

WELCOME!

Hierarchical Modelling of Species Communities with the R-package Hmsc

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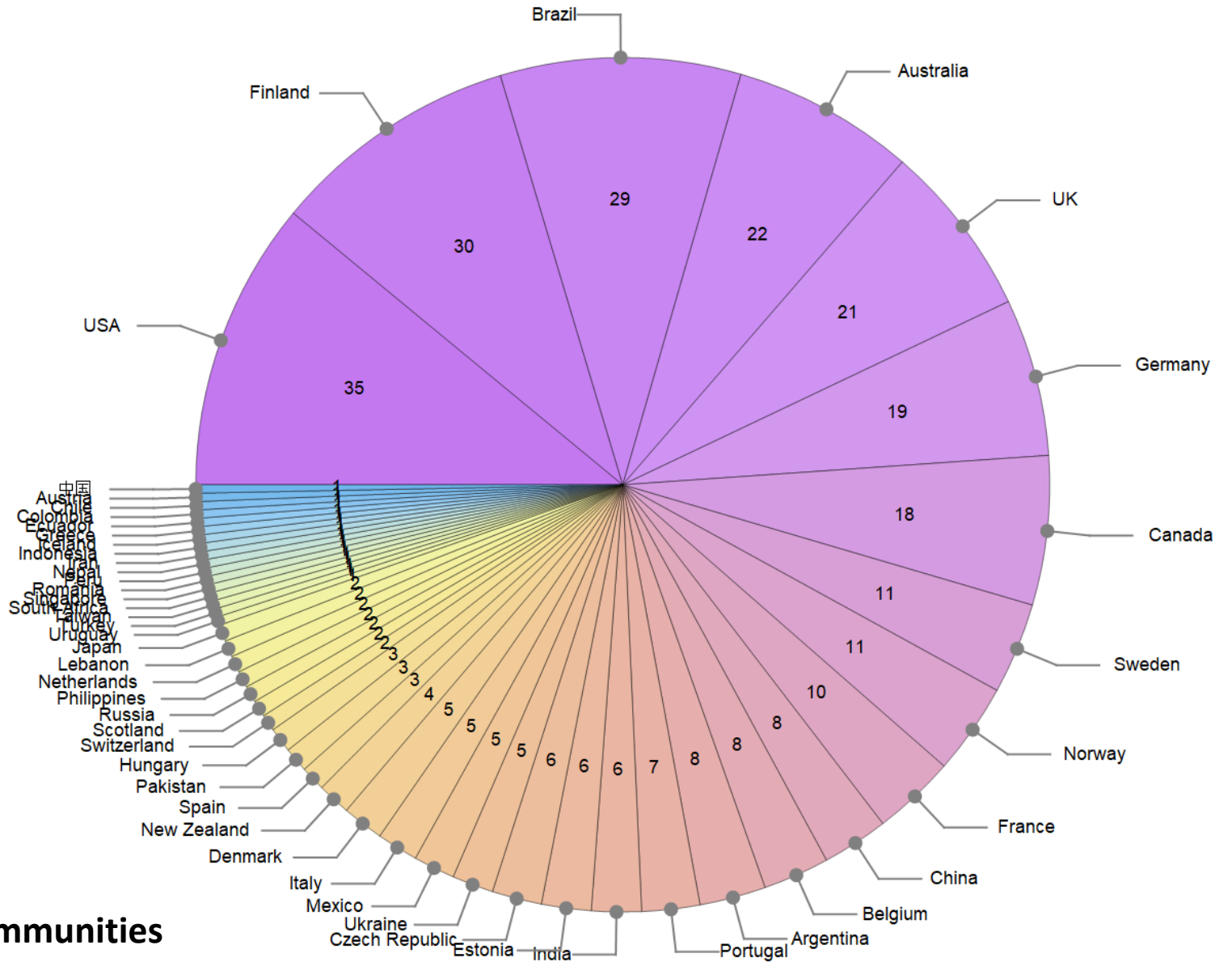
ANY QUESTIONS? PLACE THEM IN CHAT!

