

The Time Complexity of Self-Assembly

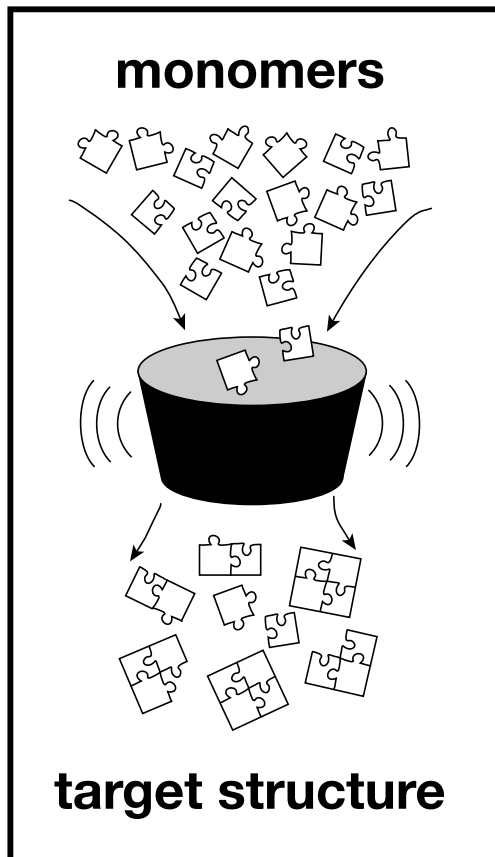
Erwin Frey



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Heterogeneous & homogeneous self-assembly

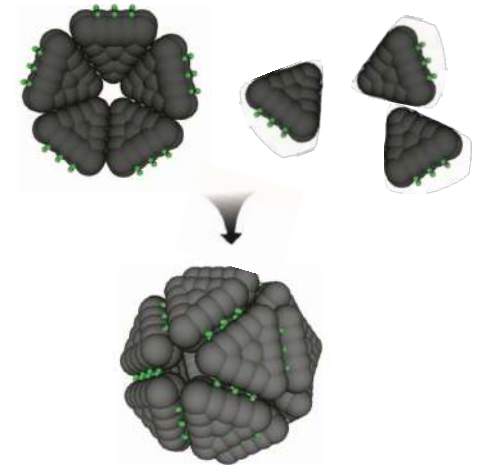


DNA Origami
(information-rich)



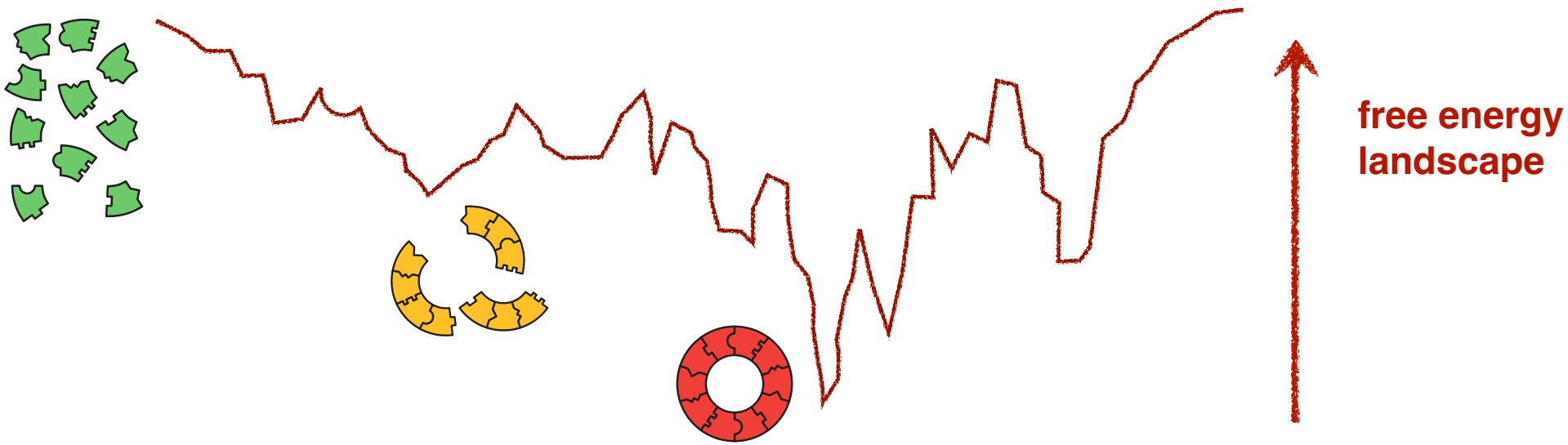
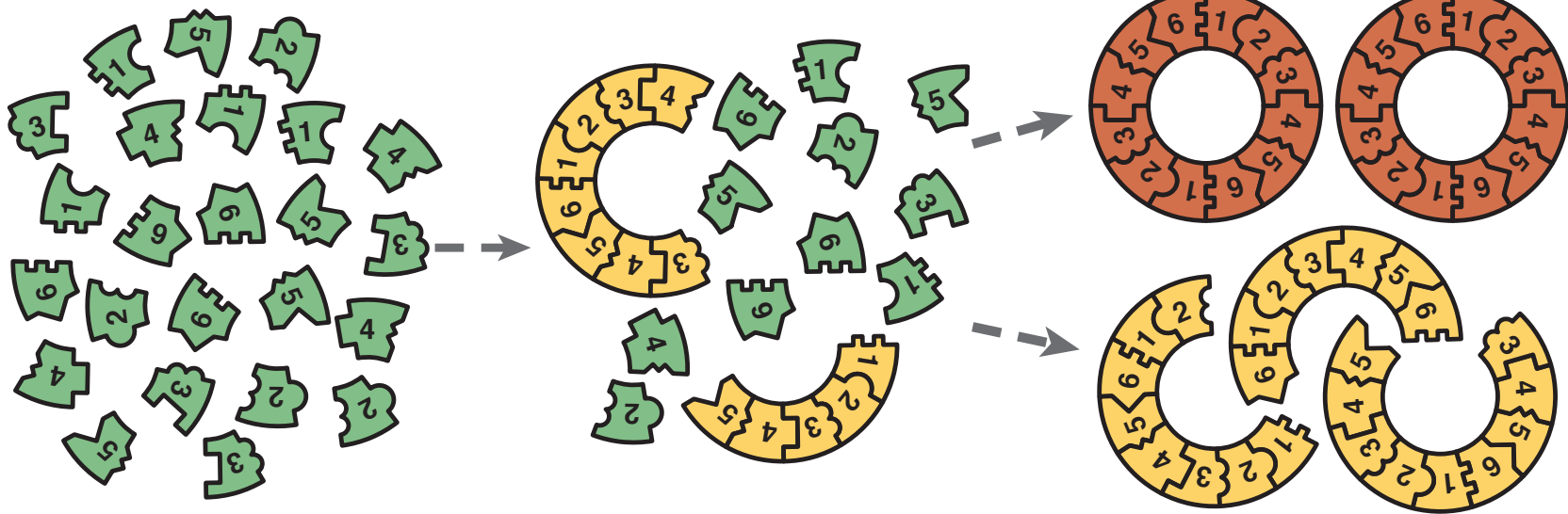
Hedges et al. *Soft Matter* 10, 6404 (2014)
Murugan et al. *Nat Commun* 6, 6203 (2015)

Viral Capsid Assembly
(information-poor)



