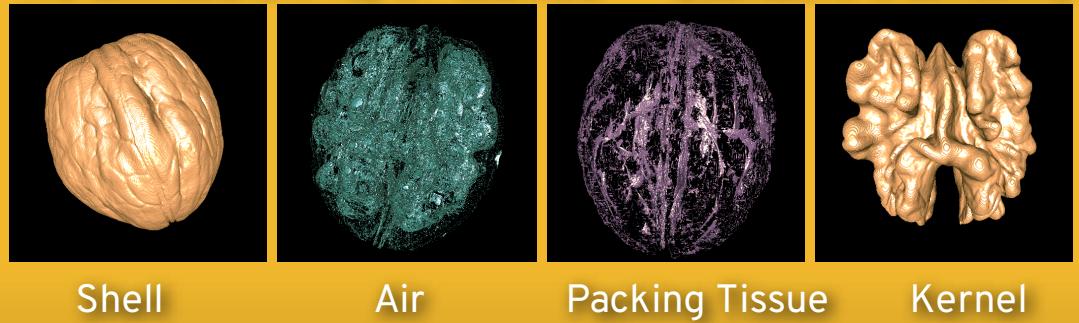


# The shape and size of shells, kernels, and cracks –in a nutshell



148 accessions X-ray CT scanned



Shell

Air

Packing Tissue

Kernel

Preprint

DOI: [10.1101/2023.09.26.559651](https://doi.org/10.1101/2023.09.26.559651)

Python Code  
[github.com/amezqui3/walnut\\_tda](https://github.com/amezqui3/walnut_tda)



## Phenotyping walnuts with X-ray CT scanning

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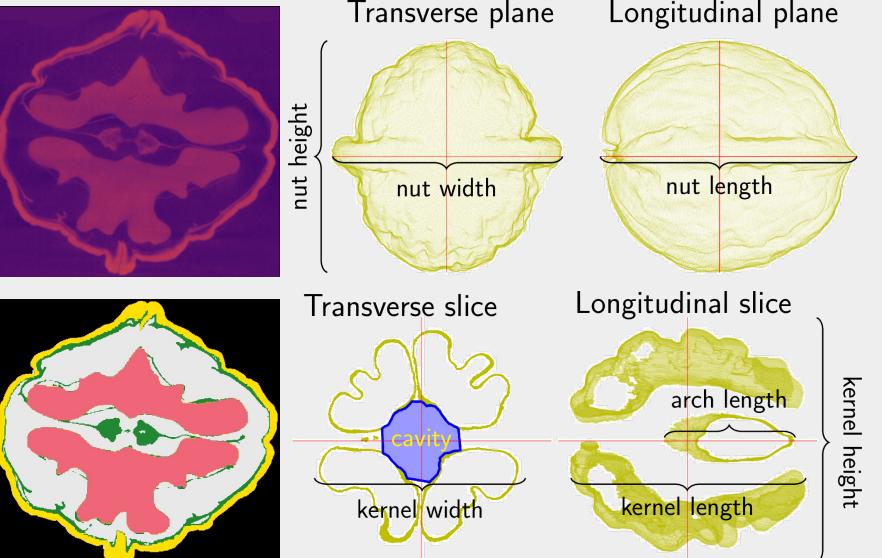
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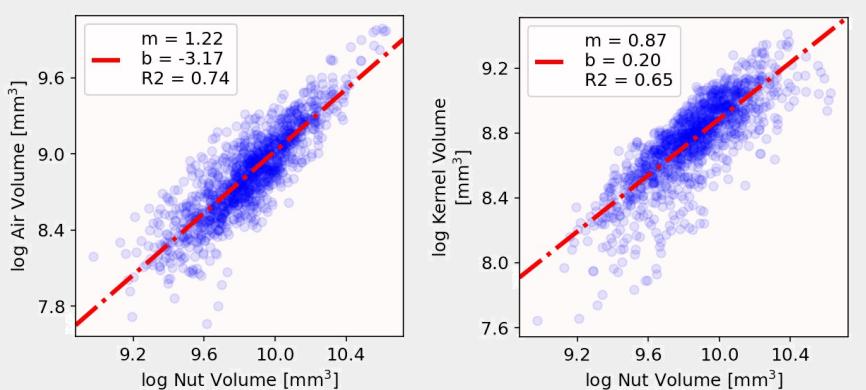
<sup>4</sup>. Plant Sciences, University of California, Davis

## Materials and methods



- 1264 individuals → 149 accessions
- 49 morphological phenotypes:
  - lengths, areas, absolute and relative volumes, ...
- 12 traits of commercial interest:
  - kernel weight, ease of kernel removal, shell strength

