

# Leveraging Super High Optical Resolution Microscopy to Probe the Interaction Zone Between *Clostridium thermocellum* and Biomass

EMSL Open House, October 6, 2020

John Yarbrough

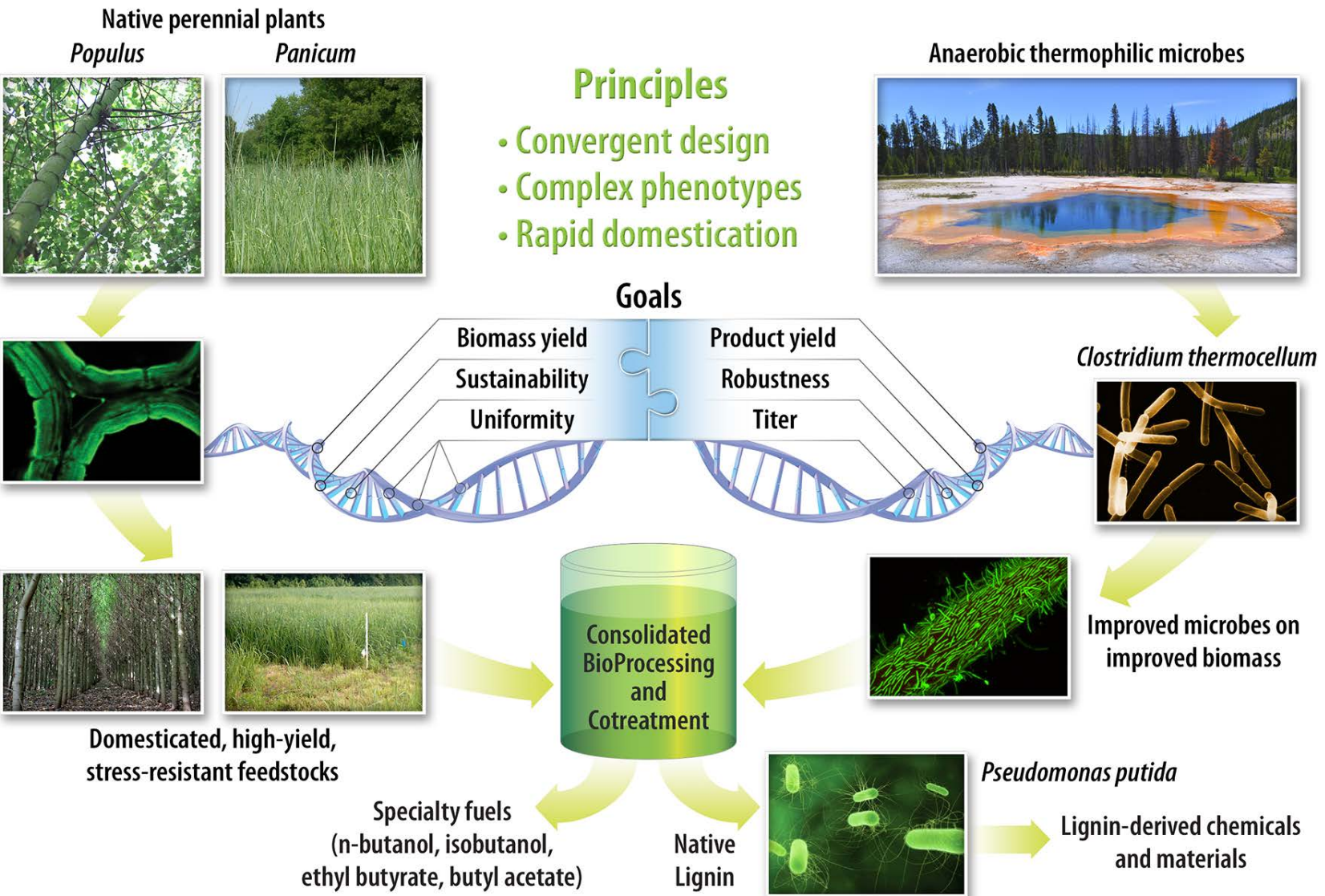
National Renewable Energy Laboratory

CBI



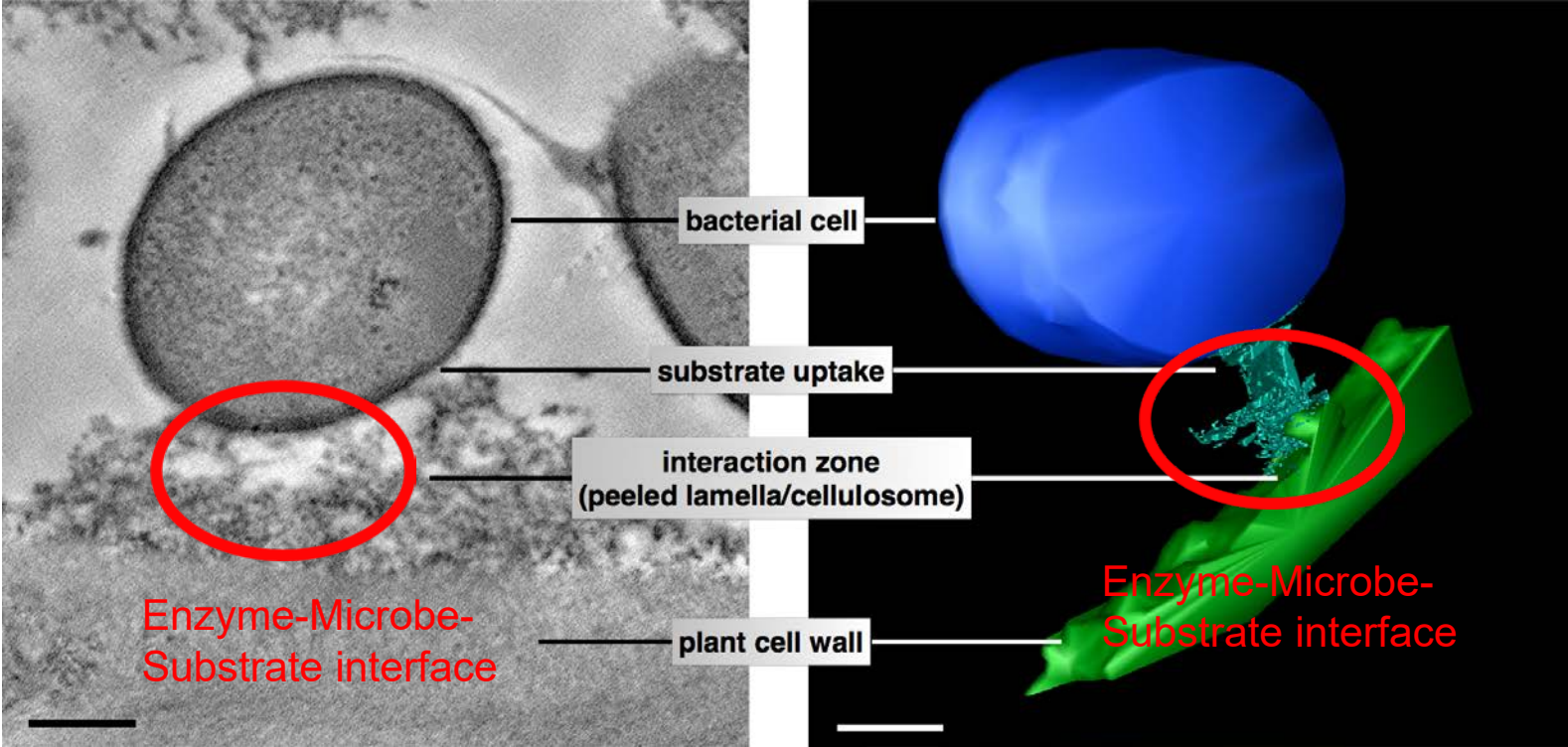
# The Center for Bioenergy Innovation

Convergent improvement of plants and microbes for feedstocks, fuels and products



