

MSc Computational Science  
joint programme UvA/VU



# FROM CONIDIAL GERMINATION TO HYPHAL GROWTH: A SPATIAL MODEL OF ASPERGILLUS spp.

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## THESIS TOPIC PROPOSAL

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October 2, 2024

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Examiner: Dr. Jaap Kaandorp, University of Amsterdam

# OUTLINE

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## 1 Introduction

Research Relevance

Research Context and Data

## 2 Model

Model Goals

Preliminary Ideas

## 3 Outlook

Tentative Schedule

- » Filamentous moulds from the genus *Aspergilli*, phylum Ascomycota
- » Notable species:
  - *Aspergillus fumigatus* - pathogen causing aspergillosis;
  - *Aspergillus niger* - food contaminant, possible pathogen, use in chemical industry;
  - *Aspergillus nidulans* - research organism in cell biology;
  - *Aspergillus oryzae* - used in the fermentation of soy products;
  - *Aspergillus terreus* - producer of organic acids, can cause opportunistic infection in humans.

# A. NIGER AS MODEL SPECIES



- » Extensively researched species;
- » Production of citric acid recognised as far back as 1917;
- » Production of enzymes (e.g. glycoamylase).

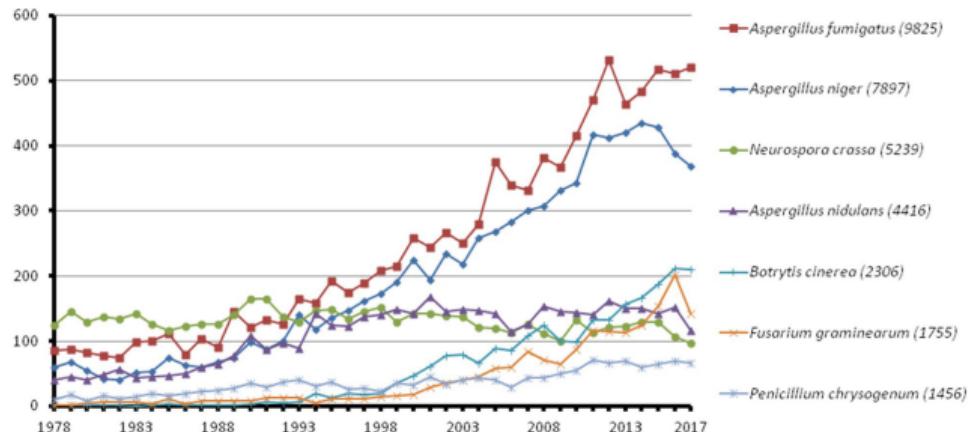


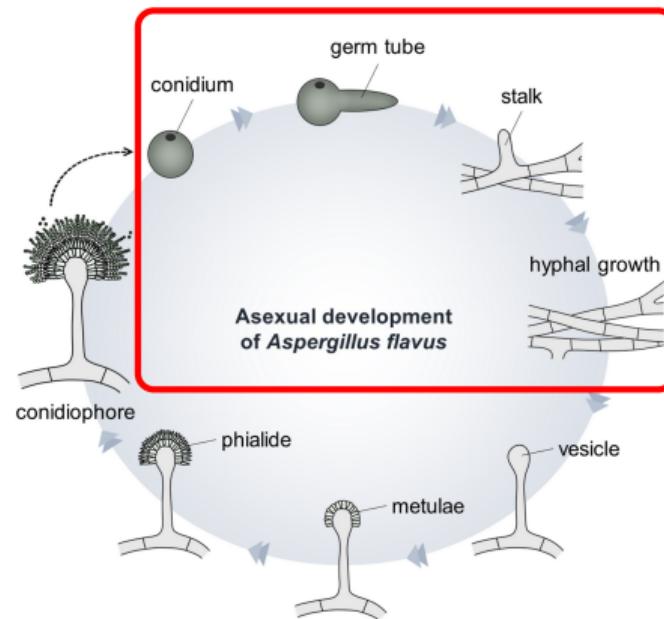
Figure: Number of published papers on PubMed about specific filamentous fungi[2].

# ASPERGILLUS LIFE CYCLE



QUESTION

- » Stages of interest - inoculation to hyphal outgrowth (excluding reproduction).