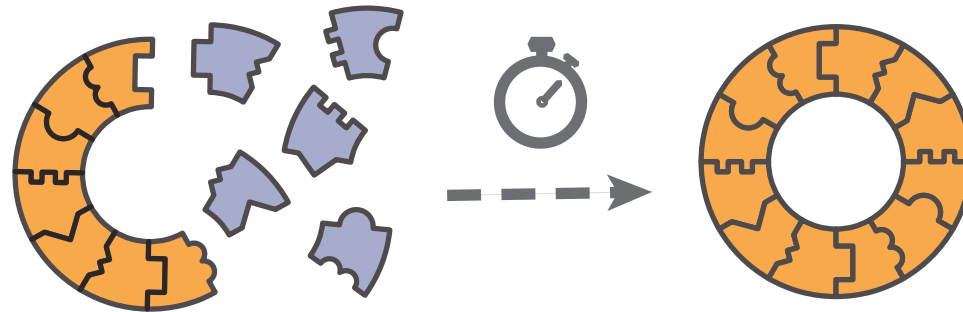
Chen et al. *J Phys Chem A* 112, 9405 (2008)
Hagan et al. *J Chem Phys* 135, 104115 (2011)
Michaels et al. *Sci Rep* 7, 12295 (2017)

Nucleation must be significantly slower than growth



Time complexity of self-assembly

How fast can one reach the self-assembled state?



Even if the steady state is an equilibrium state
this is a question of dynamics!

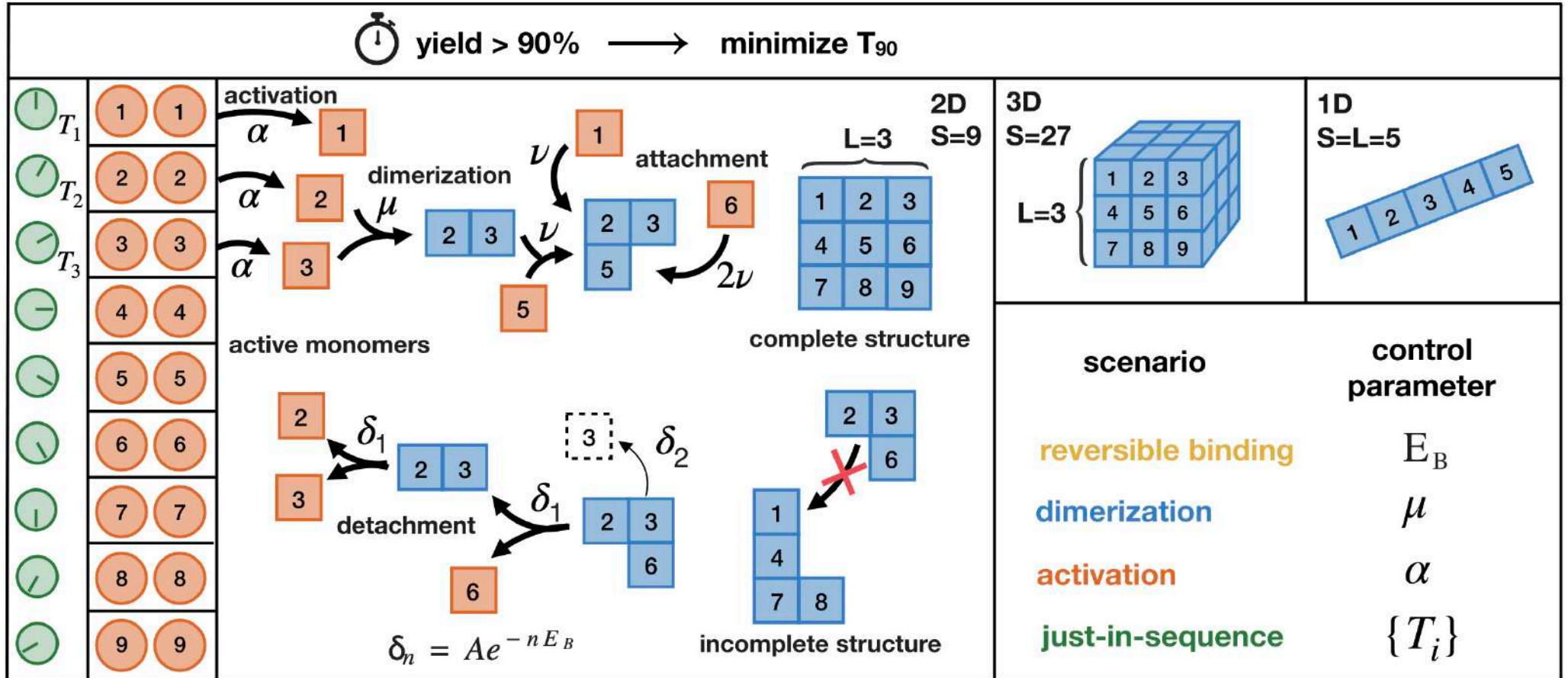
Gartner, Graf & Frey, eLife 9, e51020 (2020), PNAS 119, e2116373119 (2022)

Self-assembly “algorithms”

Assembly is a “computational problem”

Gartner, Graf & Frey, eLife 9, e51020 (2020), PNAS 119, e2116373119 (2022)

A conceptual self-assembly model



Gartner, Graf & Frey, eLife 9, e51020 (2020), PNAS 119, e2116373119 (2022)

Self-assembly scenarios (control)

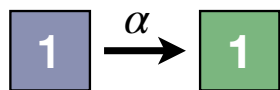
supply control

just-in-sequence scenario



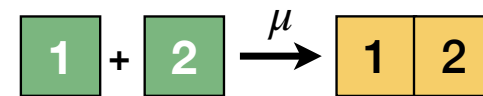
$$T_1 < T_2 < T_3 < \dots$$

activation scenario

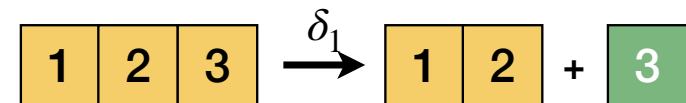


molecular control

dimerization scenario



reversible binding scenario



Computer Science

computational problem

algorithm

termination criterion

CPU time

input size

$$T(S) = ?$$



Self-Assembly

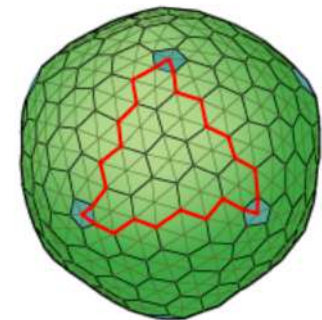
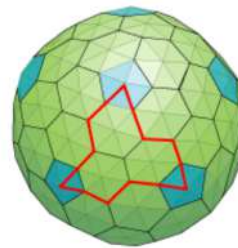
biological self-assembly

