

KNOWLEDGE MODELS OF PHOTOBIOREACTORS AND THEIR PATH-INTEGRAL FORMULATION

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MELISSA conference, 8-10/11 2022



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Photo-reactive Systems Engineering research group

Incident
solar radiation

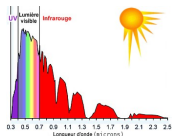
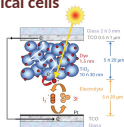
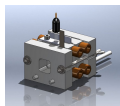
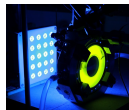
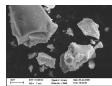


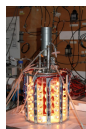
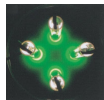
Photo-electrochemical cells



Photoreactors



Photobioreactors



Artificial
photosynthesis

Hydrogen, syngaz,
methanol...

Biofuel,

Raw molecules for chemistry,
high valuable products

Biomass converted
In bio-refinery

Natural
photosynthesis



Solar fuels

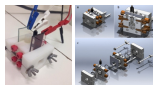


Green chemistry
and manufacturing

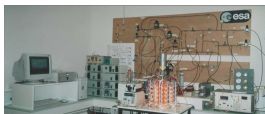


closed-loop ecosystems

Methodology



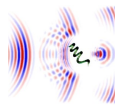
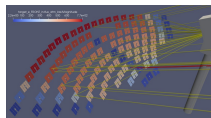
Photoelectrochemical cell



Photobioreactor



Photoreactor



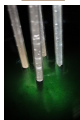
High accuracy benches designed for model validation at the lab scale



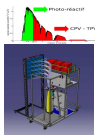
Development of knowledge models

Design of innovative demonstrators with high energy and kinetic efficiencies
(model-based optimization)

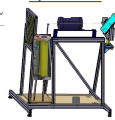
Dilution



DiCoFluV - solar dilution photoreactor
(30 L - 1 m² - héliostat 2 m²)

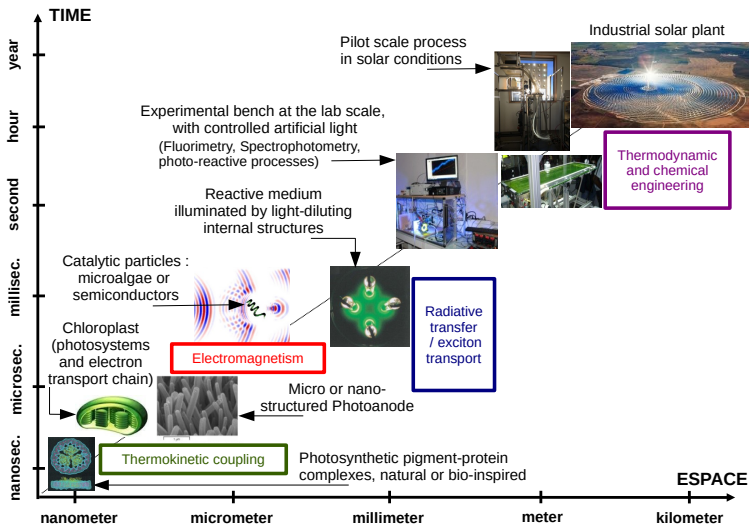


Hybridization

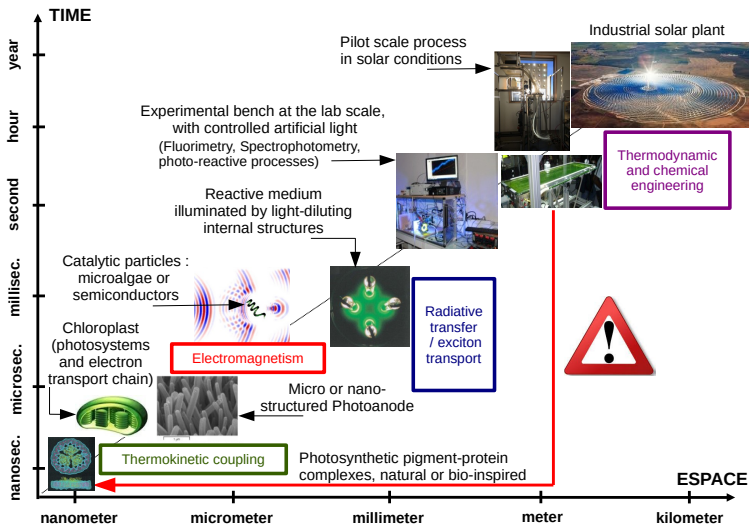


DiCoFluV-Hy - hybrid solar reactor
(2 L - 0,03 m² - héliostat 0,1 m²)

