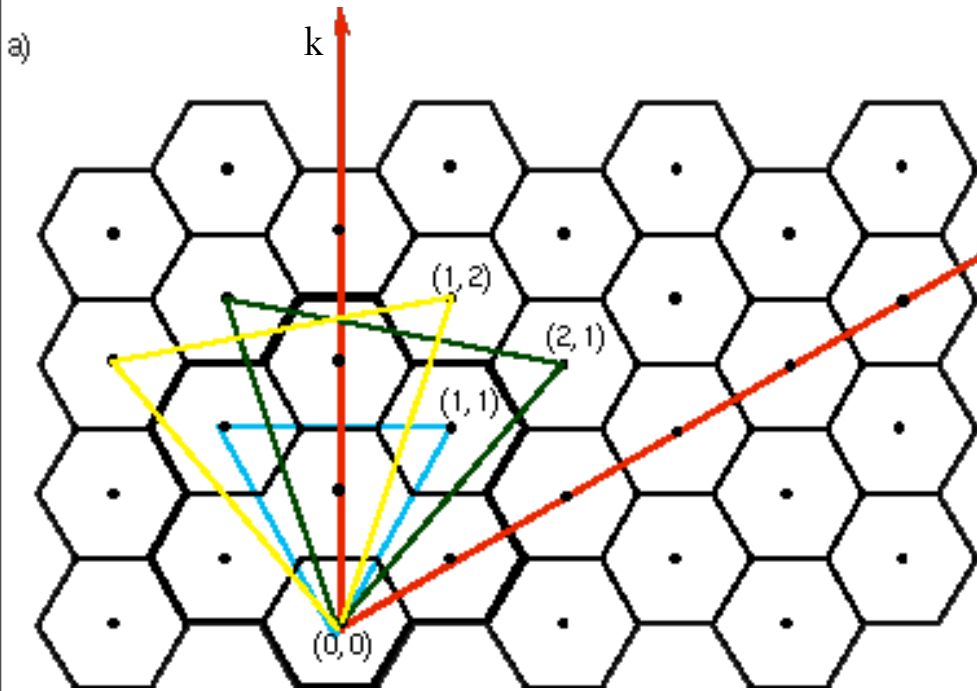
Golden ratio :  $\tau = \frac{1}{2}(1 + \sqrt{5})$



$$\frac{\text{length}}{\text{width}} = \frac{1}{x} = \frac{x}{1-x} \equiv \tau = \text{golden ratio}$$

↓  
Defining property

# Caspar-Klug classification

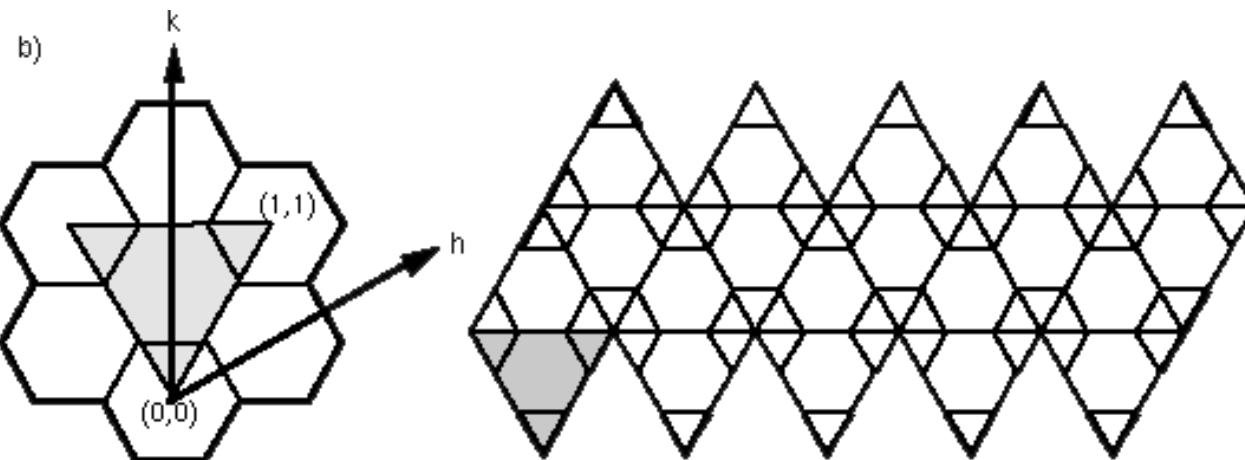
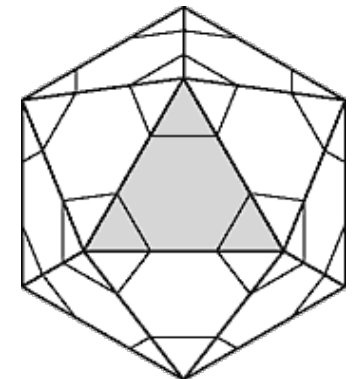


$$T = h^2 + hk + k^2, \quad h, k \in \mathbb{N} \cup \{0\}$$

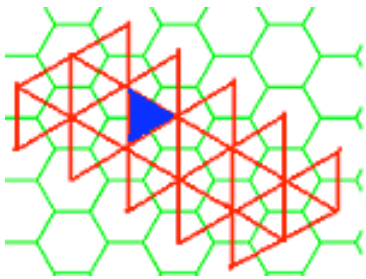
$$T = 1, 3, 4, 7, 9, 12, 13, \dots$$

global 3-fold symmetry axis or  
local 6-fold symmetry axis

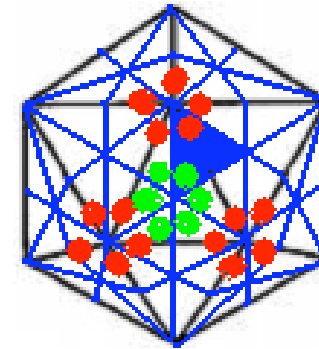
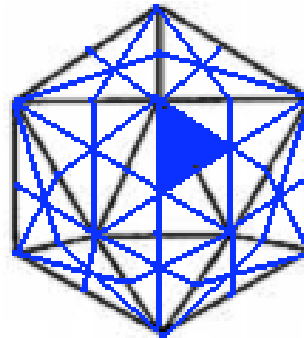
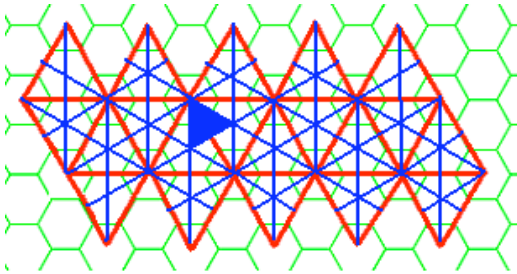
example:  $T=3$  ( $h=k=1$ ) buckyball



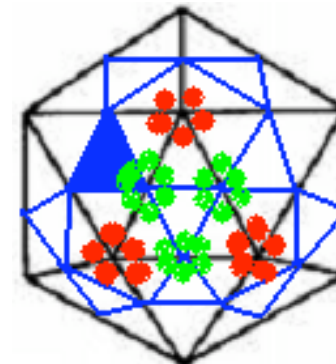
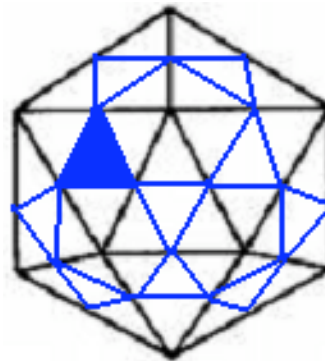
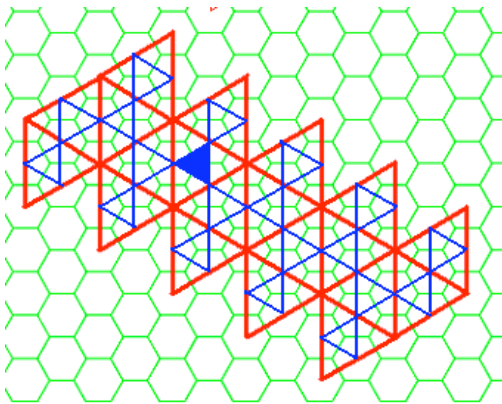
# The surface lattices ( Caspar-Klug classification)



12 pentagonal clusters  
 $T=1$



12 pentagonal clusters  
20 hexagonal clusters  
 $T=3$

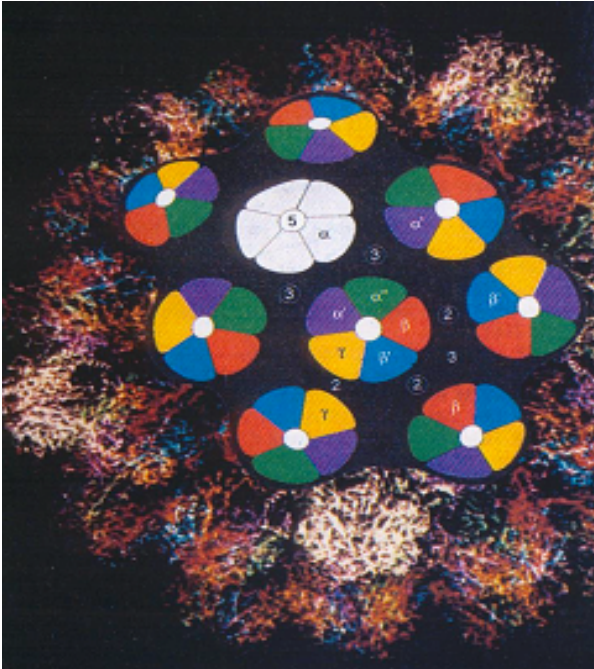


12 pentagonal clusters  
30 hexagonal clusters  
 $T=4$

Viruses following the predicted surface lattices have **subsequently been discovered experimentally.**

# However...

Not all viruses follow these predictions



Rayment et al. (Nature, 1982) and Liddington et al. (Nature, 1991) observe a virus with 72 pentamers

Example:

**Cancer-causing viruses, such as Human Papilloma virus.**

It causes cervical cancer which represents 10% of all cancers in women

**All clusters are pentamers, meaning:**

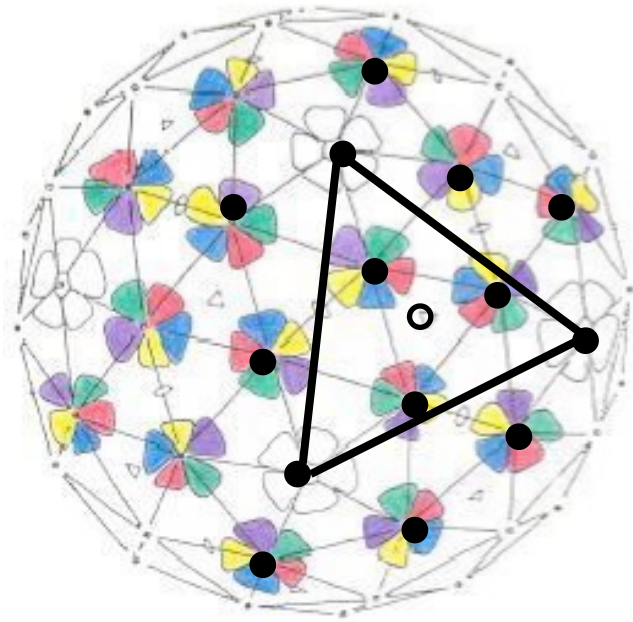
- 1. existence of local 5-fold symmetry axes**
- 2. they can not be modelled via hexagonal lattices**



# Adapted maths: Viral Tiling Theory

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Puzzle of all-pentamer viruses like SV40



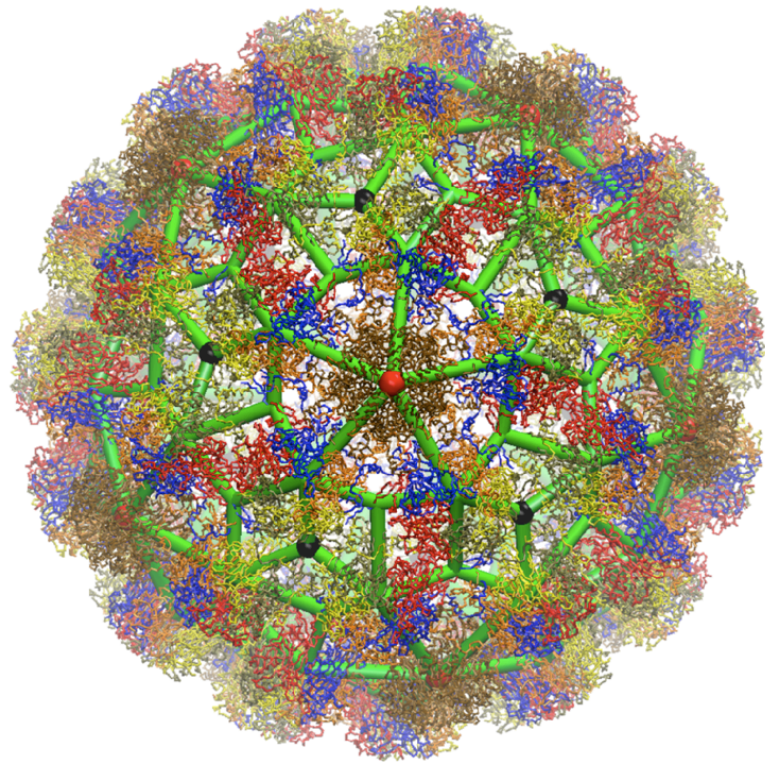
Patera and Twarock, 2002

Twarock, 2004

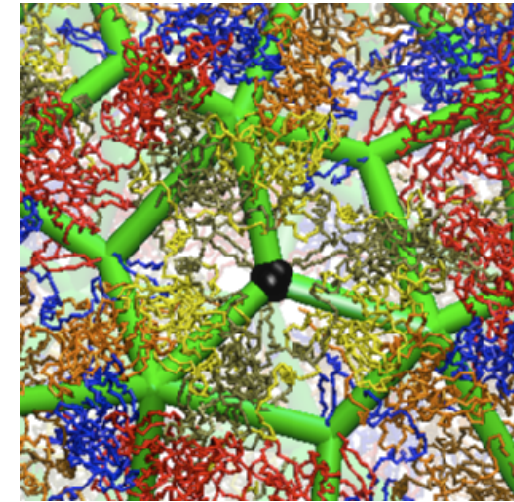
Technique providing fragments of  
aperiodic tilings

# Tiling of SV40: Rhombs and kites

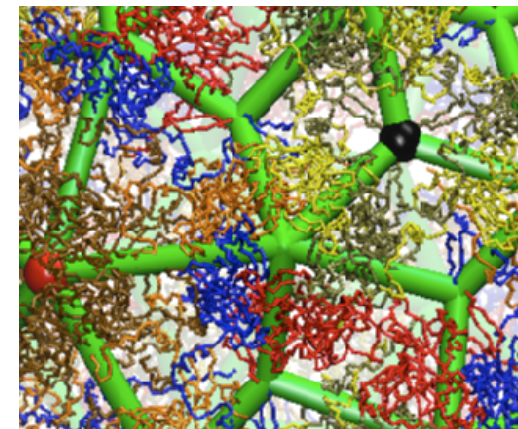
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5-fold axis



3-fold axis



Pentamer not located at 5-fold axis

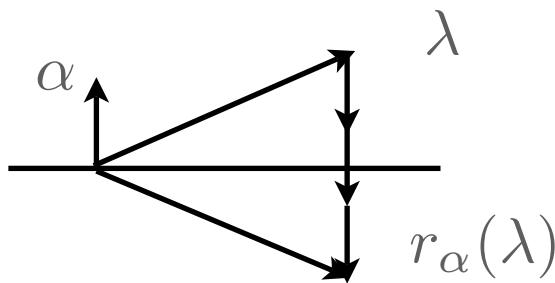
# New Maths: 3d implications of non-crystallographic properties

# Finite crystallographic vs non-crystallographic Coxeter groups

- Finite crystallographic Coxeter groups
- Weyl groups associated with simple Lie algebras (Ex:  $W(A_2)$  of order 6)

- generated by reflections

$$r_\alpha \lambda = \lambda - 2 \frac{(\lambda, \alpha)}{(\alpha, \alpha)} \alpha, \quad 2 \frac{(\lambda, \alpha)}{(\alpha, \alpha)} \in \mathbb{Z}$$



- admit a unique affine extension (infinite-dim)
- root lattice generated via translation by the highest root and reflections

- Finite non-crystallographic Coxeter groups

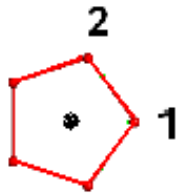
- Symmetry groups of regular polygons with any number of vertices but 2, 3, 4, 6 (Ex:  $H_2$  - pentagons/decagons; order 10);  $H_3$  - icosahedral group, order 120;  $H_4$  - order 14400

- generated by reflections

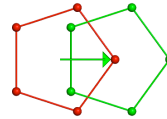
$$2 \frac{(\lambda, \alpha)}{(\alpha, \alpha)} \in \mathbb{Z}[\tau], \quad \tau = \frac{1}{2}(1 + \sqrt{5})$$

- admit a unique affine extension (infinite-dim)
- application of reflections and translation by the highest root produces a dense point set

# Non-dense point sets



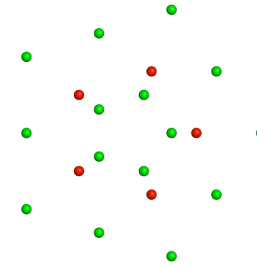
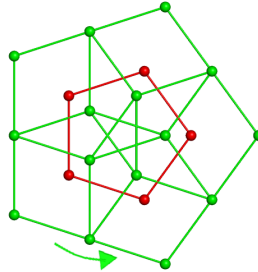
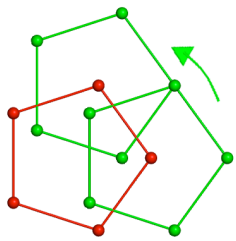
5-fold rotation by 72 degrees, called **R**



a translation called **T**

The extended group contains every possible combination of R and T:

**R**, **RR**, **RRR**, **RRRR**, **T**, **RT**, **RRT**, **RRRT**, etc...



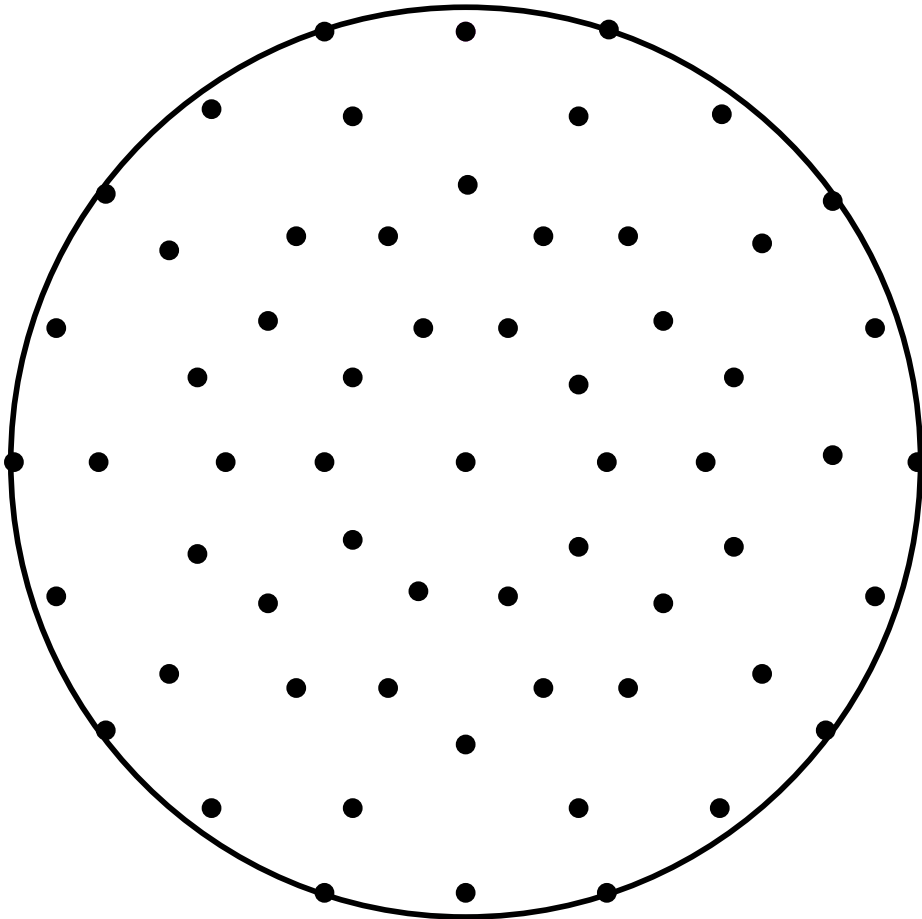
$$Q_2(n) = \{s^m(T, R)O : m \leq n\}, n \in N$$

# Non-dense point sets

Introduce a **cut-off** (T only acts  $n$  times, reflections are unrestricted) to obtain point sets  $S(n)$  that are subsets of the vertex sets of Penrose tilings.