assembly scenario

90% yield

real time

size of target structure



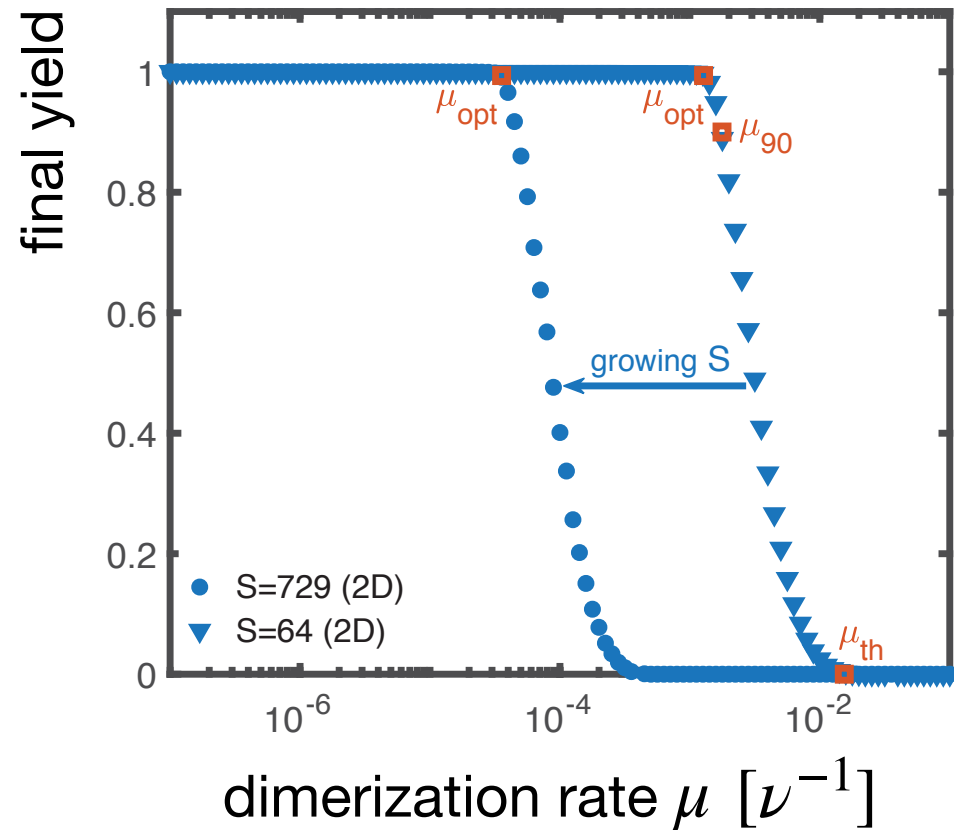
Yield curves (steady states)



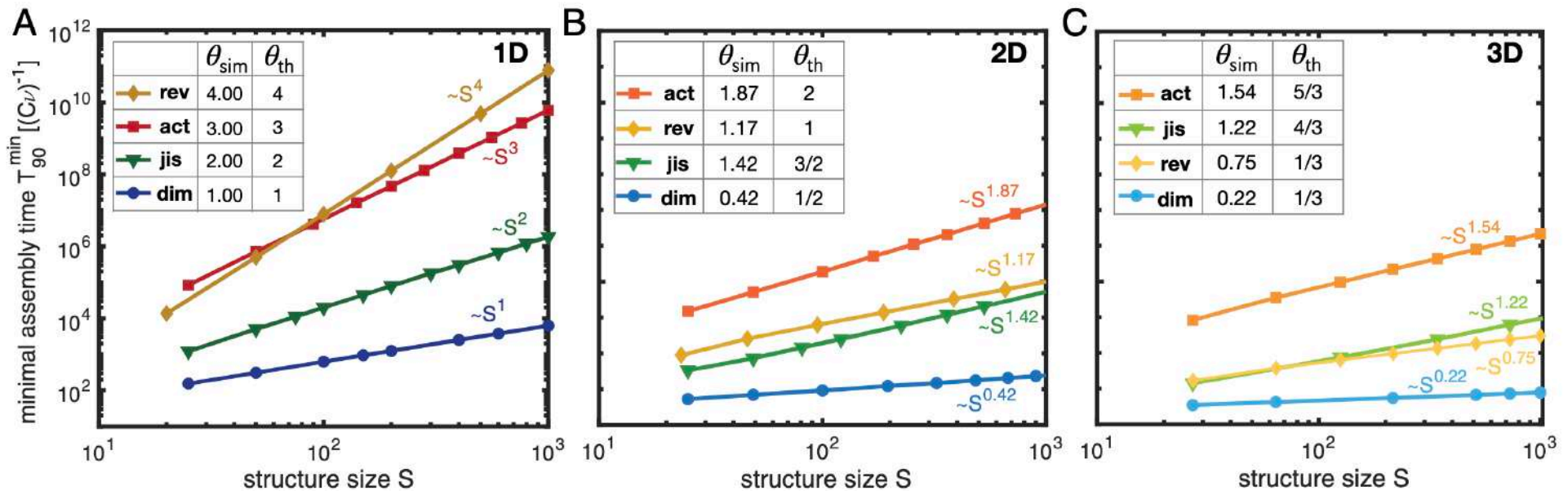
dimerization limits nucleation

What is the dimerisation rate that minimises the time to achieve a yield of 90%?

μ_{opt} : 90% yield
in minimal time



Time complexity scaling (universality)



Control parameter P

Structure size S

$$P \sim S^\phi \Rightarrow T_{90} \sim S^\theta$$

ϕ : control parameter exponent

θ : time complexity exponent

Scaling analysis exemplified for dimerization

Slow nucleation principle:

$$\frac{\text{\# nucleation events}}{\text{\# attaching monomers}} \sim 1/S$$

Dimerization scenario: decreasing the dimerization rate μ disfavours initiation of new structures relative to the growth of existing structures.

$$\mu_{\text{opt}} S/\nu \sim 1/S$$

$$\mu_{\text{opt}} \sim \nu/S^2$$

Dimerization is the rate-limiting step.

$$T_{\text{min}} \sim (C \mu_{\text{opt}} S)^{-1} \sim (C\nu)^{-1} S$$

Time complexity exponent: $\theta = 1$

How to transfer the result from 1d to 2d to 3d?

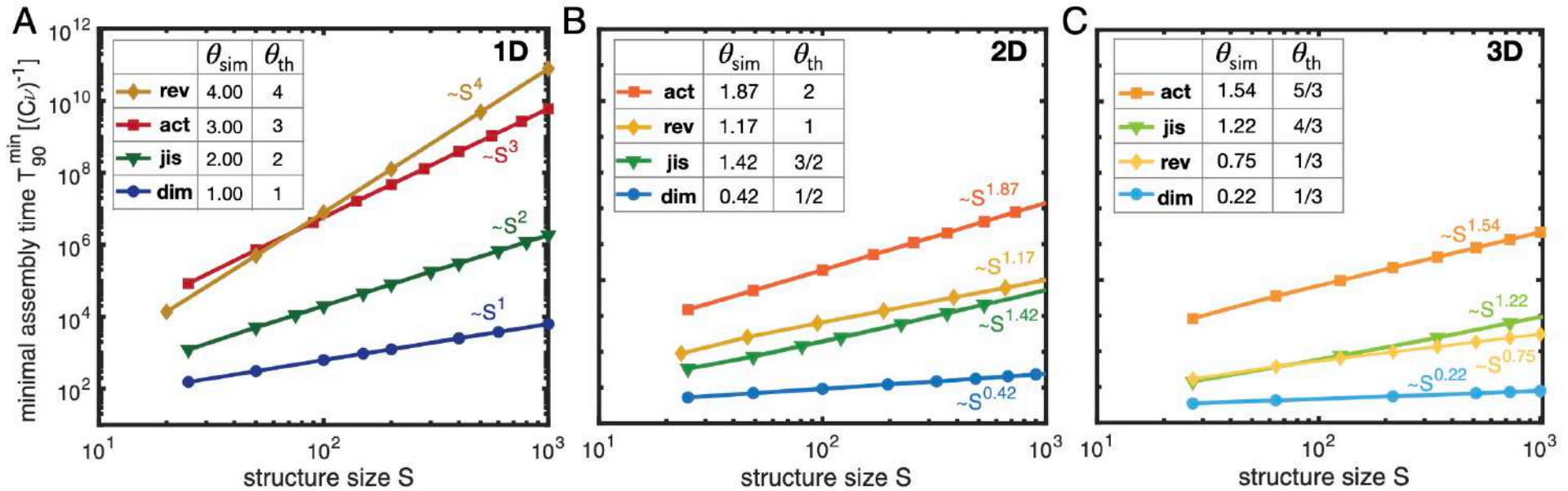
$$\text{Volume} \sim R^d \sim S$$

$$\text{Area} \sim R^{d-1} \sim S^{(d-1)/d} \quad \Rightarrow \quad \nu \rightarrow \nu S^{(d-1)/d}$$

$$\Rightarrow T_{\text{min}} \sim S^\theta \quad \text{with} \quad \theta = 1 - \frac{d-1}{d}$$

