

# Open Quantum Systems: from qubits to quantum biology

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Resources:

[www.qutip.org](http://www.qutip.org)

Reviews: Lambert *et al.* Nature Physics (2013), Scholes *et al.*, Nature (2017).

J. Preskill, “Quantum Computing 40 years later”, arxiv:2106.10522

Breuer and Petruccione, “The theory of open quantum systems”

Supported by:



- From Manchester (Mancunian) UK, and PhD from the University of Manchester. Supervisor: Tobias Brandes



- 2005: JSPS Fellow @ The University of Tokyo (Prof. Akira Shimizu)



- 2008-2021: @ RIKEN (Dr. Franco Nori), became Senior Research Scientist in 2019.



# Overview:

## Part 1:

Introduction to qubits and quantum computing

From qubits to quantum biology

Introduction to QuTiP

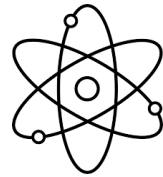
## Part 2:

Deriving approximate noise models: Lindblad master equation

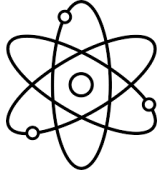
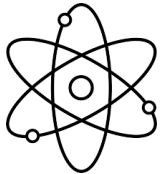
Non-perturbative methods: HEOM and reaction coordinates

# What is quantum computing in a nutshell?

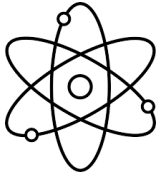
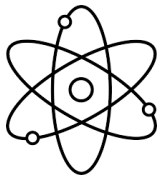
- Quantum systems are difficult to simulate on a classical computer



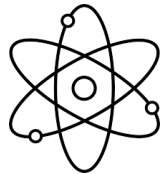
$$\psi = \alpha|0\rangle + \beta|1\rangle$$



$$\psi = \gamma|00\rangle + \epsilon|01\rangle + \zeta|10\rangle + \eta|11\rangle$$



...

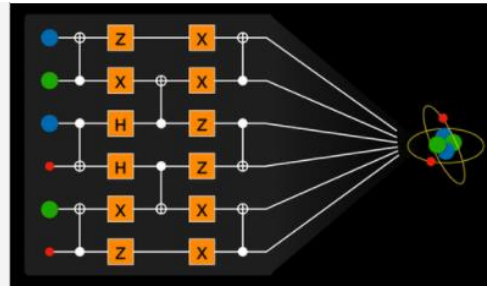


N atoms require  $2^N$  parameters.

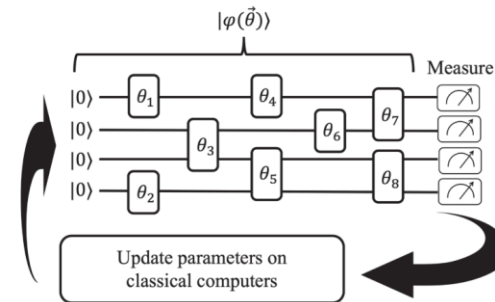
Efficient simulation of a quantum system requires a quantum system

If we build a computer from controllable quantum components (qubits) we can:

- Simulate other quantum systems (digital and analog, practical applications to quantum chemistry?), solve (some) optimization problems (variationally, annealing)



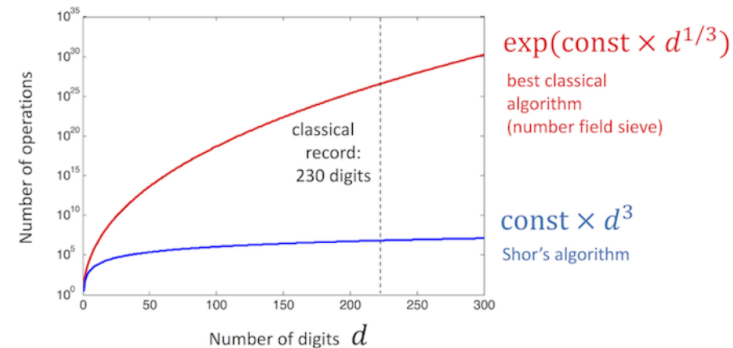
(Aspuru-Guzik)



(S. Endo et al, J. Phys. Soc 2020)

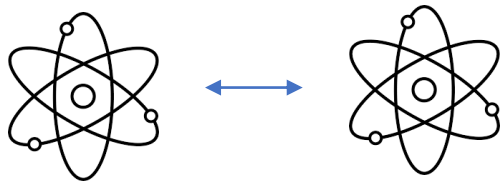
- Run certain algorithms faster than possible on a classical computer, e.g, Shor's algorithm, Grover's algorithm.

**Shor's algorithm:** Can find the prime factors of an integer exponentially faster than the best known classical algorithm, can then break public-key encryption like RSA.



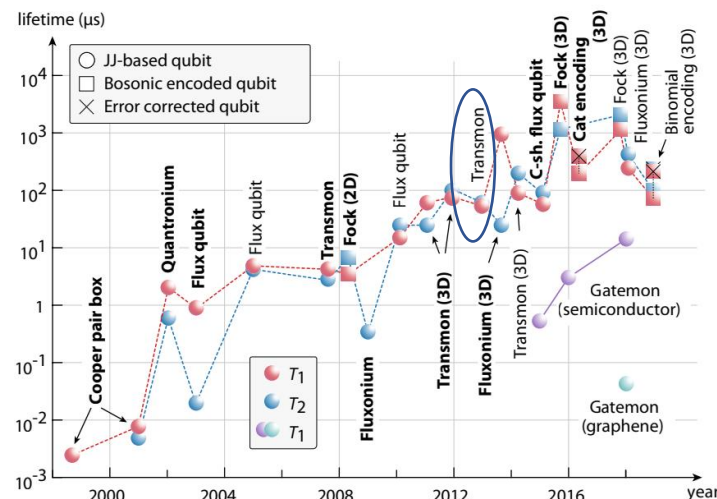
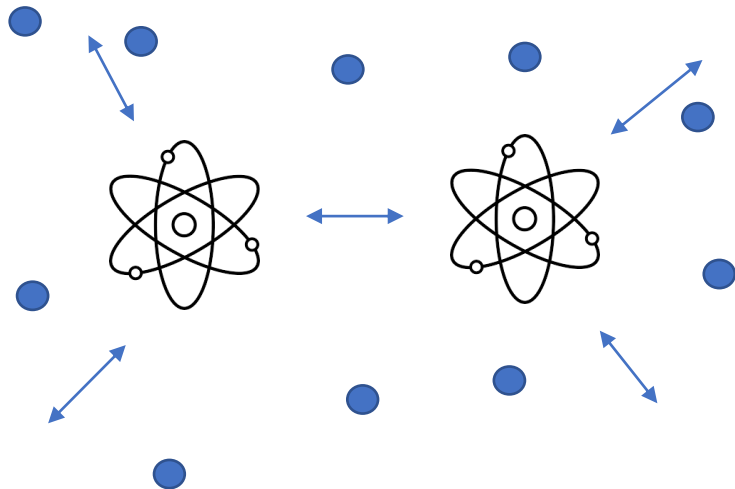
# What are the obstacles?

- Quantum systems are difficult to simultaneously control and isolate



$$\psi = \gamma|00\rangle + \epsilon|01\rangle + \zeta|10\rangle + \eta|11\rangle$$

- We need to both make multiple ‘atoms’ interact, while limiting their interaction with the rest of the universe (the dominant source of noise)



Amazing progress on many technologies, e.g., superconducting qubits.

Current limits: material imperfections, Cosmic Rays! (even.. Dark matter? axions, Weakly interacting particles)

# Timeline of quantum computation

1982  
Feynman:  
To efficiently  
simulate a  
quantum  
system we  
need a  
quantum  
computer

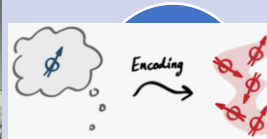


1984: BB84  
(Bennett &  
Brassard)  
propose  
quantum key  
distribution

1993:  
Quantum  
teleportation  
(Bennett  
Brassard,  
Crepeau,  
Jozsa, Peres  
and Wootters)



1996:  
Quantum  
error  
correction  
(CSS codes)



1994: Shor's  
Algorithm  
(Peter Shor @  
Bell Labs)

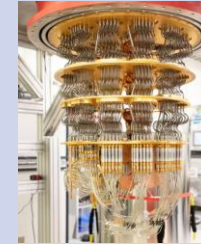
1995: Solovay-Kitaev  
theorem

2001: Nakamura, Pashkin, Tsai  
demonstrate coherent  
superconducting qubit



2011: D-Wave  
announces  
annealing  
device

2014: Google  
partners with  
UCSB (John  
Martiniz)



2016: IBM  
releases first  
cloud  
quantum  
computer

2018: NISQ  
era defined  
(universal  
quantum  
computation  
still distant?)