# *C. thermocellum* is, so far, the most efficient cellulolytic bacterium that has been isolated.

*C. thermocellum* can solubilize more than 60% of C5 and C6 sugars in 4-5 days from non-pretreated mature biomass such as switchgrass, far exceeding the performance of fungal preparations.

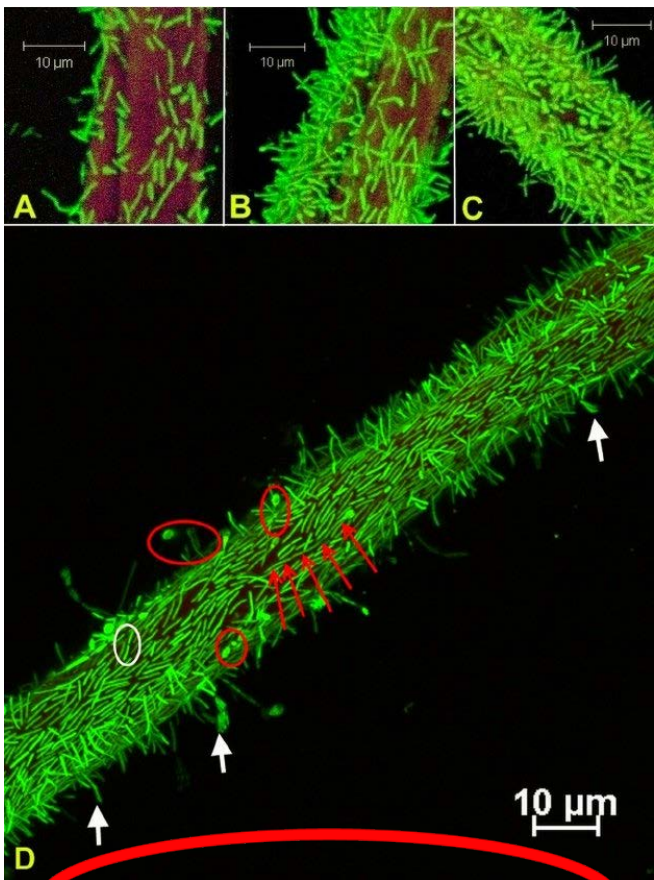


Is the key in the Enzyme-Microbe-Substrate interface?