Dimerization

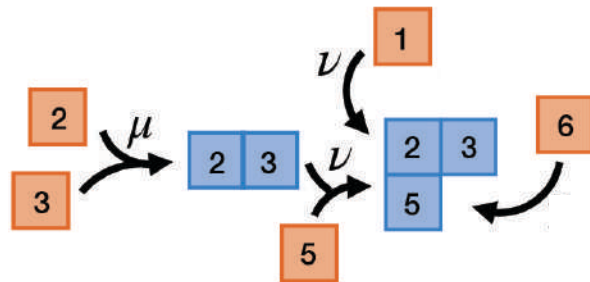
$$T_{\min} \sim S^\theta \quad \text{with} \quad \theta = 1 - \frac{d-1}{d} = \frac{1}{d}$$



Dimerization scenario

$$\mu \ll \nu$$

allosteric effects, enzymes

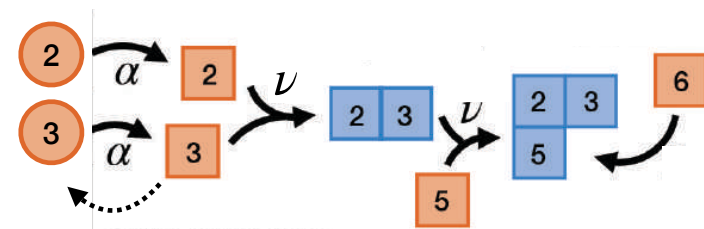


flagellum⁽¹⁾, viruses⁽²⁾, ribosomes

Activation scenario

$$\alpha \ll C\nu$$

slow production/injection, NTPases



viruses⁽²⁾, membrane attack complex⁽³⁾

(1) Caspar, D. L. Movement and self-control in protein assemblies. Quasi-equivalence revisited. *Biophysical Journal*, 32(1), 103–138 (1980)

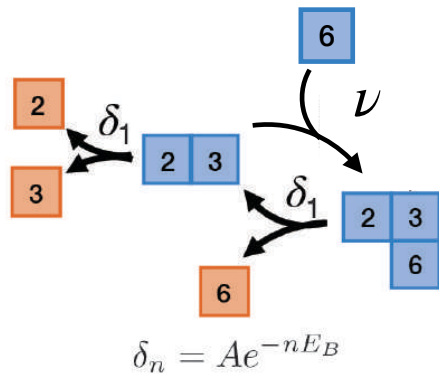
(2) Lazaro, G. R. & Hagan, M. F. Allosteric Control of Icosahedral Capsid Assembly. *J. Phys. Chem. B* **120**, 6306–6318 (2016).

(3) Leung, C. *et al.* Stepwise visualization of membrane pore formation by suliyisin, a bacterial cholesterol-dependent cytolysin. *Elife* **3**, e04247 (2014).

Reversible binding scenario

$$\delta \gg C\nu$$

reduced binding energy, high temperature

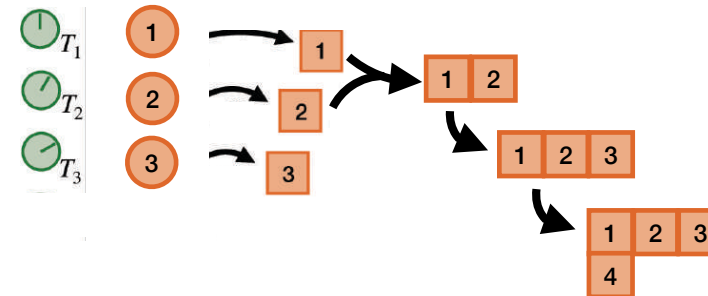


virus capsids⁽³⁾, DNA nanotechnology⁽⁴⁾

Just-in-sequence scenario

$$T_1 < T_2 < T_3 < \dots$$

coordinated supply, gene expression



DNA nanotechnology

supply protocol (2D)

v	iv	iii	iv	v
iv	iii	ii	iii	iv
iii	ii	i	ii	iii
iv	iii	ii	iii	iv
v	iv	iii	iv	v

(3) Rapaport, D. C. Role of reversibility in viral capsid growth: A paradigm for self-assembly. *Phys. Rev. Lett.* **101**, 1–4 (2008).

(4) Hong, F., Zhang, F., Liu, Y. & Yan, H. *DNA Origami: Scaffolds for Creating Higher Order Structures. Chemical Reviews* **117**, (2017).

Morphology of building blocks

Shape matters!

Gartner & Frey, under review




Strong binding & preferred kinetic pathways

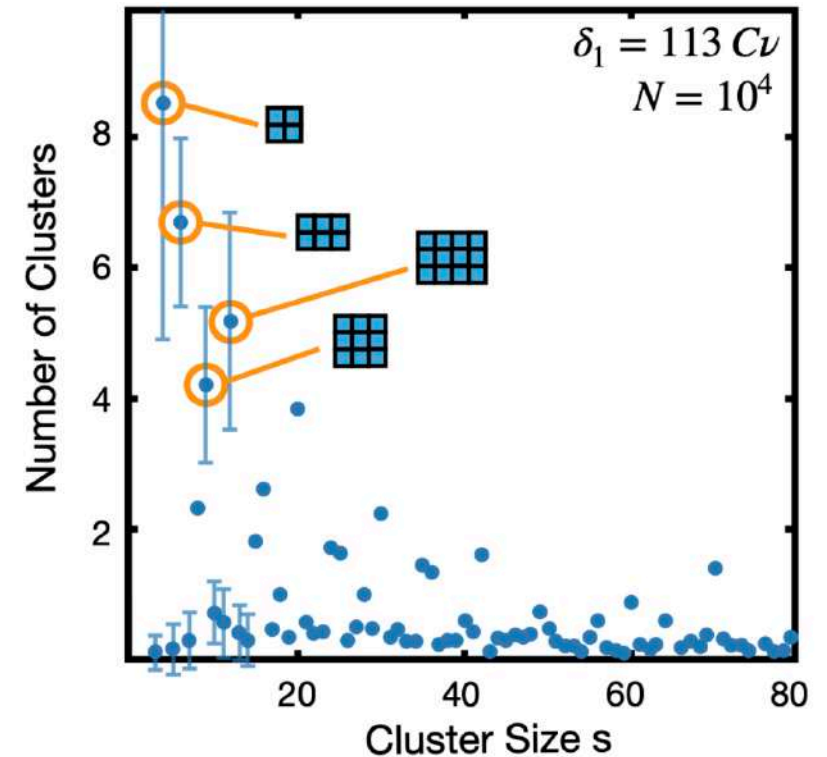
Detachment rate: $\delta_n \sim \exp[-n E_{\text{bind}}/k_B T]$