2019: Google's quantum  
supremacy



# Universal quantum computation vs. NISQ

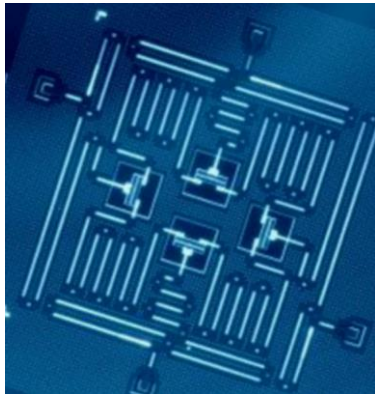
Requirement:	NISQ	Univ. QC (error corrected)
# of qubits	50 - 1000?	> 1,000,000 ?
Error correction	None, or error mitigation	Yes: Surface code, etc
Acceptable gate error rate	Unclear (error mitigation can compensate to some degree)	$<10^{-2}$ ?
Applications	Exploring quantum physics, limited analog quantum simulations of quantum systems, hybrid/variational approaches, annealing	Shor's algorithm, Grover's algorithm, digital quantum simulation of quantum systems
Scalability issues	May become a problem O(100) qubits	Fabrication, wiring complexity, sheer size

These are not Independent

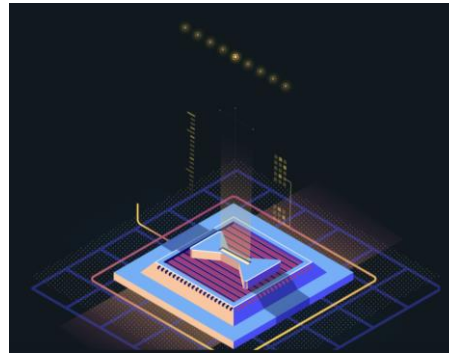


# Current technologies

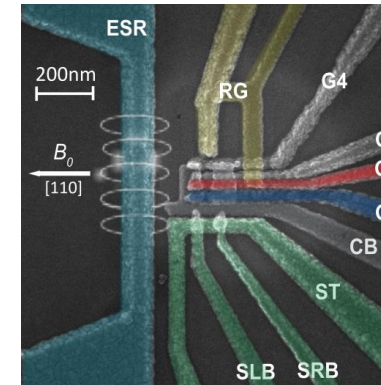
Superconducting qubits  
(Google, IBM)



Ion traps  
(IonQ)



Semiconductor spin  
(Intel?)



## Others:

- NV centers in diamond
- Topological (Microsoft)
- Photons (Psi Quantum)
- GKP code

**# of qubits:** 50+ qubits

30+ qubits

2-5 qubits

**Errors:**  $\sim 10^{-3}$  two qubit gate error rate (best case)

$\sim 10^{-3}$  two qubit gate error rate (best case)

$\sim 10^{-3}$  two qubit gate error rate (best case)

**Scalability:** + parallel gates  
- large circuits, wiring,  
big variations in fab

+ identical ions, long-range interactions,  
- How to connect traps?

+ small circuits,  
well established fab  
- tuning/variability

# NISQ applications

## Exploring quantum physics

Theorists can do experiments!

- 500 papers published using IBM-Q
- E.g., H-Y. Ku et al., NPJ-QI 2020

In NISQ-era, one can study:

- many-body entanglement,
- quantum chaos,
- phase transitions,
- analog simulation of quantum dynamics,

and many other features of quantum systems that are inaccessible on classical computers

## Hybrid quantum-classical variational approaches

QAOA (Quantum Approximate Optimization Algorithm), Farhi et al, 2014

- Encode optimization problem (e.g., max-cut) into Hamiltonian (e.g, Ising model), classically vary parameters in two unitaries to find solution

$$|\psi(\boldsymbol{\beta}, \boldsymbol{\gamma})\rangle = \underbrace{U(\boldsymbol{\beta})U(\boldsymbol{\gamma}) \cdots U(\boldsymbol{\beta})U(\boldsymbol{\gamma})}_{p \text{ times}} |\psi_0\rangle$$

To minimize:

$$\langle \psi(\boldsymbol{\beta}_{opt}, \boldsymbol{\gamma}_{opt}) | H_P | \psi(\boldsymbol{\beta}_{opt}, \boldsymbol{\gamma}_{opt}) \rangle$$

## Others:

VQE: Like QAOA for general problems (quantum chemistry)

Annealing (D-wave)

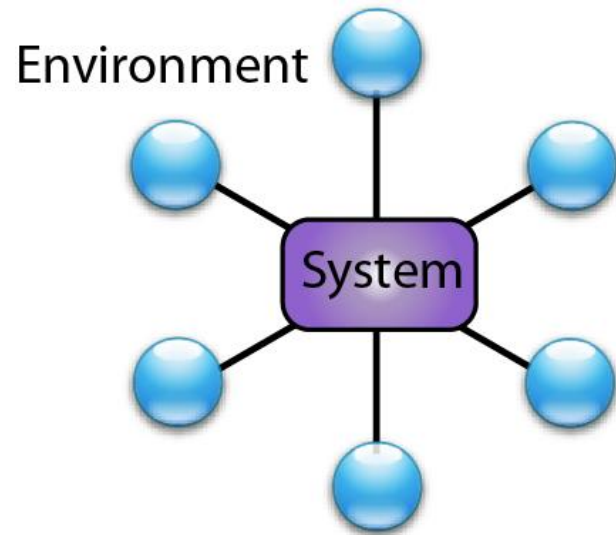
Coherent Ising Machine (NTT)

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# What is noise in the context of quantum computing?

Despite having access to NISQ devices, it is still important to perform classical modelling on a classical computer, to confirm results and understand errors.

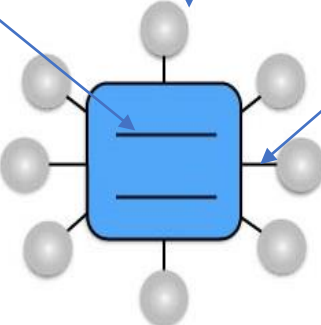
In particular, we must model these devices as open systems, and understand how they interact with their environments, and how errors in control and measurements arise or can be mitigated.



The environment is typically composed of infinite degrees of freedom. However, if it is only weakly coupled to the system, one can adopt several perturbative approaches.

# Spin-boson model

- We can usually capture the main influence of environment degrees of freedom with as a continuum of bosonic modes:

$$H_{\text{SB}} = \frac{\epsilon}{2}\sigma_z + \frac{\Delta}{2}\sigma_x + \sum_k \omega_k a_k^\dagger a_k + \sigma_z \sum_k \frac{g_k}{\sqrt{2\omega_k}}(a_k + a_k^\dagger)$$


The diagram illustrates the spin-boson model. A central blue square represents the system, with two horizontal lines inside. It is surrounded by eight gray spheres representing the bath modes. Three blue arrows point from the equation to the diagram: one from  $\frac{\epsilon}{2}\sigma_z$  to the system, one from  $\sum_k \omega_k a_k^\dagger a_k$  to the bath modes, and one from  $\sigma_z \sum_k \frac{g_k}{\sqrt{2\omega_k}}(a_k + a_k^\dagger)$  to the coupling between the system and the bath.

System energy

Bath mode frequencies

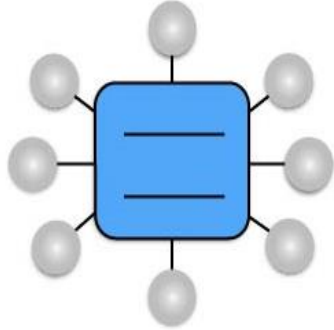
Coupling strengths

Remarkably this model can reproduce classical friction, and explain decoherence (the emergence of the classical world)

# Spin-boson model

- Generally we capture the main influence of bath degrees of freedom with as a continuum of bosonic modes:

$$H_{\text{SB}} = \frac{\epsilon}{2}\sigma_z + \frac{\Delta}{2}\sigma_x + \sum_k \omega_k a_k^\dagger a_k + \sigma_z \sum_k \frac{g_k}{\sqrt{2\omega_k}}(a_k + a_k^\dagger)$$



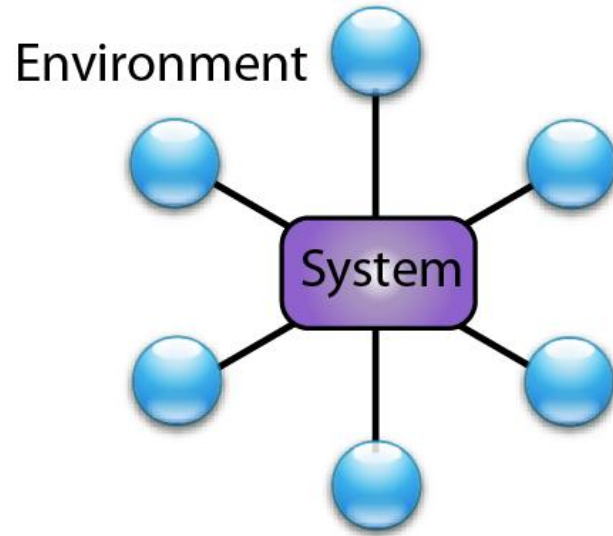
Environment characterized by  
spectral density and  
correlation functions

$$J(\omega) = \pi \sum_k \frac{g_k^2}{2\omega_k} \delta(\omega - \omega_k)$$

$$C(t) = \frac{1}{\pi} \int_0^\infty d\omega J(\omega) \left[ \coth\left(\frac{\beta\omega}{2}\right) \cos(\omega t) - i \sin(\omega t) \right].$$

While complex, we can impose perturbative approximations and arrive at a range of different simple methods that model most noise sources accurately.