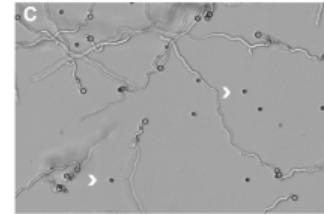
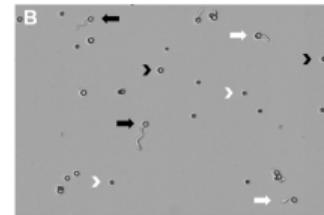
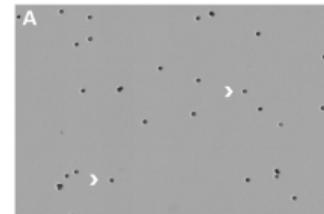
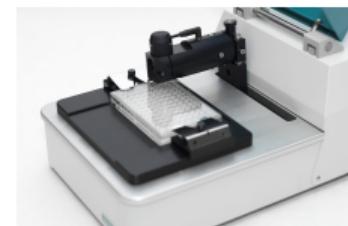


# STUDIES BY IJADPANAHSARAVI ET AL.



## Microscope imaging with oCelloscope

- » Frames of conidia samples in well plates, taken at regular intervals for 24 hours[7];
- » Computer vision algorithm detects properties of observed spores: Area, Circularity, Elongation, Granularity, Thinned Length, X and Y Position, Branch Points, Bounding Box;
- » Overlapping objects yield ambiguous measurements and are therefore removed from analysis.

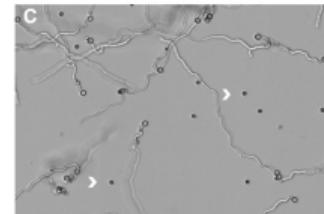
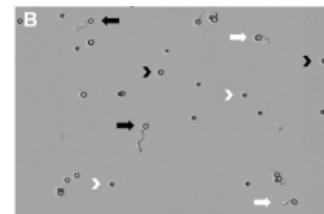
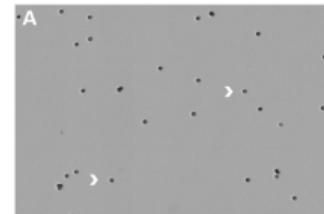


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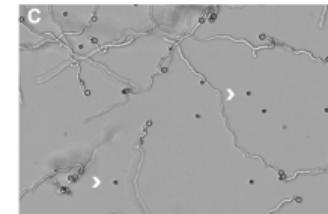
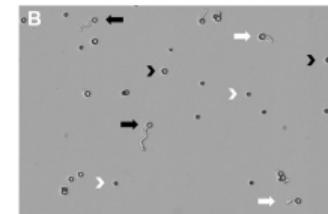
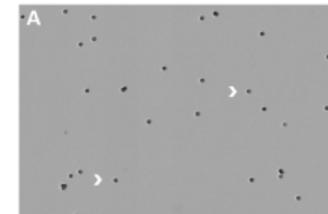
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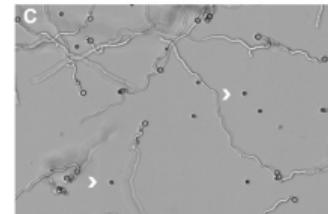
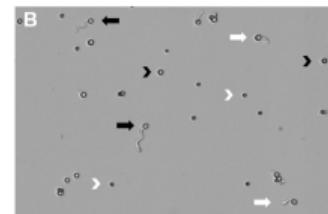
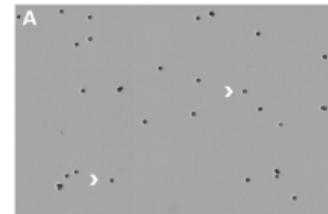
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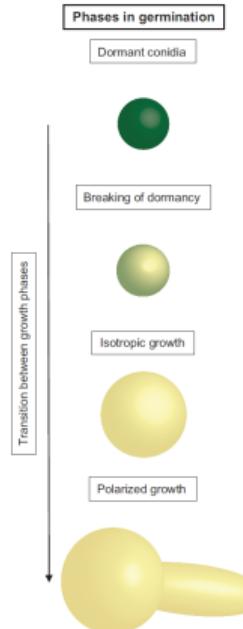
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## Germination phases[1]

- » Dormancy
- » Swelling
- » Polarisation
- » Germ tube formation
- » Hyphal extension



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## Minimal nutrient requirements for germination

- » Glucose + either inorganic phosphate, inorganic nitrogen or magnesium sulphate: sufficient for swelling and germination;
- » These conditions are not sufficient for outgrowth;
- » Therefore, a fraction of the spores "takes a chance" to germinate.

## Effect of highly inducing amino acids on *A. niger*

- » Alanine and proline - highly inducing amino acids (stronger effect on germination than glucose);
- » They are sources of carbon and nitrogen, usually forming in plants under stress.

