

# Statistical reconstruction of yeast nuclear organisation

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# Introduction

- Nuclear organisation = spatial organisation of genome inside nucleus
- Important for nuclear function: transcription, DNA repair and replication

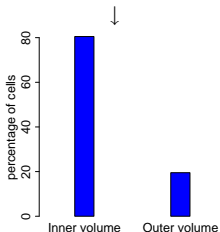
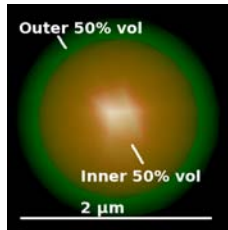


# Introduction

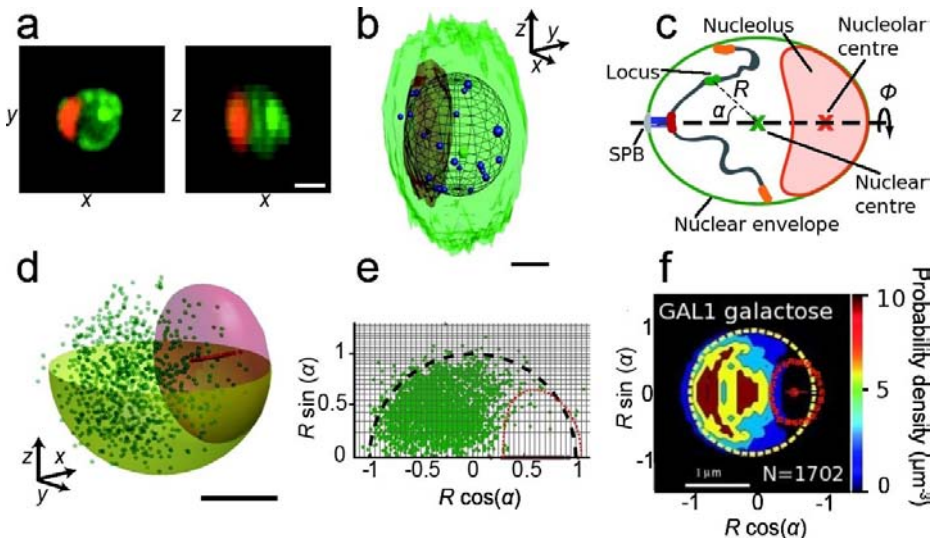
- Nuclear organisation = spatial organisation of genome inside nucleus
- Important for nuclear function: transcription, DNA repair and replication
- PTR 218 'Functional analysis of gene location and dynamics through quantitative imaging'
  - Labs of U. Nehrbass, B. Dujon and C. Zimmer
- In *Saccharomyces cerevisiae* yeast, e.g.
  - GAL1 gene moves to nuclear periphery during transcription (Cabal et al., *Nature*, 2006)
  - Genes near telomeres (chromosomal extremities) at the nuclear periphery
    - tend to be silenced (Hediger et al., *Current Biol.*, 2002)
    - have highest DNA repair efficiency (Thérizols et al., *JCB*, 2005)
- but detailed nuclear organisation in eukaryotic cells (including yeast) is largely unknown

## Current state of statistical description of nuclear organisation

- Chromatin has random components of motion (Heun et al., *Science*, 2001)
  - statistical descriptions required
- binary classification of distance to nuclear periphery
- low resolution
- diffraction limit for optical microscopes:  $\sim 0.25\mu\text{m}$  laterally,  
 $\sim 0.5\mu\text{m}$  axially



## From 3-d microscope images to 2-d locus maps

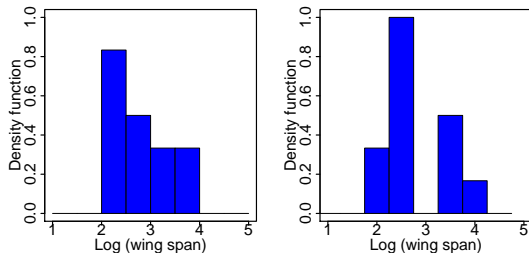


Ref: (Berger et al., *Nature Meth.*, 2008, In press)



# Histograms vs kernel estimators

Histogram (same data)

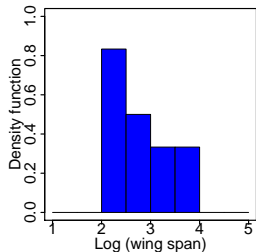


$$\hat{f}_{\text{Hist}}(x) = n^{-1} \sum_{i=1}^n 1\{X_i \in \text{bin}(x)\}$$

arbitrary placement of bin end points  
unrealistic jump discontinuities

# Histograms vs kernel estimators

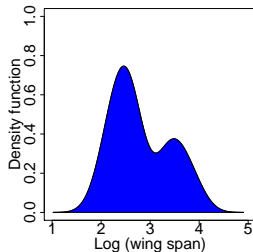
## Histogram (same data)



$$\hat{f}_{\text{Hist}}(x) = n^{-1} \sum_{i=1}^n 1\{X_i \in \text{bin}(x)\}$$

arbitrary placement of bin end points  
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## Kernel estimator