**319 participants
from 49 countries!**

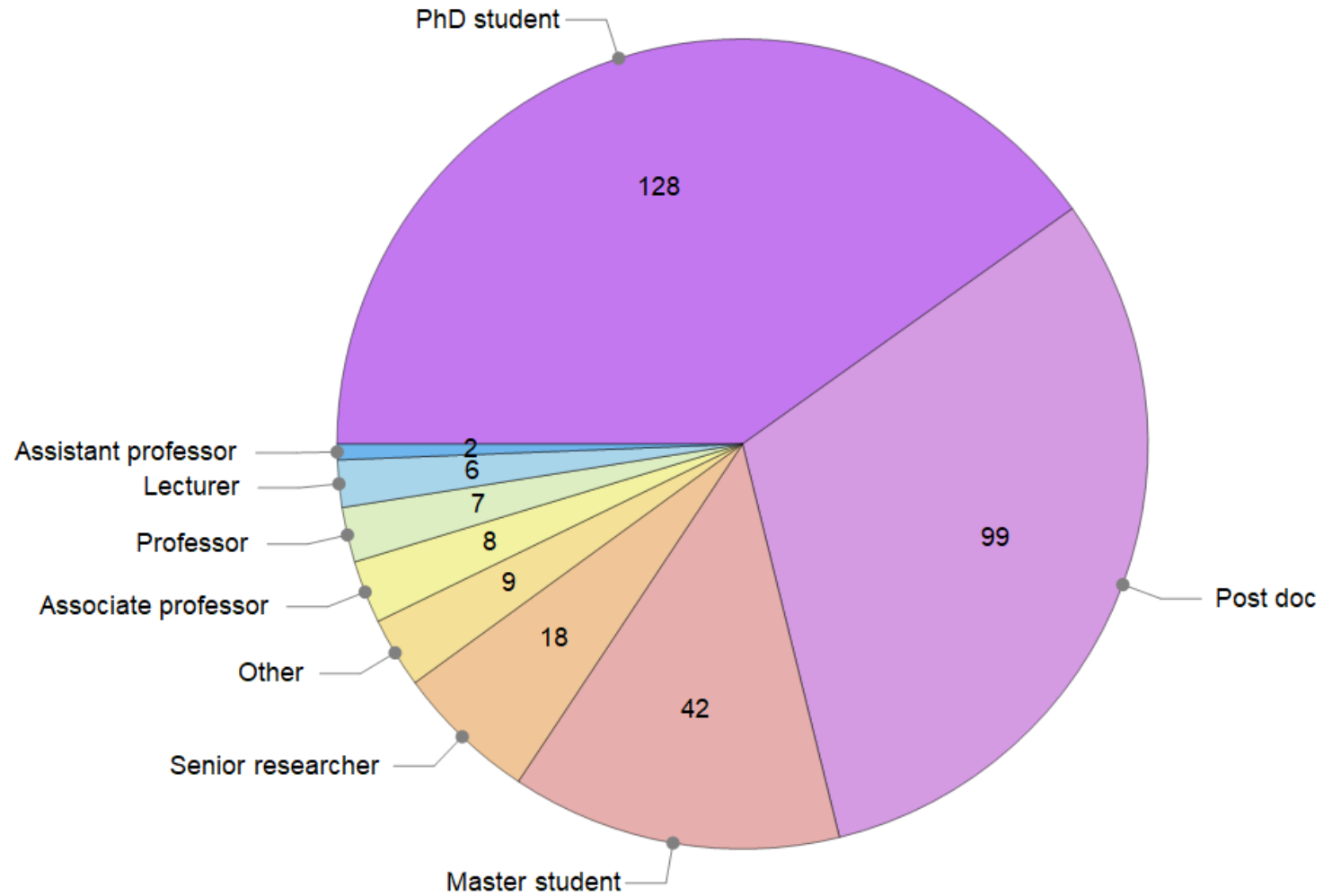


#HMSCmarathon

HMSC = Hierarchical Modelling of Species Communities



Majority of the participants are PhD students, post docs & master students

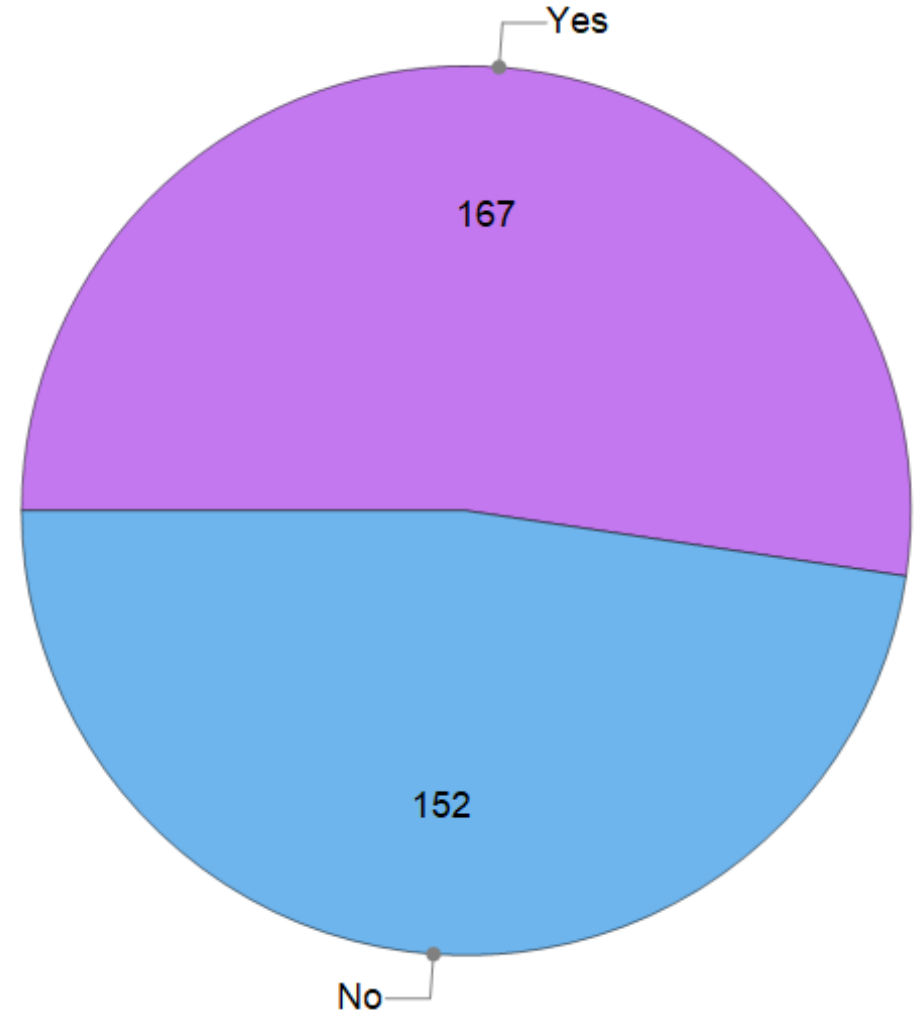


Need study credits (2 ECTS)?

- You can receive a signed certificate stating that you have successfully completed this 2ECTS course – hopefully your university will then accept to register the credits.
- To achieve the study credits, you should turn in a learning diary at the end of the course (2-5 pages in total, pdf-file), where you summarize in your own words what you learned during each of the course days. Send the pdf file to hmsc-course@helsinki.fi, with email subject learning_diary_surname_firstname, e.g. learning_diary_ovaskainen_otso.
- If you are a student at Helsinki, we can register your credits directly.