$$Q_2(n) = \{s^m(T, r_{\alpha_1}, r_{\alpha_2})O : m \leq n\} = \left\{ \sum_{\alpha \in \Phi} n_{\alpha} \alpha : n_{\alpha} \in \mathbf{N} \cup \{0\}, \sum_{\alpha \in \Phi} n_{\alpha} \leq n \right\}$$

$n=2$



$$\Phi = \{ \pm \alpha_1, \pm \alpha_2, \pm(\alpha_1 + \tau \alpha_2), \\ \pm(\tau \alpha_1 + \alpha_2), \pm(\tau \alpha_1 + \tau \alpha_2) \}$$

$$\tau^2 = \tau + 1$$

$$\alpha_1 = 1, \alpha_2 = e^{4i\pi/5}$$

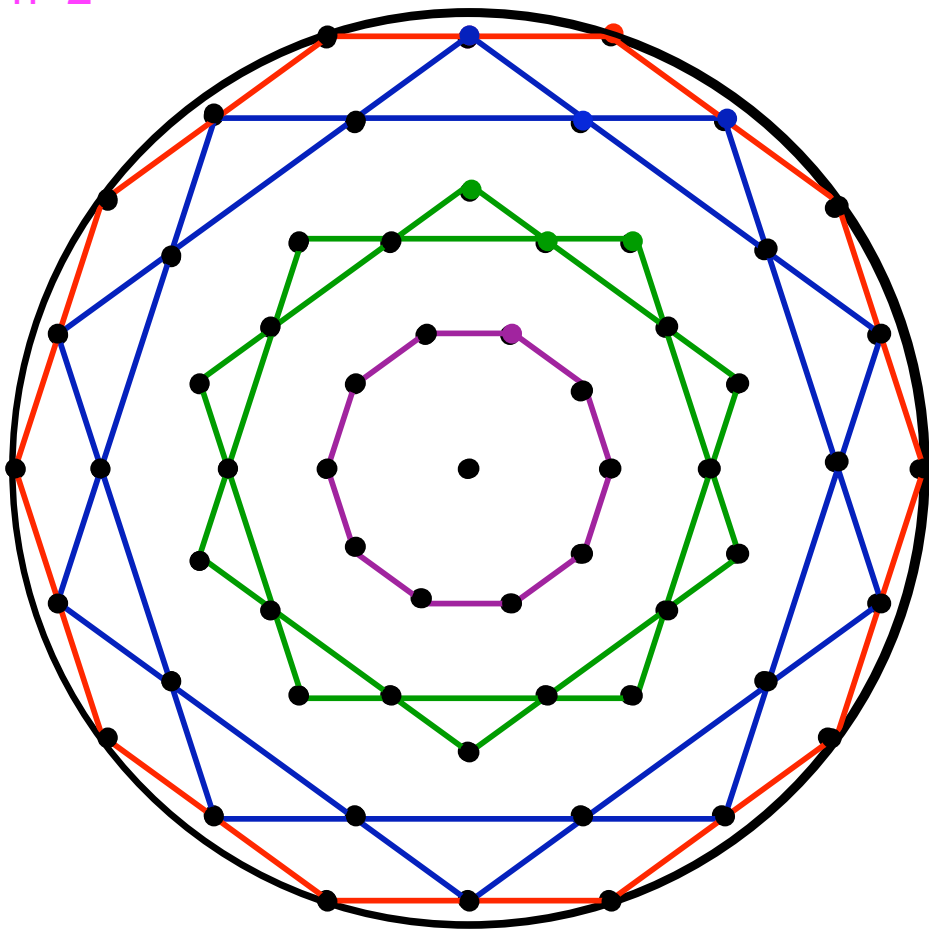


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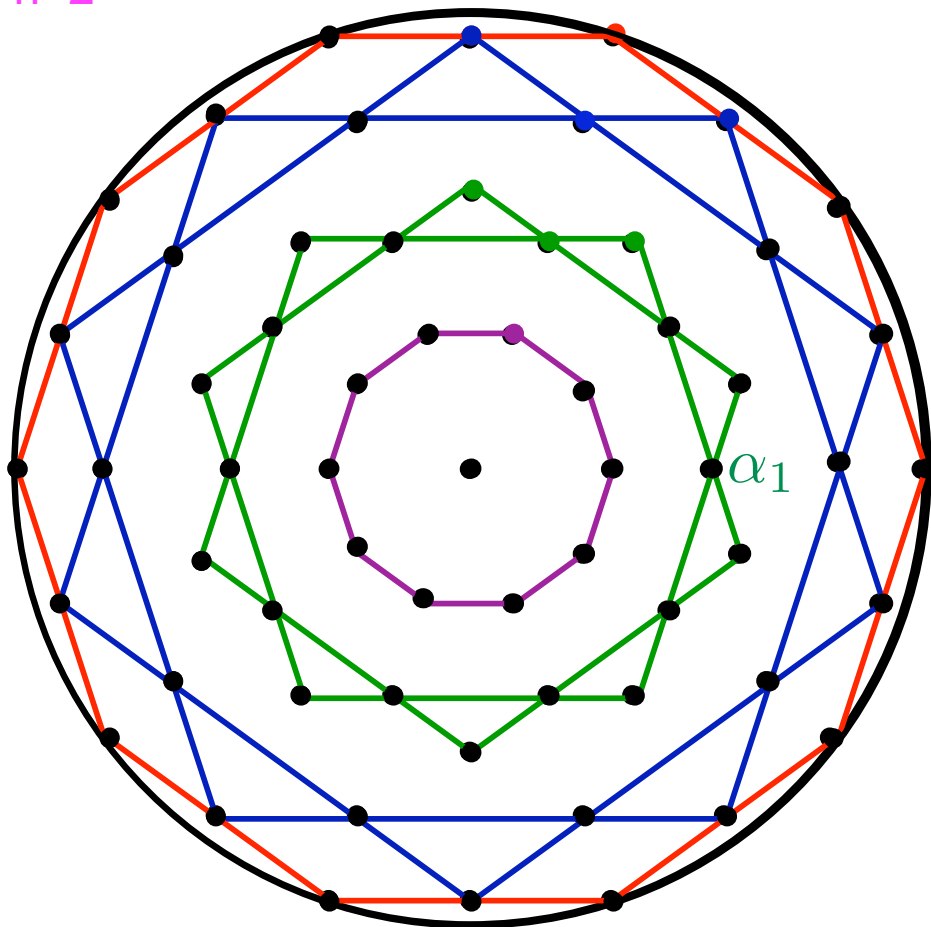
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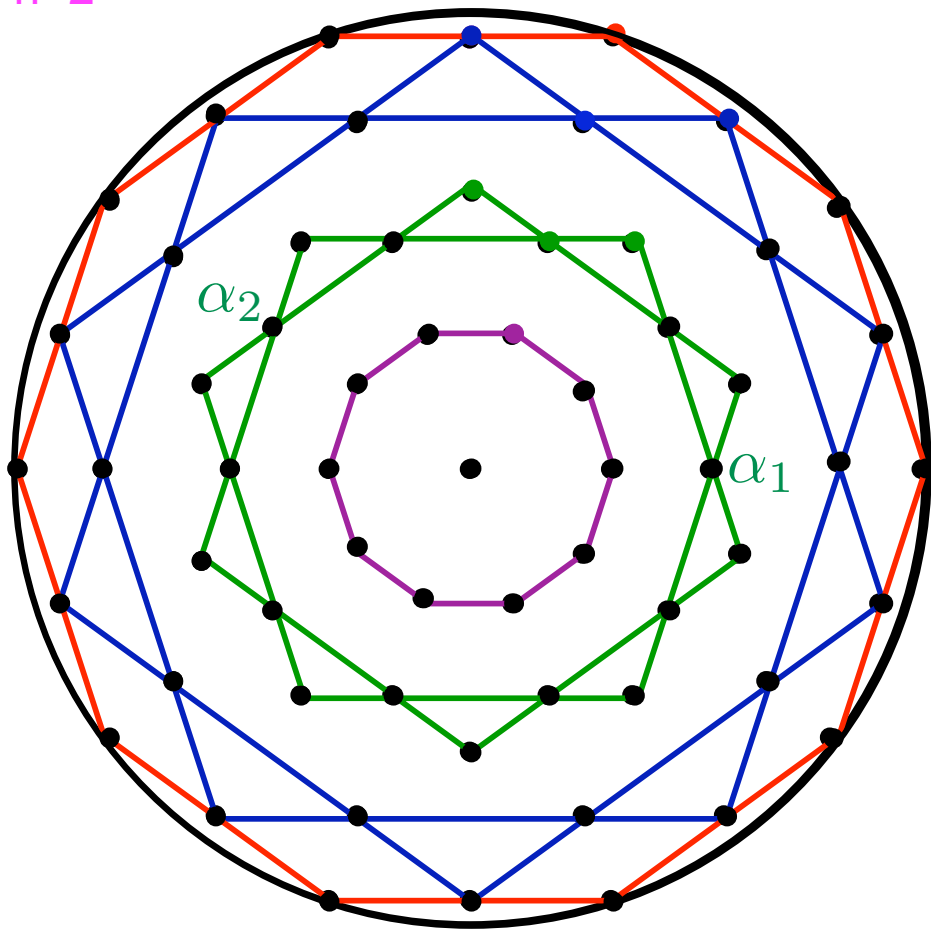
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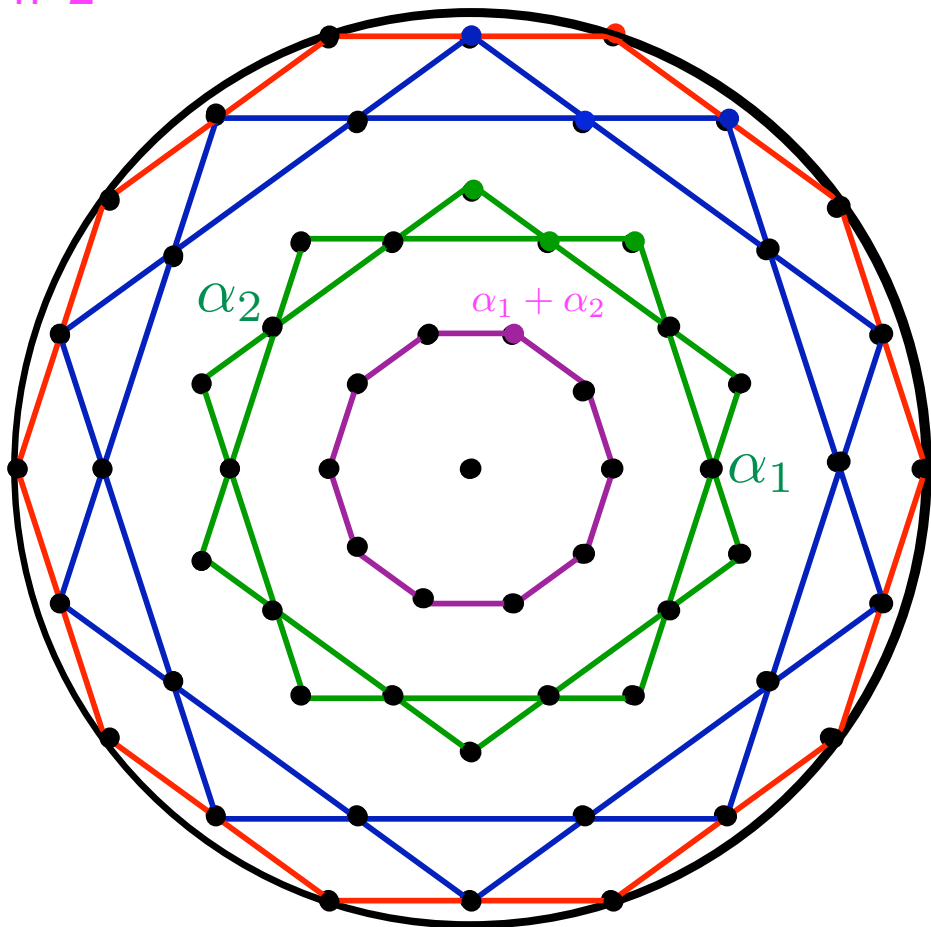
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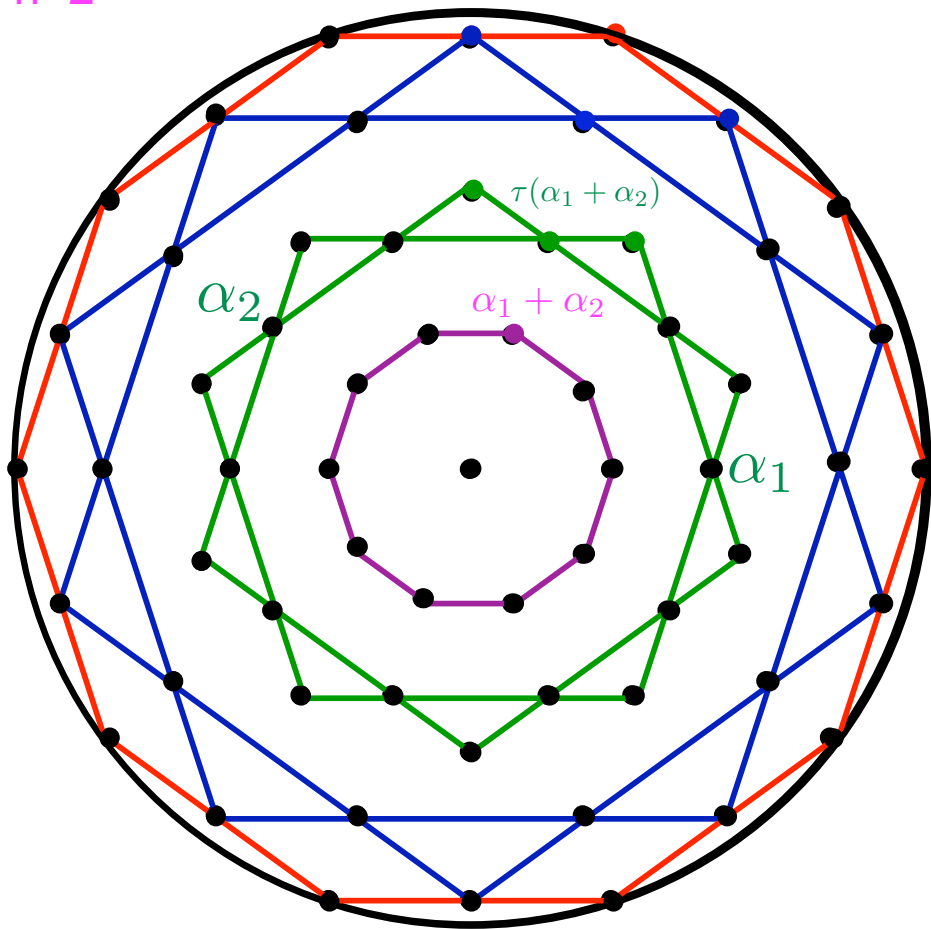
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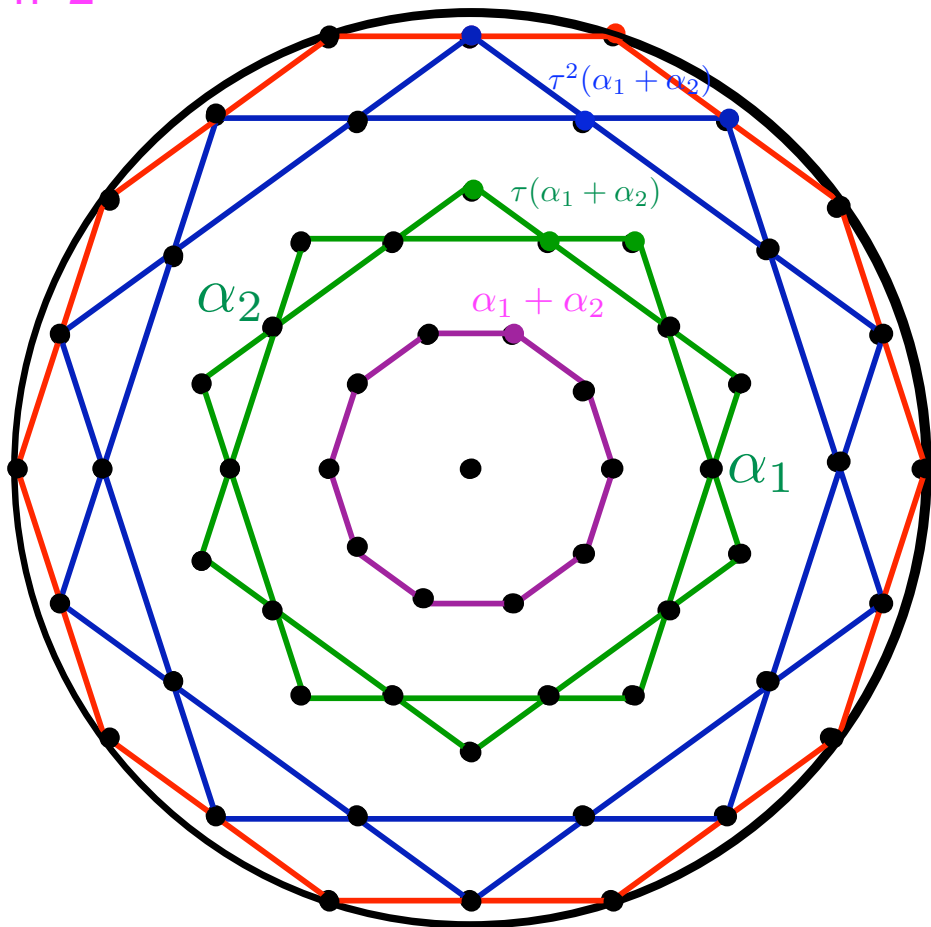
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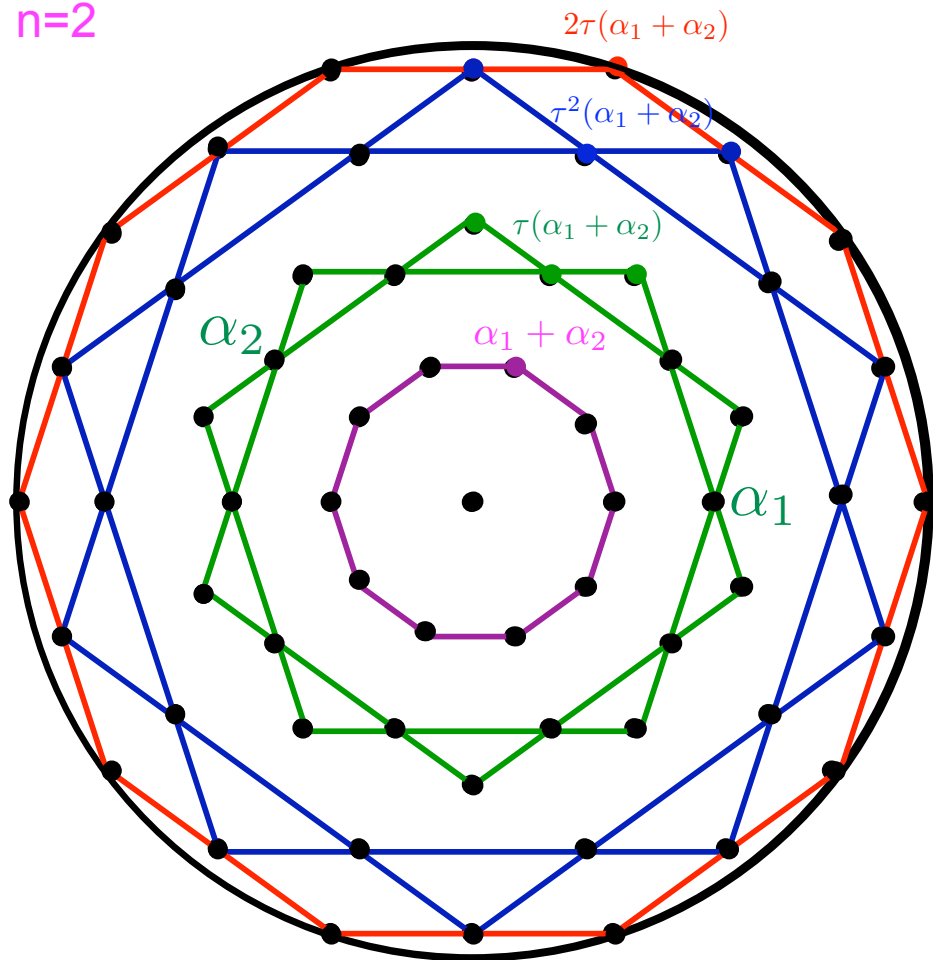
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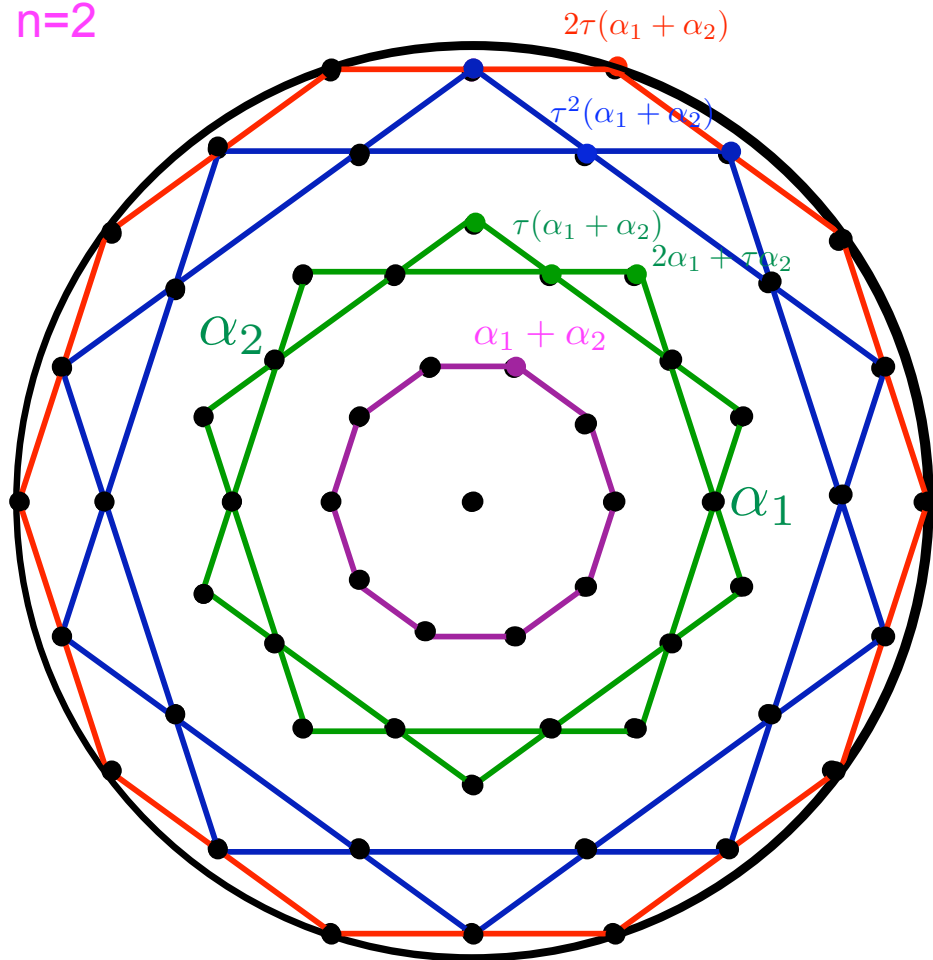