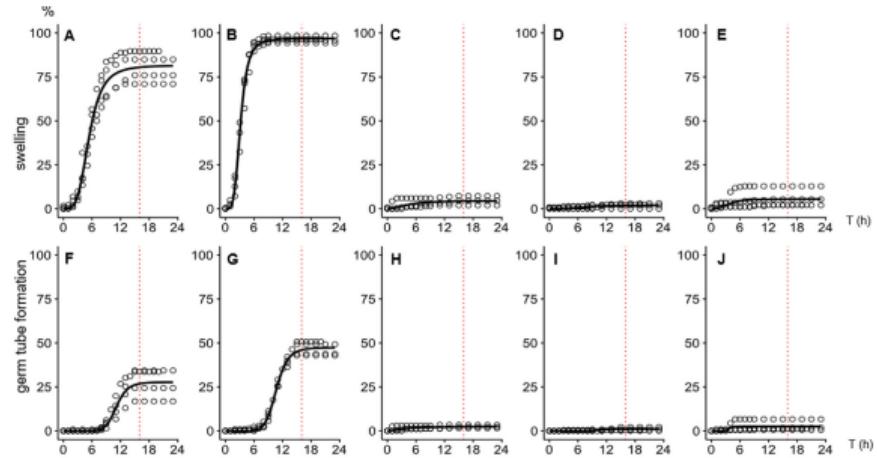


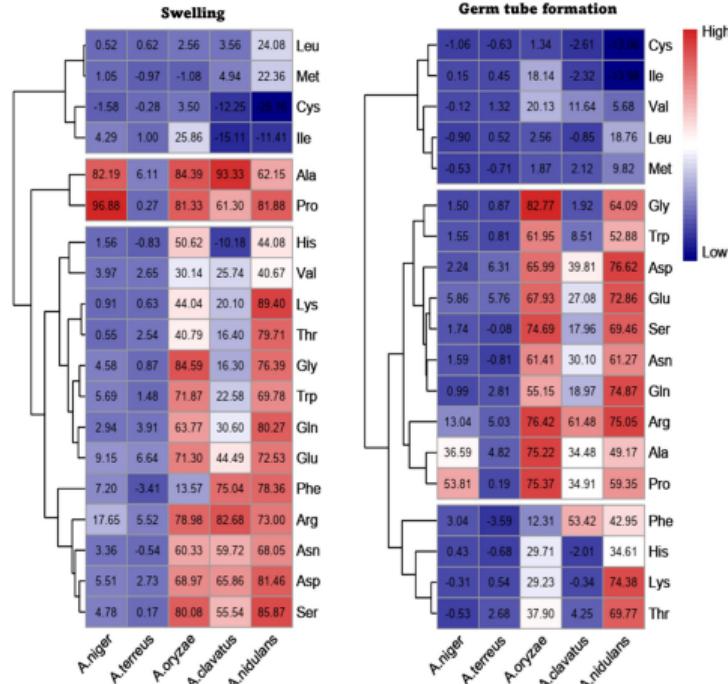
Figure: Fitted asymmetrical model[4] on *A. niger* data measured in different media: alanine (A, F), proline (B, G), glutamate (C, H), histidine (D, I), phenylalanine (E, J)[7].

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## Amino acid effects on other *Aspergilli*

- » Germination in different species is induced by different amino acids.[6]



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## Carbon sensing

- » G and Ras proteins play a role in environmental sensing.

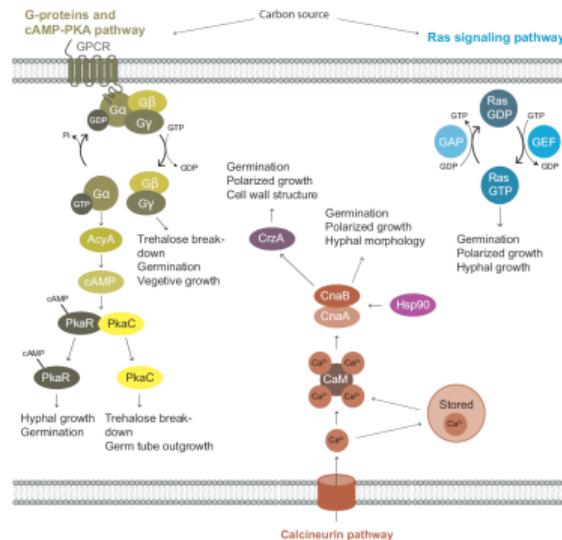


Figure: Membrane-related regulatory pathways involved in conidial germination[1].

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## Effect of spore size, density and co-cultures

- » **Aspergilli** form conidia of different sizes to accommodate different germination responses.
- » Large spores more sensitive to germination inducers (surface area proportional to number of carbon receptors).
- » High density of same-species conidia **inhibits germination incidence** (but not germination time).
- » Presence of other-species conidia may **inhibit germination incidence** (but not germination time) depending on medium.