Strong binding limit: $\delta_1 \gg \delta_2$

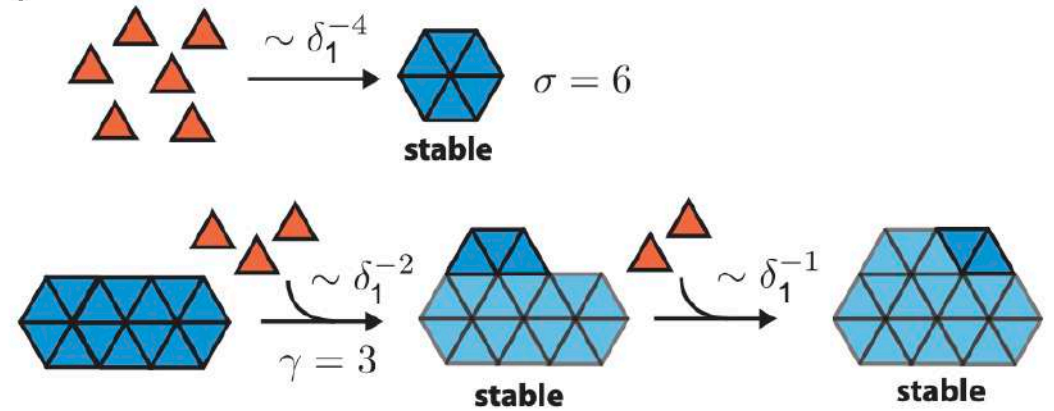
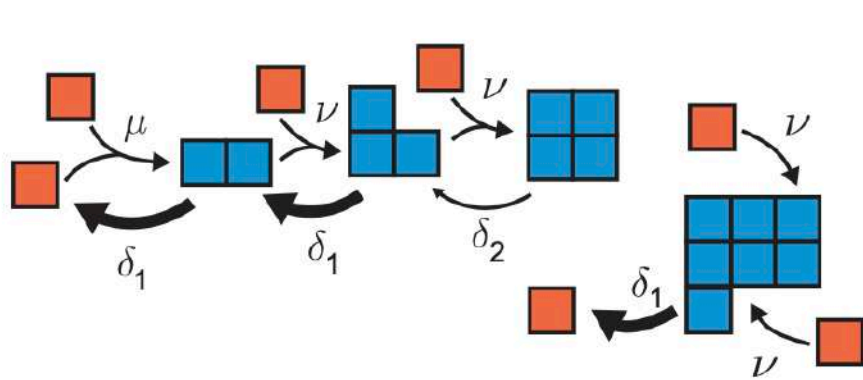
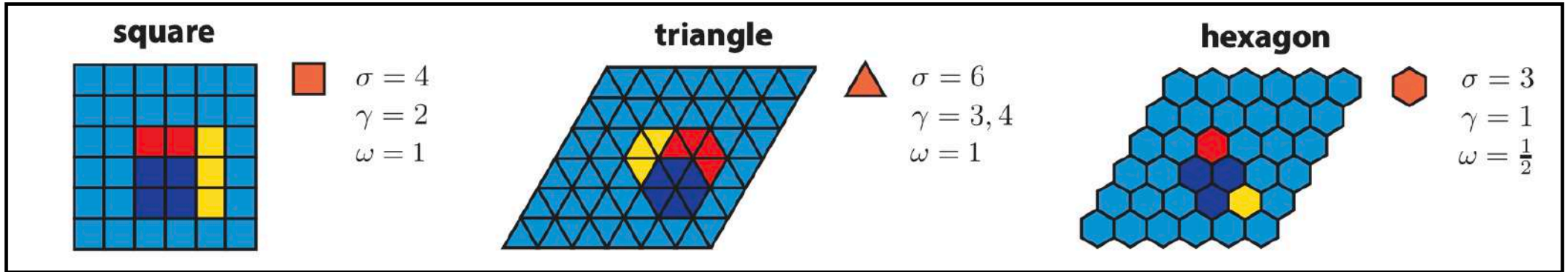
Bonds with two binding partners are unbreakable



	$\sigma = 4$	nucleation size
	$\gamma = 2$	attachment order
	$\omega = 1$	growth exponent

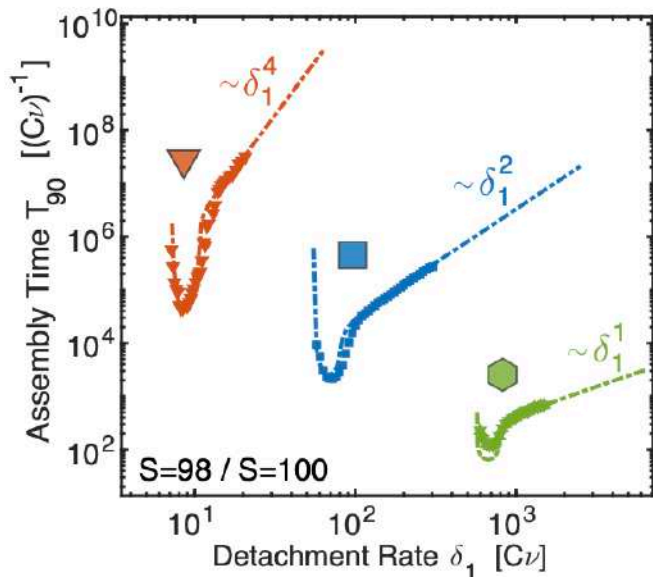


Initial nucleation — Secondary nucleation — Growth ('domino effect')

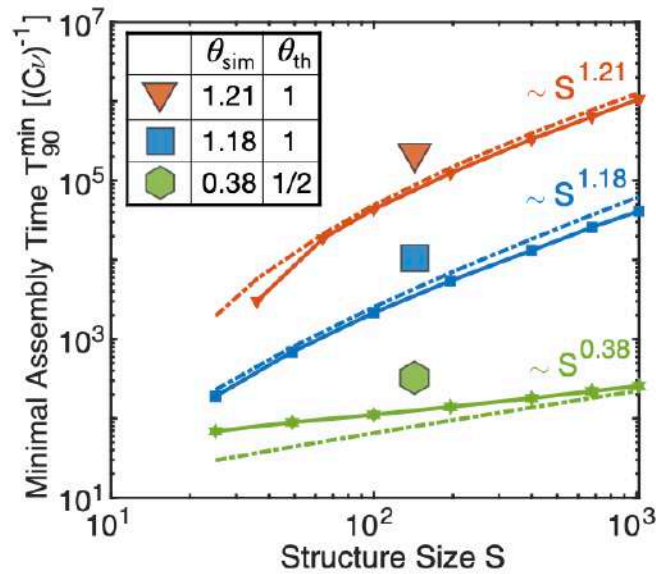


Initial nucleation — Secondary nucleation — Growth ('domino effect')