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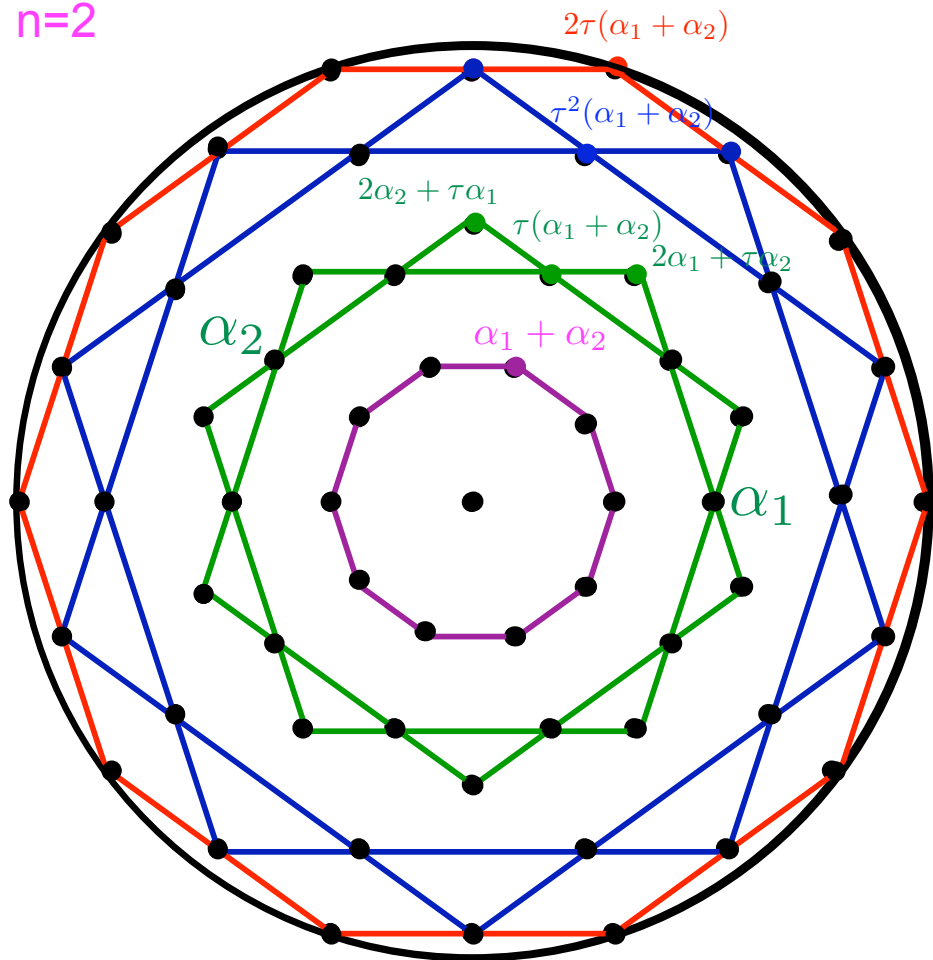
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$$\Phi = \{\pm\alpha_1, \pm\alpha_2, \pm(\alpha_1 + \tau\alpha_2), \pm(\tau\alpha_1 + \alpha_2), \pm(\tau\alpha_1 + \tau\alpha_2)\}$$

$$\tau^2 = \tau + 1$$

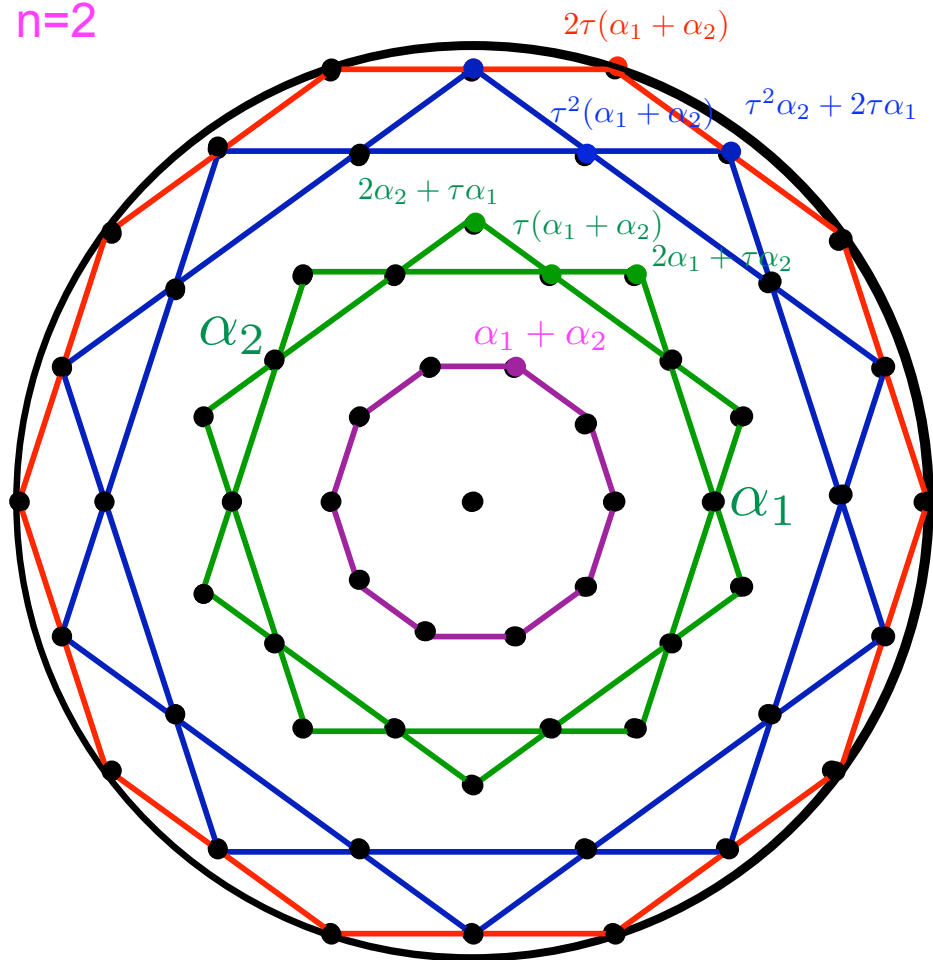
$$\alpha_1 = 1, \alpha_2 = e^{4i\pi/5}$$

# Non-dense point sets

Introduce a **cut-off** (T only acts  $n$  times, reflections are unrestricted) to obtain point sets  $S(n)$  that are subsets of the vertex sets of Penrose tilings.

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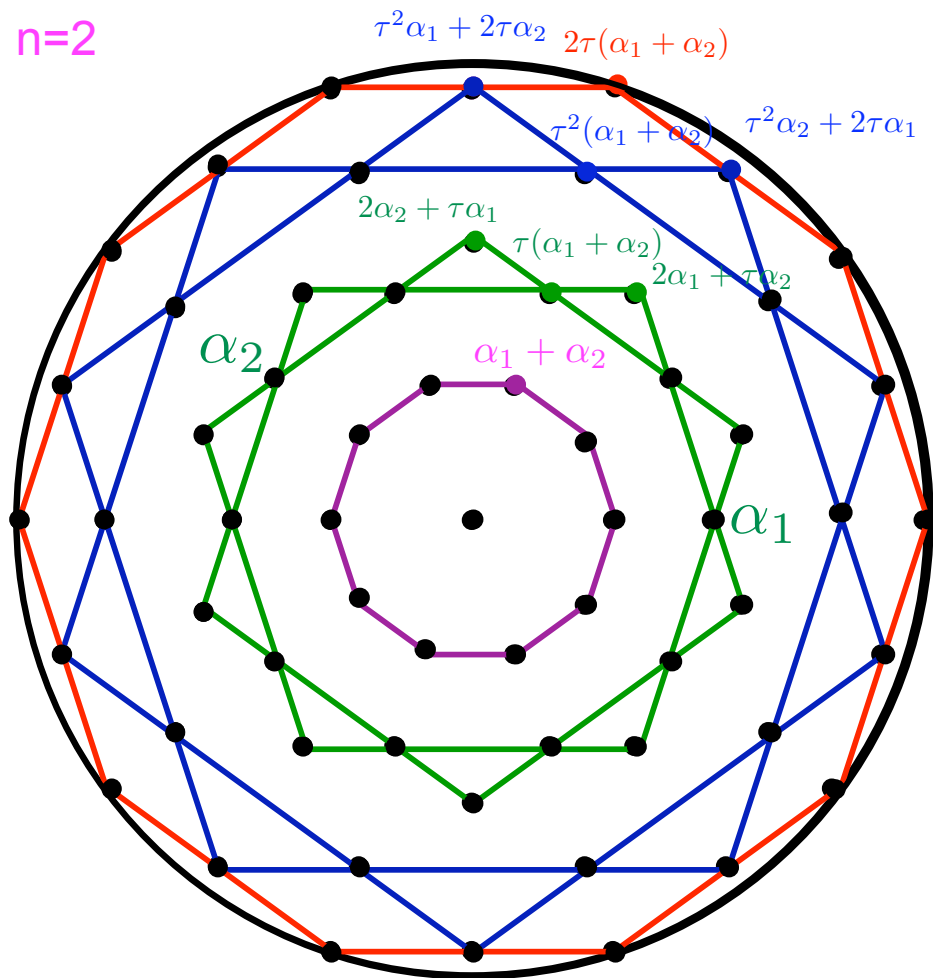
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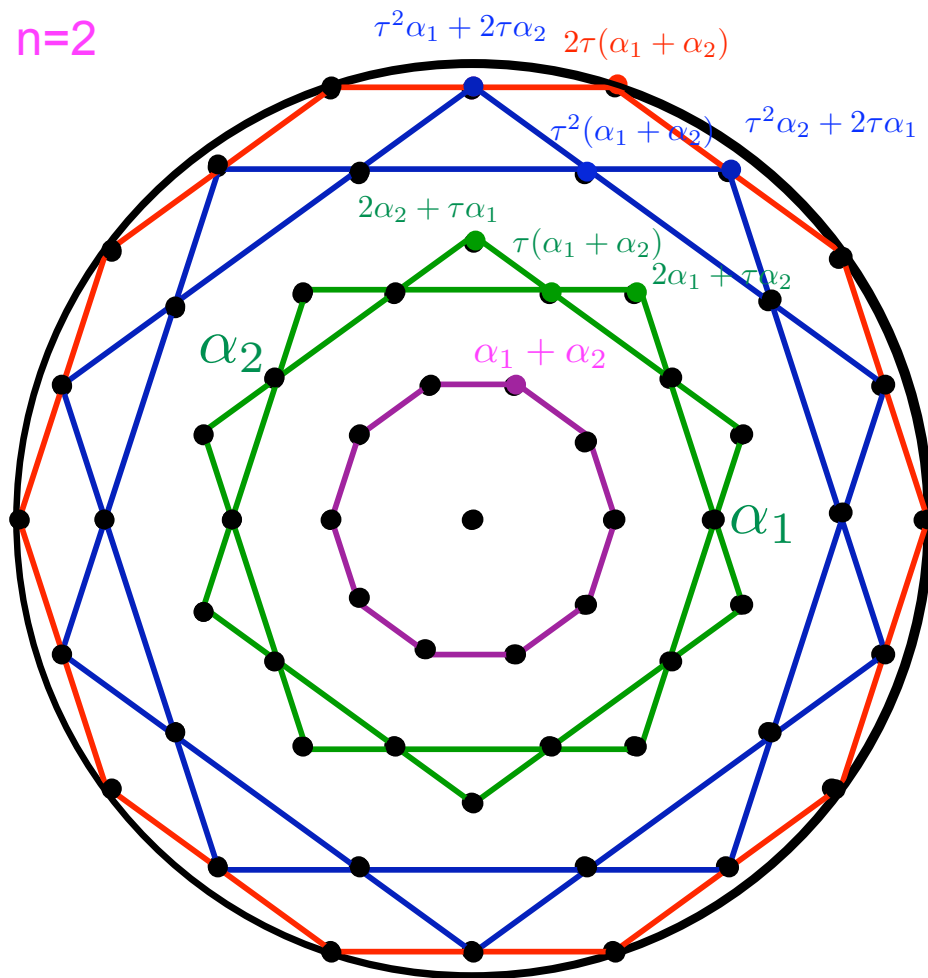
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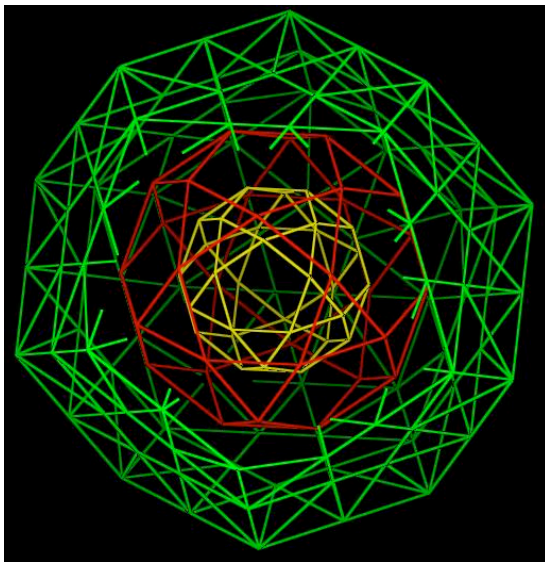
**Nested decagons and pentagons**

# Solving the puzzle of Papovaviridae

---

The 3d point set  $S(5)$  of H3 is dense enough to contain the vertices of polyhedra representing the all-pentamer capsids observed so far.

181 nested shells of radii between 0.236 and 5



Courtesy T. Keef and R. Twarock

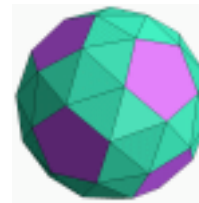
templates  
(5-coordinated  
vertices)



icosahedron  
 $R=1.17$ ;  $S(3)$



snub cube  
 $R=2.32$ ;  $S(4)$



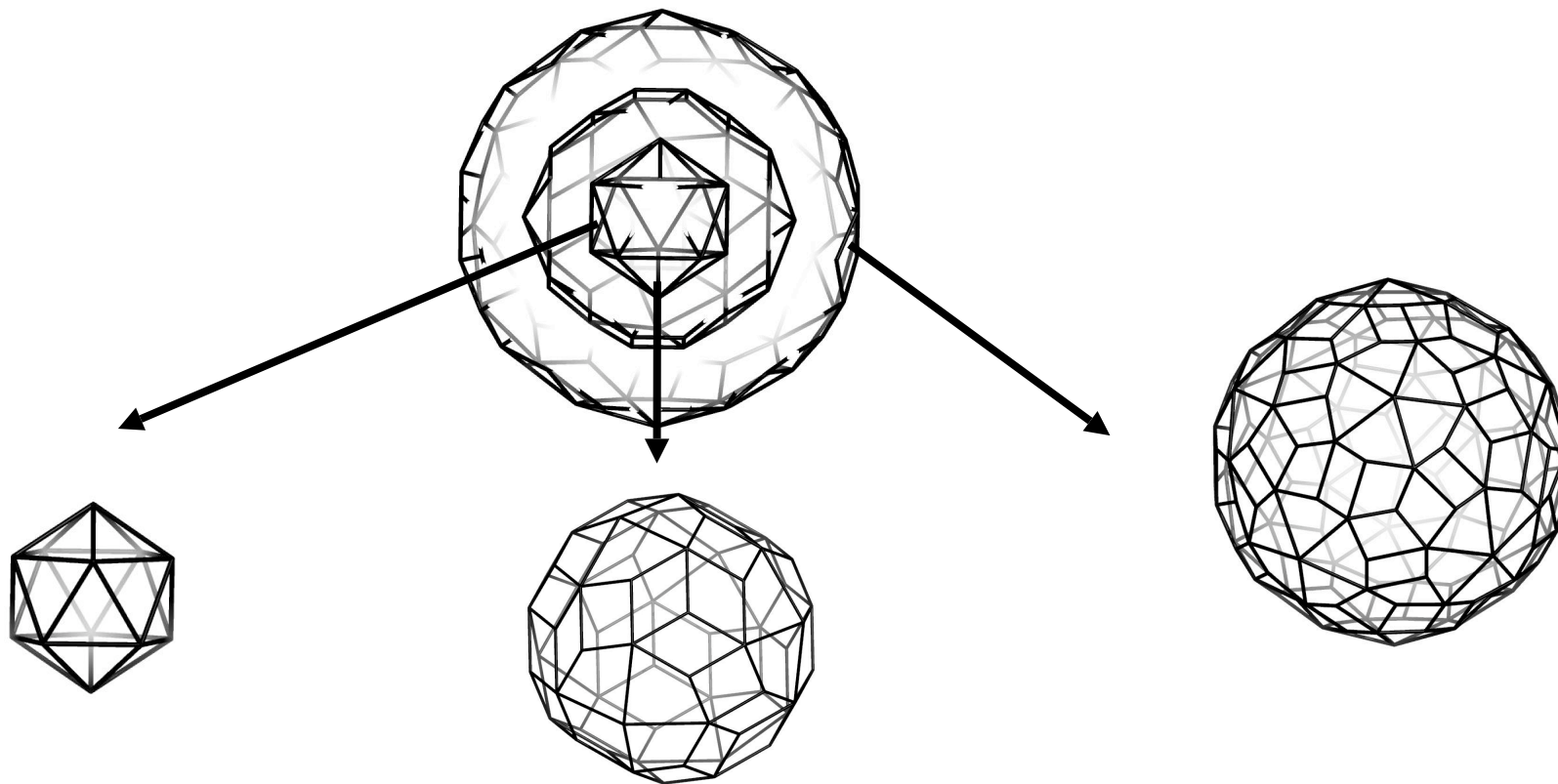
snub dodecahedron  
 $R=3.12$ ;  $S(5)$

[Keef & Twarock, q.bio.BM/0512047](http://q.bio.BM/0512047)