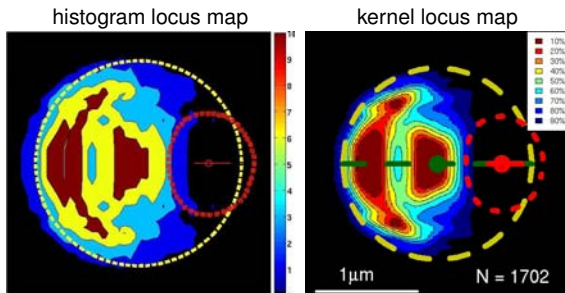


$$\hat{f}_{\text{Kern}}(x) = n^{-1} \sum_{i=1}^n K_h(x - X_i)$$

no end points required  
no jump discontinuities  
faster convergence in prob.

## 2-d chromosomal locus map

- GAL1 gene under galactose conditions,  $n = 1702$  cells
- Visually similar locus maps
- Both are high resolution ( $\lesssim 150\text{nm}$ )
- but kernel smoother map is more statistically rigorous





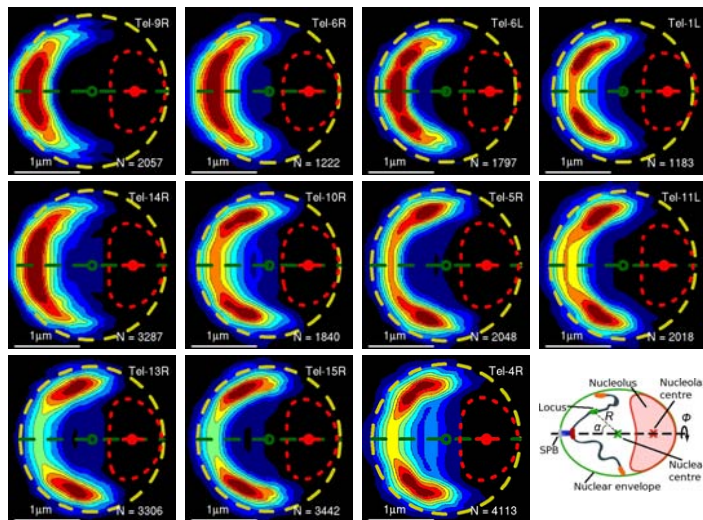
## Focusing on telomeres (1)

- Existing evidence that 32 yeast telomeres preferentially localise at the nuclear periphery and form 4 to 5 clusters
  - highly non-uniform localisation inside nucleus
- Ideal candidates for investigating spatial location and nuclear function
  - Working hypothesis: proximity of telomeres directly related to their recombination efficiency (Gotta et al., *JCB*, 1996)

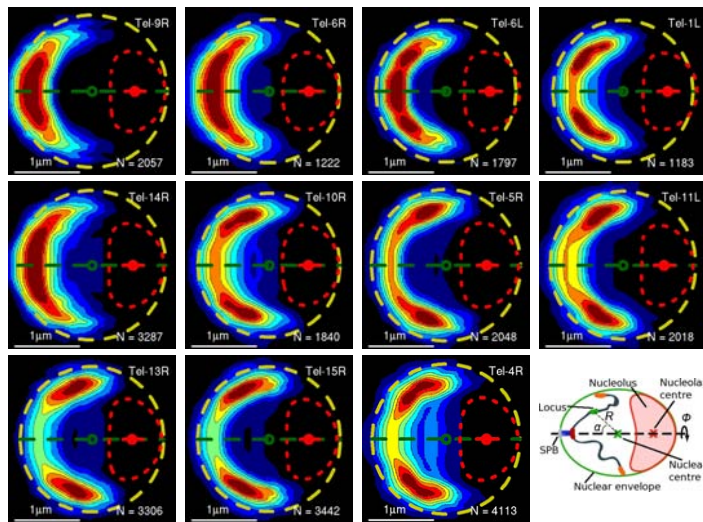
## Focusing on telomeres (1)

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- 2-d locus maps reveal localisation of single locus wrt nuclear landmarks
- but require localisation of telomeres wrt each other