## Allometry reveals biophysical limits



- If nut volume increases by 2X
  - Then air volume increases by 2.3X
  - Walnut diameter capped at 15cm (6")
  - Diameter larger than 1.6cm ( $\frac{5}{8}$ ")
- If nut volume increases by 2X
  - Kernel volume only increases by 1.8X

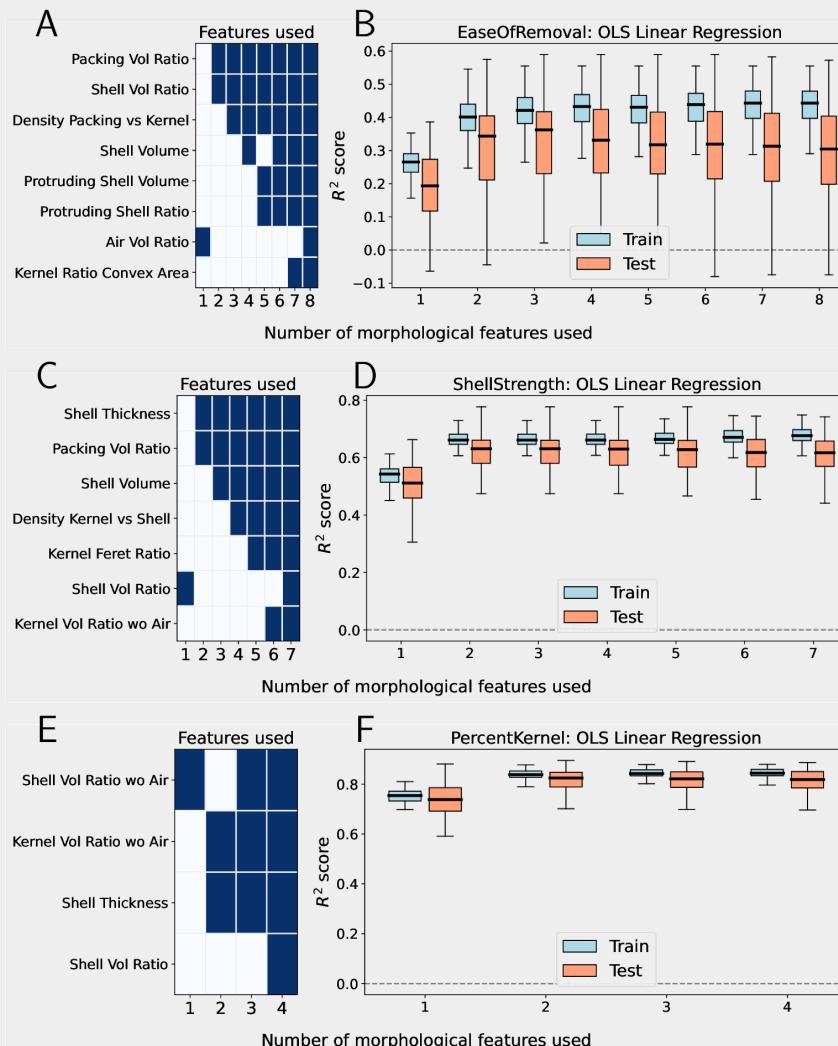
## Acknowledgements

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## References

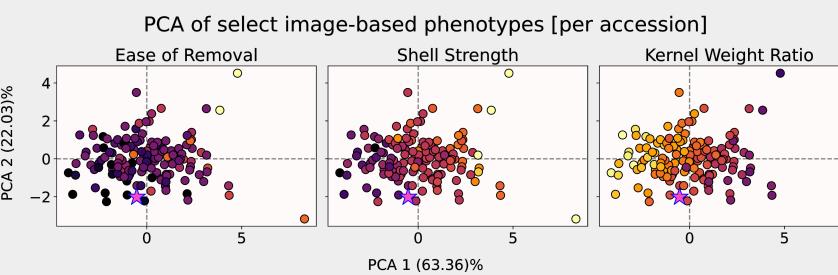
[1] Bernard, A., Hamdy, S., Le Corre, L. et al. (2020) "3D characterization of walnut morphological traits using X-ray computed tomography," *Plant Methods*, **16**, 115.

## Phenotyping → better walnut breeding



- Stepwise linear regression to model commercial traits using only morphological traits
- Determine shape traits that contribute the most to the predictive model
- Perform a 70/30 train/test split to avoid overfitting
- Use only traits with significant Spearman correlation
- **Relative tissue volume and thickness is all you need!**
- Inexpensive phenotyping platforms focused solely on volumetric analyses

## Future directions: domestication



- Earliest Himalayan accession is notoriously hard to crack open yet it is morphologically average
- There must be a subtle yet fundamental morphological change when walnut was domesticated
- Inexpensive platforms → More phenotyping
  - More data → Better math models
  - Insights into breeding and domestication