# Prediction: relative sizes

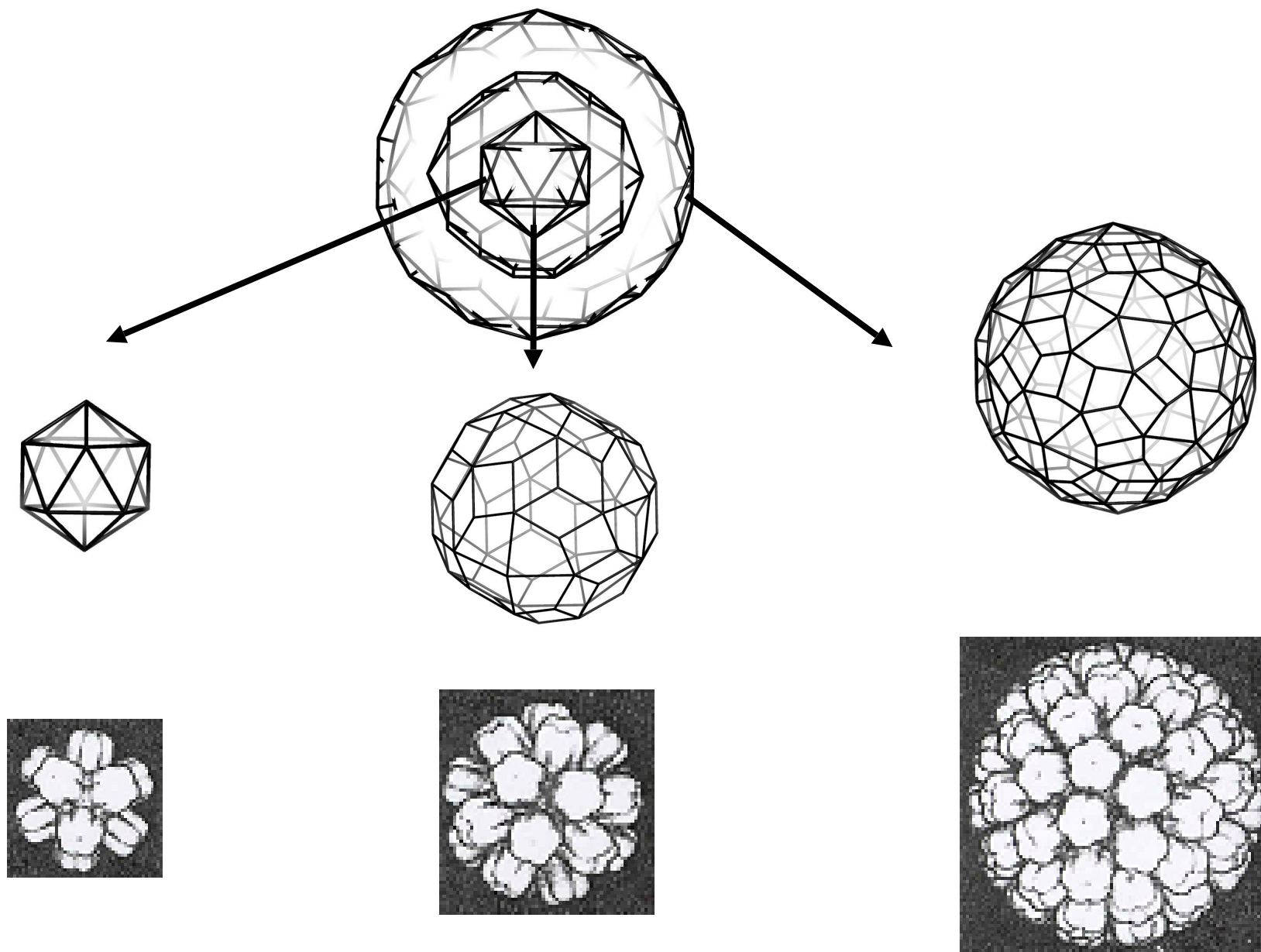
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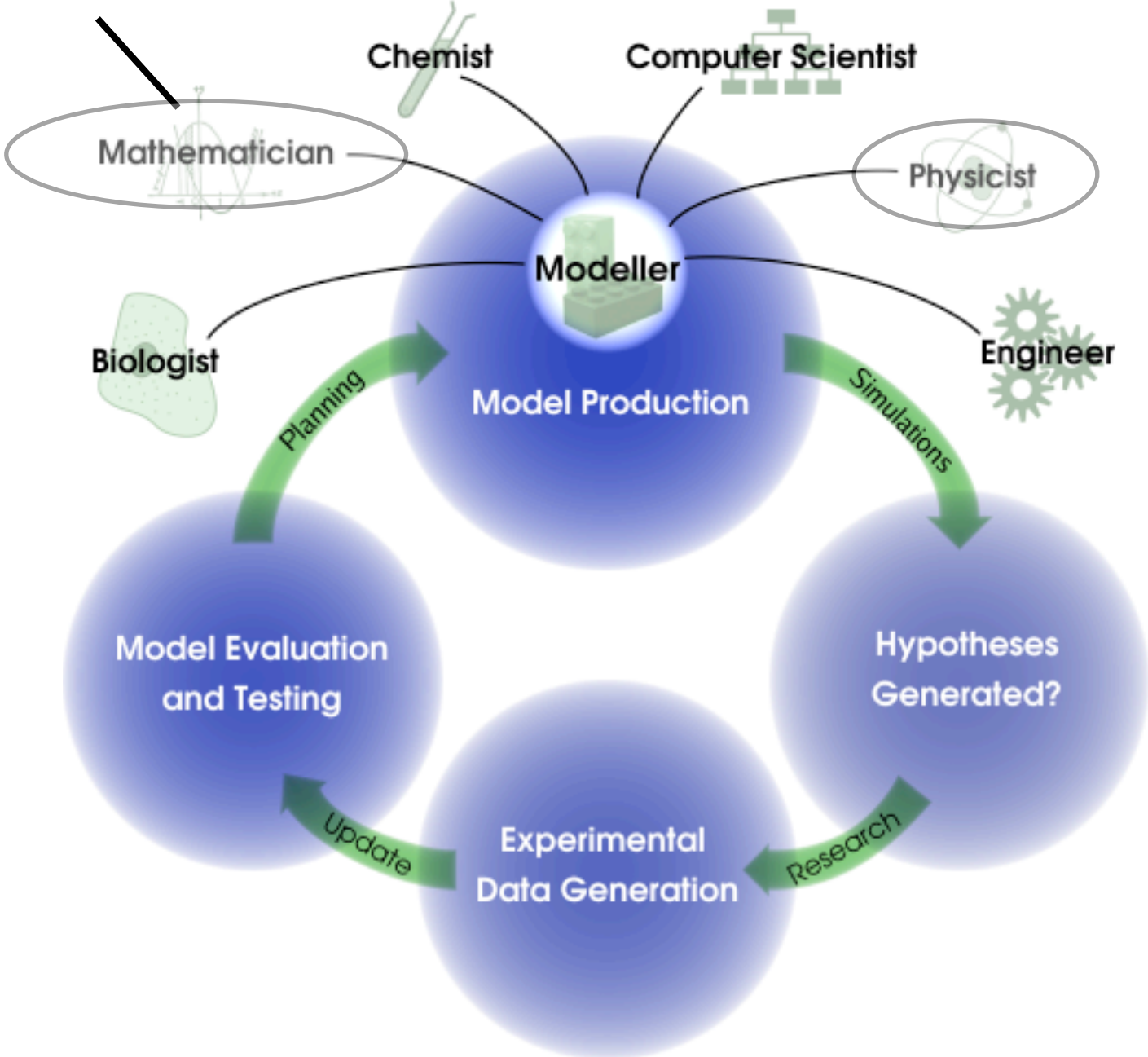
Predictions are in good agreement with experiments (Kanesashi et al.)

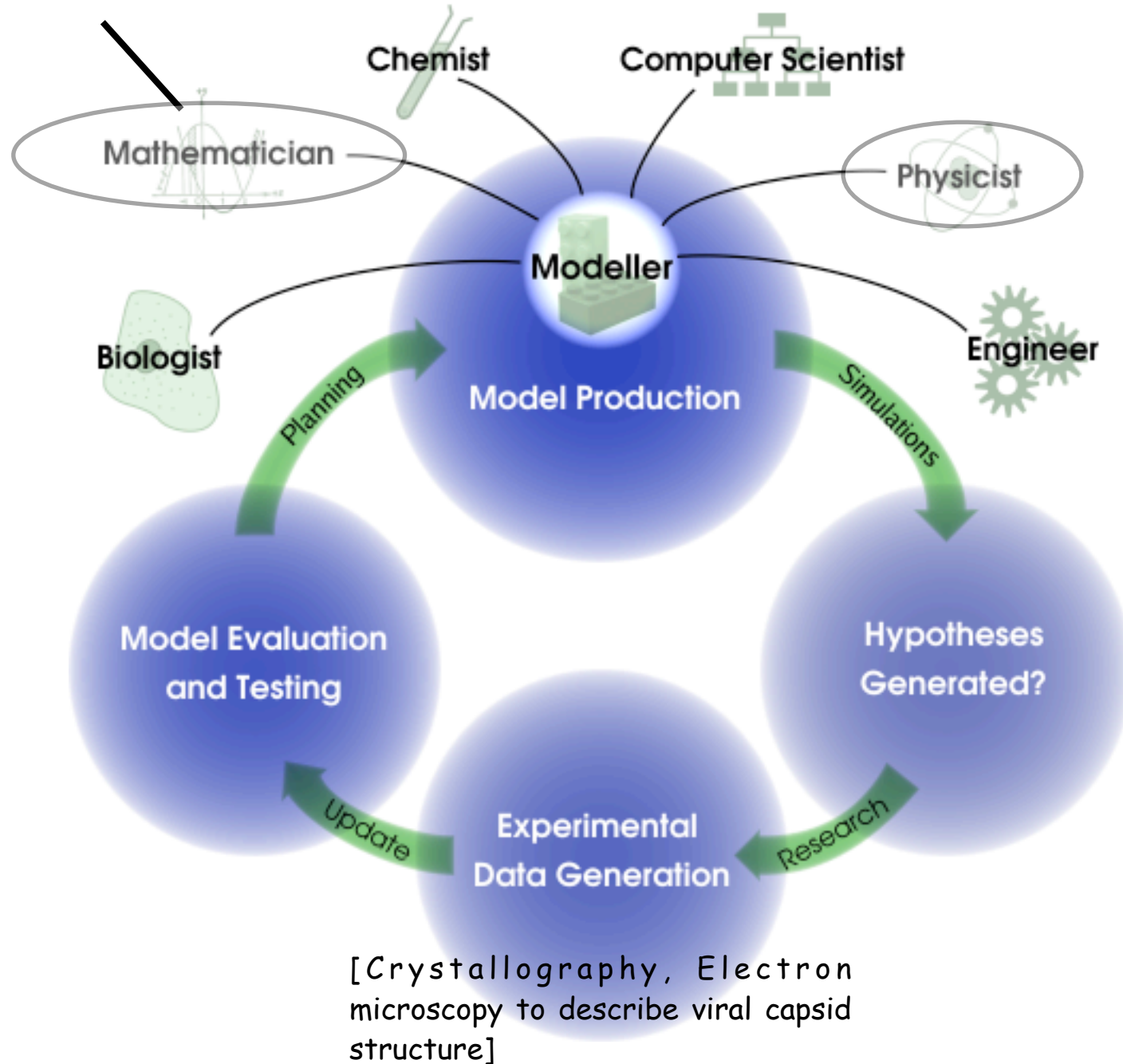
# Prediction: relative sizes

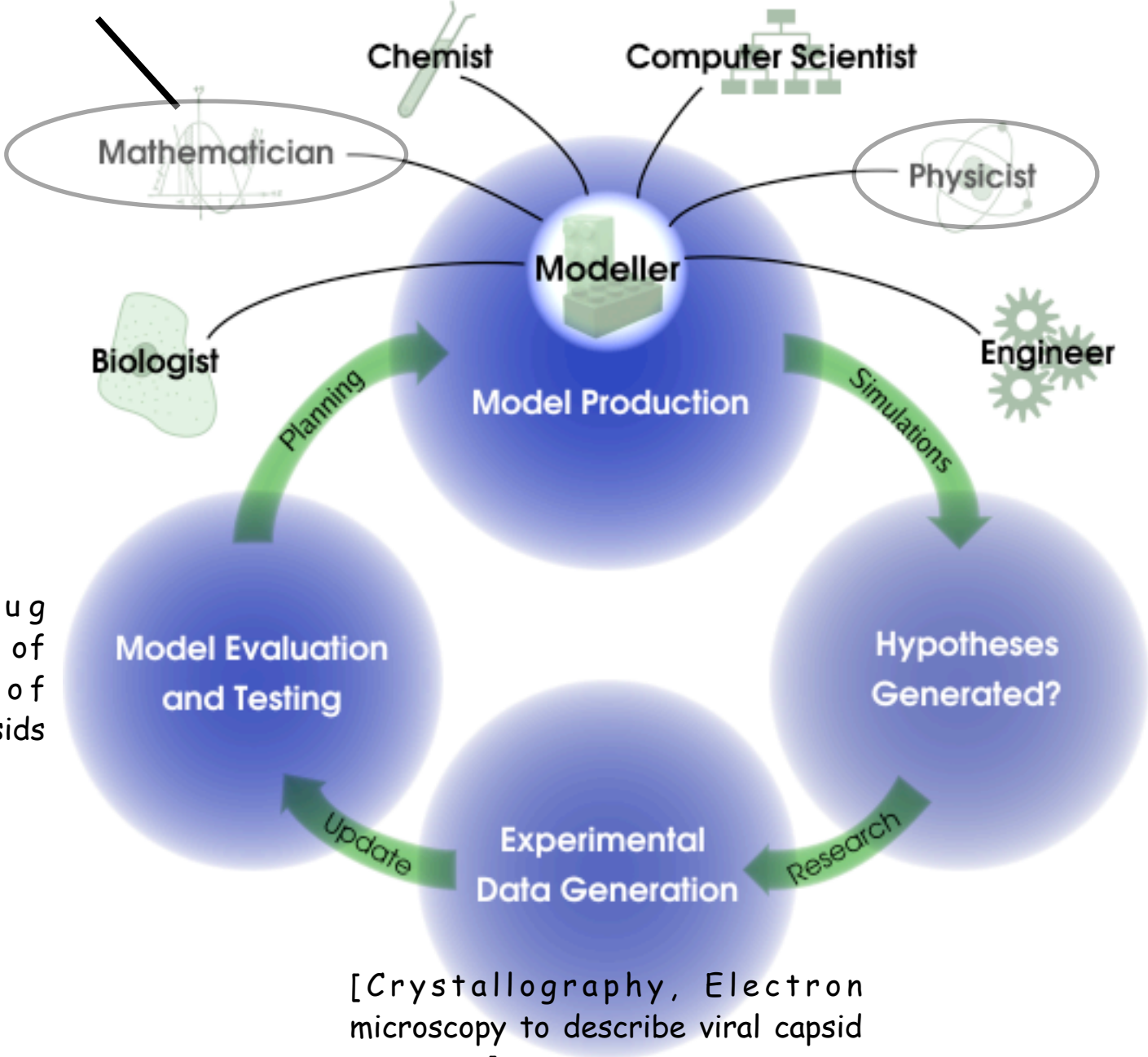
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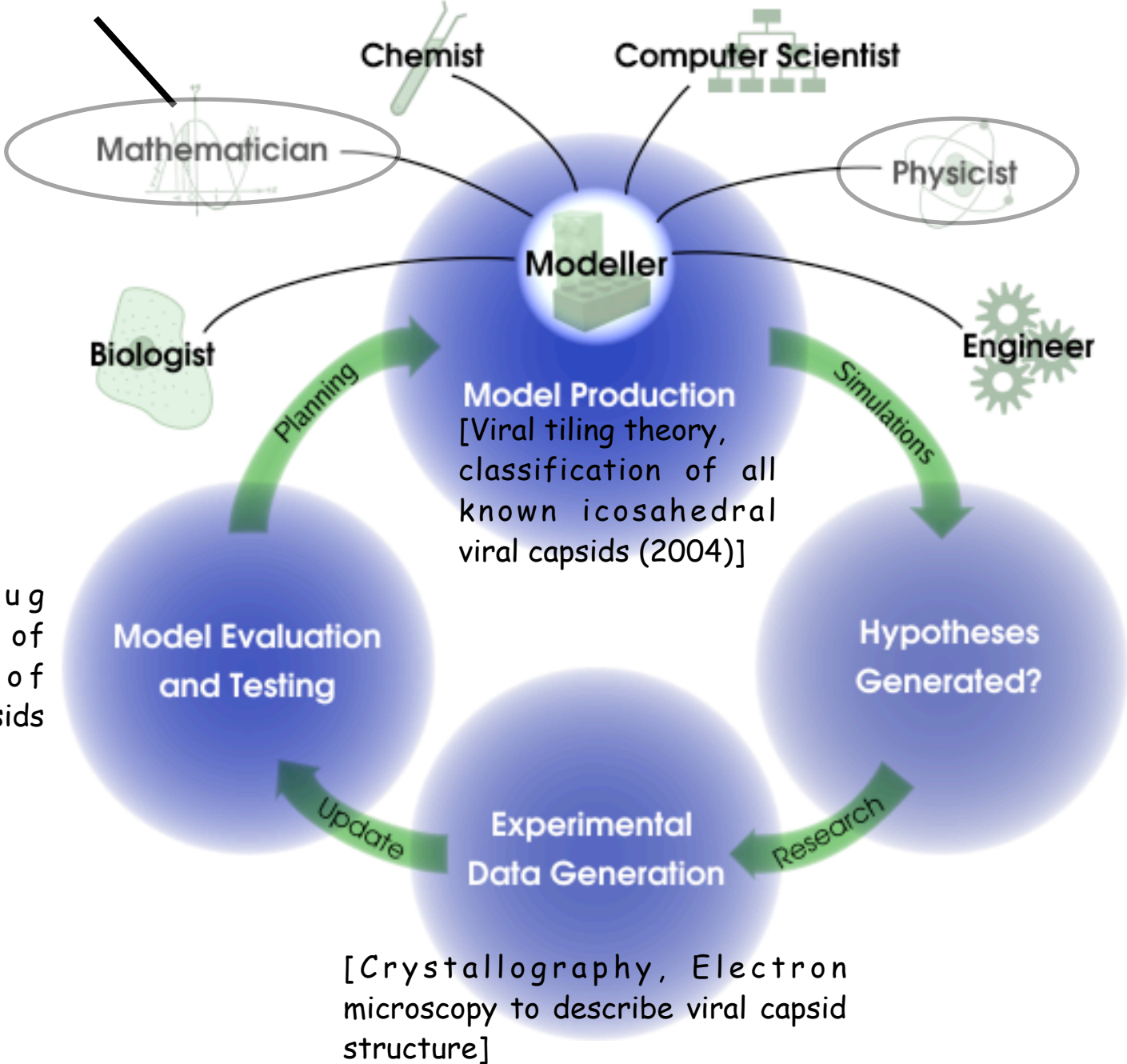




[Kaspar-Klug classification of main class of icosahedral capsids (1962)]

[Crystallography, Electron microscopy to describe viral capsid structure]



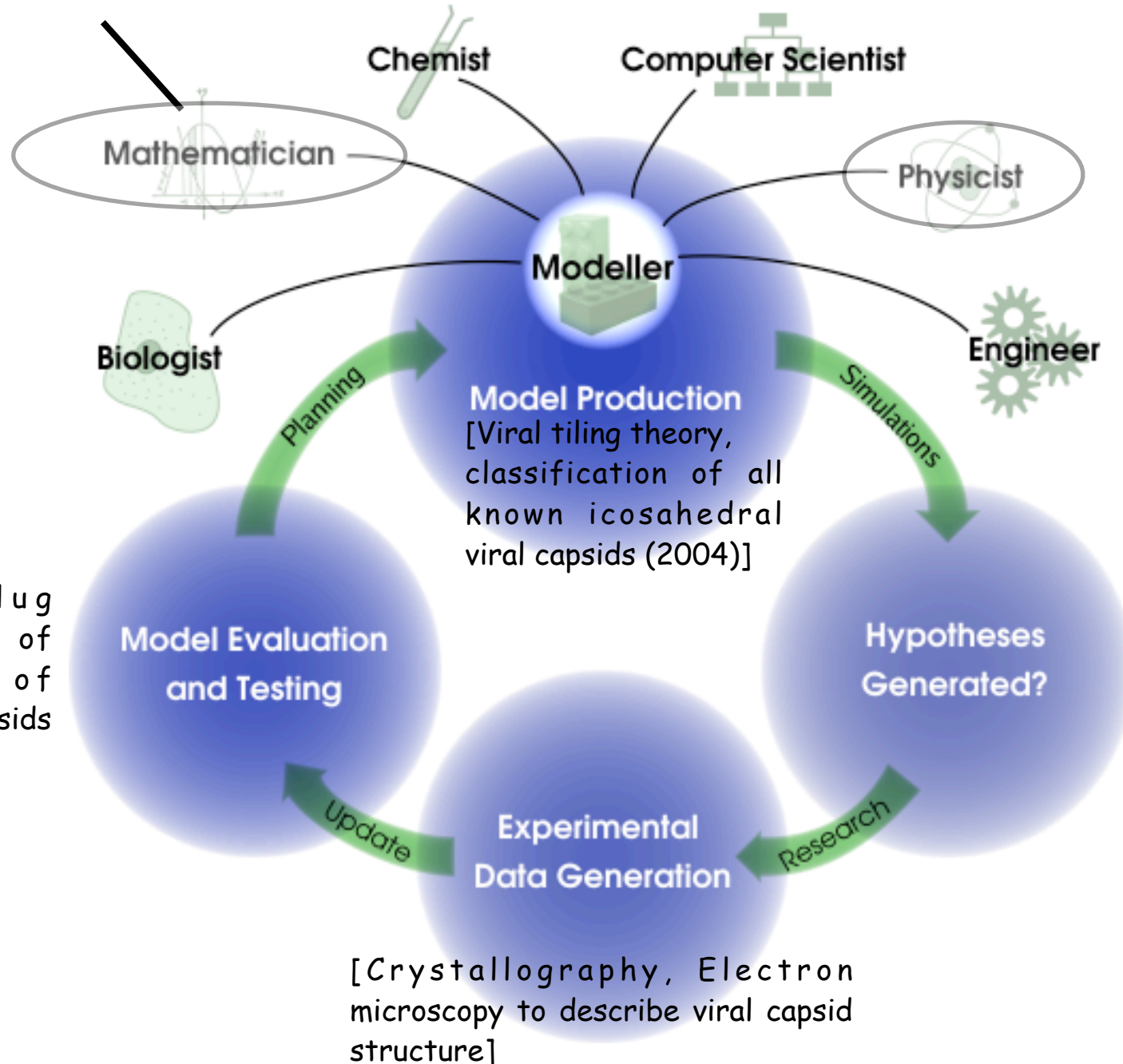




# New Maths

[Affine non-crystallographic  
Coxeter groups]