# Perturbative methods



Perturbative approaches:



- Lindblad master equations
- Polaron methods
- Bloch-Redfield/non-Secular master equations
- Higher order expansions

To model noise in quantum circuits on a classical computer, we can either:

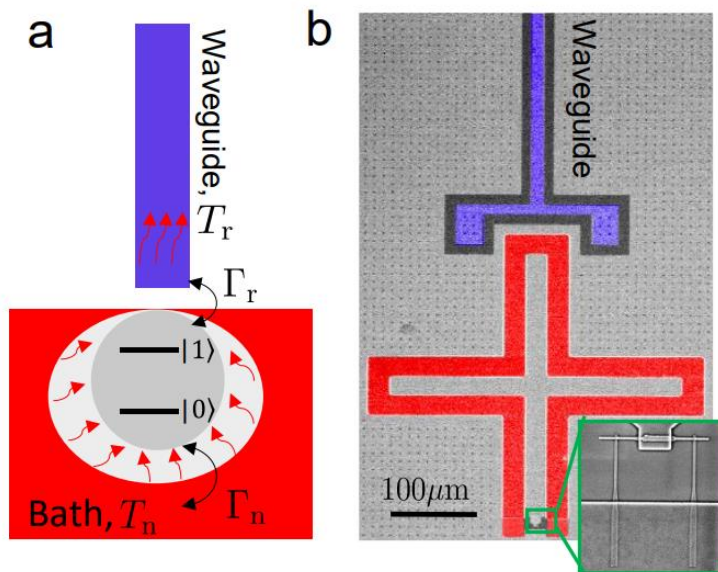
- Take a 'discrete trajectory' approach, and model bit flips and phase noise as discrete random events (like quantum Monte-Carlo) while frequency and strength depend on environment properties
- Model the average behavior with a 'density matrix' and Liouvillian equation of motion

Many powerful software packages make this easier than ever!

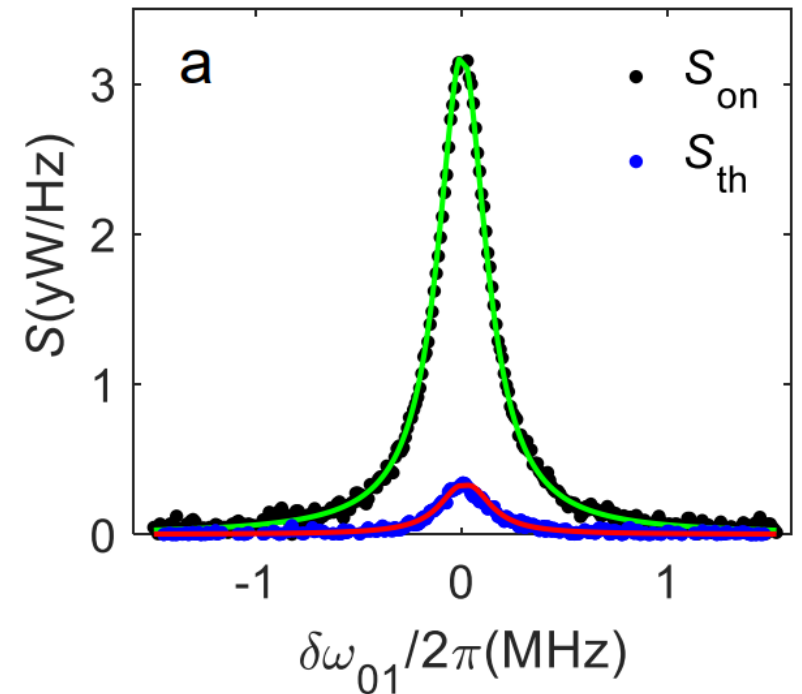
# Example: Nonequilibrium heat transport and work with a single artificial atom coupled to a waveguide: emission without external driving

Yong Lu, Neill Lambert, Anton Frisk Kockum, Ken Funo, Andreas Bengtsson, Simone Gasparinetti, Franco Nori, and Per Delsing

By very weakly coupling a qubit to a waveguide we can monitor other noise sources



If we monitor the output of the waveguide, without driving, what do we expect to see?



Superconducting qubits are strongly affected by quasiparticles (breakdown of superconductivity) and two-level systems in their environment

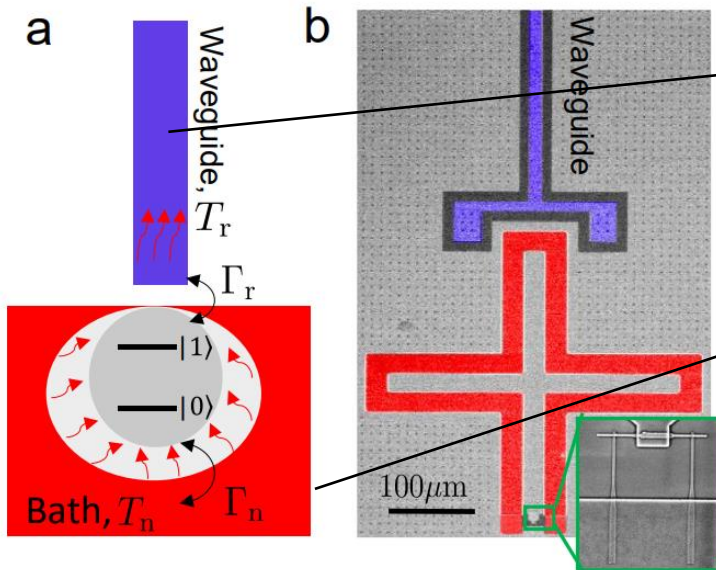


# Nonequilibrium heat transport and work with a single artificial atom coupled to a waveguide: emission without external driving

Yong Lu, Neill Lambert, Anton Frisk Kockum, Ken Funo, Andreas Bengtsson, Simone Gasparinetti, Franco Nori, and Per Delsing

$$\frac{H_q}{\hbar} = -\frac{\Delta}{2}\sigma_z + \frac{\Omega}{2}\sigma_x,$$

$$\frac{\partial}{\partial t}\rho_S(t) = -\frac{i}{\hbar}[H_q, \rho(t)] + \mathcal{L}[\rho(t)],$$



$$\begin{aligned} \mathcal{L}[\rho(t)] = & \frac{\Gamma_r}{2} (n_r + 1) \mathcal{D}[\sigma_-]\rho + \frac{\Gamma_r}{2} n_r \mathcal{D}[\sigma_+]\rho \\ & + \frac{\Gamma_n}{2} (n_n + 1) \mathcal{D}[\sigma_-]\rho + \frac{\Gamma_n}{2} n_n \mathcal{D}[\sigma_+]\rho \\ & + \frac{\Gamma_\phi}{4} \mathcal{D}[\sigma_z]\rho, \end{aligned}$$

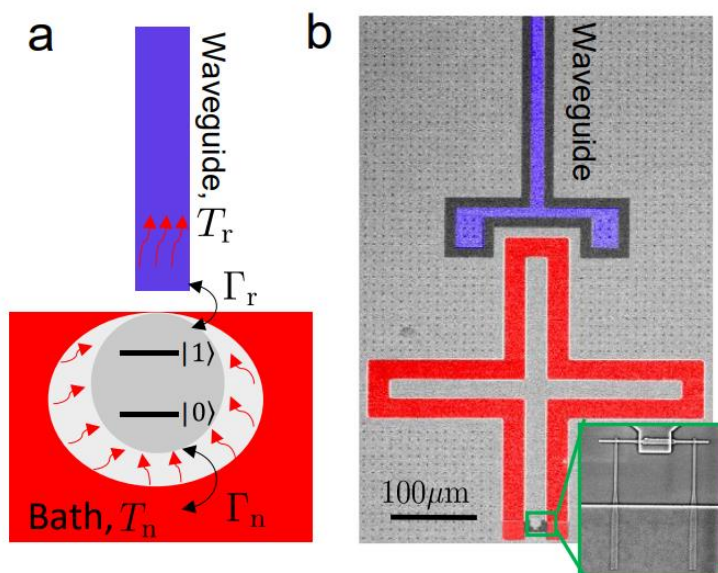
$$S(\omega) = \frac{\hbar\omega_{01}}{2\pi} \int_{-\infty}^{\infty} dt e^{-i\omega t} \langle b_{\text{out}}^\dagger(t) b_{\text{out}}(t') \rangle_{(t' \rightarrow \infty)}$$

$$\begin{aligned} \langle b_{\text{out}}^\dagger(t) b_{\text{out}}(t') \rangle = & \Gamma_r (n_r + 1) \langle \sigma_+(t) \sigma_-(t') \rangle \\ & - \Gamma_r n_r \langle \sigma_-(t') \sigma_+(t) \rangle + \langle f_{\text{in}}^\dagger(t) f_{\text{in}}(t') \rangle \\ & - \frac{i\Omega^*}{2} \langle \sigma_-(t') \rangle + \frac{i\Omega}{2} \langle \sigma_+(t) \rangle + \frac{|\Omega|^2}{4\Gamma_r}. \end{aligned}$$