Phenomenological, geometric and temporal complexity



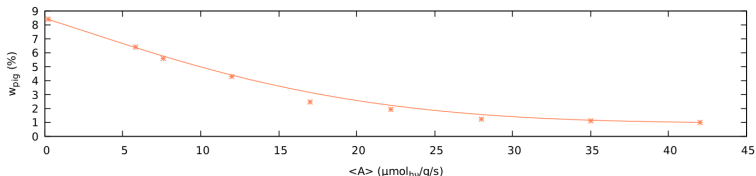
Feedback loop on radiative properties



Feedback loop on radiative properties

- via pigment content

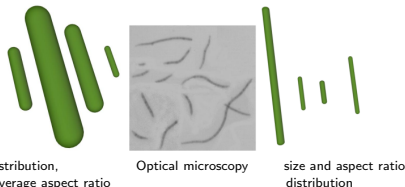
varies as a function of photon absorption rate



Experimental results from Arnaud ARTU, PhD at GEPEA (*Chlorella vulgaris*)

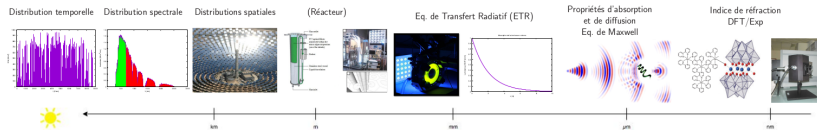
- via micro-organism geometry

shape and size distribution vary as a function of mixing



Experimental results from Vincent Rochatte, PhD at Institut Pascal (*Arthrospira platensis*)

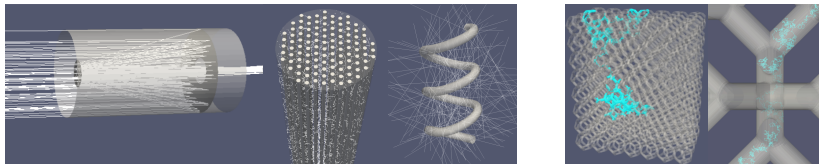
Extending Feynmann-Kac path integral formulation



$$\langle \bar{r}_{02} \rangle = \phi \int_{\Delta t} DNI(t) dt \int_{\Delta \nu} p_{\nu}(\nu) d\nu \int_V \frac{1}{V} dr r_{O_2} \left(r, \int_{\mathcal{D}_{\Gamma}} p_{\Gamma}(\gamma) d\gamma k_{a,\nu} e^{-C \int_{\mathcal{G}} p_{\mathcal{G}}(g) dg} \sigma_{a,\nu}(\sum_n k_{s,n,\nu}) l(\gamma) \right)$$

Renewed interpretation of the process:

- 1 highlighting the scales, phenomenon and their hierarchical coupling
- 2 bringing random walks that propagate in a multi-physics multi-scales path-space



A research topic in the french consortium EDStar (www.edstar.cnrs.fr/prod/fr/):
recent advances to handle couplings, including nonlinearities

Monte Carlo method

Numerical simulations benefit from path-integral formulations:

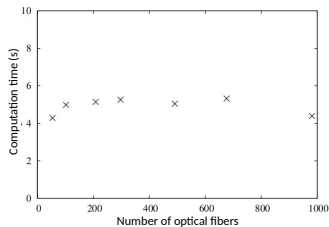
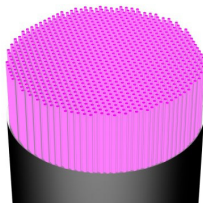
- convergence rates is independent of the number of nested integrals
 → *phenomenological complexity*

	C_x (kg m ⁻³)		$\tilde{\sigma}_\nu$ (d _m)	$\sigma_{a,\nu}$	$L_\nu(\vec{x}, \vec{u}, t)$	$\mathcal{A}(\vec{x}, t)$	$r_x(\vec{x}, t)$	$\langle r_x \rangle(t)$	$\langle \bar{r}_x \rangle$
<i>Arthrospira platensis</i>	1	t_{brut} (s)	1.096	1.339	6.39	11.11	96.4	64.8	80.6
		ϵ (%)	0.0505	0.0813	0.0988	0.213	0.0212	0.0178	0.0915
		$t_{1\%}$ (s)	0.00280	0.00885	0.06228	0.502	0.043	0.0205	0.674
	4	t_{brut} (s)			18.03	17.37	2383	963	950
		ϵ (%)			0.402	0.958	0.145	0.076	0.154
		$t_{1\%}$ (s)			2.91	15.93	49.9	5.59	22.21

Monte Carlo method

Numerical simulations benefit from path-integral formulations:

- convergence rates is independent of the number of nested integrals
 → *phenomenological complexity*
- computer graphics tools for orthogonal handling of the geometric data
 → *fast path-tracing insensitive to geometric complexity*



Monte Carlo method

Numerical simulations benefit from path-integral formulations:

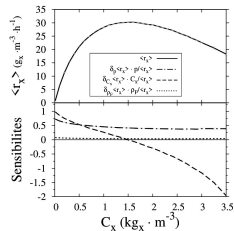
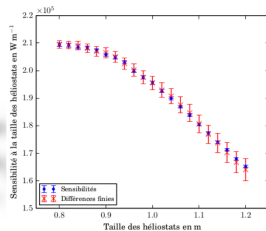
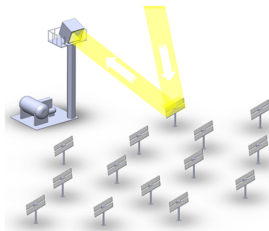
- convergence rates is independent of the number of nested integrals
→ *phenomenological complexity*
- computer graphics tools for orthogonal handling of the geometric data
→ *fast path-tracing insensitive to geometric complexity*
→ *inverse design*



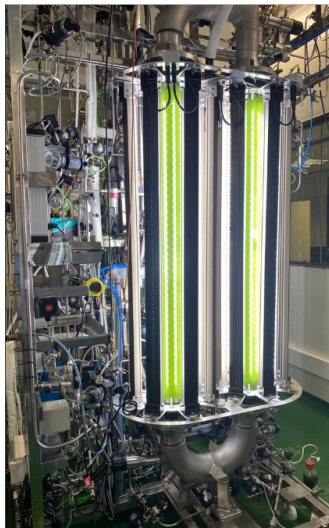
Monte Carlo method

Numerical simulations benefit from path-integral formulations:

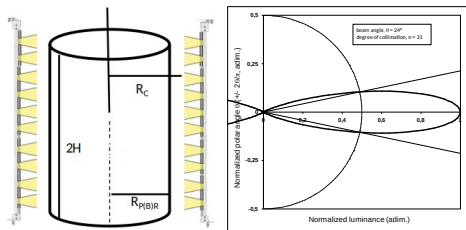
- convergence rates is independent of the number of nested integrals
 → *phenomenological complexity*
- computer graphics tools for orthogonal handling of the geometric data
 → *fast path-tracing insensitive to geometric complexity*
 → *inverse design*
- sensitivity analysis
 → *guides optimization*



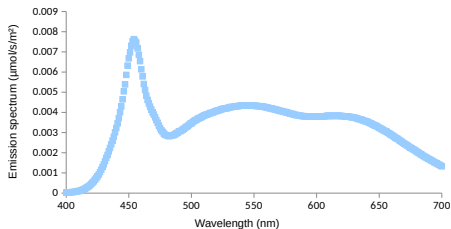
UAB photobioreactor configuration



Cylindrical photobioreactor



Radial illumination by 8 panels made of 80 white LEDs + optics $\theta = 24^\circ$



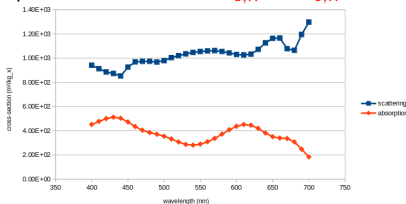
A focus on radiative transfer and thermokinetic coupling

- Radiative transfer equation

$$\omega \cdot \text{grad}_x L_\lambda(x, \omega) = -C_x (\sigma_{a,\lambda} + \sigma_{s,\lambda}) L_\lambda(x, \omega) + C_x \sigma_{s,\lambda} \int_{4\pi} L_\lambda(x, \omega') p_{\Omega,\lambda}(\omega|\omega') d\omega'$$

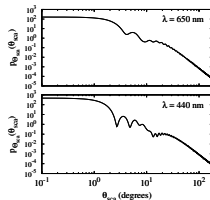
- Radiative properties (schiff: www.meso-star.com/projects/schiff/schiff.html)

Arthrospira platensis: cross-sections $\sigma_{a,\lambda}$ and $\sigma_{s,\lambda}$



Hybrid model and experimental results from Vincent Rochatte, PhD at Institut Pascal

phase function $p_{\Omega,\lambda}(\omega|\omega')$



- Thermokinetic coupling law at each point x

$$r_{O_2}(x) = C_x \Phi \rho_m \frac{K}{K + \mathcal{A}(x)} \mathcal{A}(x) \quad ; \quad \mathcal{A}(x) = \sigma_{a,\lambda} \int_{4\pi} L_\lambda(x, \omega) d\omega$$