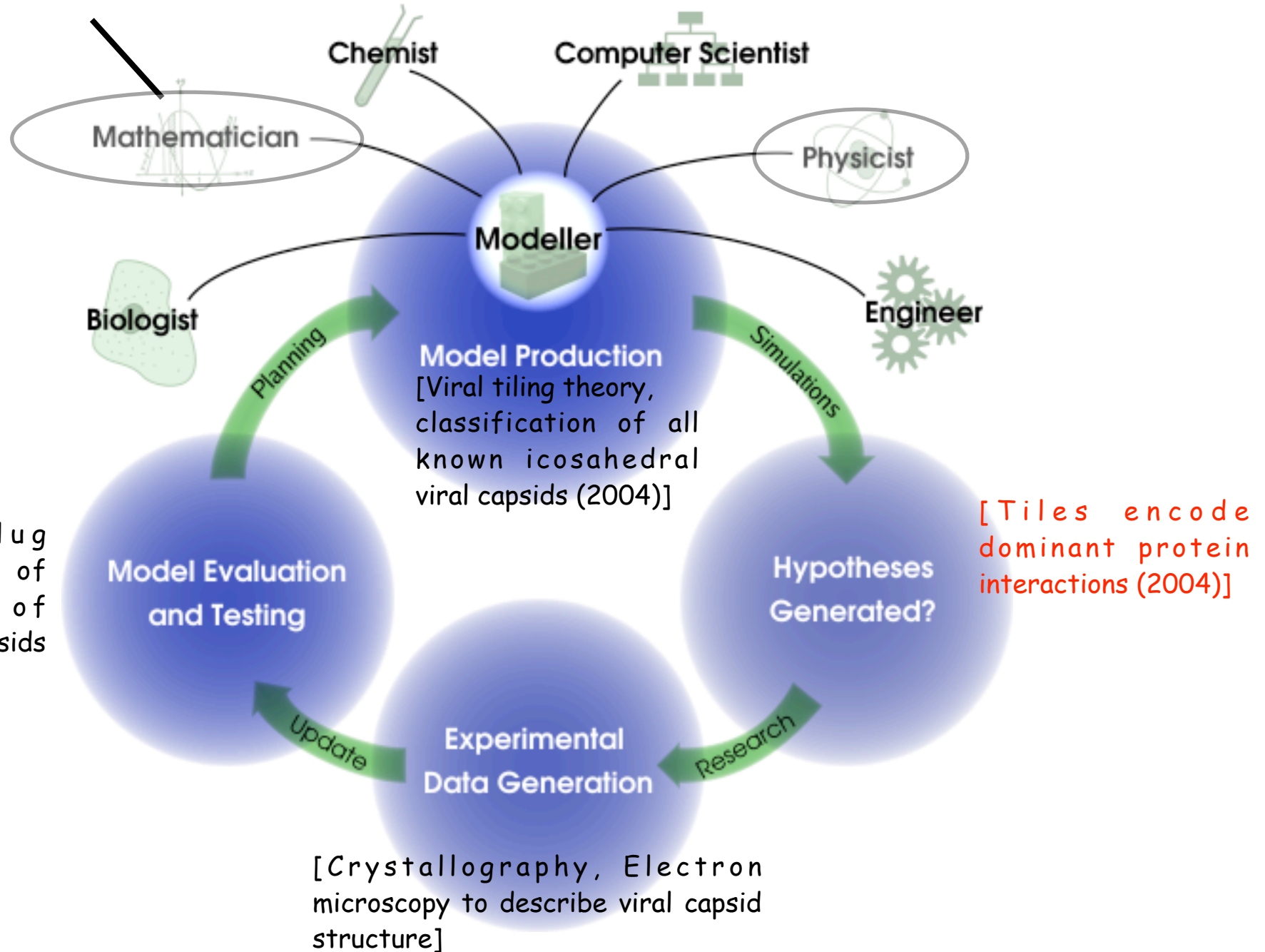
# Integrative biology



# New Maths

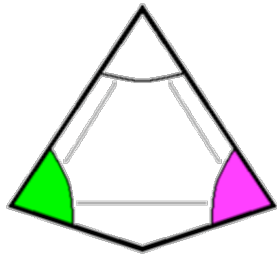
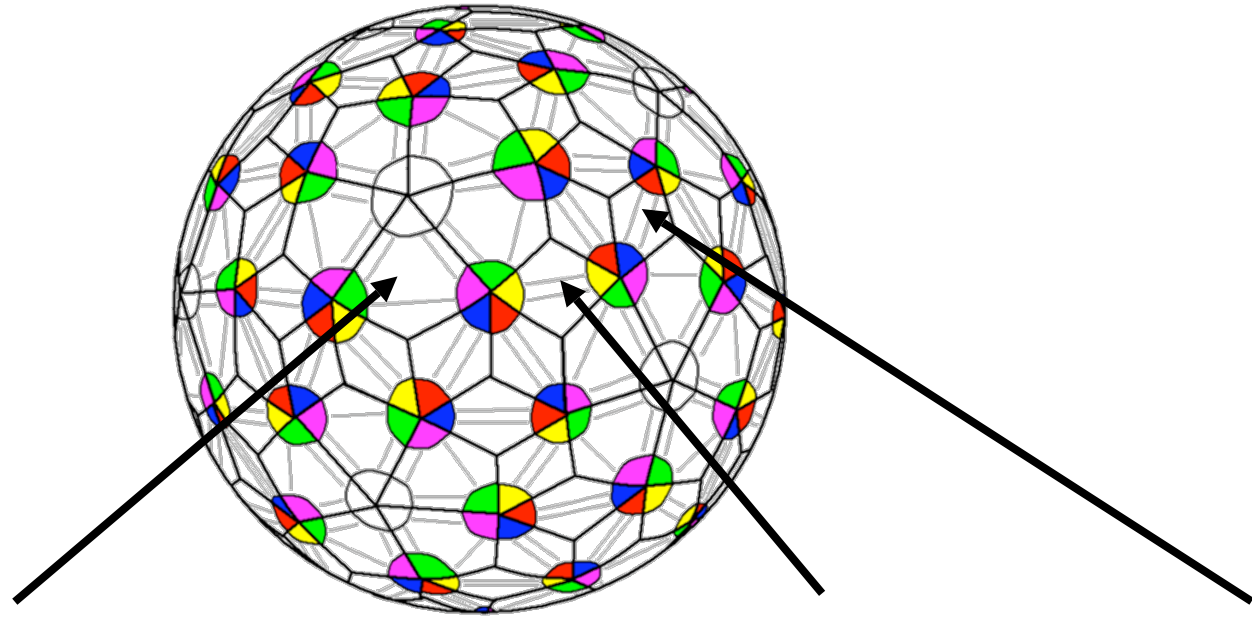
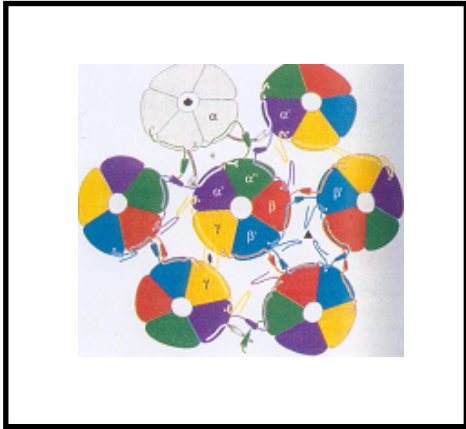
[Affine non-crystallographic Coxeter groups]

# Integrative biology

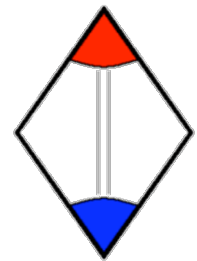
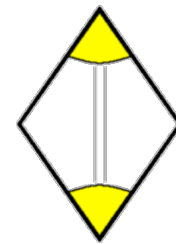


# Adapted Maths: Vibrations of viral capsids

# Integrative biology: Prediction of Bonding structure

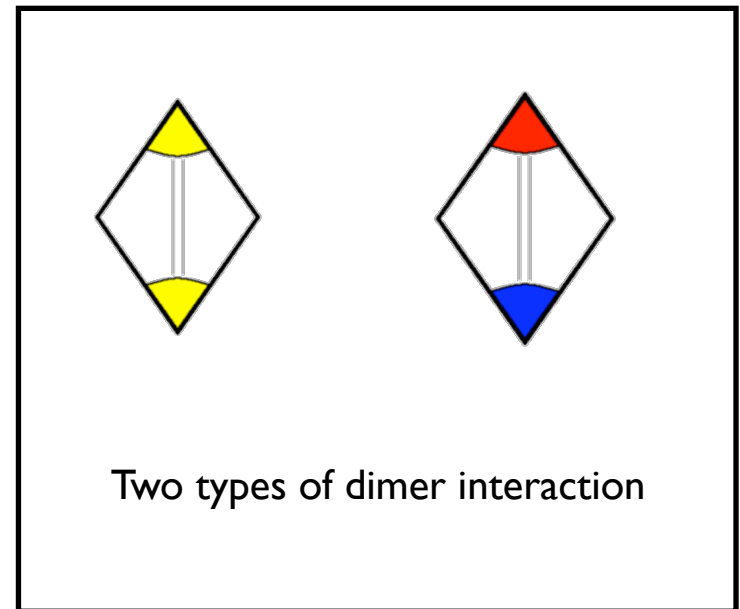
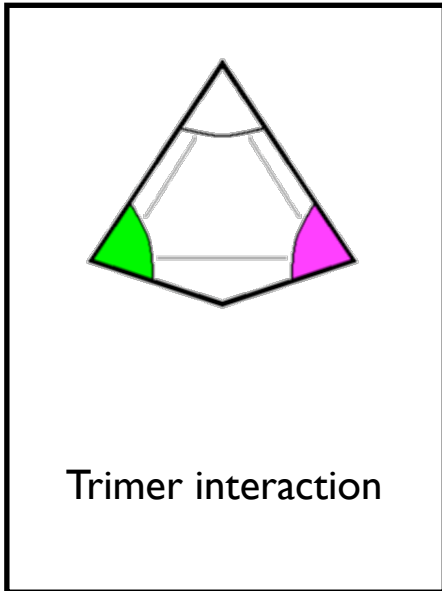
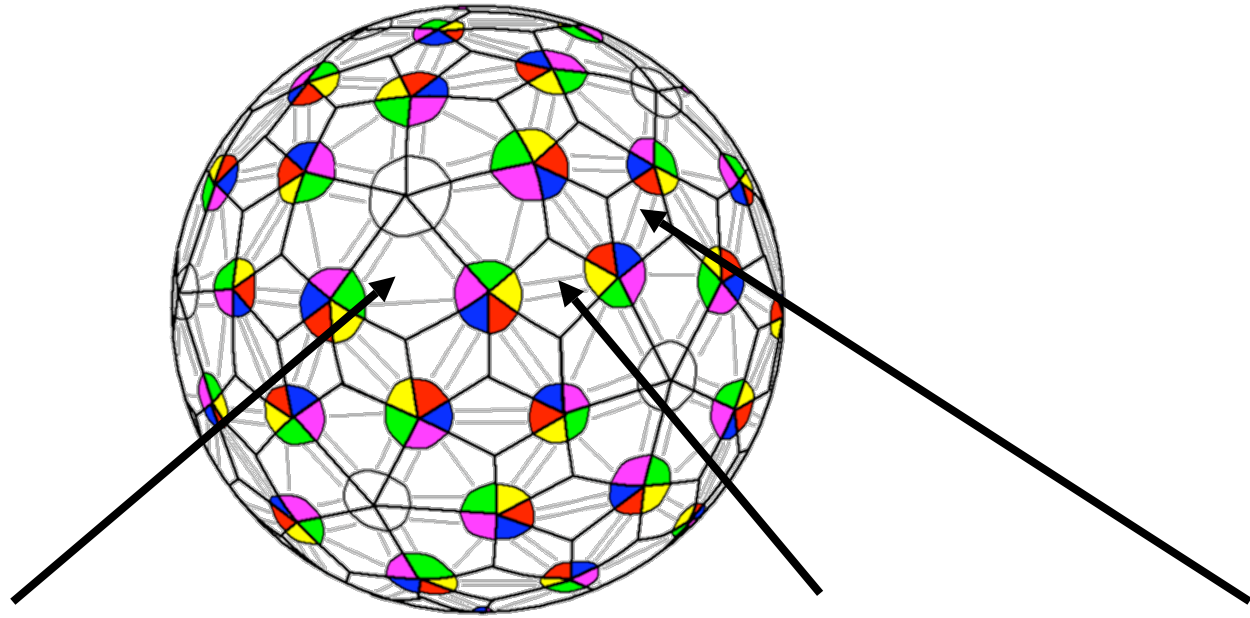
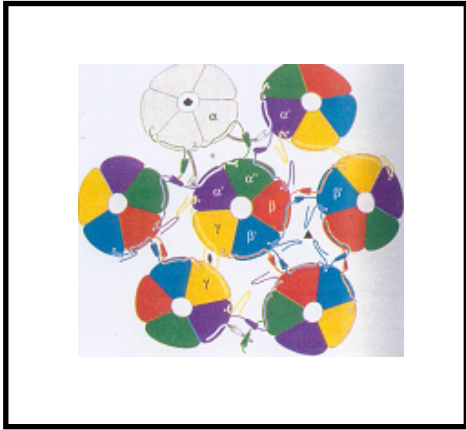


Trimer interaction

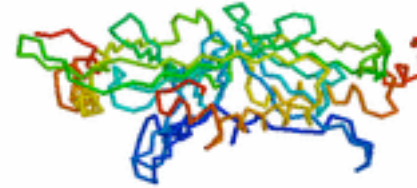
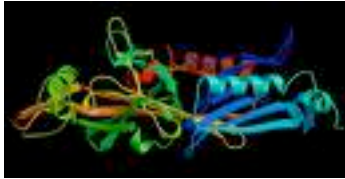


Two types of dimer interaction

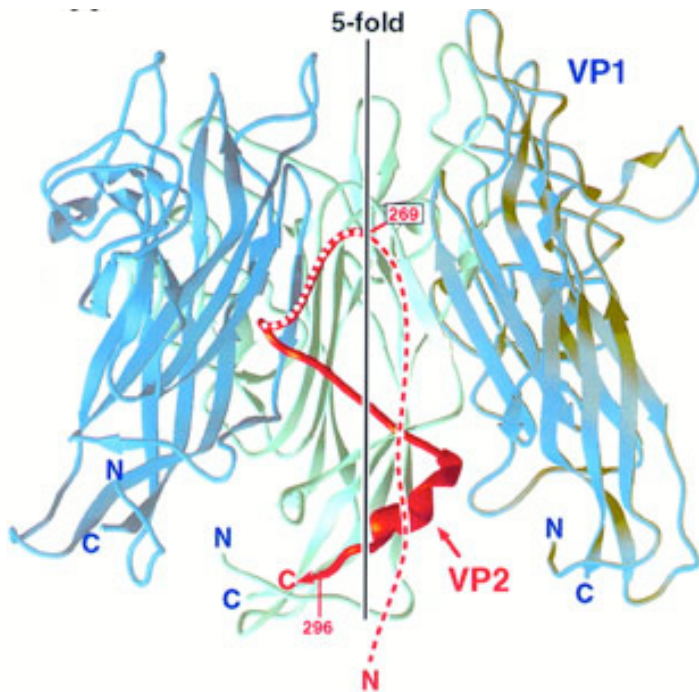
# Integrative biology: Prediction of Bonding structure



# Capsid structure : Huge number of degrees of freedom



vibration of protein



Ex: The capsid protein **VP1** exhibits 361 residues, and the capsid of SV40 is formed with 360 such proteins

$$D = 360 \times 361 \times A \times 3 = 129,960 \times A \times 3$$

Degrees of freedom:

$$D = P \times R \times A \times 3 = 3n$$

$\downarrow$  number of proteins  
 $\downarrow$  number of residues  
 $\downarrow$  number of atoms per residue  
 $\downarrow$  spatial d.o.f. per atom

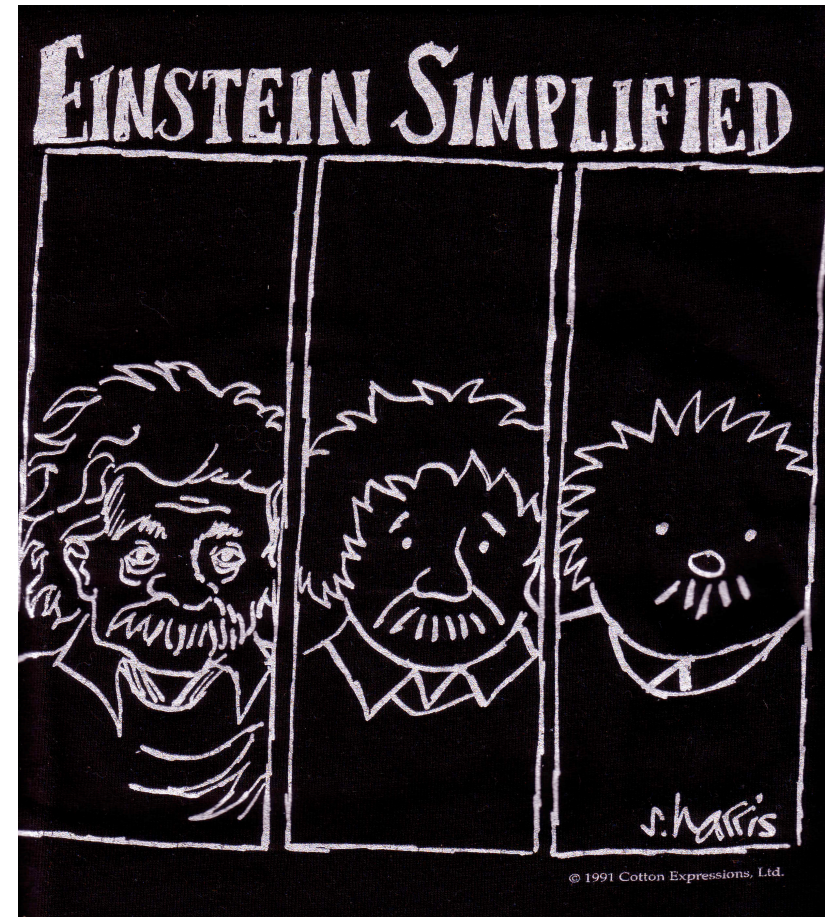


# Capsid structure : Coarse-Graining

Reduced number of d.o.f.