# Nonequilibrium heat transport and work with a single artificial atom coupled to a waveguide: emission without external driving

Yong Lu, Neill Lambert, Anton Frisk Kockum, Ken Funo, Andreas Bengtsson, Simone Gasparinetti, Franco Nori, and Per Delsing

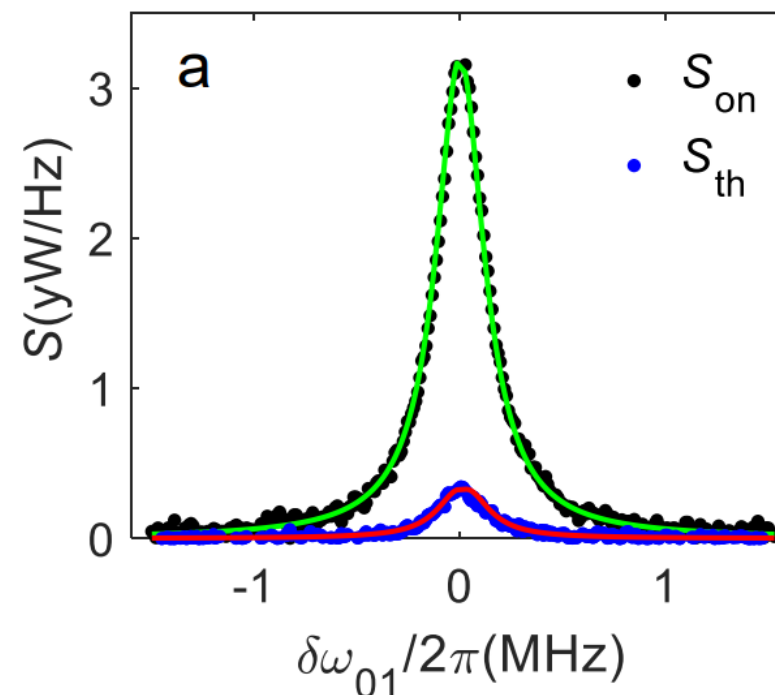
By very weakly coupling a qubit to a waveguide we can monitor other noise sources



If we monitor the output of the waveguide, without driving, what do we expect to see?

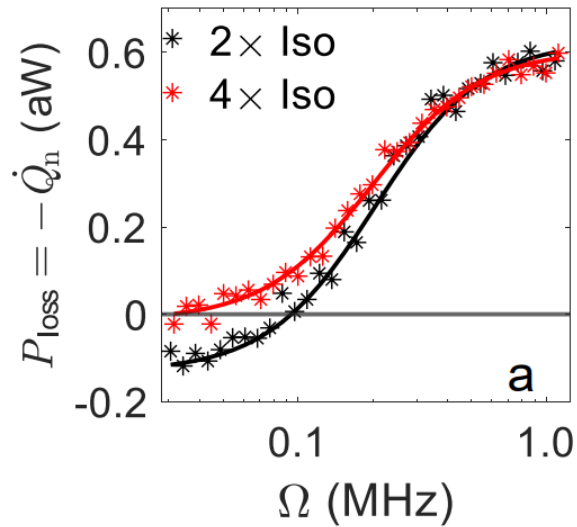
$$S_{\text{th}}(\omega) = \hbar\omega_{01} \frac{\Gamma_r}{2\pi} \frac{2\Gamma_2\Gamma_n\Delta n/\Gamma_1}{\delta\omega_{01}^2 + \Gamma_2^2},$$

$$\Delta n = n_n - n_r$$



Superconducting qubits are strongly affected by quasiparticles (breakdown of superconductivity) and two-level systems in their environment

**Simple noise models are very robust:** If we add coherent drive, we can also characterize the power loss, work and heat

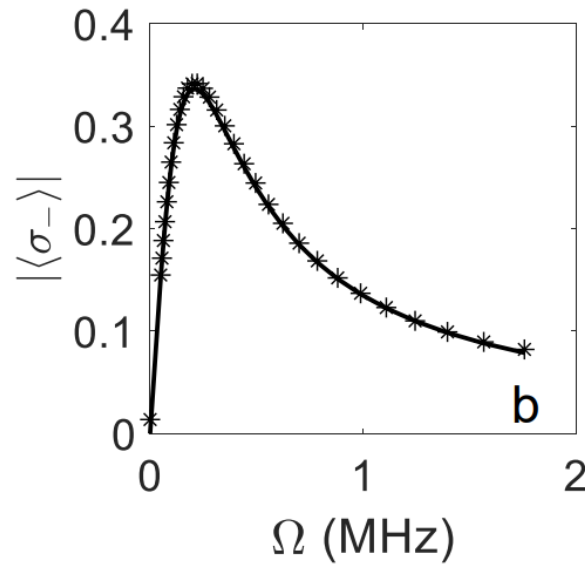


Power loss = Input – output power

**Zero drive:** gain from thermalization of qubit from secondary bath

**Strong drive:** saturation of qubit

Adding isolators reduces temperature of secondary bath



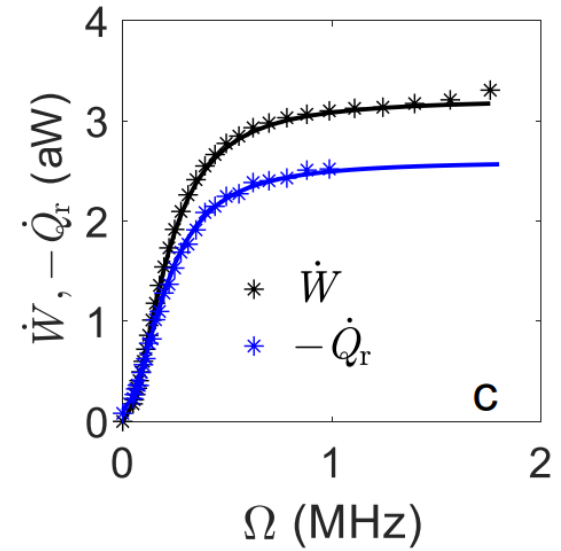
We can extract the qubit coherence from the single-tone spectroscopy

$$\langle \sigma_- \rangle = i(\langle b_{\text{out}} \rangle - \langle b_{\text{in}} \rangle) / \sqrt{\Gamma_r}$$

And use it to calculate the work done by the coherent drive

$$\dot{W} = \text{Tr} \{ -i[H_0, H_1] \rho \} = \frac{\hbar \Omega}{2} \langle \sigma_y \rangle = \hbar \Omega \Re[i \langle \sigma_- \rangle]$$

$$\dot{Q}_i = \hbar \omega_{01} (\Gamma_i n_i \langle \sigma_- \sigma_+ \rangle - \Gamma_i (n_i + 1) \langle \sigma_+ \sigma_- \rangle)$$



Essentially, we show that the power loss is given by the heat flow to the secondary bath, and that work and the two heat flows of course obey the first law

$$\dot{Q}_r + \dot{Q}_n + \dot{W} = \dot{U}$$

# Overview:

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Introduction to QuTiP

## Part 2:

Deriving approximate noise models: Lindblad master equation

Non-perturbative methods: HEOM and reaction coordinates

# Timeline of quantum effects in biology (focus on photosynthesis and magnetoreception)

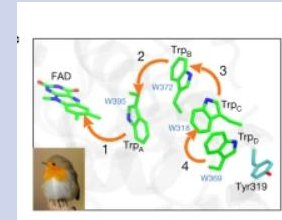
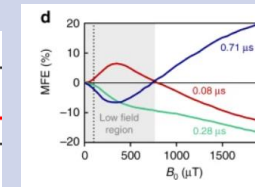
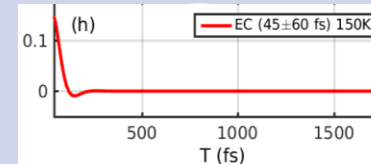
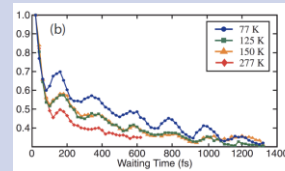
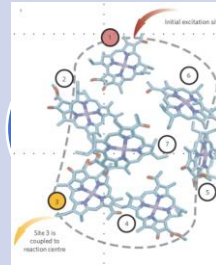
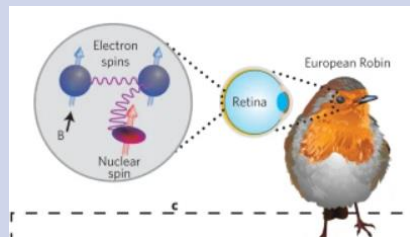
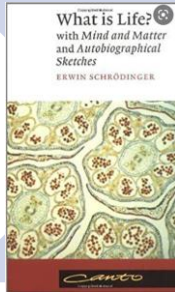
2007-???: Large range of explanations for the role of coherence and noise in optimal efficiency (Plenio, Aspuru-Guzik, Manczel, etc)

1944  
Schrodinger:  
Quantum  
effects  
important in  
some biological  
processes?

2007: Engel et al.  
demonstrate  
beating in FMO  
complex @ 77K

2017/2021: Repeated  
FMO experiments show  
limited coherence  
(Thorwart, Miller).  
Focus on the influence  
of noise?