# Optimal techniques used to study the microbial/surface interactions

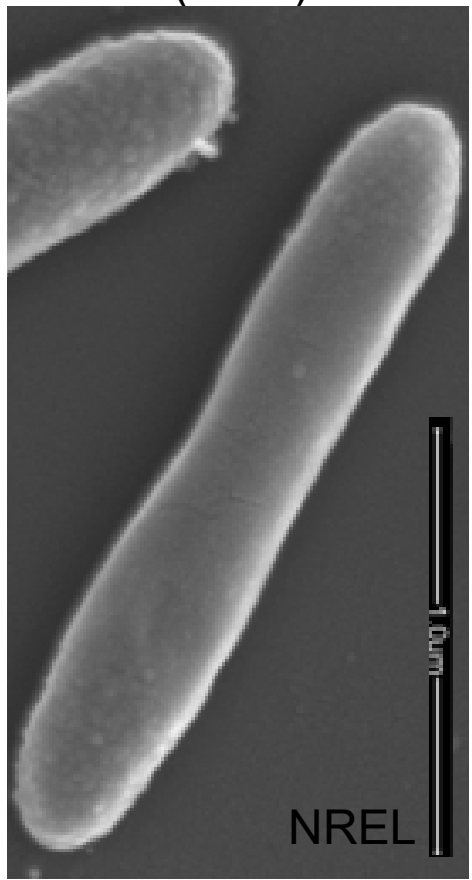
### Optical Imaging



Resolution > 250nm

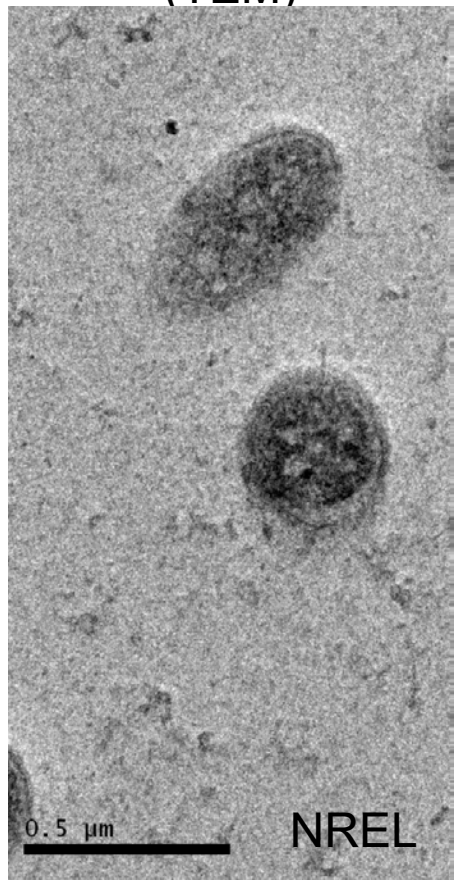
Source: Dumitrache, Alexander. et al. 2013. "Form and Function of *Clostridium thermocellum* Biofilms". AEM, January 2013 <https://aem.asm.org/content/79/1/231>

### Scanning Electron Microscopy Imaging (SEM)



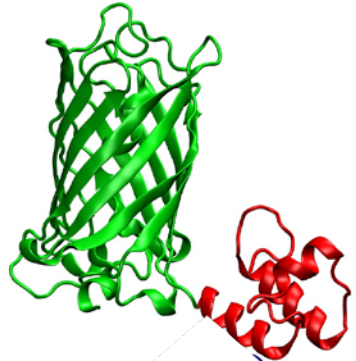
Resolution > 10nm

### Transmission Electron Microscopy Imaging (TEM)

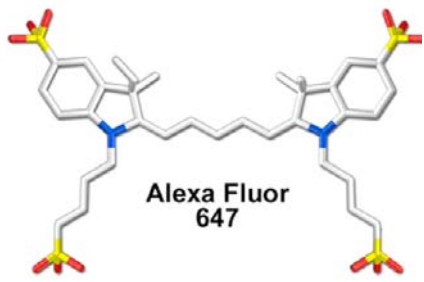


Resolution > 0.2nm

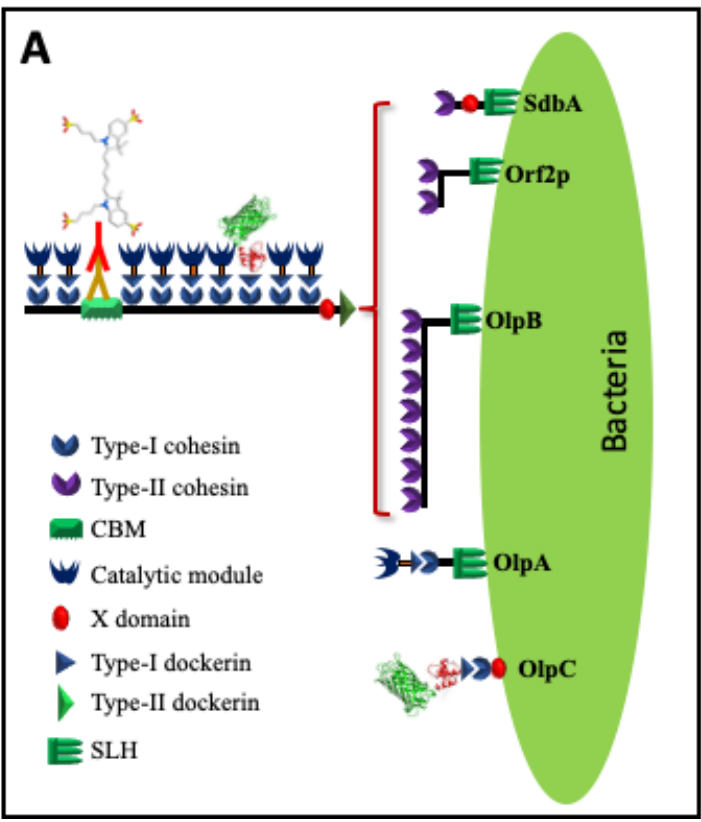
# Labeling *C. thermocellum* for Super High resolution imaging