Insight in *systematics* of capsid dynamics

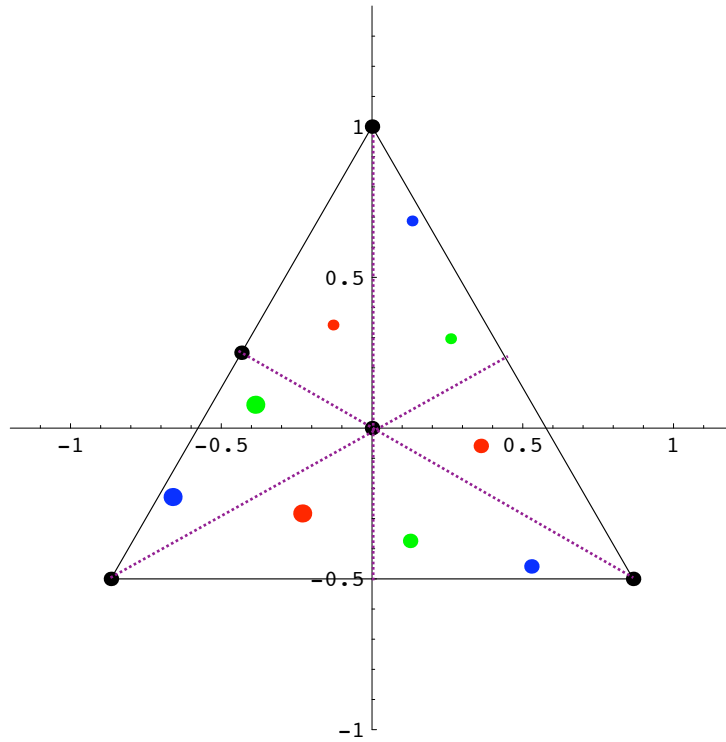
Each capsid protein is replaced  
by its centre of mass calculated  
from all its constituent atoms



The equilibrium positions of proteins are taken from the VIPER website and are assumed to respect icosahedral symmetry

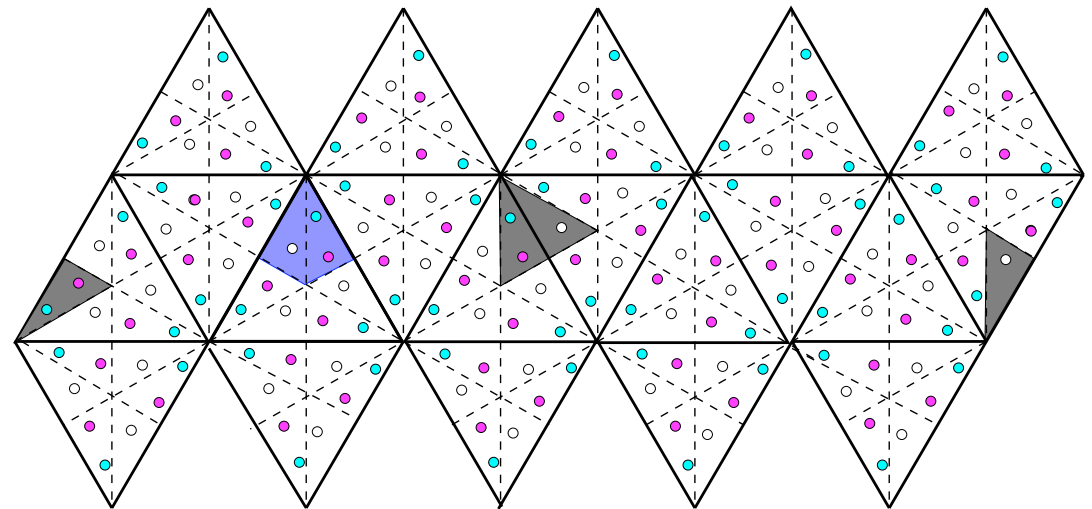


# Typical example: Rice Yellow Mottle Virus



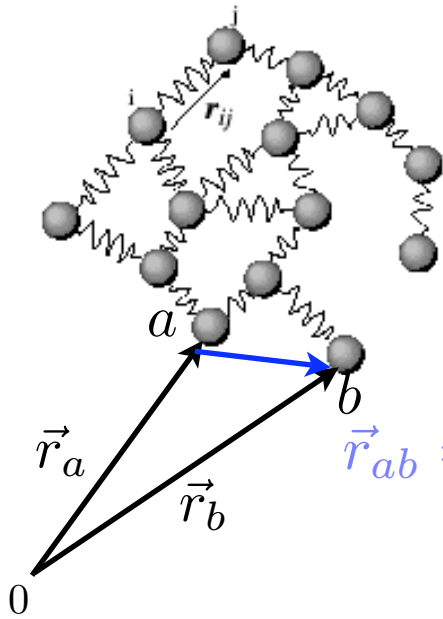
T=3 virus

Caspar-Klug tiling (triangles)



experimental data on proteins positions

# Potential : Harmonic approximation



$$V(x_a^i, x_b^j) = \sum_{a,b=1}^N \frac{k_{ab}}{2} (|\vec{r}_{ab}| - |\vec{r}_{ab}^0|)^2$$

**spring-mass model**

small deviations from equilibrium

$$V = \sum_a \frac{\partial V}{\partial x_a^i} \Big|_{x=x_0} (x_a^i - x_a^{0i}) + \sum_{a,b} \frac{1}{2} \frac{\partial^2 V}{\partial x_a^i \partial x_b^j} \Big|_{x=x_0} (x_a^i - x_a^{0i})(x_b^j - x_b^{0j}) + \dots$$

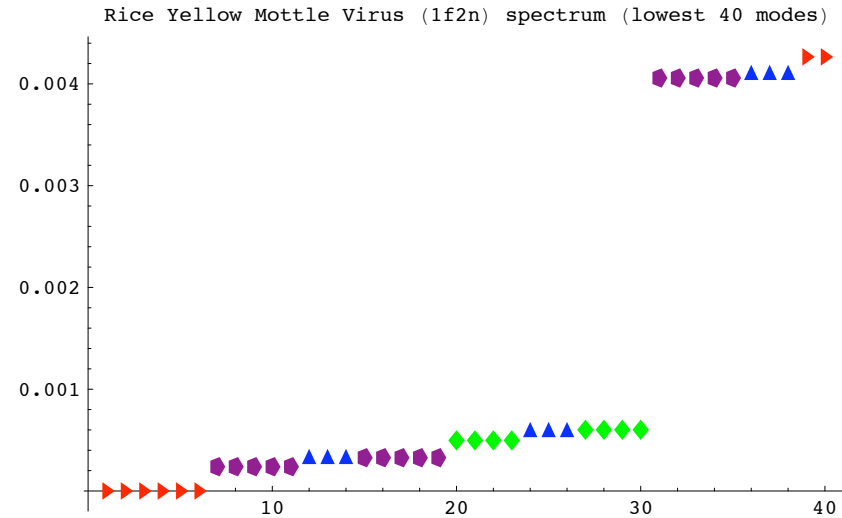
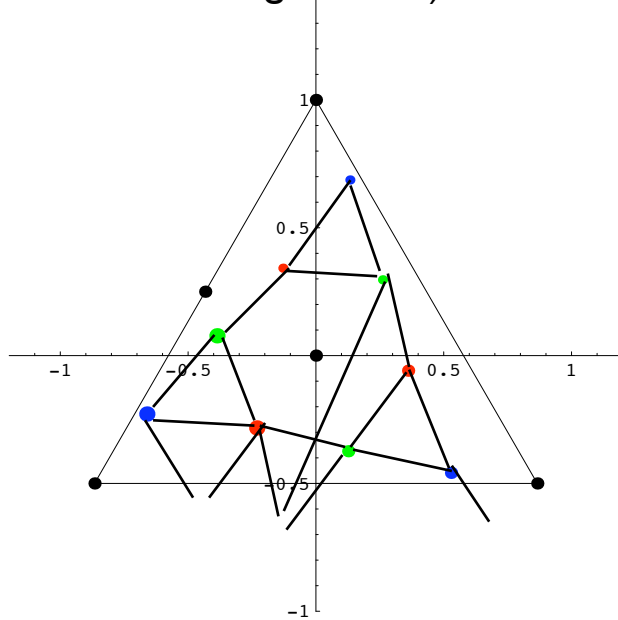
$$\frac{d^2}{dt^2} (x_a^i - x_a^{0i}) + F_{ab}^{ij} (x_b^j - x_b^{0j}) = 0$$

equations of motion for deviations from equilibrium

↓ force matrix whose eigenvalues are the frequencies of the normal modes of vibration

# Example: Low-frequency spectrum of RYMV

180 proteins (9 per triangular face)



6 trivial zero modes

$$\Gamma_{540}^{displ} = 9 [\Gamma^{1+} + 3\Gamma^{3+} + 3\Gamma^{3'+} + 4\Gamma^{4+} + 5\Gamma^{5+}]$$

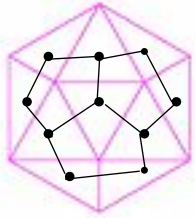
24 near zero-modes

$$2[\Gamma^{3'+} + \Gamma^{4+} + \Gamma^{5+}]$$

recurrent pattern in all Caspar-Klug viruses

# Why 24?

## Icosahedron



The vibrations of the icosahedral cage induce vibrations of the dodecahedral cage

$$\Gamma_{ICO}^{displ} = \Gamma^{1+} + (\Gamma^{3+} + \Gamma^{3-}) + \Gamma^{3-} + \Gamma^{3'-} + \Gamma^{4+} + \Gamma^{4-} + 2\Gamma^{5+} + \Gamma^{5-} \quad (36)$$

degrees of freedom:  $12 \times 3 = 36$

non-genuine vibrations:  $3 + 3 = 6$  (rotations + translations of whole capsid)

number of constraints: 30 (springs along edges of icosahedron)

number of zero modes:  $36 - 6 - 30 = 0$       stable capsid

## Dodecahedron



The vibrations of the dodecahedral cage induce vibrations of the icosahedral cage

$$\Gamma_{DODE}^{displ} = \Gamma^{1+} + (\Gamma^{3+} + \Gamma^{3-}) + \Gamma^{3-} + \Gamma^{3'-} + \Gamma^{4+} + \Gamma^{4-} + 2\Gamma^{5+} + \Gamma^{5-} \quad (36)$$

$$+ \Gamma^{3'+} + \Gamma^{3'-} + \Gamma^{4+} + \Gamma^{4-} + \Gamma^{5+} + \Gamma^{5-} \quad (24)$$

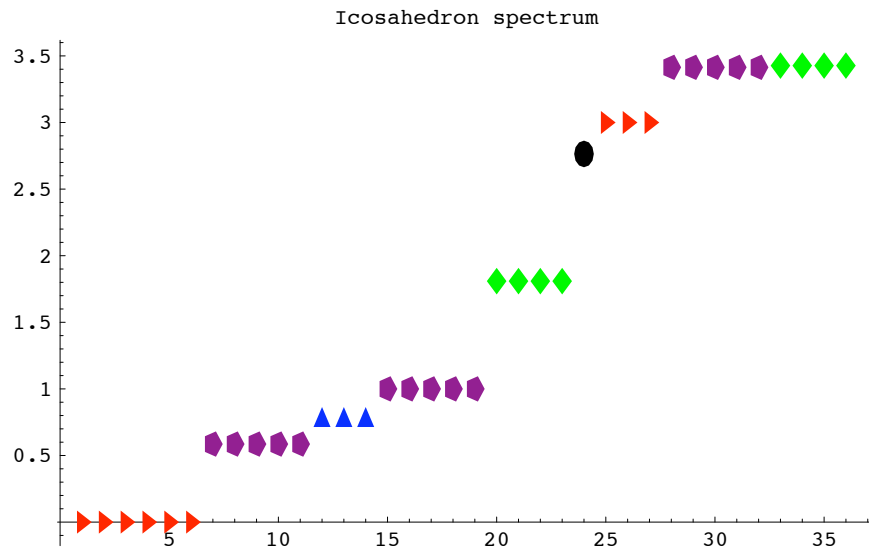
degrees of freedom:  $20 \times 3 = 60$

non-genuine vibrations:  $3 + 3 = 6$  (rotations + translations of whole capsid)

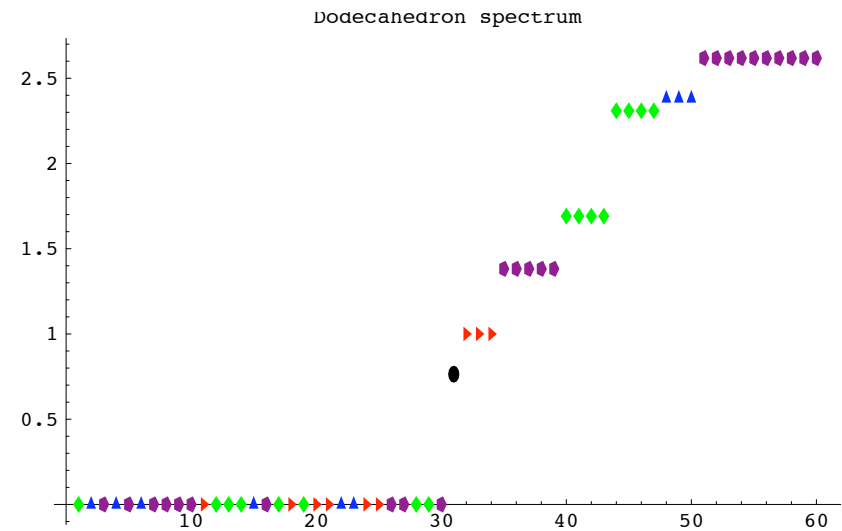
number of constraints: 30 (springs along edges of dodecahedron)

number of zero modes:  $60 - 6 - 30 = 24$       unstable capsid

# Spectrum within spring-mass model



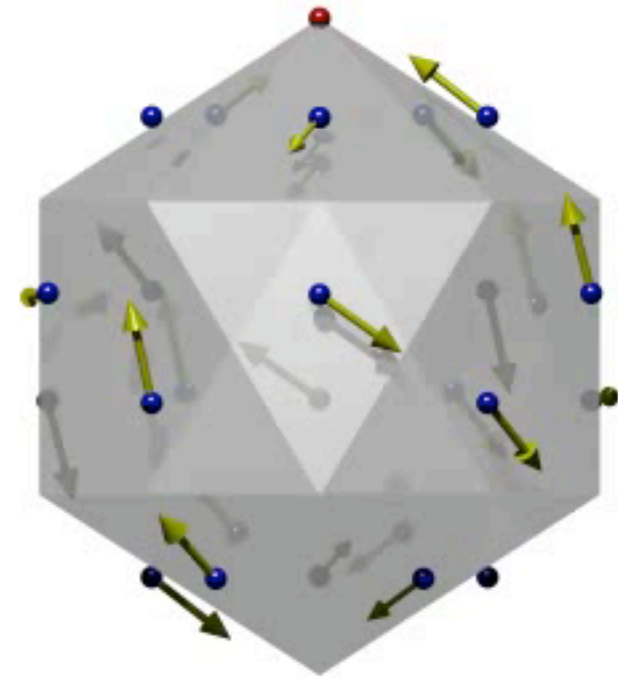
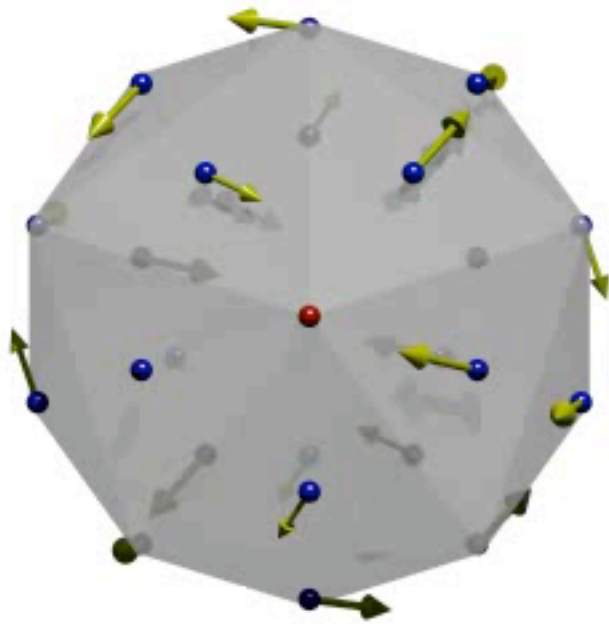
stable capsid



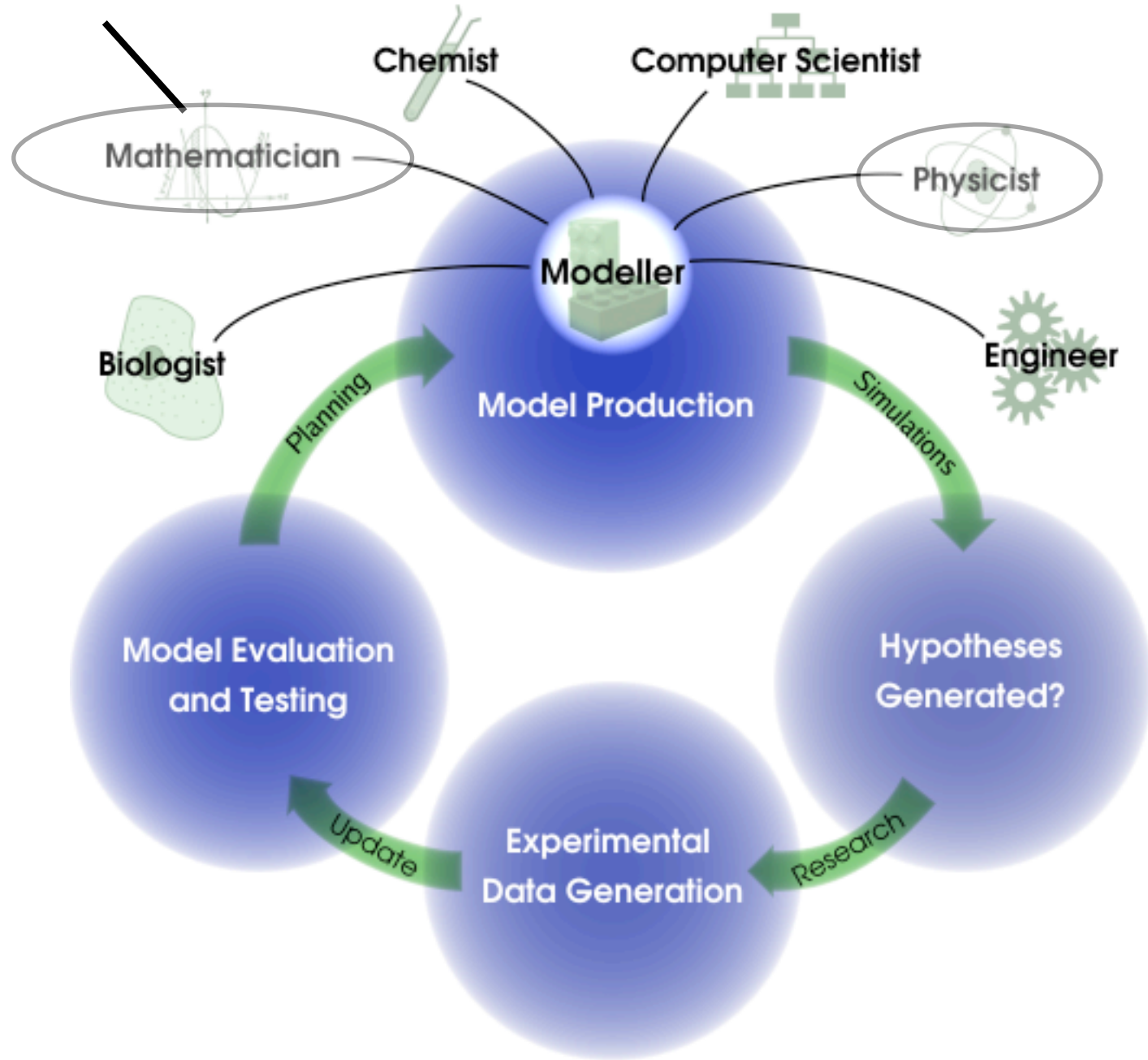
unstable capsid (24 zero-modes)

Map between representations in icosahedron and dodecahedron cases

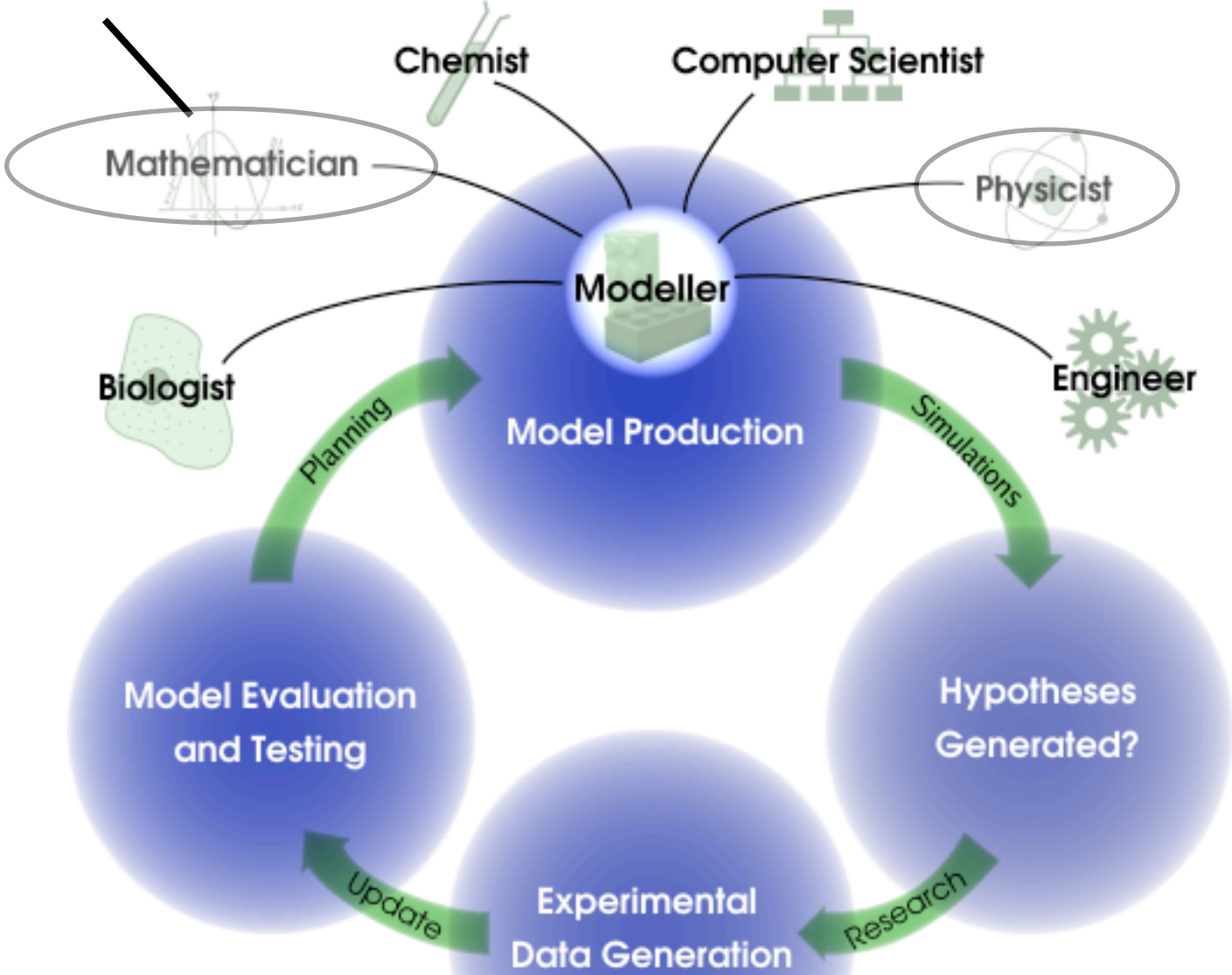
$$\begin{aligned}
 \Gamma_{ICO}^{displ} &= \Gamma^{1+} + (\Gamma^{3+} + \Gamma^{3-}) + \Gamma^{3-} + \Gamma^{3'-} + \Gamma^{4+} + \Gamma^{4-} + 2\Gamma^{5+} + \Gamma^{5-} \\
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 &\quad + \Gamma^{3'+} + \Gamma^{3'-} + \Gamma^{4+} + \Gamma^{4-} + \Gamma^{5+} + \Gamma^{5-} \\
 &\quad \downarrow \\
 &= 0
 \end{aligned}$$