2021:  
Demonstration  
of magnetic  
sensitivity in  
cryptochrome  
from migratory  
songbird (Xu,  
Hore, Nature)



1978:  
Radical-pair  
magneto-  
reception  
proposal  
(Schulten et al.)

2010: FMO  
complex  
experiment  
repeated at  
room  
temperature  
(PNAS)

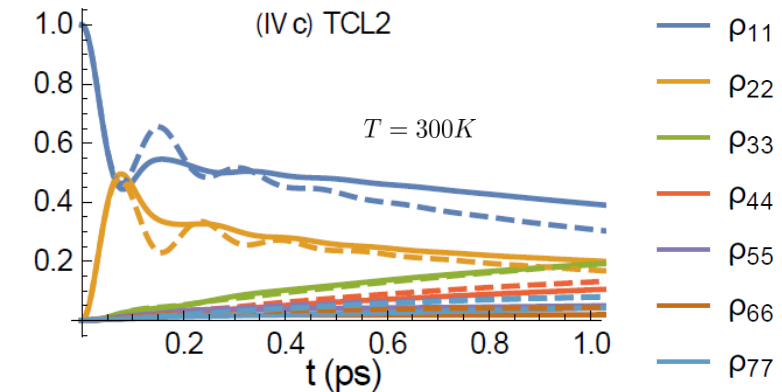
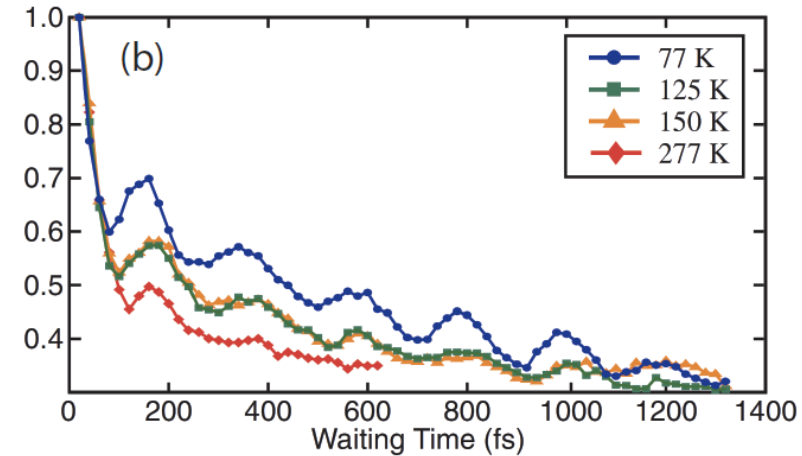
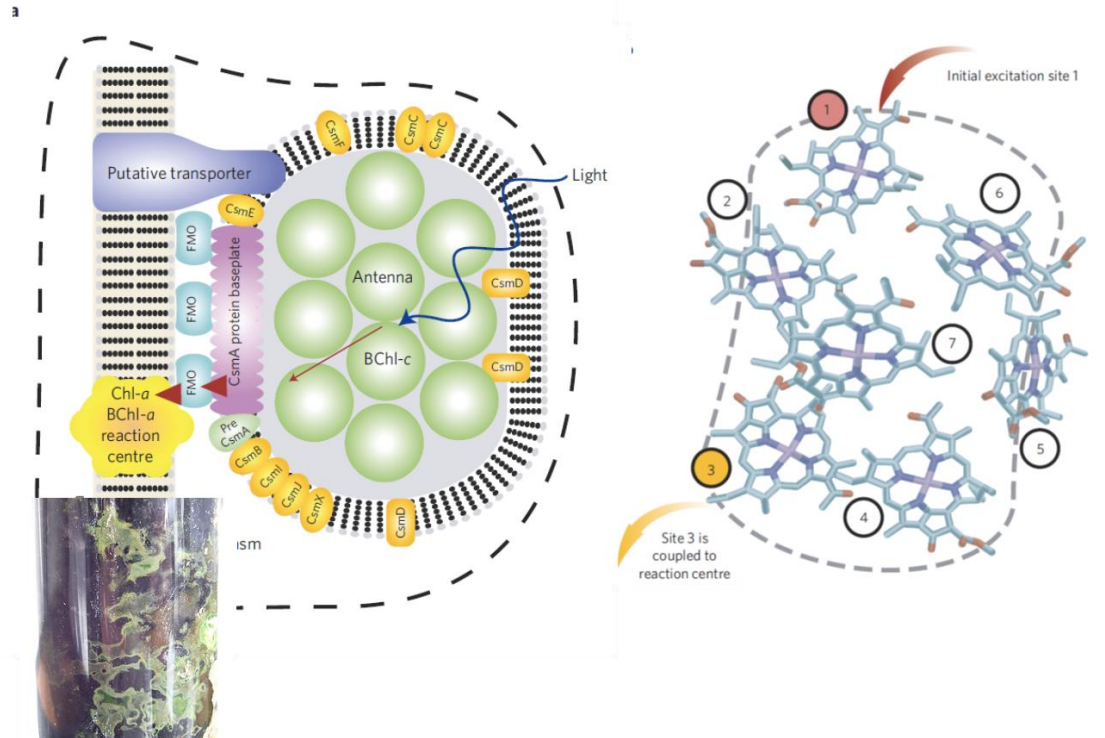
2019: Kerpel et  
al, Nat. Comms,  
Demonstration  
of sensitivity of  
radical pair to  
50 micro-tesla

1972: Wiltschko:  
Bird's have an  
inclination compass:

2006/2010: Wiltschko: Bird's ability to navigate dependent on ambient light,  
affected by external oscillating Magnetic fields.  
Hore/Schulten: Cryptochromes.  
Maeda: Demonstration in solution

# Photosynthesis: A simple physics picture

Light-harvesting in the Fenna-Matthews-Olsen complex: does quantum coherence persist on time scales relevant for energy transfer?



Fruchtman, Lambert, Gauger, Sci. Rep. 2016

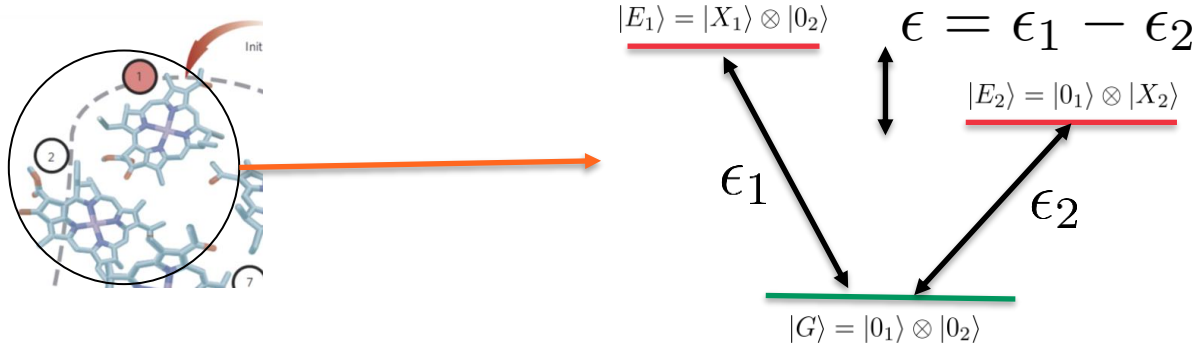
Modelling the energy transfer might be tricky:

- Electrical excitations strongly couple to nuclear motion
- Thermal energy is on the same order as reorganization energy, electronic coupling, etc



# Photosynthesis: A simple physics picture

- A minimal model of a single excitation being transported through the complex: lets focus on just two sites