Scaling laws & assembly exponents

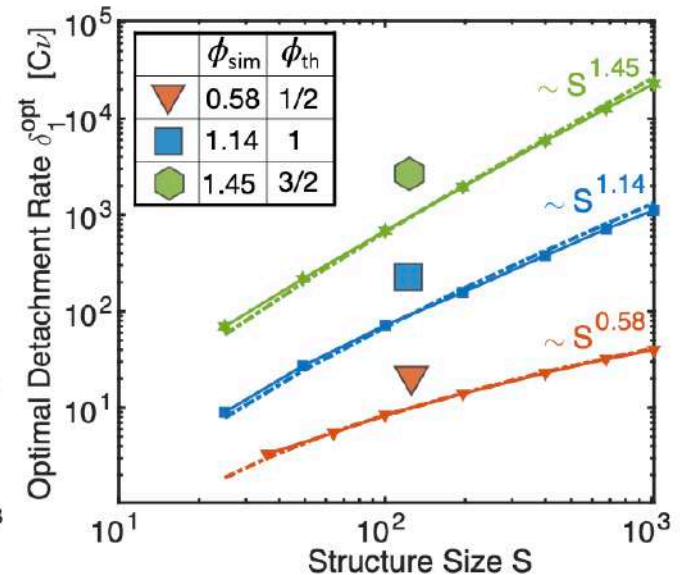


There is an optimal detachment rate
(control parameter)



Minimal assembly time shows
power law in structure size

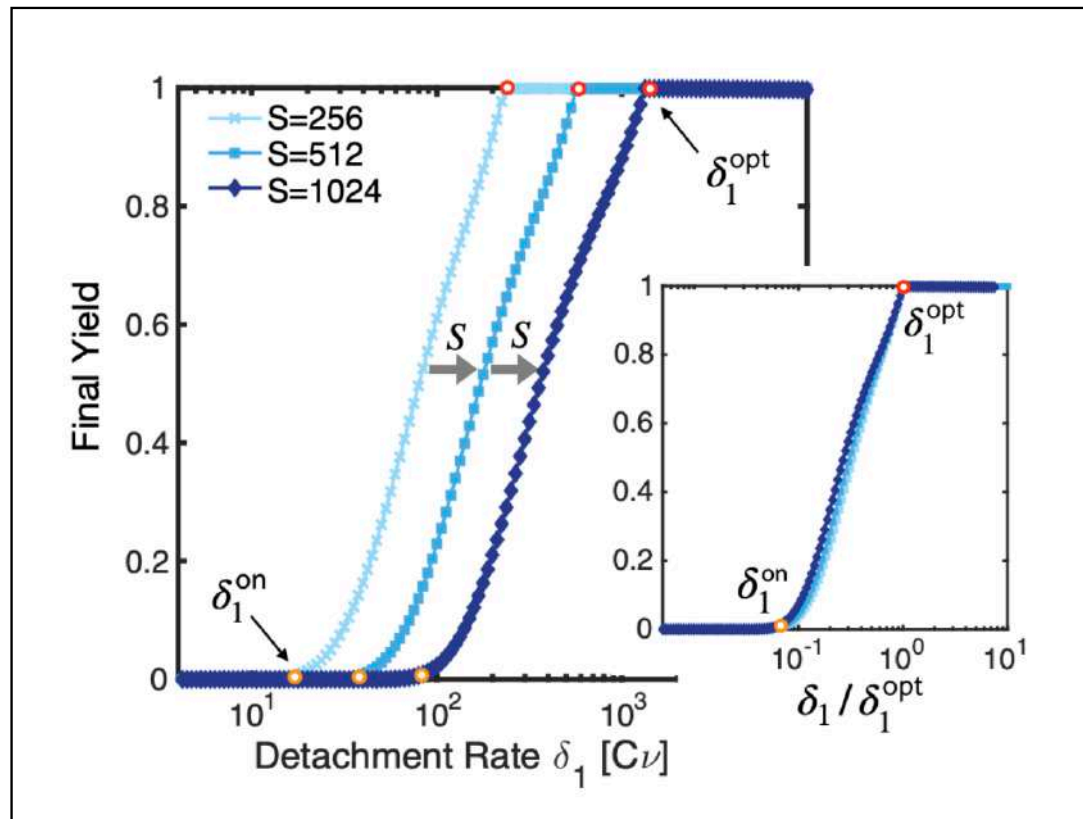
$$T_{\min} \sim S^{\theta}$$



Optimal detachment rate shows
power law in structure size

$$\delta_1^{\text{opt}} \sim S^{\phi}$$

Scale invariance!



There is a scaling curve for the final yield as a function of the detachment rate.

Effective kinetic model

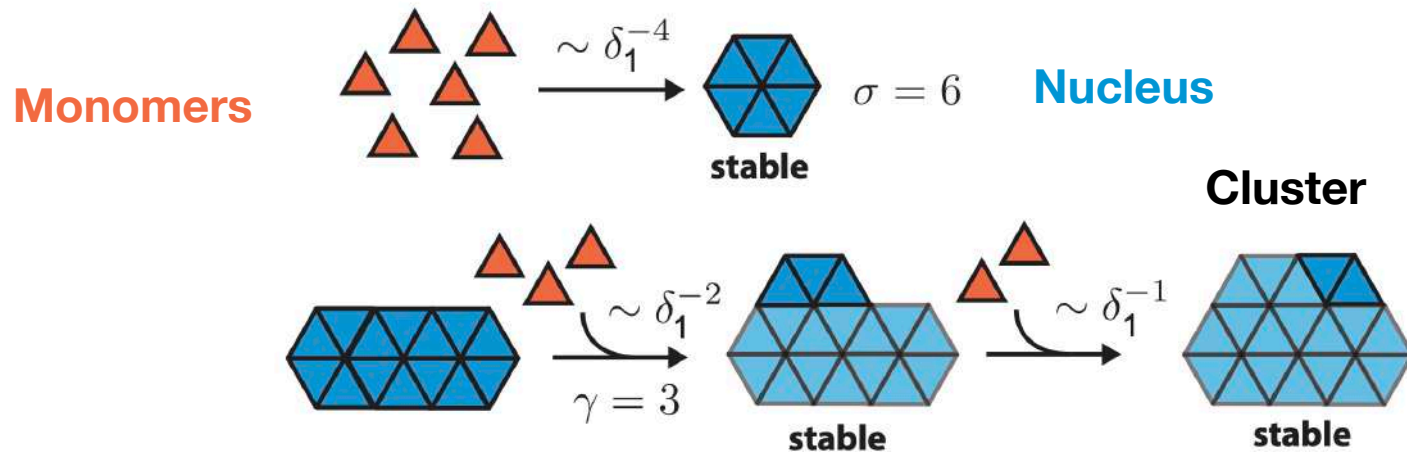
Monomers

Nucleus

Cluster

$$\begin{aligned} \partial_t m(t) &= -\sigma \bar{\mu} m^\sigma(t) - \bar{\nu} m^\gamma(t) \sum_{s=\sigma}^{S-1} f_s c_s(t), \\ \partial_t c_\sigma(t) &= \bar{\mu} m^\sigma(t) - \bar{\nu} m^\gamma(t) f_\sigma c_\sigma(t), \\ \partial_t c_s(t) &= \bar{\nu} m^\gamma(t) [f_{s-1} c_{s-1}(t) - f_s c_s(t)]. \end{aligned}$$

combinatorial factor: $f_s = a s^\omega$



Scale invariance of assembly kinetics

Monomers $\partial_t m(t) = -a \bar{\nu} m^\gamma \int_\sigma^S s^\omega c(s) ds$

Nucleus $a \bar{\nu} m^\gamma(t) \sigma^\omega c(\sigma, t) = \bar{\mu} m^\sigma(t)$