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# RESEARCH ON HYPHAL OUTGROWTH



## Free filaments vs. pellets

- » Single conidia form free filaments.
- » Agglomerated conidia form pellets.

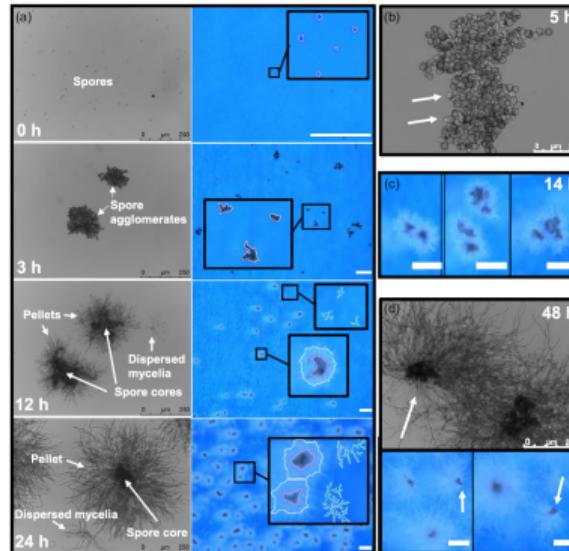


Figure: Pellets at different cultivation stages: differential interference contrast (DIC) images (grayscale) and stereomicroscopic images (RGB).[8]

# RESEARCH ON HYPHAL OUTGROWTH



## Synchrotron radiation-based microcomputed tomography

- » Available data on 3D pellet morphologies of a hyper-branching *A. niger* mutant.
- » Can serve as an extreme case verification.

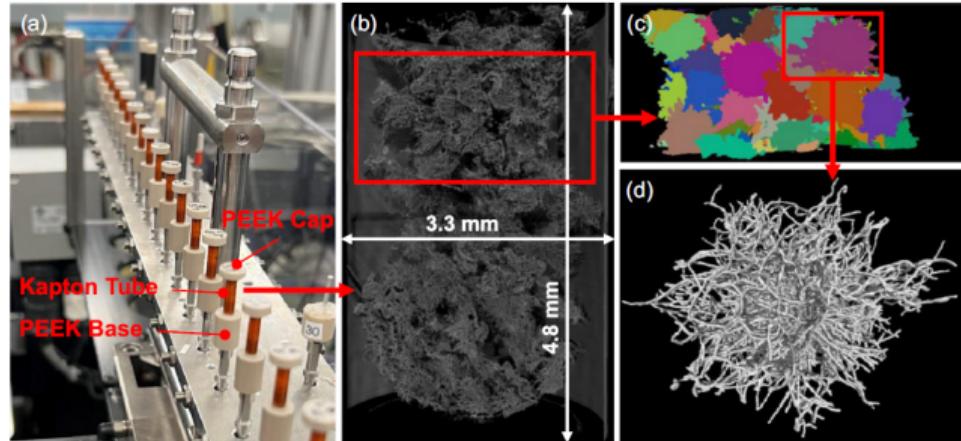


Figure: Process of obtaining 3D imagery of an *A. niger* pellet through microtomography[9].

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# THE ASPECT OF SPACE

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- » The spatial colonisation of substrate is important for tracing pathogenicity or productivity of an *Aspergillus* fungus.
- » Spatial heterogeneities may be indicative e.g. of competition effects or irregular distribution of resources.
- » Results of spatial results can be qualitatively and quantitatively compared to microscope imagery.
- » The spatial spread and morphology should be traceable back to the inoculation and germination conditions.
- » Current models predominantly focus either on germination or on outgrowth, but not on both.

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# BRIDGING THE GAP



## Considering space in germination

- » Asymmetrical model by Dantigny[4] is used to fit germination parameters  $P_{max}$ ,  $\tau$  and  $d$ :

$$P = P_{max} \left[ 1 - \frac{1}{1 + \left( \frac{t}{\tau} \right)^d} \right] \quad (1)$$

- » It results in a good fit but is not directly based on biological principles (derived from non-competitive inhibition model).