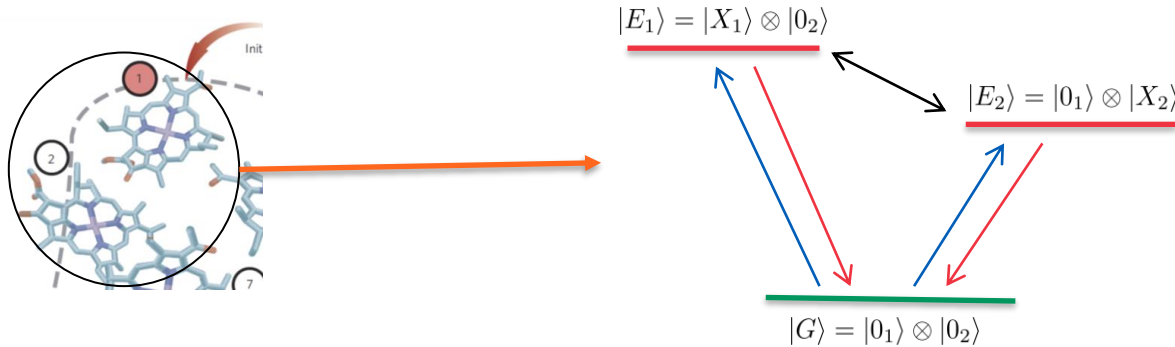
- If we focus on a single excitation subspace, we can just describe the two molecules as an effective spin:

$$\begin{array}{c}
 |E_1\rangle = |X_1\rangle \otimes |0_2\rangle \\
 \hline
 \updownarrow \epsilon = \epsilon_1 - \epsilon_2 \\
 \hline
 |E_2\rangle = |0_1\rangle \otimes |X_2\rangle
 \end{array}
 \quad
 \begin{array}{l}
 H_E = \frac{\epsilon}{2} \sigma_z \\
 \sigma_z = |X_1, 0_2\rangle \langle X_1, 0_2| - |0_1, X_2\rangle \langle 0_1, X_2|
 \end{array}$$

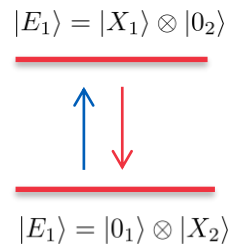


# Photosynthesis: A simple physics picture

- Energy transfer between sites is given by dipole coupling:



- Energy transfer between sites does not involve an actual movement of charge. We can also capture the contribution to the total energy (Hamiltonian) with two-site model

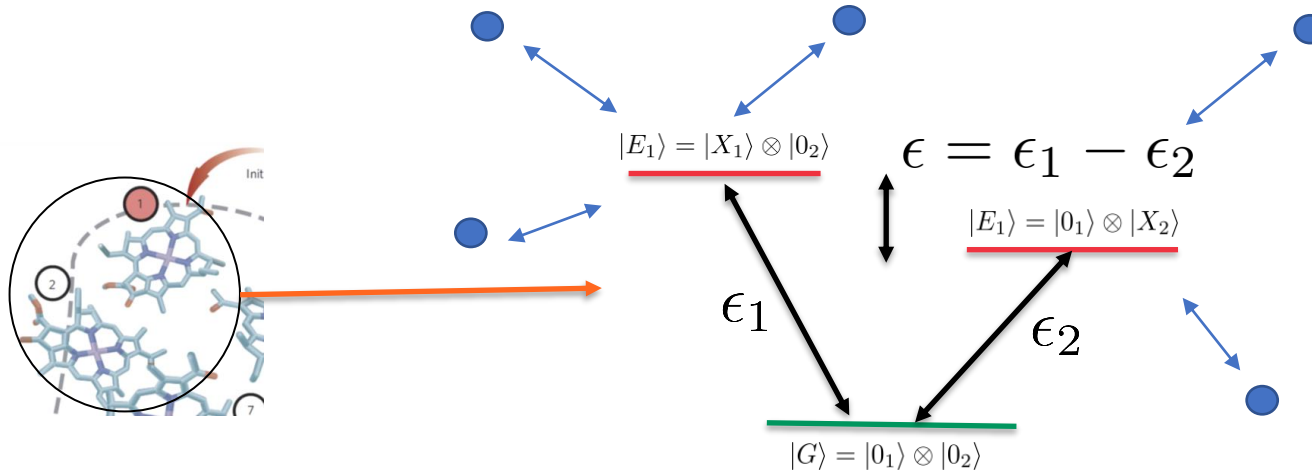


$$H_D = \frac{\Delta}{2} \sigma_x$$

$$\sigma_x = |X_1, 0_2\rangle\langle 0_1, X_2| + |0_1, X_2\rangle\langle X_1, 0_2|$$

# Spin-boson model

- The nuclear motion+molecular vibrations and protein scaffold, modulate the electronic excitation energy. We describe these with a bath of harmonic oscillators



$a_k$  Is the annihilation operator for mode  $k$   
In the environment (destroys a vibrotational  
Excitation at frequency  $\omega_k$ )

$$[a_k, a_k^\dagger] = 1$$

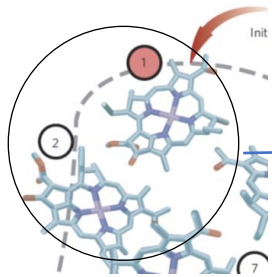
$$H_{\text{SB}} = \frac{\epsilon}{2}\sigma_z + \frac{\Delta}{2}\sigma_x + \sum_k \omega_k a_k^\dagger a_k + \sigma_z \sum_k \frac{g_k}{\sqrt{2\omega_k}} (a_k + a_k^\dagger)$$

$$\sigma_x = |X_1, 0_2\rangle\langle 0_1, X_2| + |0_1, X_2\rangle\langle X_1, 0_2| \quad \sigma_z = |X_1, 0_2\rangle\langle X_1, 0_2| - |0_1, X_2\rangle\langle 0_1, X_2|$$

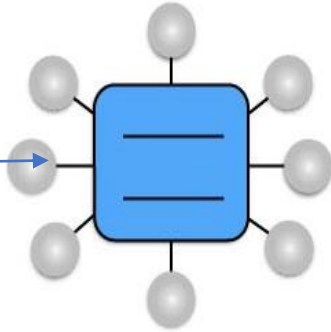
- Note that in general, each chromophore couples to an independent bath (though correlated baths have been studied).

# Spin-boson model

- The nuclear motion+molecular vibrations and protein scaffold, modulate the electronic excitation energy. We describe these with a bath of harmonic oscillators



$$H_{\text{SB}} = \frac{\epsilon}{2}\sigma_z + \frac{\Delta}{2}\sigma_x + \sum_k \omega_k a_k^\dagger a_k + \sigma_z \sum_k \frac{g_k}{\sqrt{2\omega_k}}(a_k + a_k^\dagger)$$



Environment characterized by  
spectral density and  
correlation functions

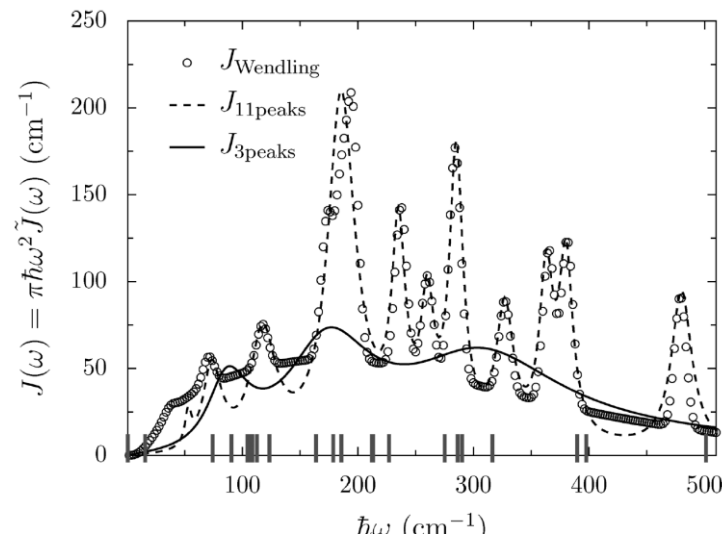
$$J(\omega) = \pi \sum_k \frac{g_k^2}{2\omega_k} \delta(\omega - \omega_k)$$

$$C(t) = \frac{1}{\pi} \int_0^\infty d\omega J(\omega) \left[ \coth\left(\frac{\beta\omega}{2}\right) \cos(\omega t) - i \sin(\omega t) \right].$$

We can use a lot of the tools we use for quantum information to model this noise, but what happens when we cannot impose those perturbative approximations?

# What are the properties of this ‘bath’?

- Modelling of the dynamics of a real photosynthetic complex is **hard** because of the **complex environment**. Are simple perturbative methods sufficient?
- Can we capture this influence in a transparent way with new methods?
- Can we understand better how the electronic and vibronic degrees of freedom are correlated, and how that affects coherence, transport, etc?
- Can these features be measured in an experiment?