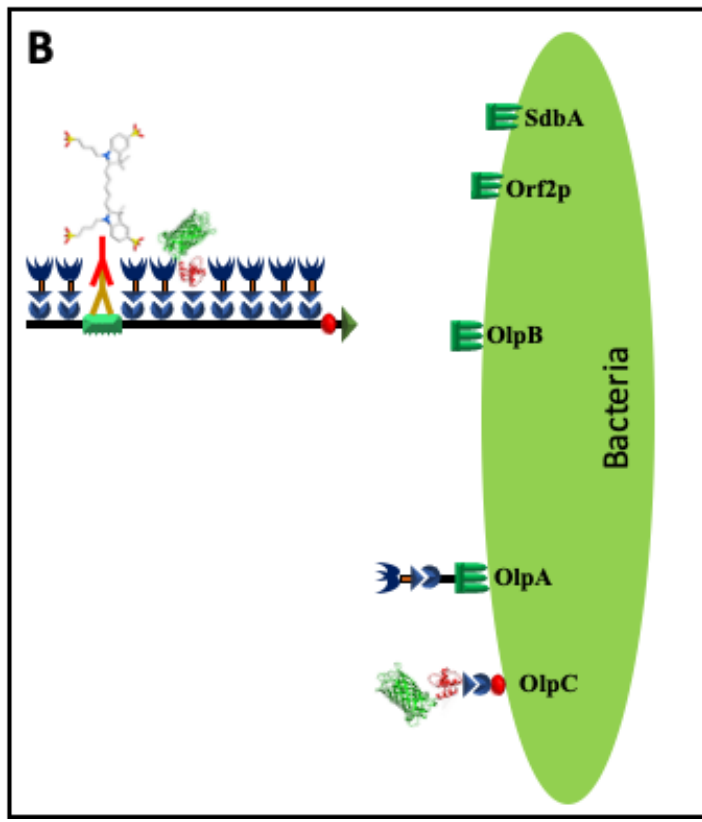
PA-GFP with a dockerin



## Wild Type



## CTN5 mutant



# *C. therm* grown on cellobiose: TEM vs Super high resolution imaging

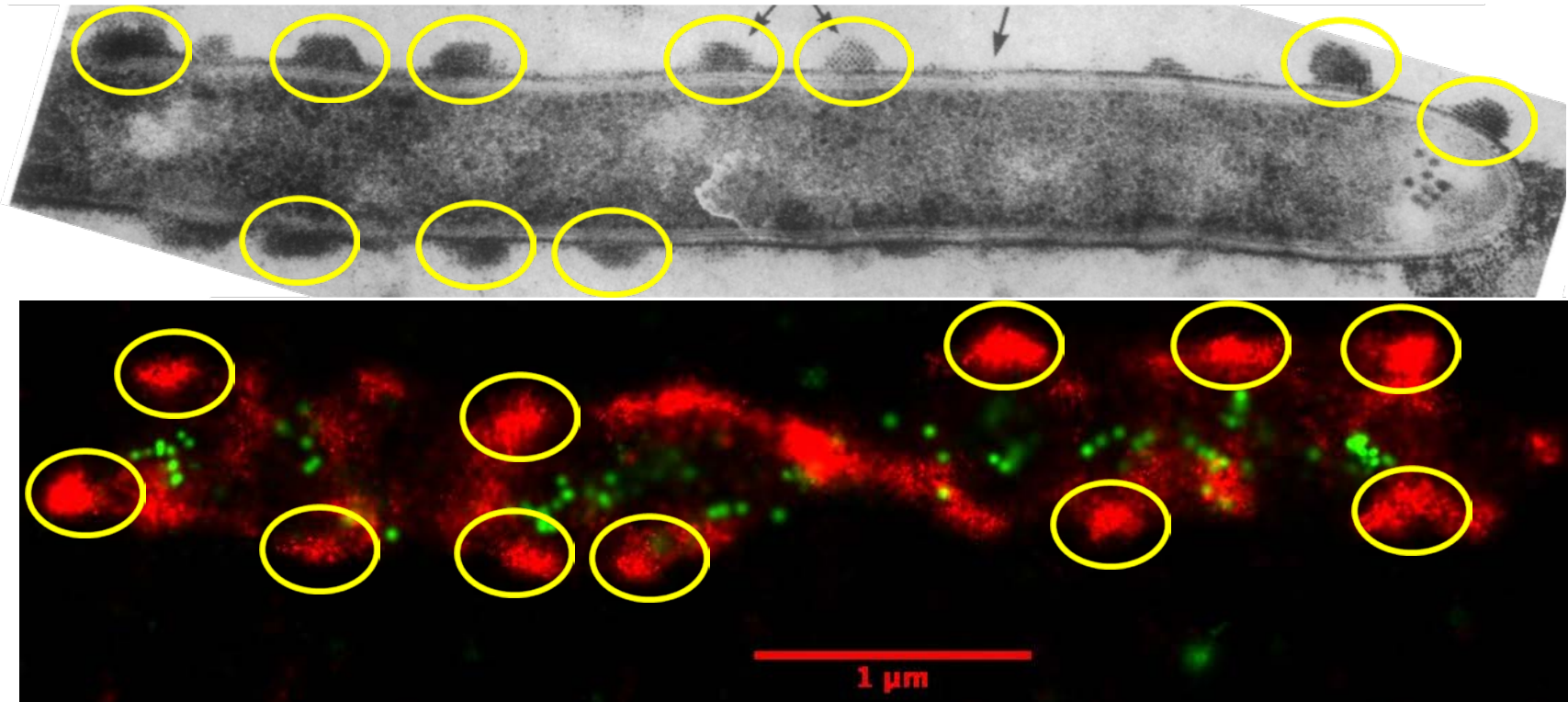


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## Polycellulosomal protuberance

- Identified back in 1986 by Ed Bayer et al and highlighted with yellow circles
  - These protuberances relationship to cellulosomes which varied in both size and longitudinally arrangement reveled through the use of antibodies were specific to cellulosomes
- bacterial cell within the optical images is decorated with fluorescence protuberances (yellow circles)
  - very similar in structure as the protuberance shown by Bayer et al