## Focusing on telomeres (2)



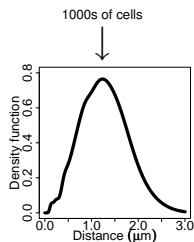
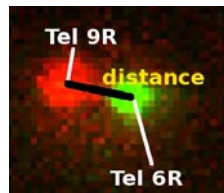
## Focusing on telomeres (2)



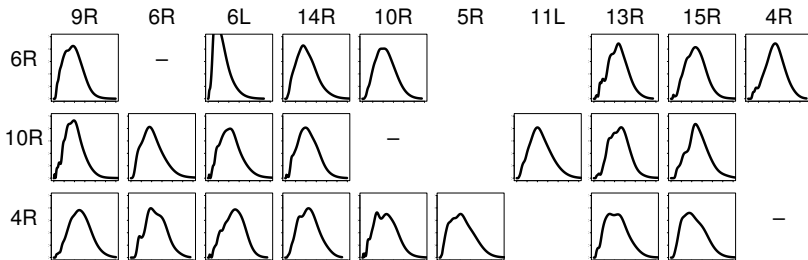
Caveat: Overlapping 2-d maps does NOT imply colocalisation

## Telomere-telomere pairwise distances (1)

- Distance between two telomeres
- Nuclear landmarks unable to be tagged concurrently (only 2 colours available)
- NB: different experiments to those for chromosomal loci

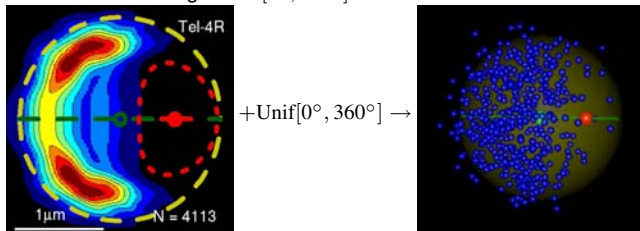


## Telomere-telomere pairwise distances (2)



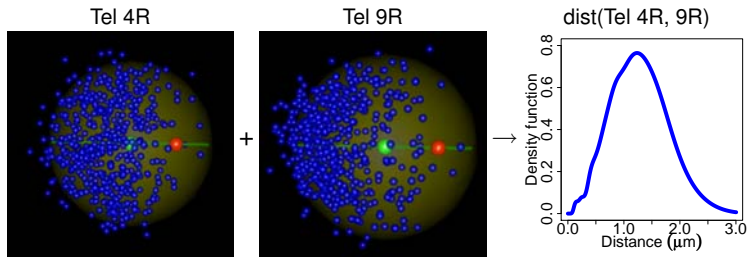
## Simple 3-d model (1)

- Limitations of 2-d maps
  - Rotation angle about the central axis (green line) not known
- Assume uniform angles on  $[0^\circ, 360^\circ]$



## Simple 3-d model (2)

- No direct 3-d validation check of uniformity assumption
- Indirect validation via distance between pairs of telomeres
- With extra assumption of statistical independence