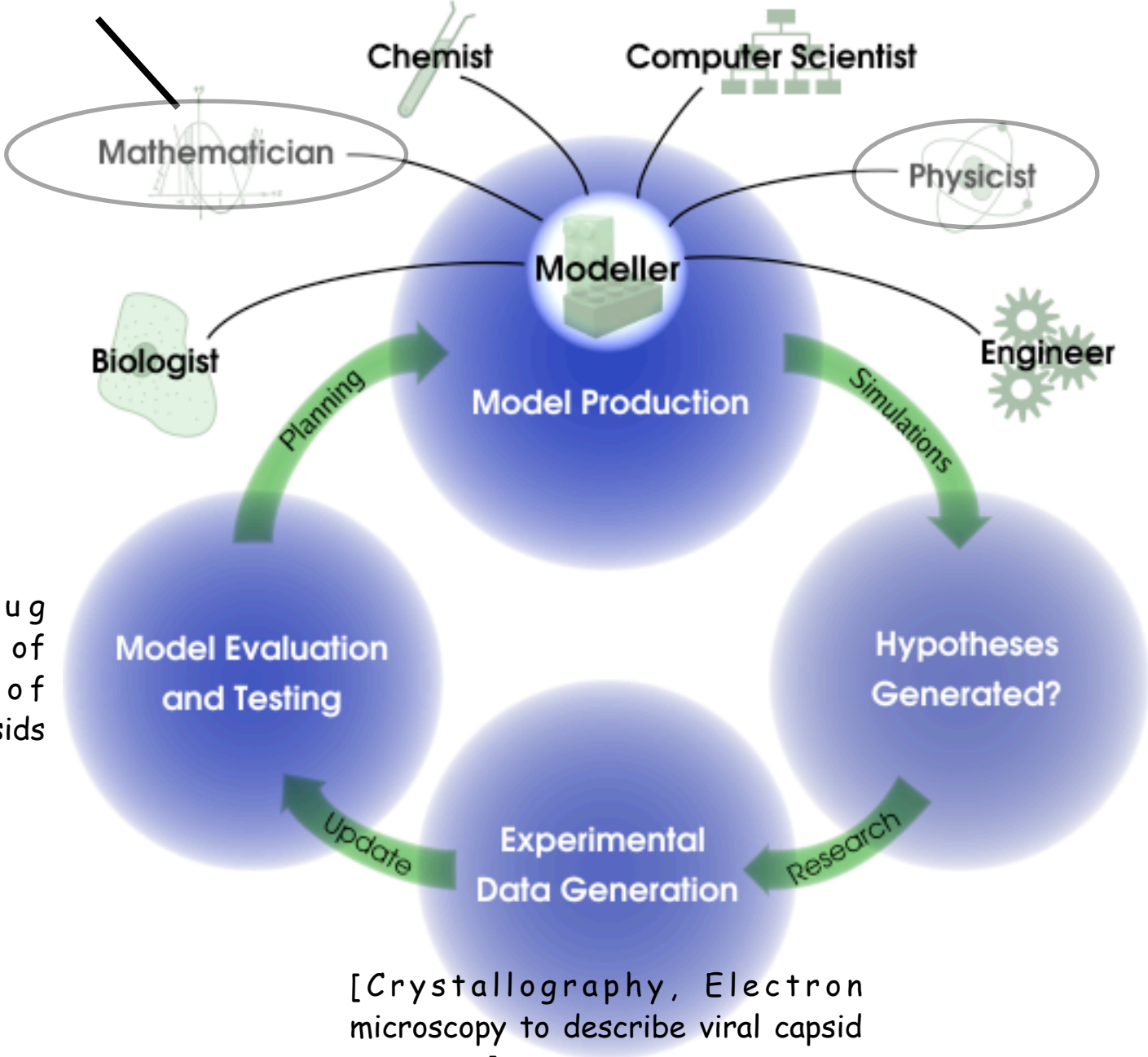
Dodecahedron zero mode  $3^+$

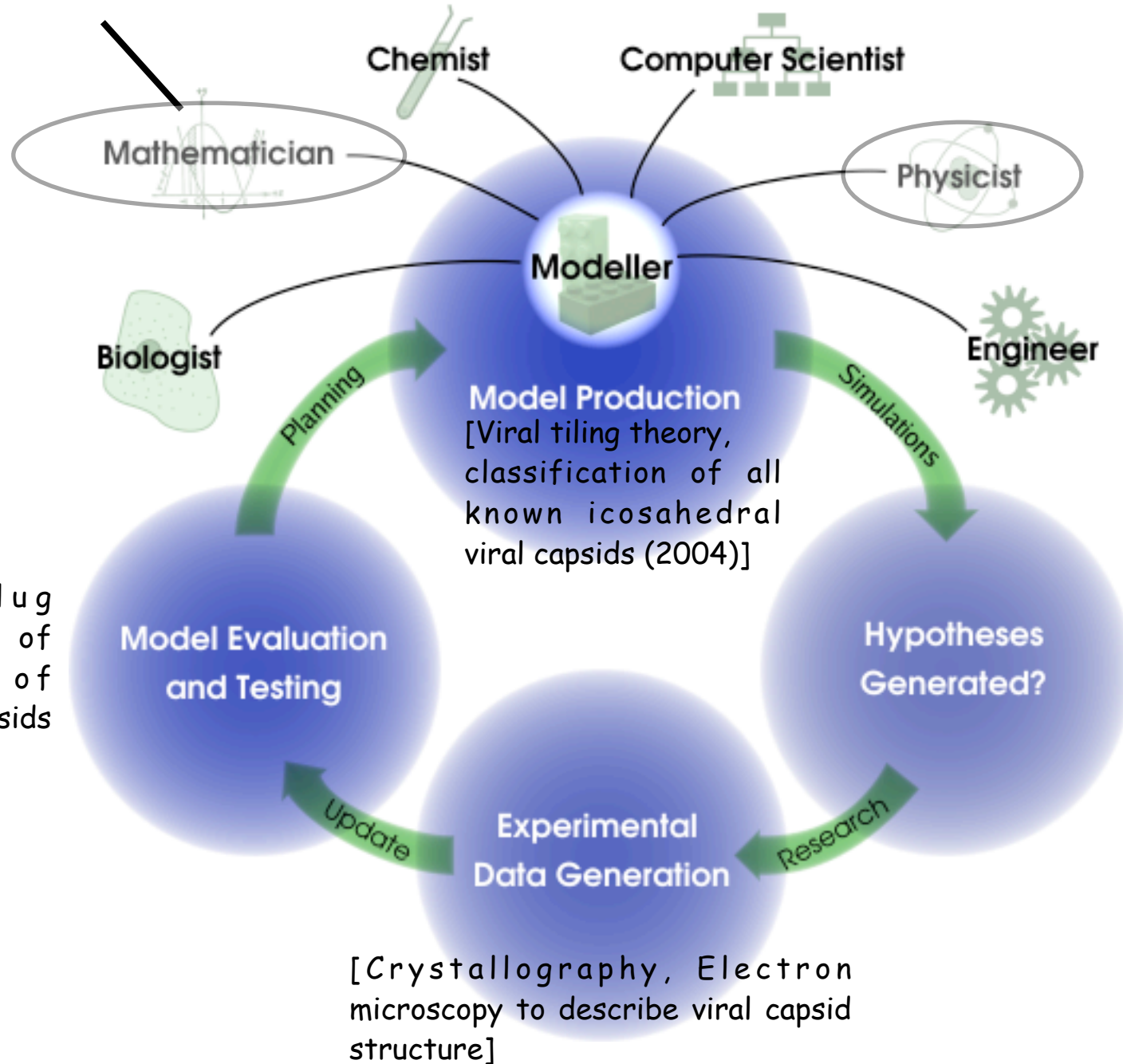






[Crystallography, Electron microscopy to describe viral capsid structure]

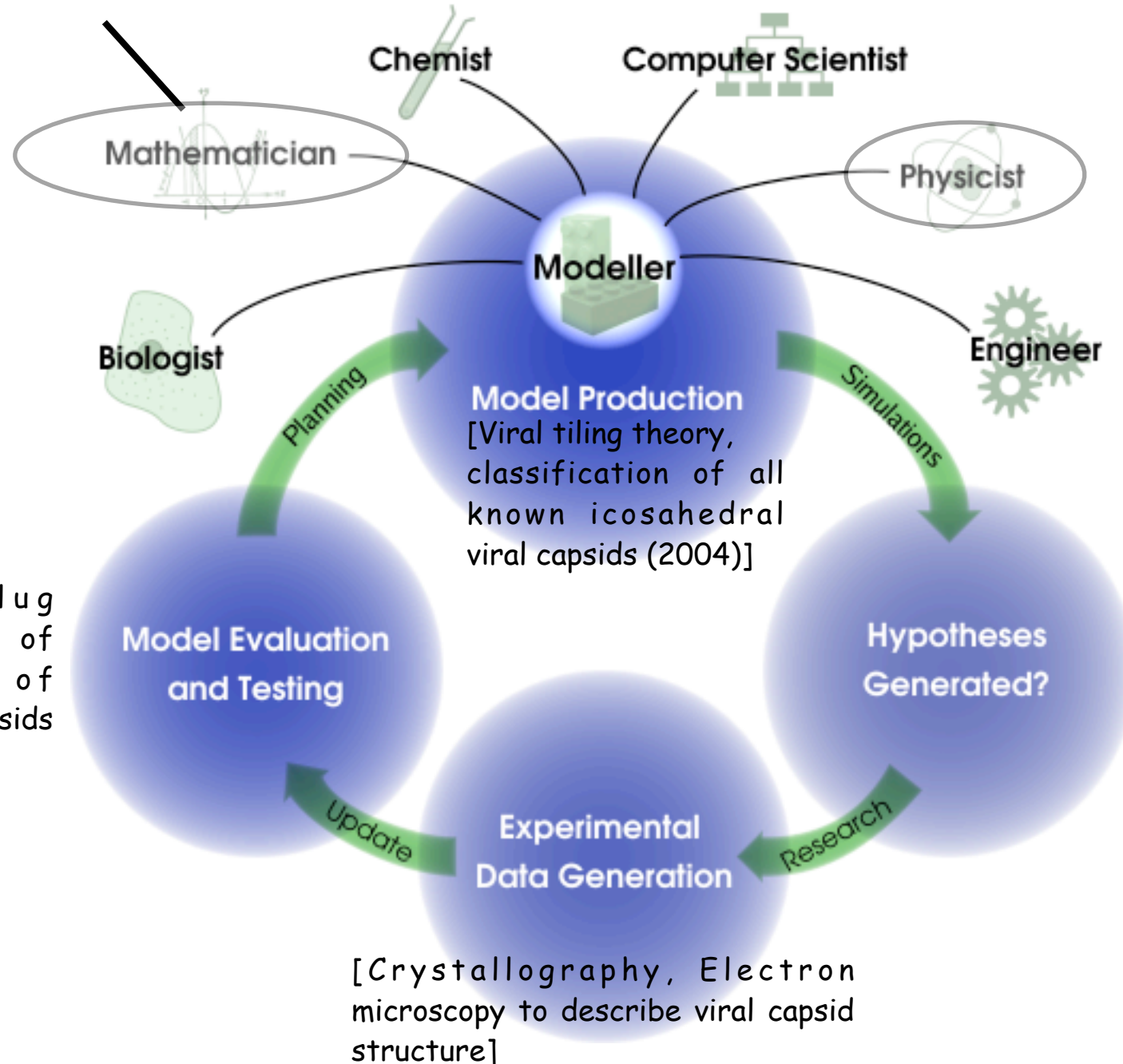




# New Maths

[Affine non-crystallographic  
Coxeter groups]

# Integrative biology

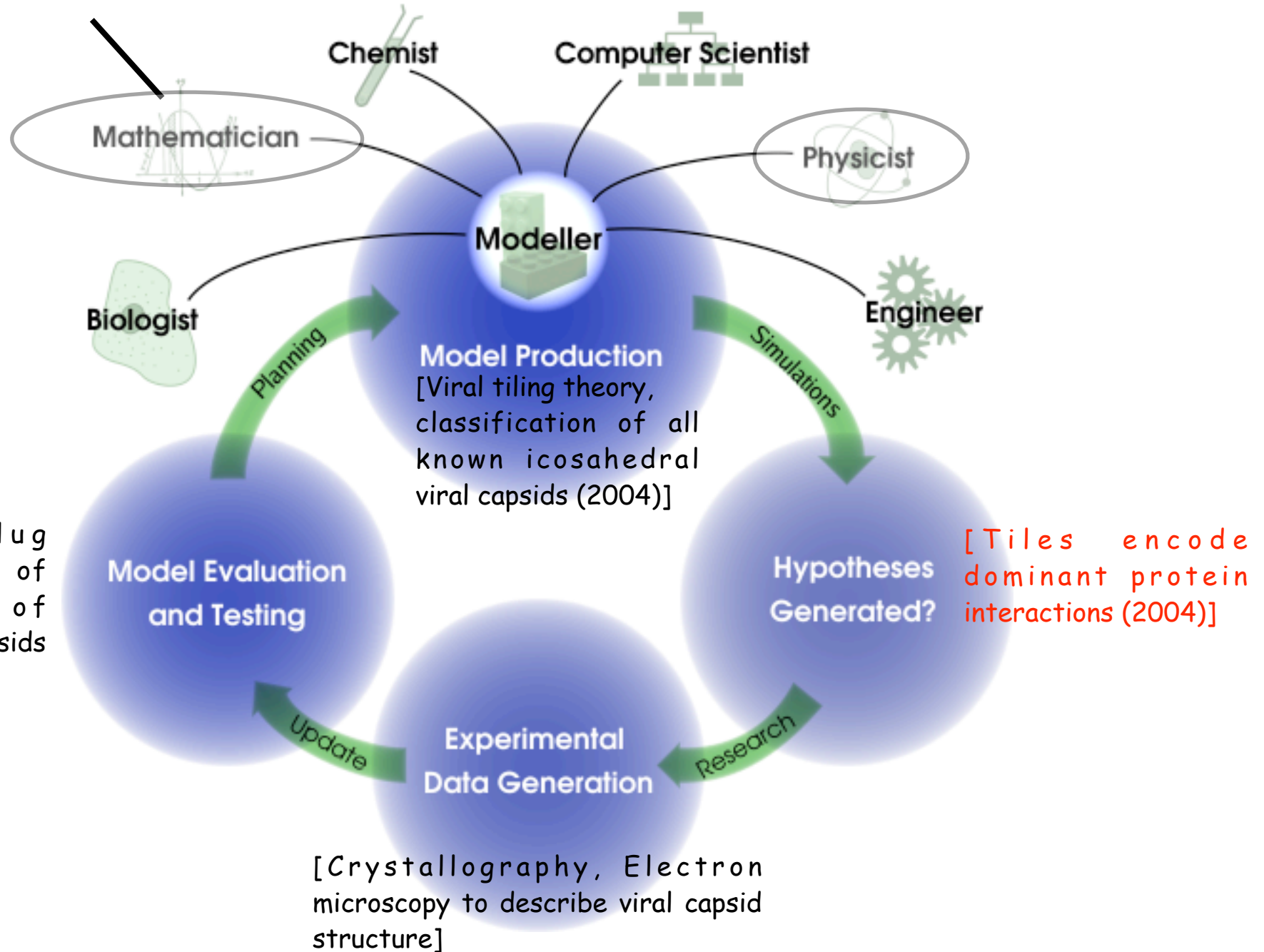




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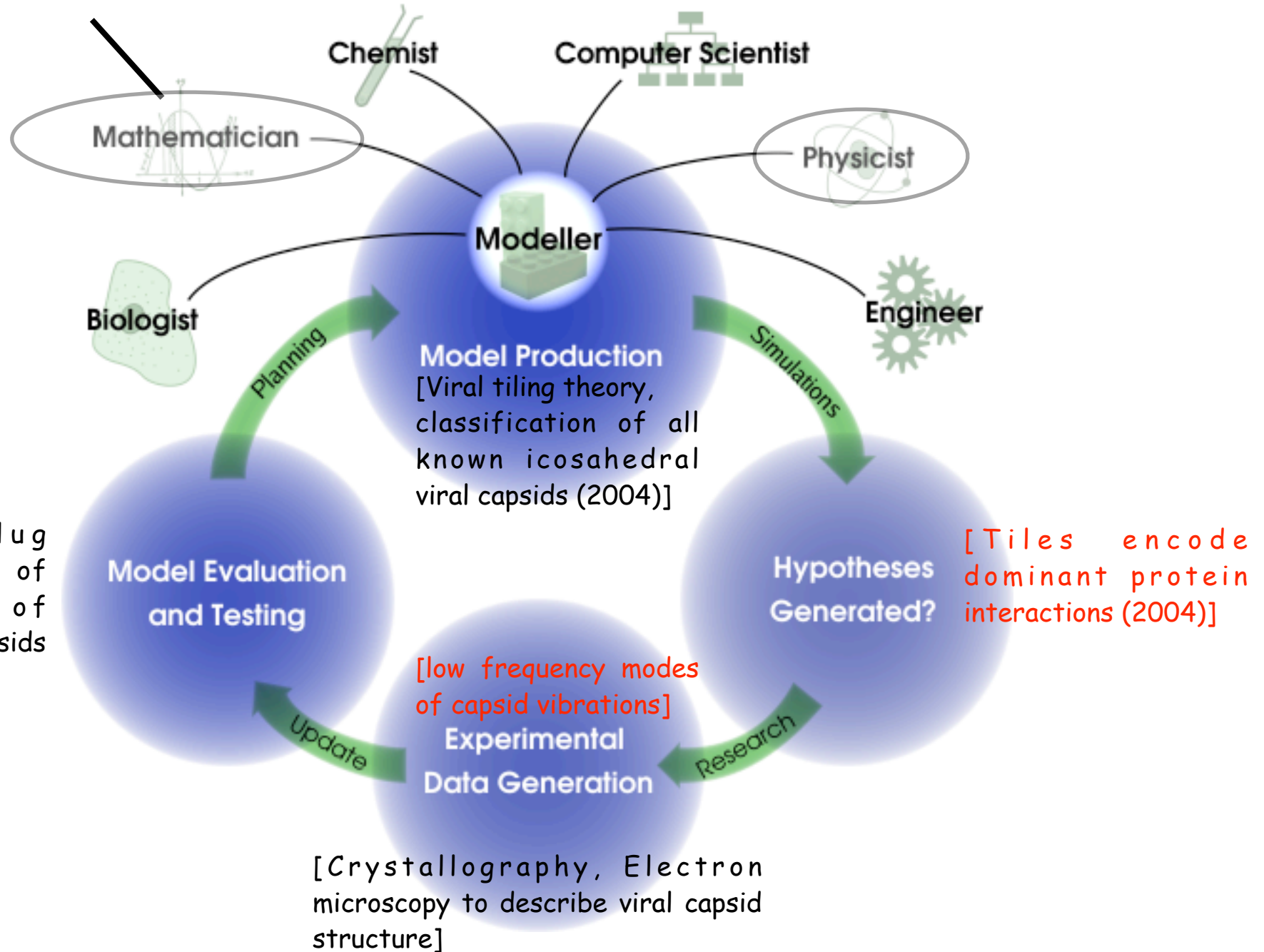
# Integrative biology