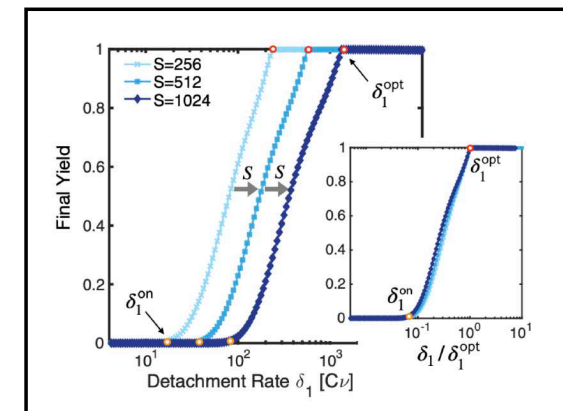
Cluster $\partial_t c(s, t) = -a \bar{\nu} m^\gamma \partial_s [s^\omega c(s)]$

These differential equations exhibit scale invariance!

$$m(t, \delta_1, S) = C \tilde{m}(S^{-\theta} \tilde{t}, S^{-\phi} \tilde{\delta}_1)$$

$$c(s, t, \delta_1, S) = C S^{-2} \tilde{c}(S^{-1} s, S^{-\theta} \tilde{t}, S^{-\phi} \tilde{\delta}_1)$$

Scaling law: $T_Y(\delta_1, S) = S^\theta \tilde{T}_Y(S^{-\phi} \delta_1)$



Exponents determined by assembly parameters

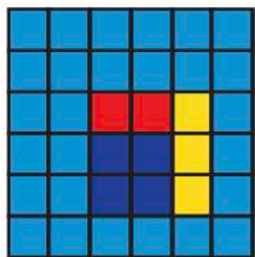
Control parameter exponent: $\delta_1^{\text{opt}} \sim S^\phi$


$$\phi = \frac{2 - \omega}{\sigma - \gamma - 1}$$

Time complexity exponent: $T_{90}^{\text{min}} \sim S^\theta$

$$\theta = \frac{(1 - \omega)\sigma + \gamma + 2\omega - 3}{\sigma - \gamma - 1}$$


square



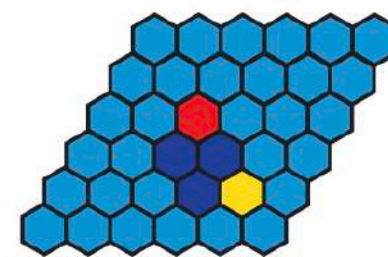
 $\sigma = 4$
 $\gamma = 2$
 $\omega = 1$


triangle



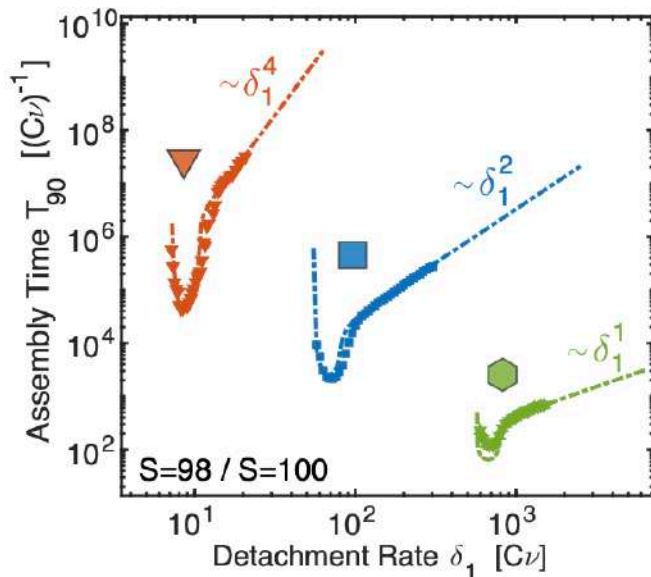
 $\sigma = 6$
 $\gamma = 3, 4$
 $\omega = 1$

hexagon

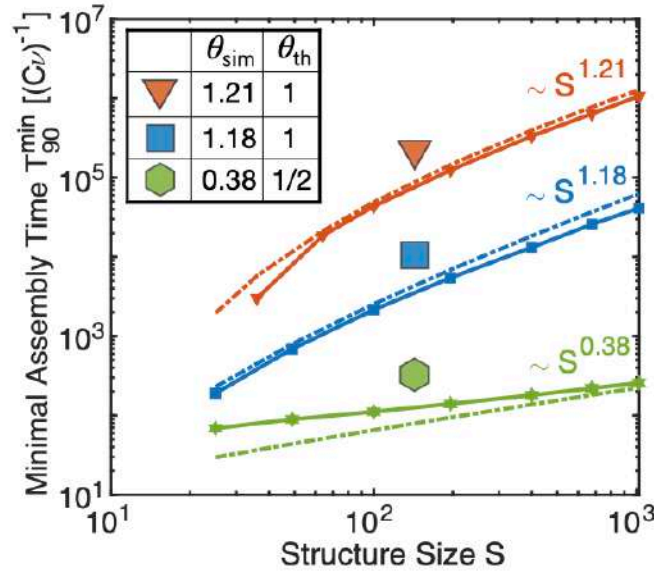


 $\sigma = 3$
 $\gamma = 1$
 $\omega = \frac{1}{2}$

Scaling laws & assembly exponents

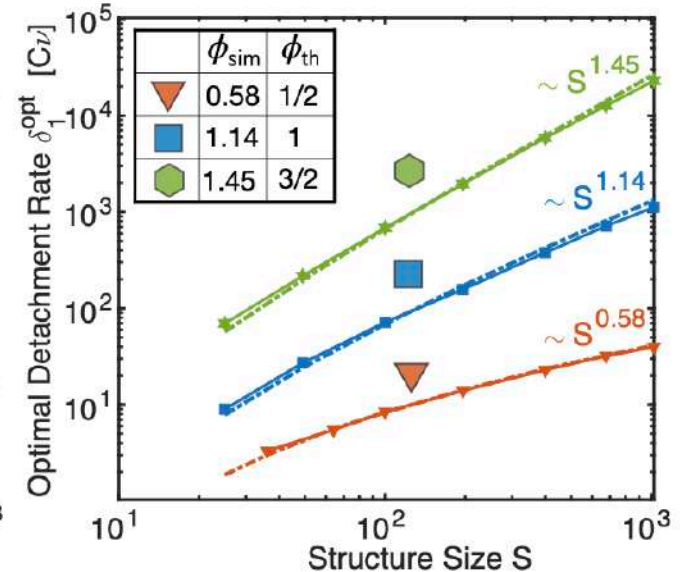


There is a optimal detachment rate
(control parameter)