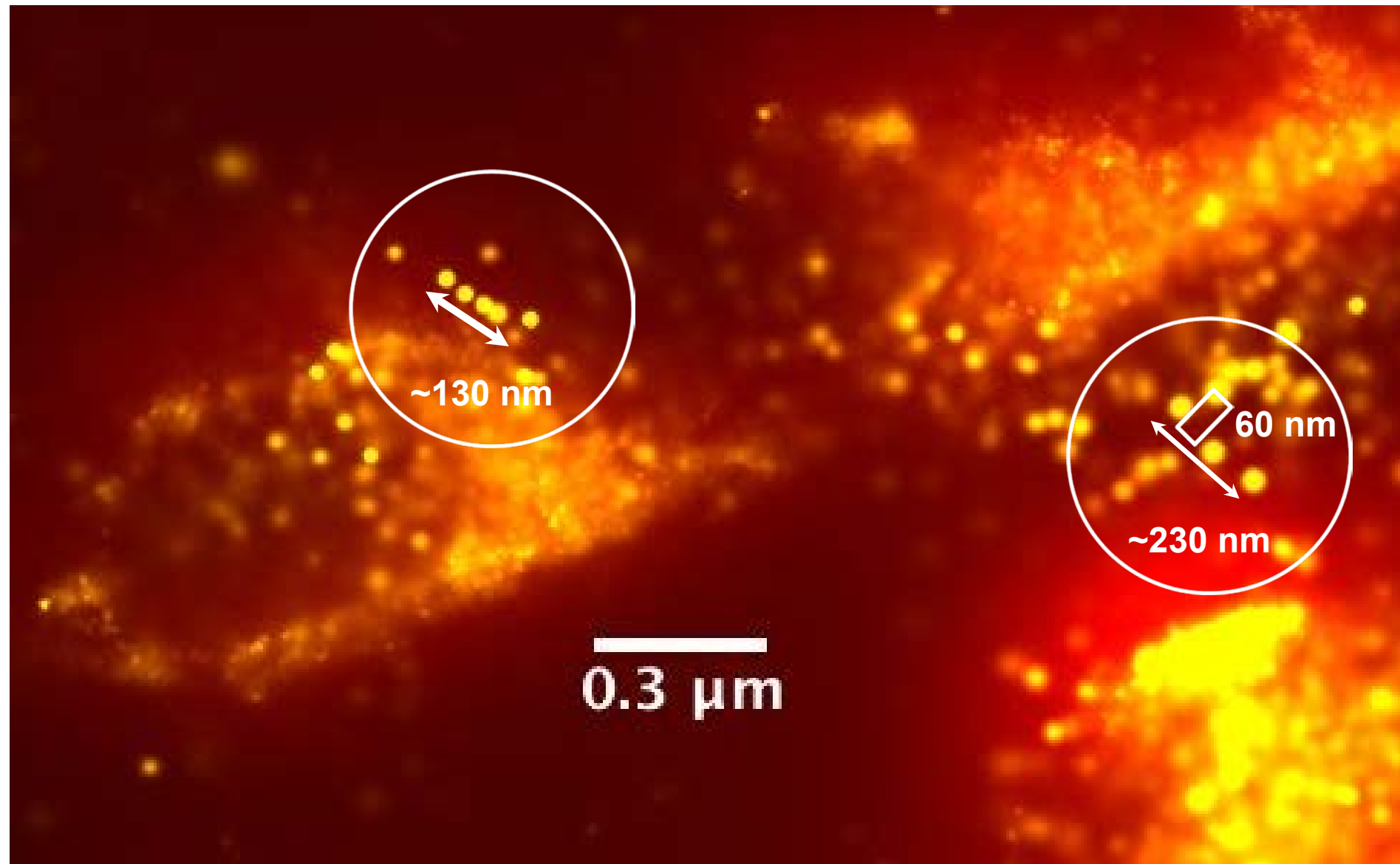


# Super high resolution imaging with *C. therm* grown on Avicel



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Far-field and STORM fluorescence  
combined



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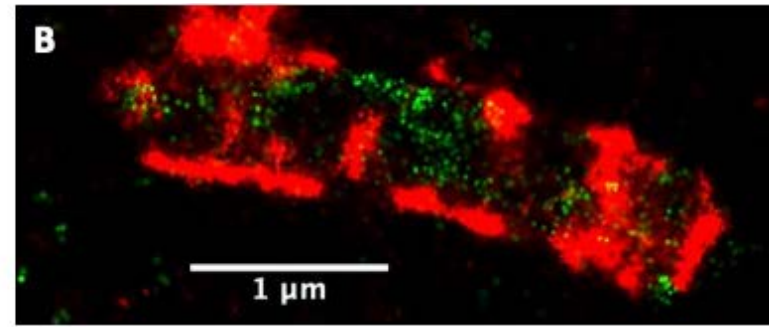
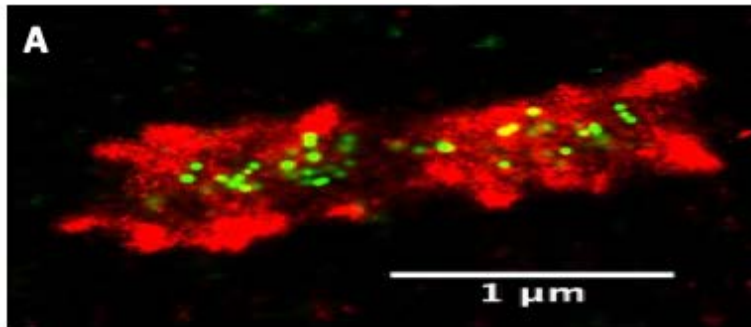
# Super high resolution imaging with *C. therm* grown on Cellobiose – Need for Quantification



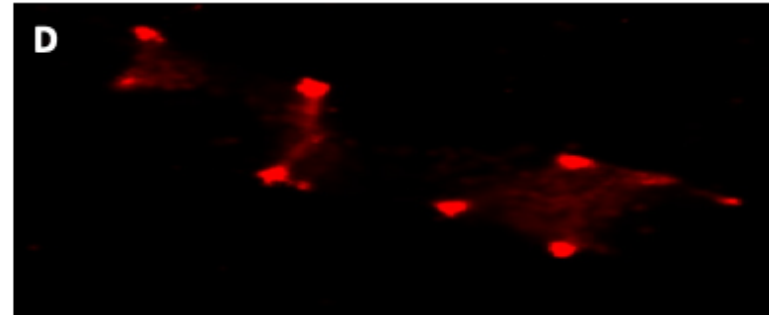
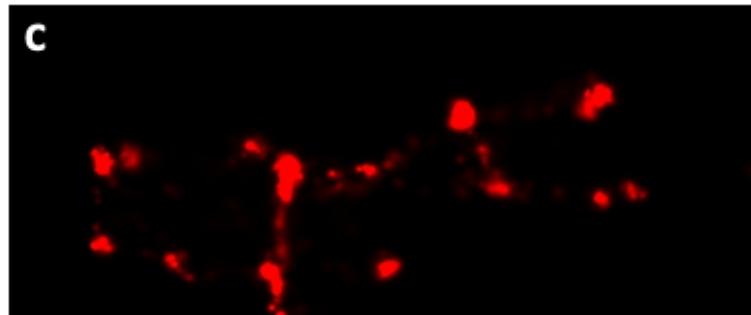
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## C. Thermocellum grown on cellobiose and captured in log phase