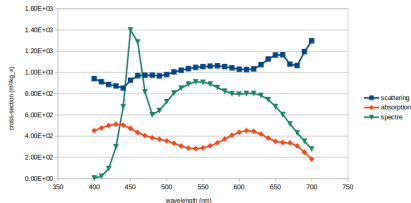
- Volume averages: $\langle \mathcal{A} \rangle$ and $\langle r_{O_2} \rangle$

Two-flux approximation for radiative transfer

- Grey approximation

$$\bar{\sigma}_i = \int_{\lambda_{min}}^{\lambda_{max}} f_{source}(\lambda) \sigma_{i,\lambda} d\lambda$$

$$\bar{\rho}_{\Omega} = \int_{\lambda_{min}}^{\lambda_{max}} \frac{f_{source}(\lambda) \sigma_{s,\lambda}}{\bar{\sigma}_s} \rho_{\Omega,\lambda} d\lambda$$



- Two-flux approximation for 1d cylindrical systems

$$\mathcal{A}(x) = 2\bar{\sigma}_a q_0 \frac{\mathcal{I}_0(\delta r)}{\mathcal{I}_0(\delta R) + \alpha \mathcal{I}_1(\delta R)}$$

with \mathcal{I} the Bessel functions, q_0 the incident flux density,

$$\delta = C_x \sqrt{\bar{\sigma}_a(\bar{\sigma}_a + 2b\bar{\sigma}_s)}, \quad \alpha = \sqrt{\frac{\bar{\sigma}_a}{\bar{\sigma}_a + 2b\bar{\sigma}_s}}, \quad b = \int_{2\pi} \rho_{\Omega,\lambda}(\omega|\omega') d\omega$$

Can be implemented in spreadsheets and programmable logic controllers

Results

$C_x = 0.05 \text{ g/l}$	Ref. (1% err.)	2-flux	diff.	max
$\langle \mathcal{A} \rangle (\mu\text{mol/s/m}^3)$	43550	34944	20%	46667
$\langle r_{O_2} \rangle (\text{mol/l/h})$	$4.39 \cdot 10^{-4}$	$4.35 \cdot 10^{-4}$	1%	$19 \cdot 10^{-4}$

$C_x = 0.10 \text{ g/l}$	Ref. (1% err.)	2-flux	diff.	max
$\langle \mathcal{A} \rangle (\mu\text{mol/s/m}^3)$	46200	42522	8%	46667
$\langle r_{O_2} \rangle (\text{mol/l/h})$	$8.45 \cdot 10^{-4}$	$8.30 \cdot 10^{-4}$	2%	$19 \cdot 10^{-4}$

$C_x = 0.20 \text{ g/l}$	Ref. (1% err.)	2-flux	diff.	max
$\langle \mathcal{A} \rangle (\mu\text{mol/s/m}^3)$	46450	42630	8%	46667
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Results

With radiative properties for *Arthrospira platensis* in different culture conditions
(reference model solved with Monte Carlo; 1% err.)

$C_x = 0.05 \text{ g/l}$	C1 (Rochatte)	C2 (Dauchet)	diff.	max
$\langle \mathcal{A} \rangle (\mu\text{mol/s/m}^3)$	43550	18136	58%	46667
$\langle r_{\text{O}_2} \rangle (\text{mol/l/h})$	$4.39 \cdot 10^{-4}$	$4.25 \cdot 10^{-4}$	3%	$19 \cdot 10^{-4}$
$C_x = 0.10 \text{ g/l}$	C1 (Rochatte)	C2 (Dauchet)	diff.	max
$\langle \mathcal{A} \rangle (\mu\text{mol/s/m}^3)$	46200	38100	18%	46667
$\langle r_{\text{O}_2} \rangle (\text{mol/l/h})$	$8.45 \cdot 10^{-4}$	$8.27 \cdot 10^{-4}$	1%	$19 \cdot 10^{-4}$

Conclusions & Perspectives

- **Radiative properties are variable**
 - illumination → pigment content
 - mixing → size and shape of the micro-organisms
- **The grey approximation accuracy depends on radiative properties**
 - cyanobacteria have "almost grey" spectral properties
 - use caution if spectral variations are sharp
 - eukaryotes (*e.g. chlamydomonas reinhardtii*)
 - photosensitizers for artificial photosynthesis (100% error)
- **Simplification of the system geometry is not always possible**
 - high energetic performance requires internal illumination (NPGC ESA project) leading to complex geometries
- **Two-flux approximation**, in our test case
 - can lead to 50% error on radiative transfer
 - but 2% error on $\langle r_{O_2} \rangle$ for cyanobacteria (no respiration)

Thank you for your attention