Minimal assembly time shows
power law in structure size

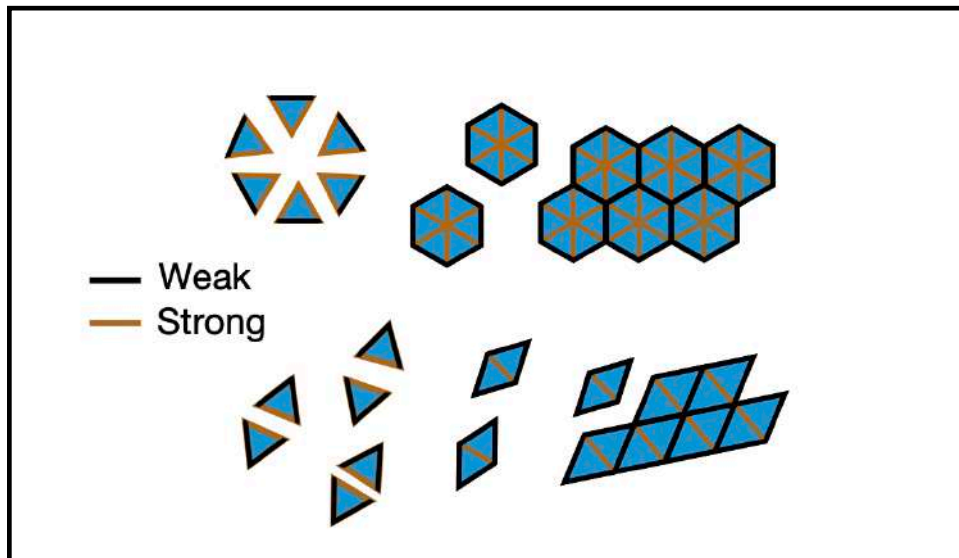
$$T_{\min} \sim S^{\theta}$$



Optimal detachment rate shows
power law in structure size

$$\delta_1^{\text{opt}} \sim S^{\phi}$$

How can we make assembly robust?

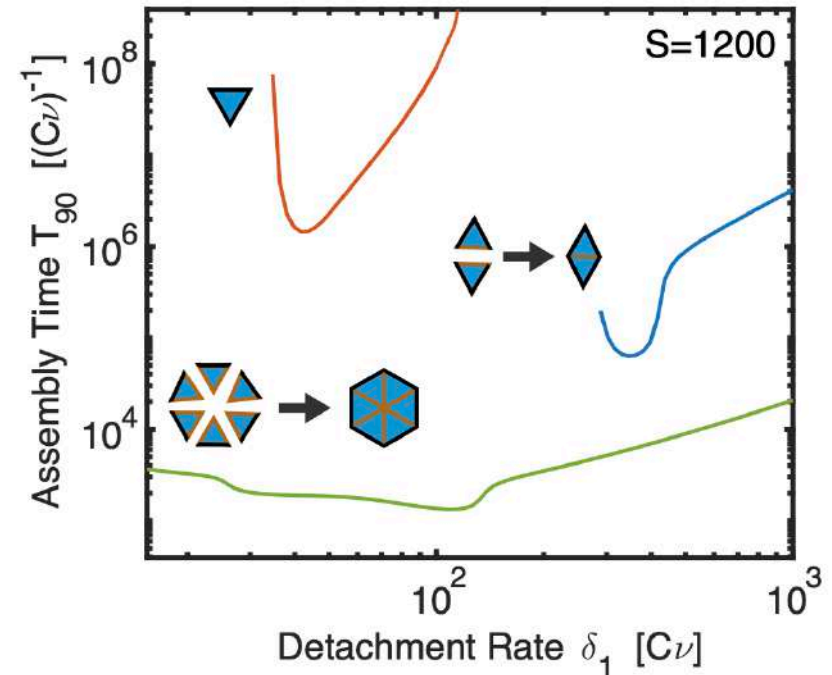


Hierarchical self-assembly schemes

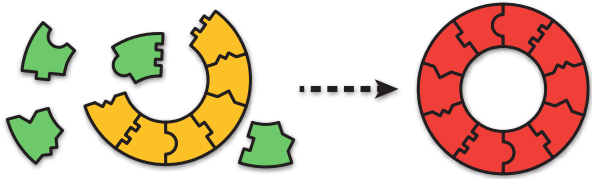
Make triangle-shaped building blocks form higher-order constituents

Huge reduction in assembly time

Increased robustness to parameter variations



Self-assembly dynamics - What we know



Slow nucleation principle

Time complexity of self-assembly $T(S) = ?$

Power laws and scaling laws

Morphology of the building blocks matters

Self-assembly dynamics - What we do not know

Information-rich vs. information-poor

Spatial and temporal organization

Size and shape control

Acknowledgements



Florian Gartner
(LMU)

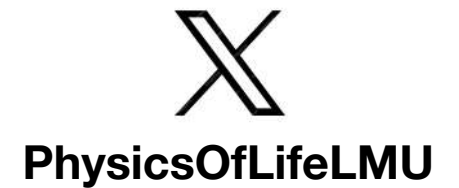


Isabella Graf
(Yale)

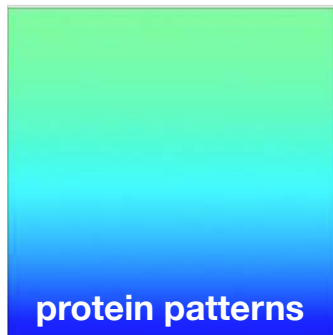


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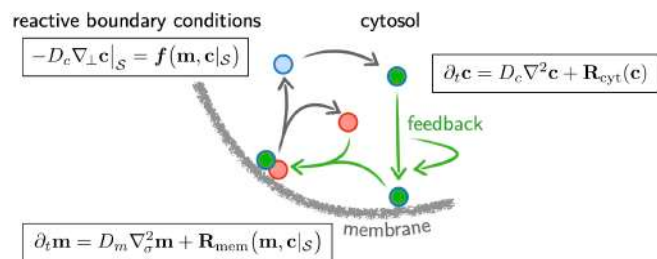
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Pattern formation in mass-conserving systems

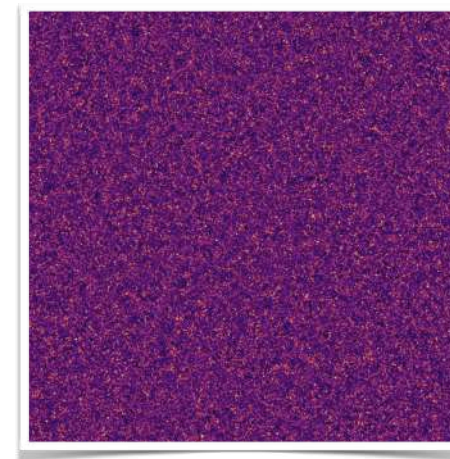


Nat Phys 21, PNAS 22, Nat Rev Phys 22,
Nat Comm 20-22, eLife 19, eLife 21



Nat Phys 18, PNAS 18
PRL 19, PRX 20, Nat Phys 21, PRL 21

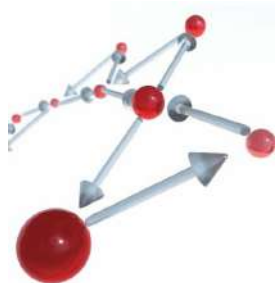
Active matter



Science 18, PNAS 20,
Nat Mat 22, Nat Comm 22

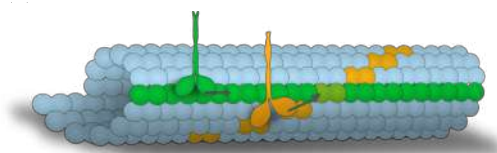
Theory of Living and Soft Matter

Topological phases in population dynamics



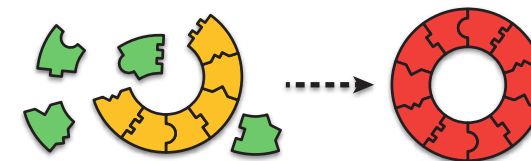
PRL 20, PRE 18

Intracellular transport



PRX 18, PRL 18, PNAS 20, PRL 21,
Science Adv 21, PRL 22

Self-assembly dynamics



eLife 20, PNAS 22, PRL 23