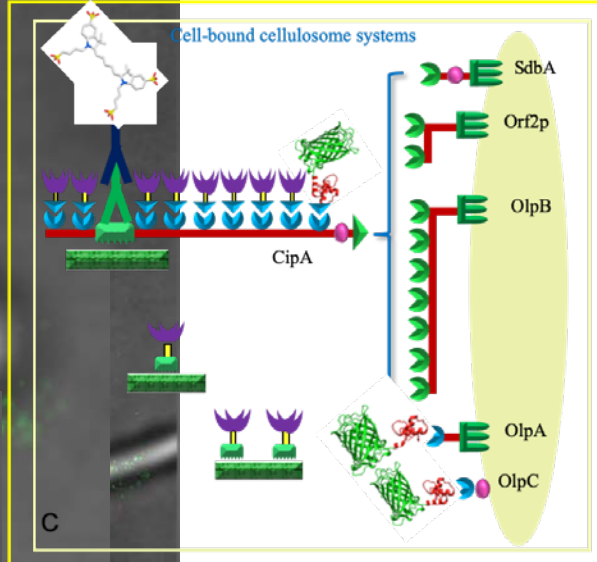
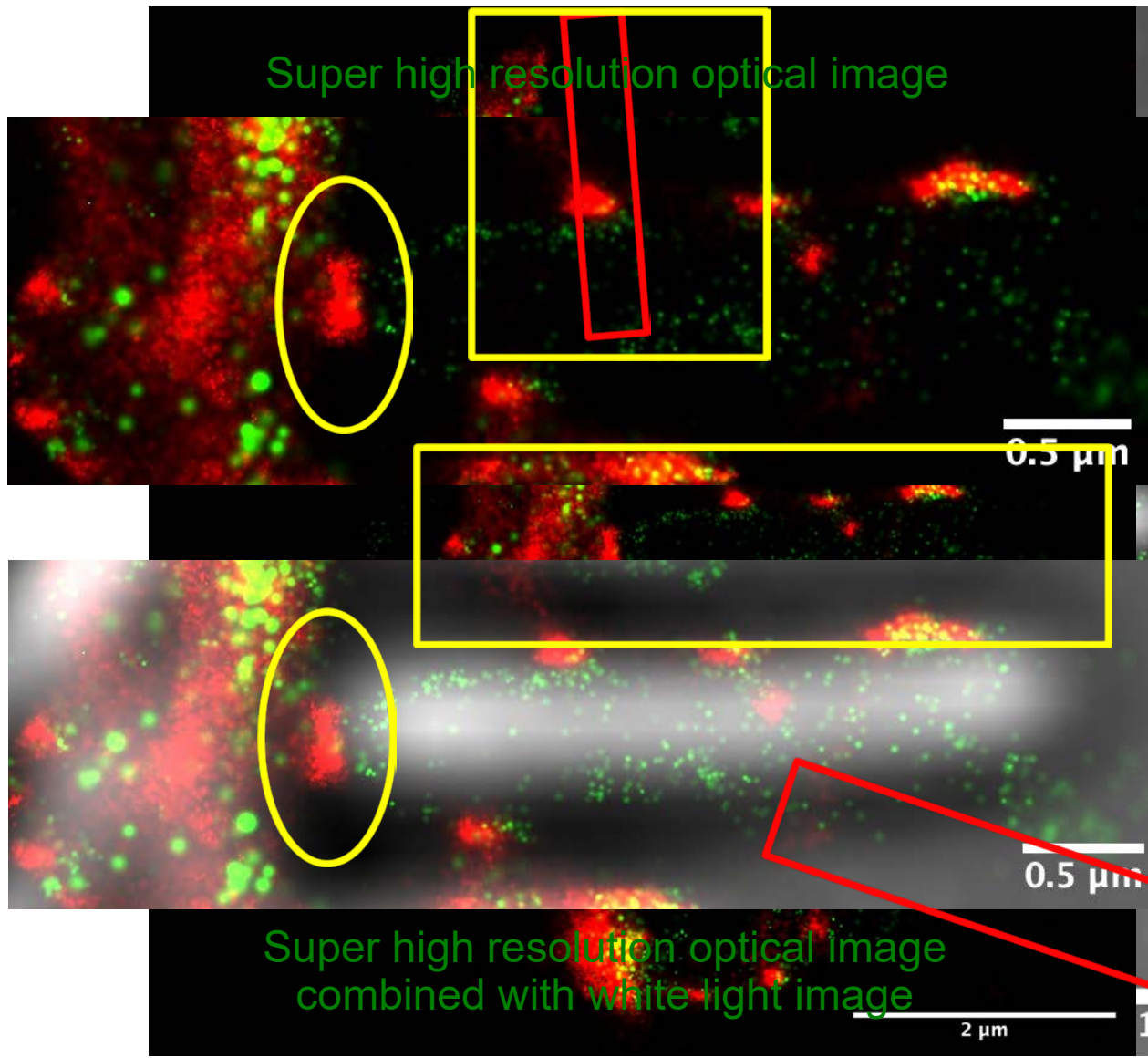