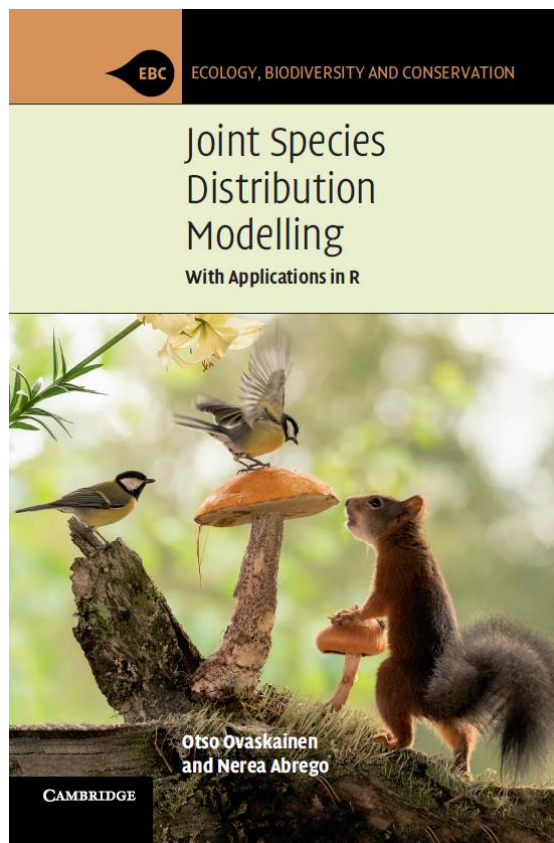
More than half planned to come with their own data

- >60 datasets received
- Pilot models fitted for 39 datasets
- We aim to set up pilot models for everybody – latest after the course!



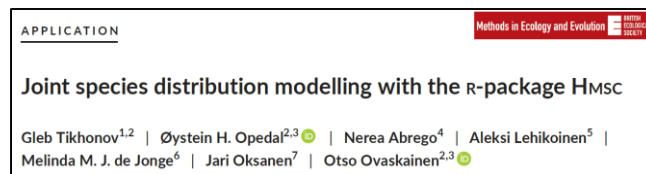
Course material

1. Book



Cambridge University Press (2020)

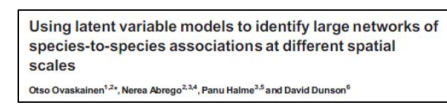
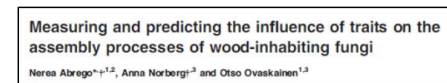
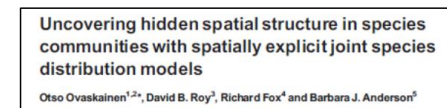
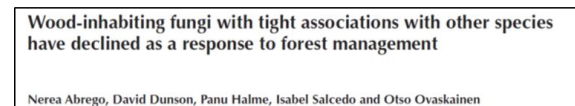
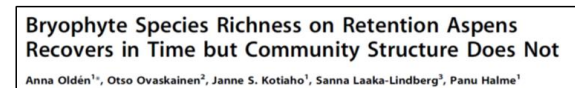
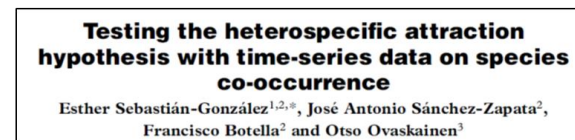
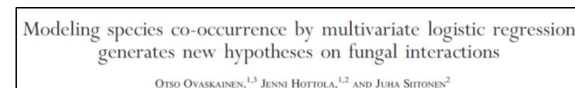
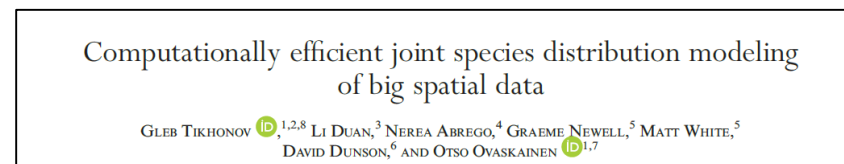
2. R-package Hmsc (in CRAN)



Methods in Ecology & Evolution (2020)

3. R-scripts (at the www-page)

Additional recommended reading



Course programme

<https://www.helsinki.fi/en/researchgroups/statistical-ecology/hmsc>

How the course relates to the book?