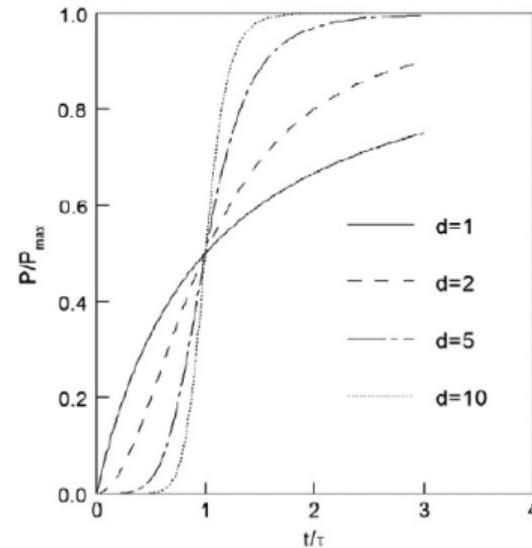


Figure: Effect of different values for the design parameter  $d$ .[4]

# BRIDGING THE GAP



## Considering space in germination

- » Can spatially distributed interactions based on actual mechanisms (carbon sensing, mutual inhibition) result in the same average germination curves?
- » Parameters can be used to construct distributions for randomised germination times of spatially distributed spores.

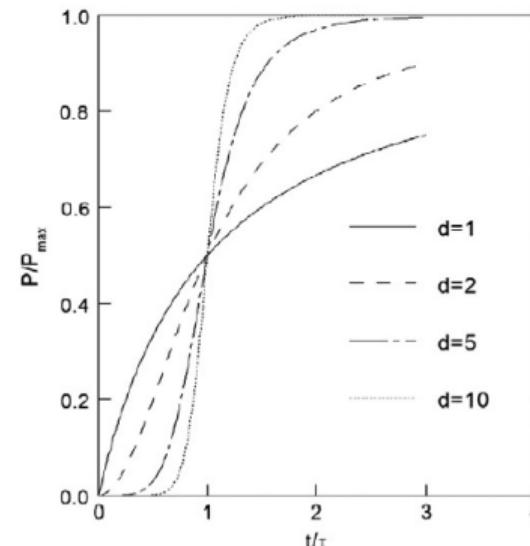


Figure: Effect of different values for the design parameter  $d$ .[4]

# BRIDGING THE GAP



## Connecting germination to outgrowth

- » Germination time is correlated with mycelium outgrowth lag time[5];
- » Inoculum consistency (concentration, agglomeration) affects pellet morphology[8];
- » Culture mixes and medium may impact not only germination but also pellet formation.

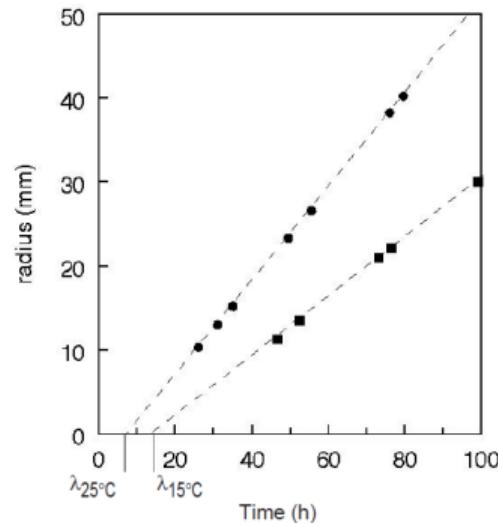


Figure: Linear growth of the radius of two *Mucor racemosus* colonies over time, grown at different temperatures[3]

# PRELIMINARY IDEAS

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- » The heterogeneous properties and interactions of spores can be captured through agent-based modelling.
- » Hyphal growth can be represented through successive (branching) vector additions to each conidium source.
- » If evidence shows a high importance of diffusive transport, lattice-based PDE techniques can be considered.

# MODEL SUMMARY

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- » Encompassing stages from inoculation to pellet/filament formation.
- » Simulated growth in three-dimensional space.
- » Initial behaviour informed by germination data.
- » Final morphologies verified by tomographic data (comparison of volume, fractal dimension, branching ratio etc.)

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# TENTATIVE SCHEDULE

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1. Submission of Thesis Proposal - by 21.10.2024;
2. Literature review (carbon signalling during germination, spore agglomeration, mechanics of hyphal growth) - by 01.12.2024;
3. Minimal model completion and data access setup - by 17.01.2025;
4. Verification and correction of model - by 28.02.2025;
5. Analysis of model results - by 28.03.2025;
6. Expansion of model (application to other species, incorporation of other mechanisms) - by 25.04.2025;
7. Documentation (writing of Thesis) - by 30.05.2025.

# BIBLIOGRAPHY

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- [1] Tim J. H. Baltussen et al. "Molecular Mechanisms of Conidial Germination in *Aspergillus* spp". In: *Microbiology and Molecular Biology Reviews* 84 (2019). URL: <https://api.semanticscholar.org/CorpusID:208642285>.
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