## C. Thermocellum grown on cellobiose and captured in stationary phase





# Super high resolution imaging with *C. therm* grown on Avicel with multiple probes

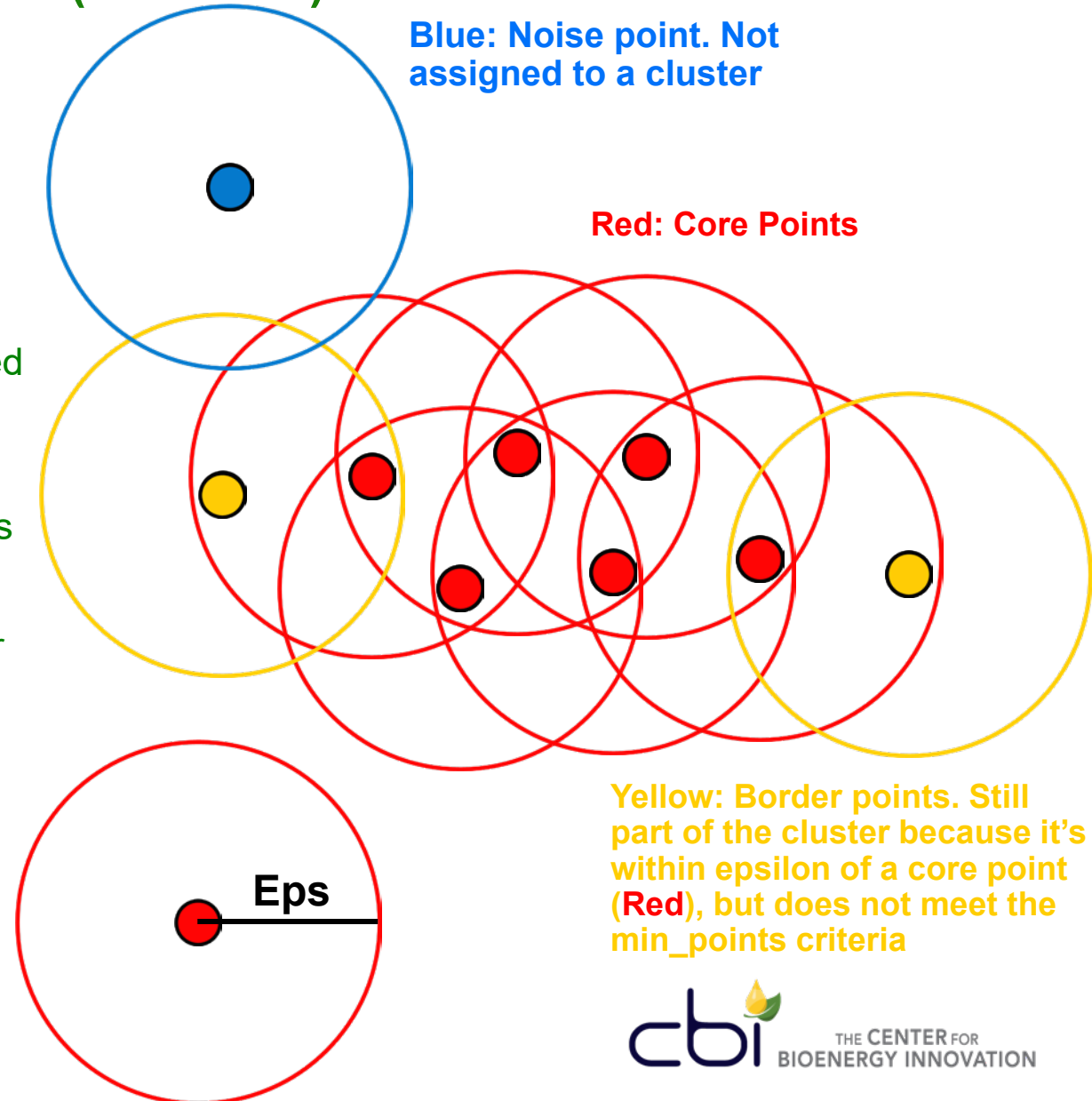


# Quantitative analysis of the distribution of cellulosomes: Density-based spatial clustering of applications with noise (DBSCAN)



## DBSCAN:

- unsupervised machine learning referred to as cluster analysis
- propagative cluster detection method
- linking points that are closely packed together
- detects outliers using user defined epsilon radius and minimum number of points
- detect arbitrary shaped clusters and is quick and robust to outliers
- User defined
  - Epsilon radius (Eps)
  - Minimum number of points, or in this case, the number of fluorescent molecules
- For this work
  - Eps set at 75nm (diameter is 150nm, approximate size of cellulosome)
  - Minimum number of points varied from 10 to 1200



# DBSCAN analysis on *C. therm* grown on Avicel

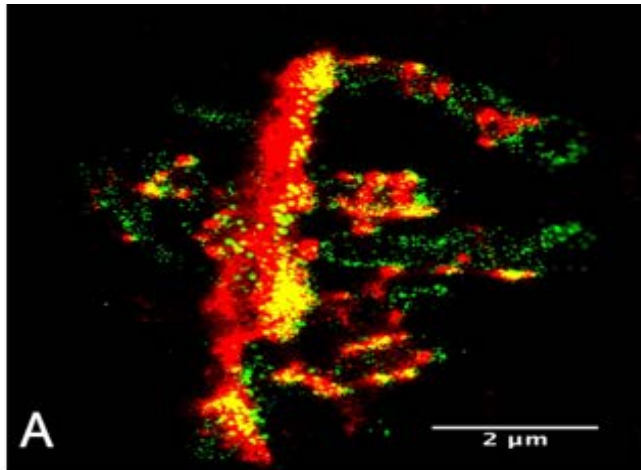


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## DBSCAN

- Raw data set contains x-y coordinates of each fluorescent event
  - Have the ability to separate channels (cbm3 and GFP)
  - This data can be used with the DBSCAN algorithms



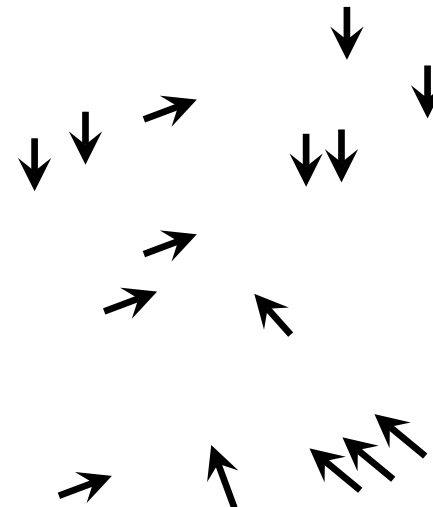


## DBSCAN initial results on individual Avicel particle

- 49 clusters with identified with having at least 500 molecules/epsilon (75nm radius)
- 27 clusters of 500 on bacteria cell wall for cellulosome
- 22 clusters are located on the Avicel

## Observations

- Increased number of molecules and larger cluster size at the interaction zone (**CBM3**)
- Larger Clusters size at the interaction zone with the with **GFP**





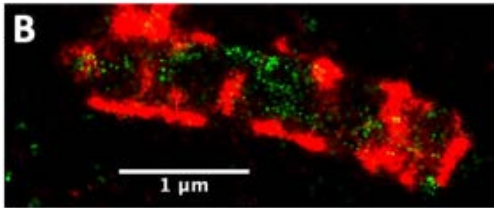
# DBSCAN analysis on *C. therm* grown on Cellobiose



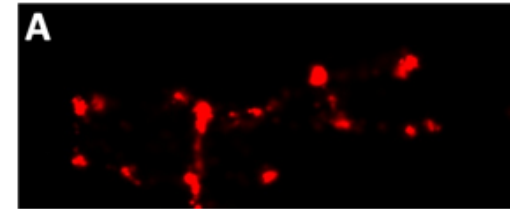
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## *C. thermocellum* in Log phase on cellobiose