# New Maths

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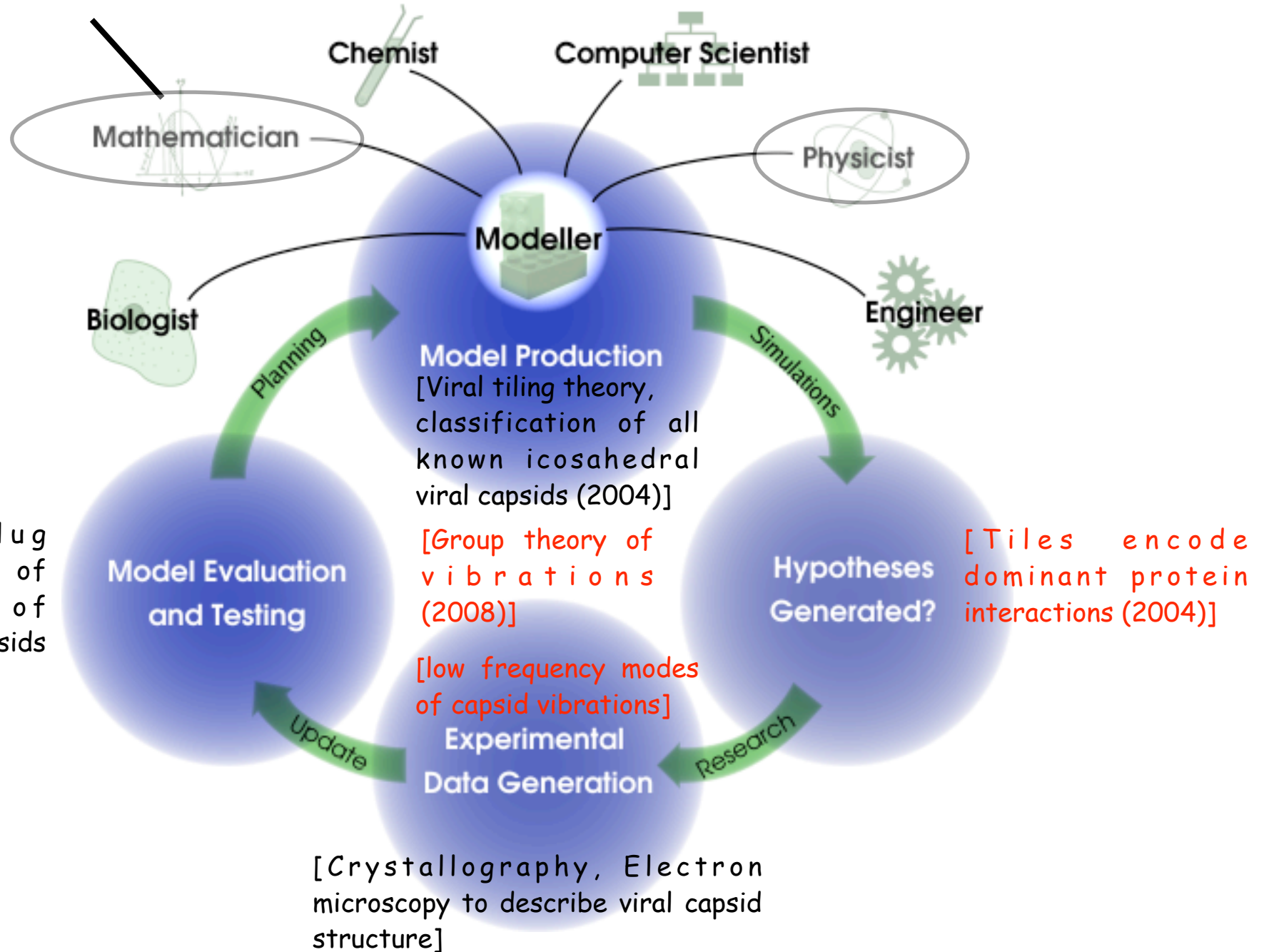
# Integrative biology



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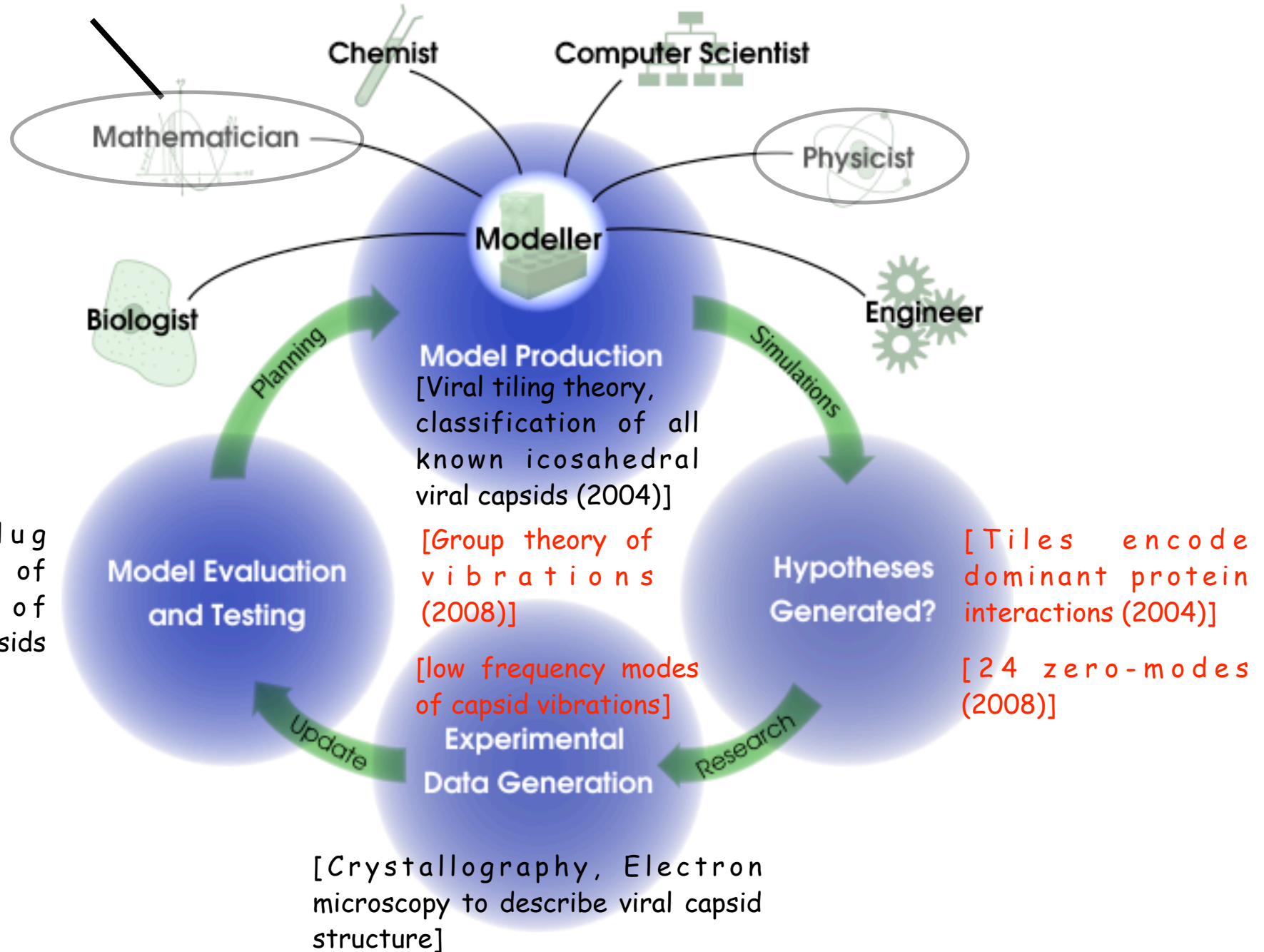




# New Maths

[Affine non-crystallographic  
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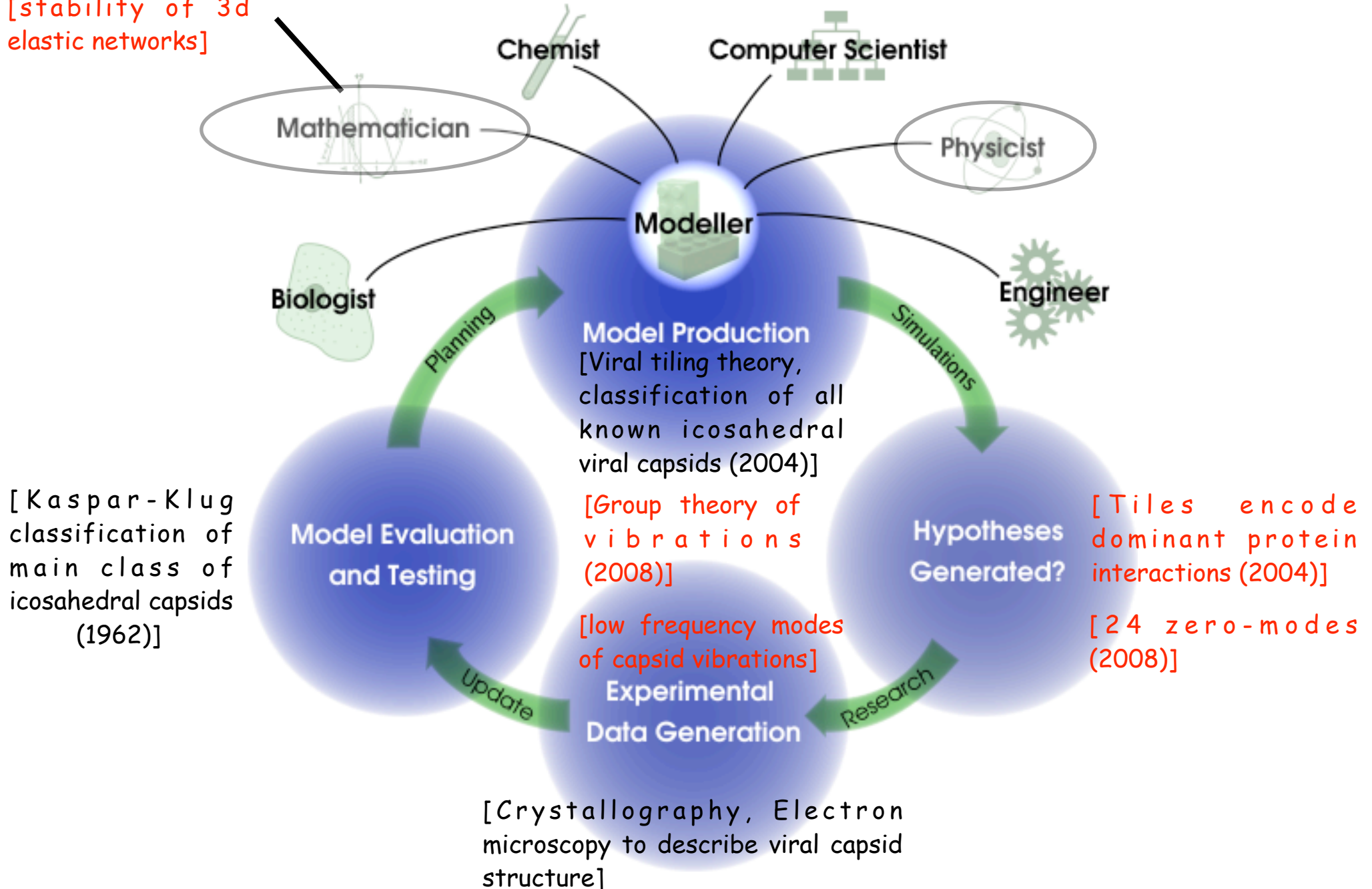


# New Maths

[Affine non-crystallographic Coxeter groups]

[stability of 3d elastic networks]

# Integrative biology

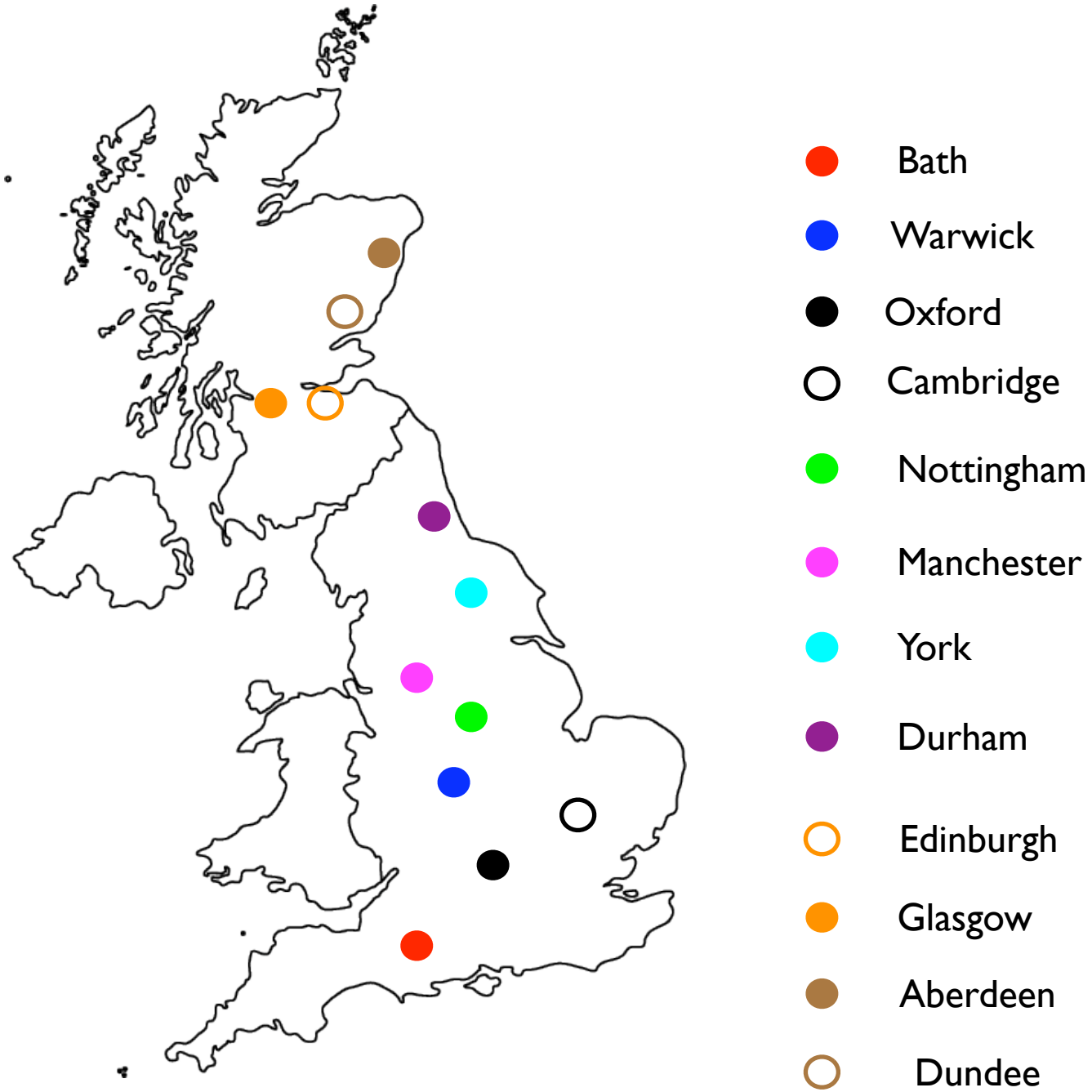


## *RAE 2008*

### *Sector Overview UoA 21: Applied Mathematics*

*Mathematical Biology:* The sub-panel noted the continued growth in this area. Strong groups were present in 13 submissions and many institutions expressed plans to expand their research in this area; some **13 of the early career researchers** were declared in this area. There is a **great breadth of coverage**, from biology and medicine right through to ecology and epidemiology. A number of groups are involved in large, **inter-departmental, multi-disciplinary research efforts**. There has been significant growth in applications in medicine. Scope remains for increased attention to problems which lead to significant advances in either science or mathematics, or both.

# Mathematical Biology in the UK (not complete)



# Centre for Mathematical Biology - Bath University

## Biology and Biochemistry

[Steve Dorus](#), evolutionary genetics and genomics.  
[Edward Feil](#), molecular evolution, recombination and population structure of bacterial pathogens.  
[Laurence Hurst](#), evolutionary genetics.  
[Alex Jeffries](#), functional genomics, molecular evolution, and bioinformatics.  
[Robert Kelsh](#), vertebrate developmental biology, gene regulatory networks, cell migration.  
[Klaus Kurtenbach](#), genetic epidemiology and evolutionary ecology of vector-borne zoonoses.  
[Mike Mogie](#), understanding the factors favouring the evolution and maintenance of sexual and asexual reproduction.  
[Alan Rayner](#), fungi, complexity.  
[Tamas Szekely](#), evolutionary biology.  
[Matthew Wills](#), macroevolutionary patterns and the fossil record.

## Mathematical Sciences

[Nick Britton](#), ecology and evolution, reaction-diffusion.  
[Ben Adams](#), host-pathogen systems - epidemiology, evolution, diversity.  
[Merrilee Hurn](#), Markov chain Monte Carlo methods, including image analysis.  
[Hartmut Schwetlick](#), analysis, PDEs, applied mathematics, modelling, numerics.  
[Gavin Shaddick](#), statistics, epidemiology.  
[Vadim Shcherbakov](#), spatial point processes and interacting particle systems.  
[Jane White](#), ecology, epidemiology.

## Computer Science

[Joanna Bryson](#), understanding natural intelligence, designing intelligent systems.  
[Mariana De Vos](#), knowledge representation and reasoning, evolutionary game theory.

## Management

[Neil Allan](#), disease theory and risk.  
[Christos Ioannidis](#), linear econometric models; non-linear, and long-memory time series dynamic models.  
[Andreas Krause](#), networks, agent-based simulations.

## Mechanical Engineering

[William Megill](#), biomimetics, comparative biomechanics, behavioural ecology, coastal oceanography.

## Pharmacy and Pharmacology

[Begona Delgado-Charro](#), drug delivery, non-invasive monitoring and pharmacokinetic profiling across the skin.

## Physics

[Dick James](#), animal aggregation.  
[Alain Nogaret](#), spiking semiconductor neurons (experimental).

## Psychology

[Suzanne Skevington](#), psychosocial aspects of HIV/AIDS, depression, exercise, dementia, etc, especially in relation to quality of life.

# Mathematics Institute Warwick - Mathematical Biology

**David Rand:** Genetic circuits in clocks, pure and applied [dynamical systems](#)

**Nigel Burroughs:** [Mathematical immunology](#), especially control and regulation of the immune system, [graph theory and phylogenetics](#), signalling and gene regulation, statistical methods for gene network inference. Most of my work is a mix of modelling and data analysis.

**David Epstein:** Phylogenetic tree construction, on the basis of sequence data. Combinatorial, computational and statistical issues which arise in the study of proteins in cell biology.

**Ian Stewart:** Pattern formation in networks of dynamical systems, with applications to animal locomotion, neuroscience, and ecosystems.

**Robert MacKay:** Dynamical systems, mathematical physics, and complexity science



# Glasgow Department of Mathematics - Mathematical Biology

**Martin Bees:** Bioconvection. Biological control of pests. Bacterial [pattern formation](#). Plankton patchiness.

**Christina Cobbold:** [Population dynamics](#). Spatial Ecology. Evolutionary ecology. Arterial disease.

**Nick Hill:** Arterial disease. Circulation of blood. Bioconvection. Plant population dynamics. Random walks and animal movement.

**Kenneth Lindsay:** Neuron morphology. Neuron function. Spiking [neural networks](#). Point processes and stochastic differential equations.

**Xiaoiu Luo:** Arterial disease. [Computational Biomechanics](#). Flow in airways. Fluid/structure interaction (FSI). Gall bladder diseases. Heart valves.

**Ray Ogden:** [Mechanics of biological tissues](#). Arteries.

**Radostin Simitev:** Waves in cardiac tissue.

**Tianhai Tian:** Genetic regulatory networks. [Cell signal transduction pathways](#). Calcium signalling and regulation. Stochastic simulation.

# School of Mathematical Sciences Nottingham - Mathematical Medicine and Biology

**Helen Byrne:** Growth and treatment of solid tumours, tissue engineering and stem cell biology. **Mathematical tools:** nonlinear dynamics, asymptotic analysis, continuum mechanics and multiscale-hybrid modelling.

**Stephen Coombes:** Role of branching dendrites with active spines on single neuron output. Effect of cannabinoids on emergent neural network dynamics . Waves and patterns in tissue level models of synaptic and EEG. **Mathematical tools:** nonlinear dynamics and statistical physics.

**Linda Cummings:** Growth and treatment of solid tumours, tissue engineering and stem cell biology. **Mathematical tools:** nonlinear dynamics, asymptotic analysis, continuum mechanics and multiscale-hybrid modelling.

# York University: York Centre for Complex Systems

**Reidun Twarock:** development and application of [group theoretical and algebraic methods](#) in mathematical biology, carbon chemistry and mathematical physics.

**Jamie Wood:** computational and analytic techniques in statistical mechanics to further our knowledge of the stability and robustness of natural systems. Flocking or herding behaviour in animals ([network rewiring](#)).

## Durham University: Biomathematics group

**Kasper Peeters:** Dynamical processes within the cell. Protein and virus conformational changes.

**Bernard Piette:** Dynamical processes within the cell. Cytoskeleton.

**Anne Taormina:** Protein and virus conformational changes. Viral capsid assembly. Construction of DNA cages.

**Ian Vernon:** modelling of intracellular chemical reaction networks as stochastic processes, applying Bayesian inference to the rate constants of such reaction networks, and the adaptation of deterministic computer model calibration techniques to the stochastic case, in view of applying them to systems biology models.

**Wojtek Zakrzewski:** Dynamical processes within the cell. Cytoskeleton.

**New lecturer (October 2009)**

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## Department of Mathematical Sciences



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