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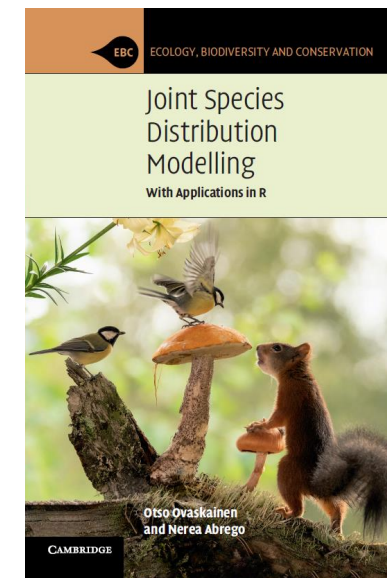
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How the course relates to the book?

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LECTURE 1:
Welcome!
LECTURE 11:
Closing words

LECTURE 8: how
to write materials
and methods?

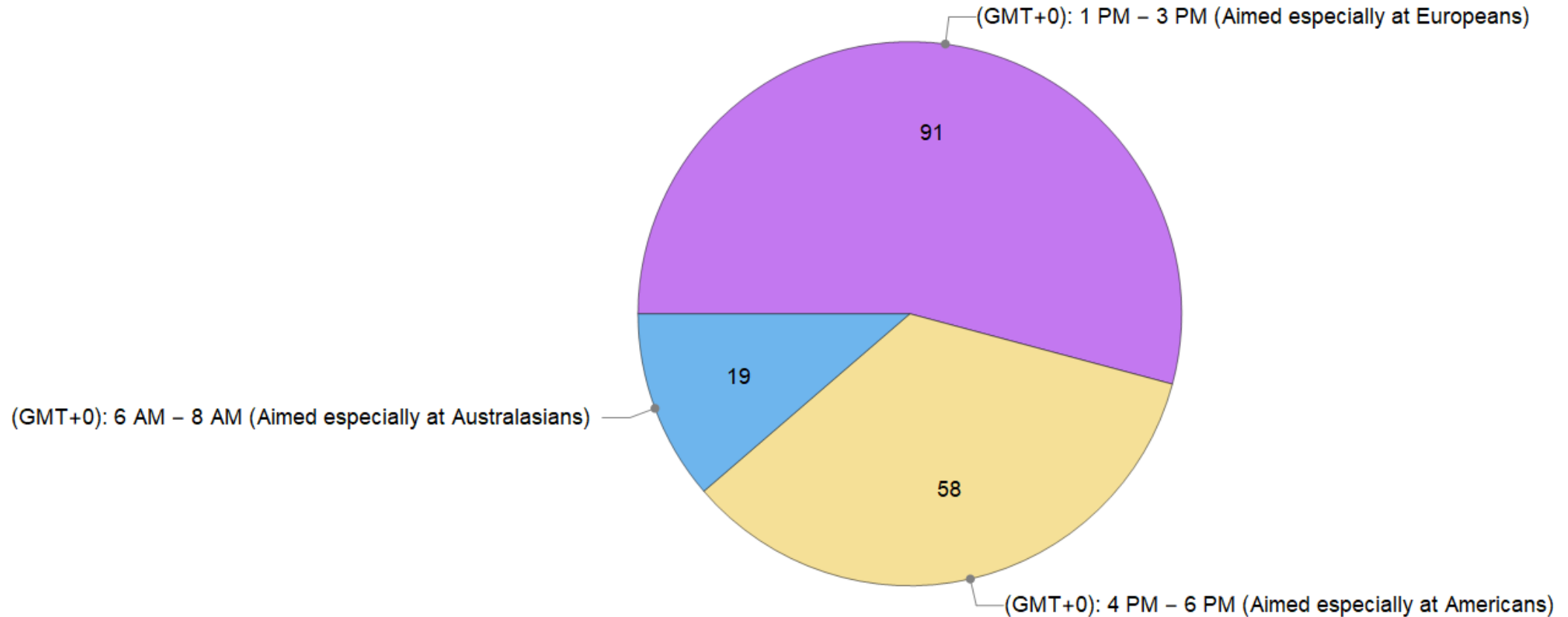
LECTURE 9: how
to write results?

R-demonstrations
4 & 5: your own
case studies!