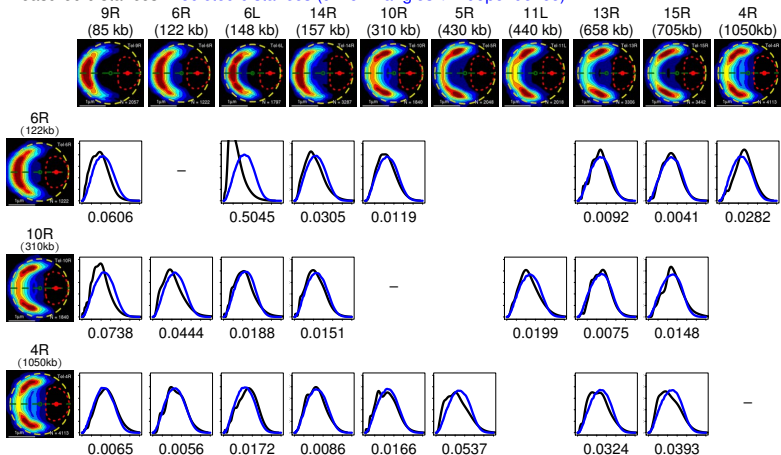






## Checking the assumptions of the simple 3-d model

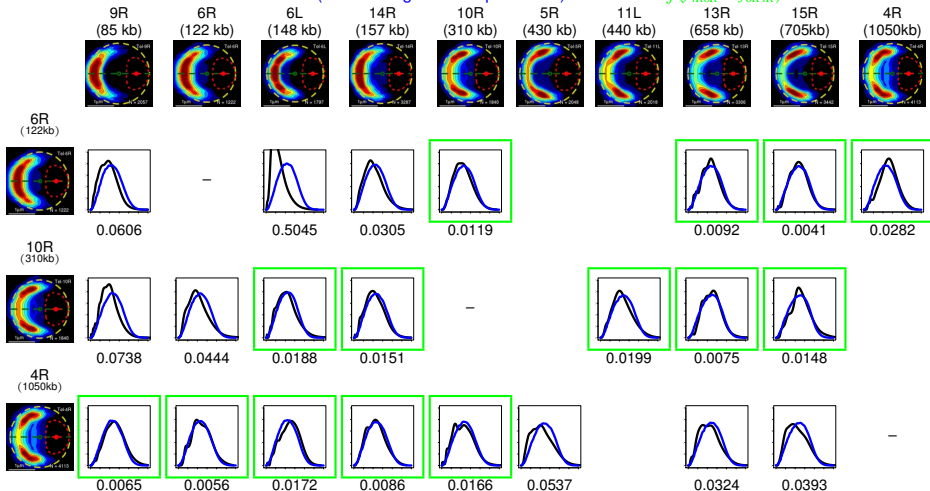
Measured distances **Predicted distances (uniform angles + independence)**





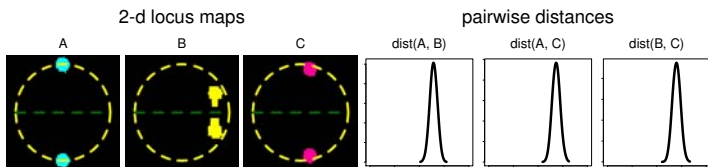
## Checking the assumptions of the simple 3-d model

Measured distances Predicted distances (uniform angles + independence) Threshold =  $\int (f_{4R6R} - f_{6R4R})^2 = 0.0322$

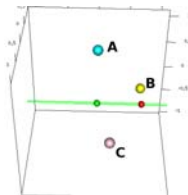


Uniform angles NOT satisfied in all cases

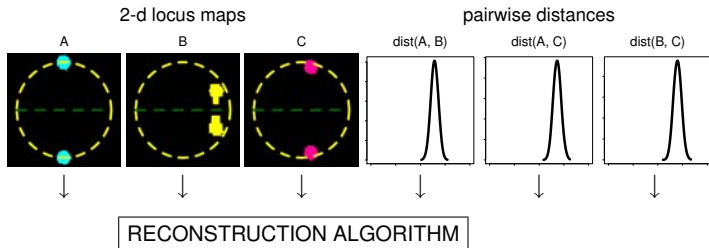
# Data-based reconstruction (synthetic example)



## True median locations

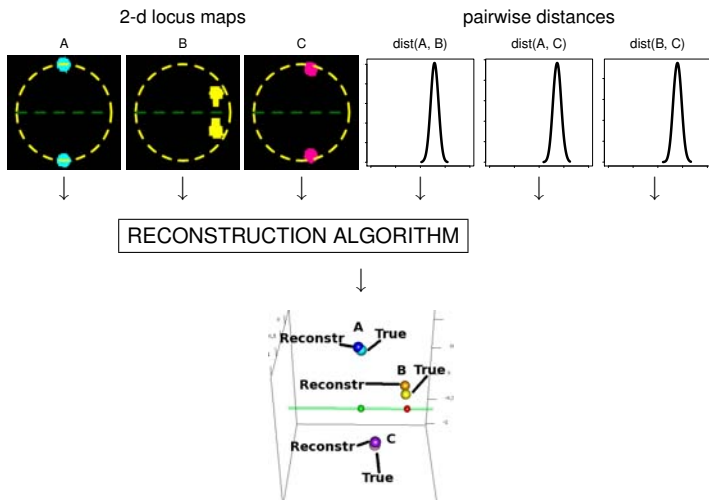


# Data-based reconstruction (synthetic example)



- All six inputs (3 locus maps, 3 distances) are each drawn from different cell populations
- Match pairs of locus maps with corr. pairwise distances
- Simulation from non-parametric distributions

## Data-based reconstruction (synthetic example)



## Next steps

- Thoroughly test reconstruction algorithm on more simulation settings
- Apply to real telomeres data

## Summary and future directions

Yeast nuclear organisation revealed in more details with:

- 2-d chromosomal kernel locus map
  - high resolution i.e. not limited by microscope diffraction
  - statistically rigorous
- 3-d reconstruction given 2-d locus maps and pairwise distances
  - work in progress
  - ultimate goal to reconstruct 3-d location of complete genome
  - connections to physical models of genome

# Acknowledgements

## PTR 218

- Unité de Génétique des Levures, Institut Pasteur
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