Kreisbeck and Kramer,  
J. Phys. Chem. Lett. 2012

*Existing methods:*

Matrix-product-state based approaches:

A. Chin *et al.* *Nat. Phys.* 2013

The hierarchy equations of motion:

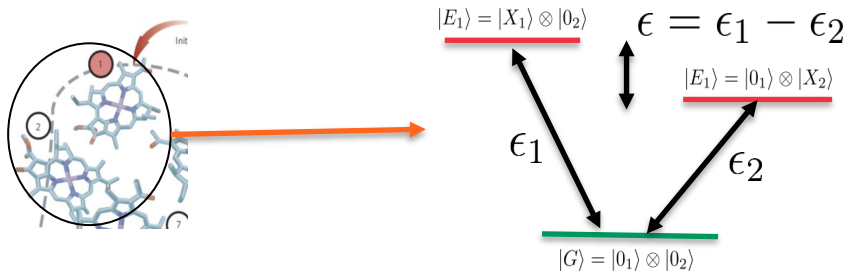
Tanimura and Kubo, J. Phys. Soc. Jpn. 1989,  
**Ishizaki** and Fleming, PNAS 2009.

# An an example of the utility of modelling non-perturbative noise:

Example: role of environment structure using RC method

Illes-Smith, Lambert, Nazir, Phys. Rev. A (2014), and J. Chem. Phys. (2016) , Ishizaki and Fleming, J. Chem. Phys. (2009)

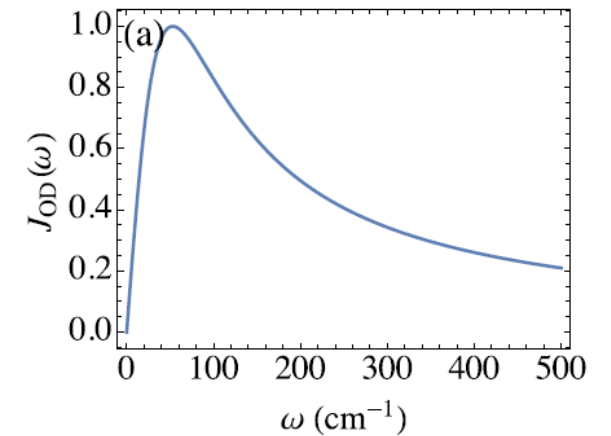
We parameterize the speed of energy transfer by fitting an effective 'rate' to the movement of an excitation from one site to another:



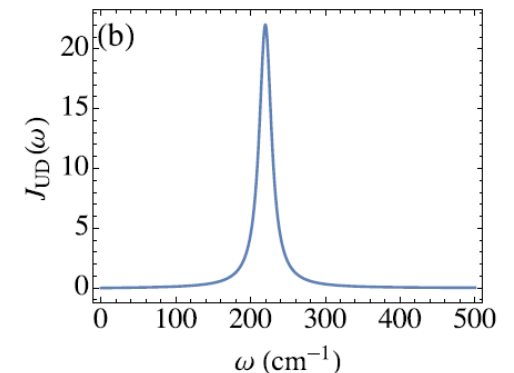
$$\begin{aligned}\frac{dP_1(t)}{dt} &= -k_{1 \rightarrow 2}P_1 + k_{2 \rightarrow 1}P_2, \\ \frac{dP_2(t)}{dt} &= k_{1 \rightarrow 2}P_1 - k_{2 \rightarrow 1}P_2.\end{aligned}$$

Using non-perturbative method, we can study resonant vs. broad environments:

$$J_{\text{SB}}^{\text{OD}}(\omega) = \alpha_{\text{OD}} \omega_c \frac{\omega}{\omega^2 + \omega_c^2}.$$



$$J_{\text{SB}}^{\text{UD}}(\omega) = \frac{\alpha_{\text{UD}} \Gamma \omega_0^2 \omega}{(\omega_0^2 - \omega^2)^2 + \Gamma^2 \omega^2}$$

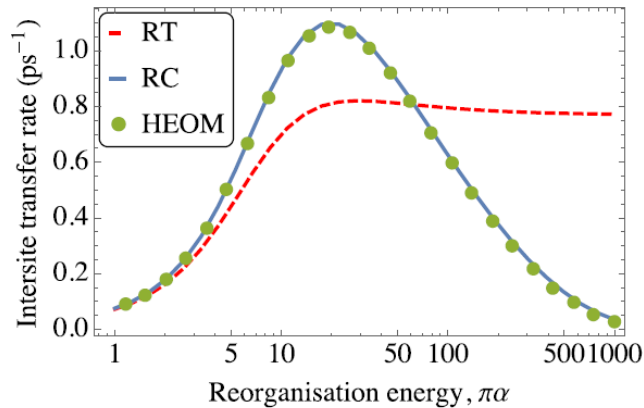
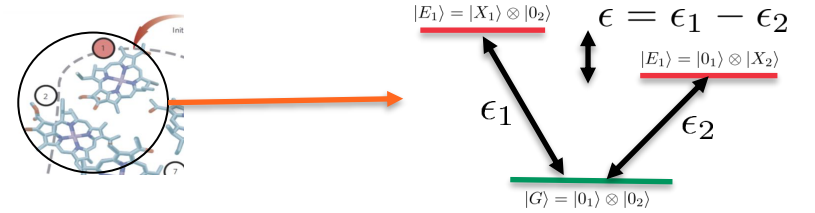


$\epsilon = 100 \text{ cm}^{-1}$ ,  $\Delta = 40 \text{ cm}^{-1}$ ,  $\omega_c = 53 \text{ cm}^{-1}$ , and  $T = 300 \text{ K}$ .

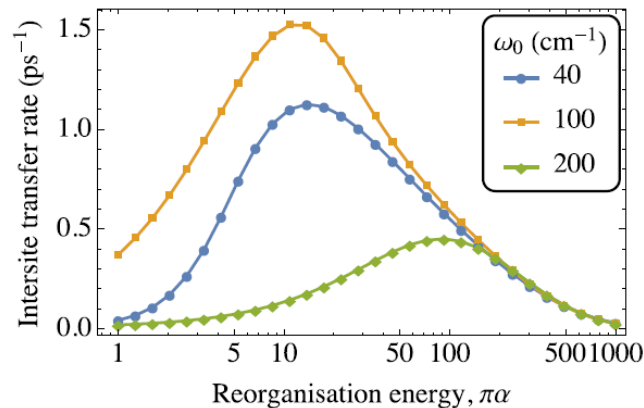
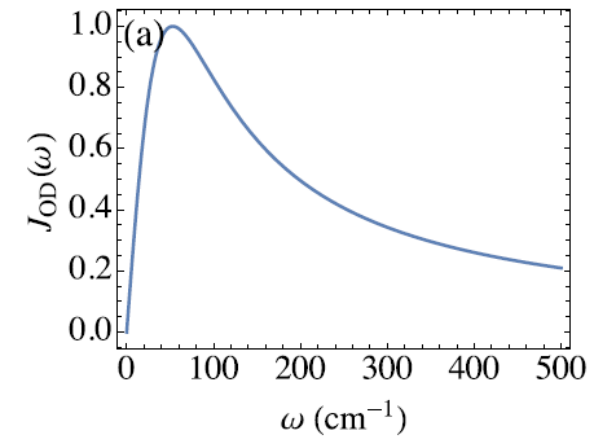
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## Example: role of environment structure using RC method

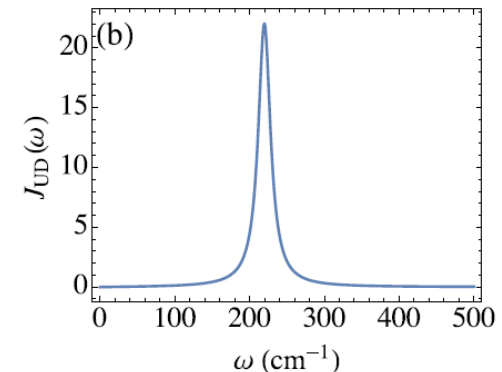
Illes-Smith, Lambert, Nazir, Phys. Rev. A (2014), and J. Chem. Phys. (2016), Ishizaki and Fleming, J. Chem. Phys. (2009)



$$J_{\text{SB}}^{\text{OD}}(\omega) = \alpha_{\text{OD}} \omega_c \frac{\omega}{\omega^2 + \omega_c^2}.$$