Break-out groups
1 & 2

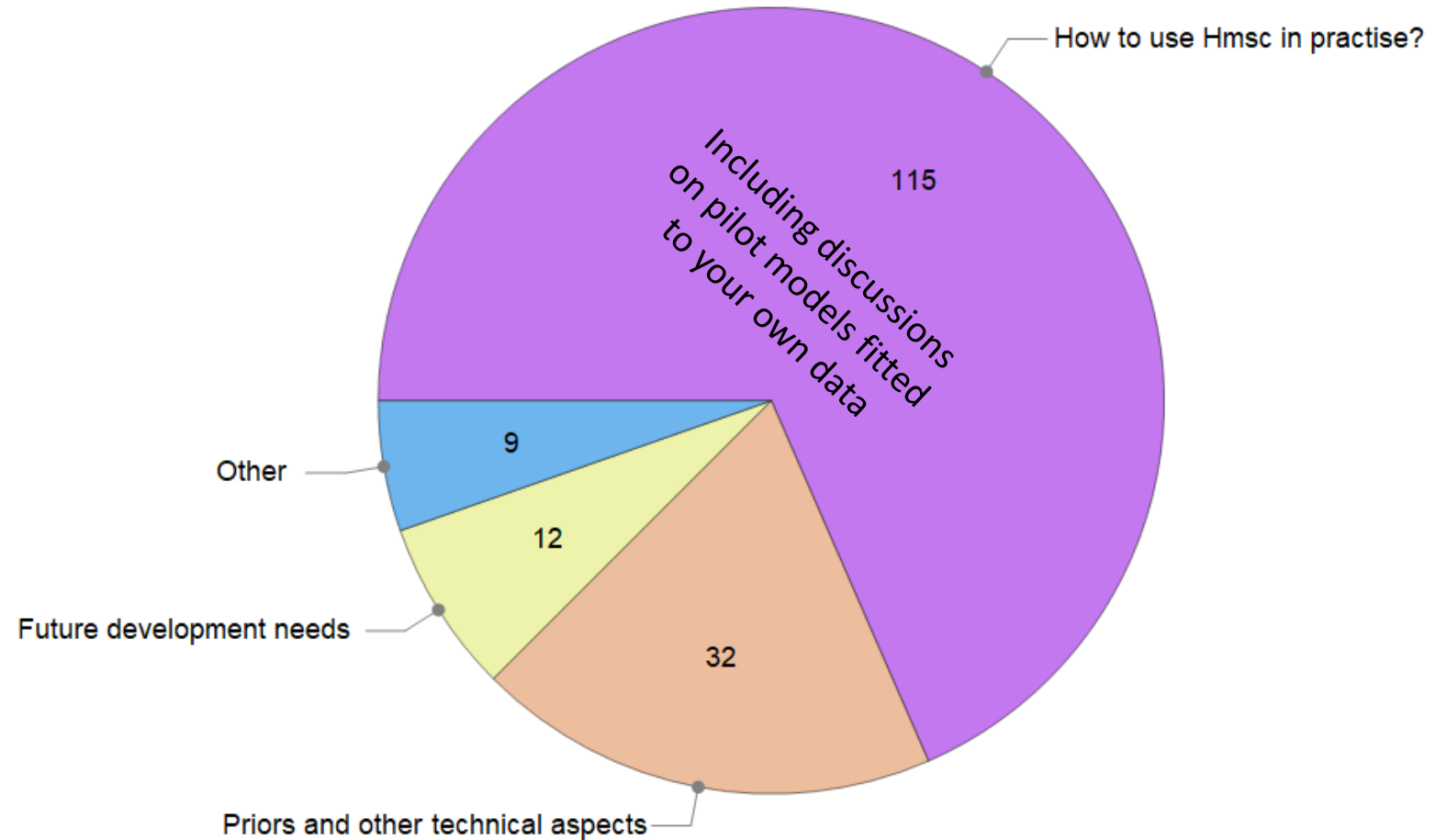
What happens in the break-out groups?

There are two break-out groups
Both of them have three time options



What happens in the break-out groups?

What do you want to talk about in the break-out groups?



Thank you for listening, and welcome again to this course!

ANY QUESTIONS ABOUT THE COURSE ARRANGEMENTS?

ASK IN CHAT!