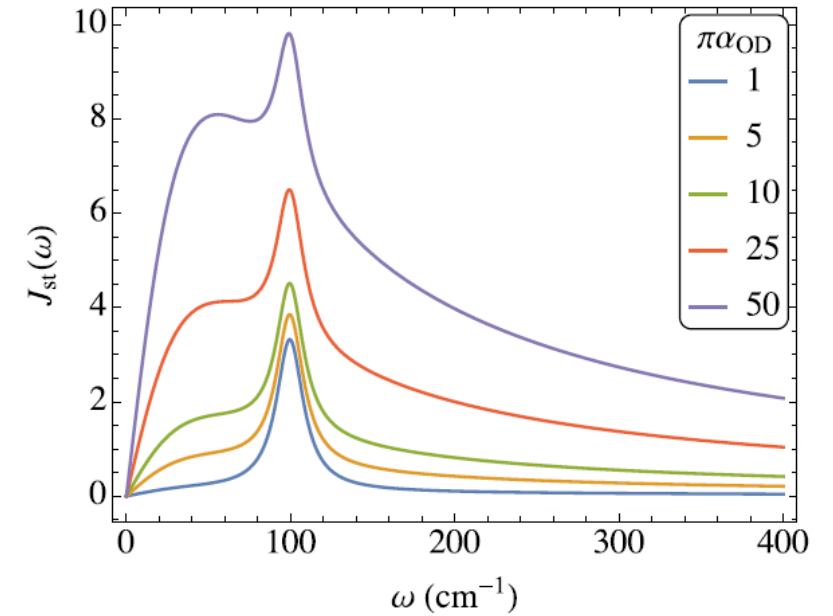
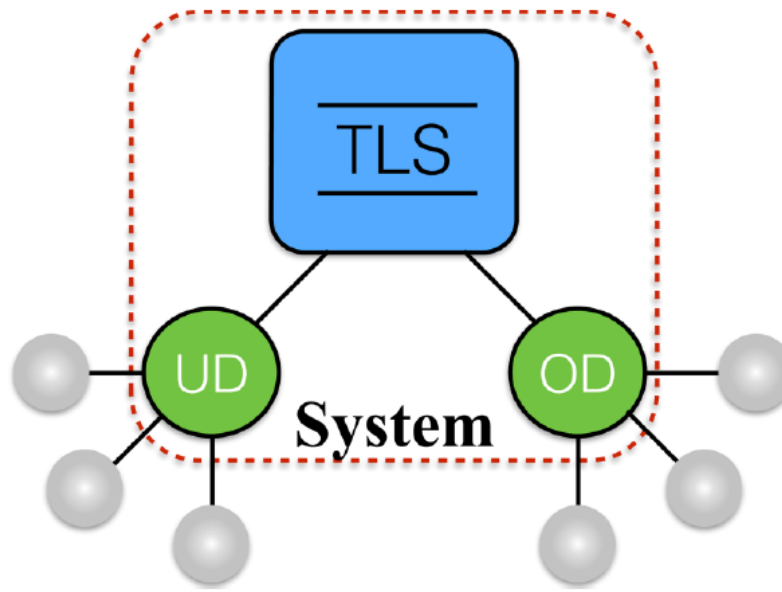
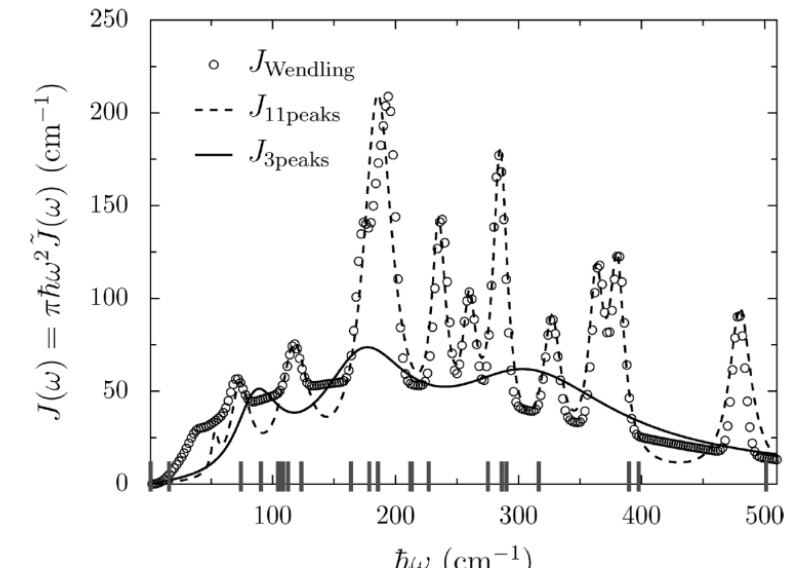


$$J_{\text{SB}}^{\text{UD}}(\omega) = \frac{\alpha_{\text{UD}} \Gamma \omega_0^2 \omega}{(\omega_0^2 - \omega^2)^2 + \Gamma^2 \omega^2}$$



$\epsilon = 100 \text{ cm}^{-1}$ ,  $\Delta = 40 \text{ cm}^{-1}$ ,  $\omega_c = 53 \text{ cm}^{-1}$ , and  $T = 300 \text{ K}$ .

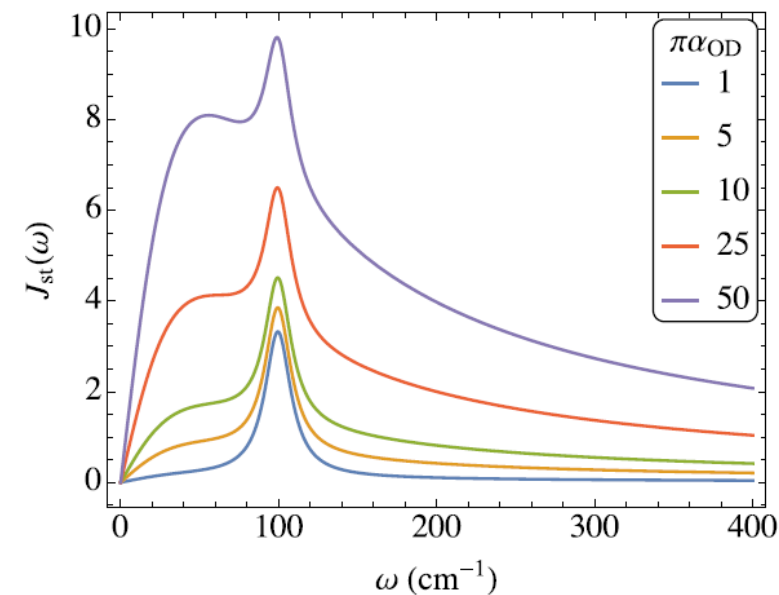
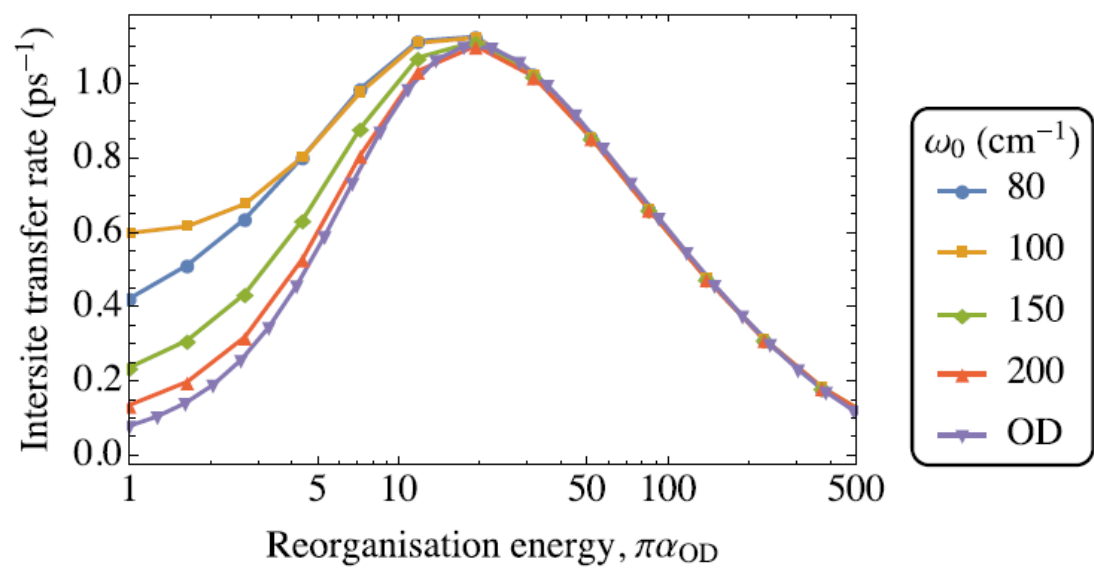
# What about when both broad and resonant baths co-exist?



$\omega_0 = 100 \text{ cm}^{-1}$ , with  $\Gamma = 20 \text{ cm}^{-1}$  and  $\pi\alpha_{\text{UD}} = 2 \text{ cm}^{-1}$ .



What about when both broad and resonant baths co-exist?



$\epsilon = 100$  cm<sup>-1</sup>,  $\Delta = 40$  cm<sup>-1</sup>,  $\omega_c = 53$  cm<sup>-1</sup>, and  $T = 300$  K.

$\omega_0 = 100$  cm<sup>-1</sup>, with  $\Gamma = 20$  cm<sup>-1</sup> and  $\pi\alpha_{UD} = 2$  cm<sup>-1</sup>.

Resonant structured baths enhance energy transfer, but their influence is diminished if the broad background is sufficiently strong

# Overview:

## Part 1:

Introduction to qubits and quantum computing

From qubits to quantum biology

Introduction to QuTiP

## Part 2:

Deriving approximate noise models: Lindblad master equation

Non-perturbative methods: HEOM and reaction coordinates