## *C. thermocellum* in stationary phase on cellobiose

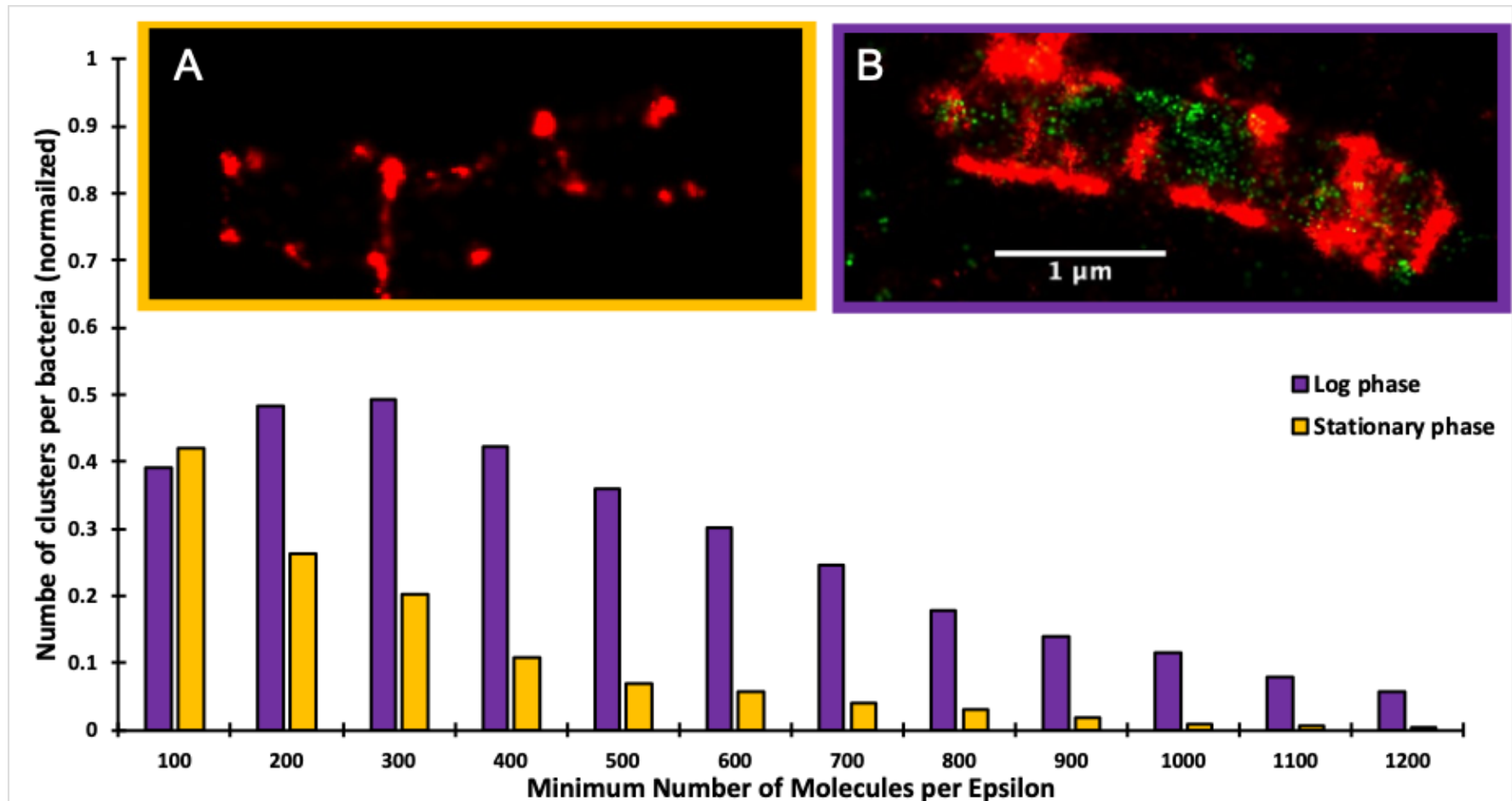


# DBSCAN analysis on *C. therm* grown on Cellobiose: Averaging through the individual cells



## DBSCAN initial results on individual Cellobiose

- 65 individual bacteria cells analyzed in log phase grown on cellobiose
- 70 individual bacteria cells analyzed in stationary phase grown on cellobiose
- All DBSCAN results for each bacteria cell are normalized and the average of the normalized number of clusters are plotted

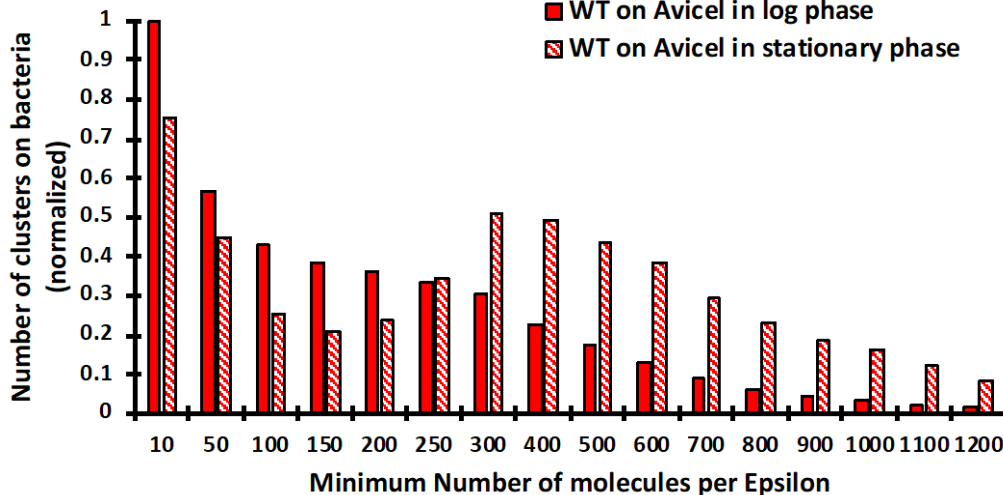
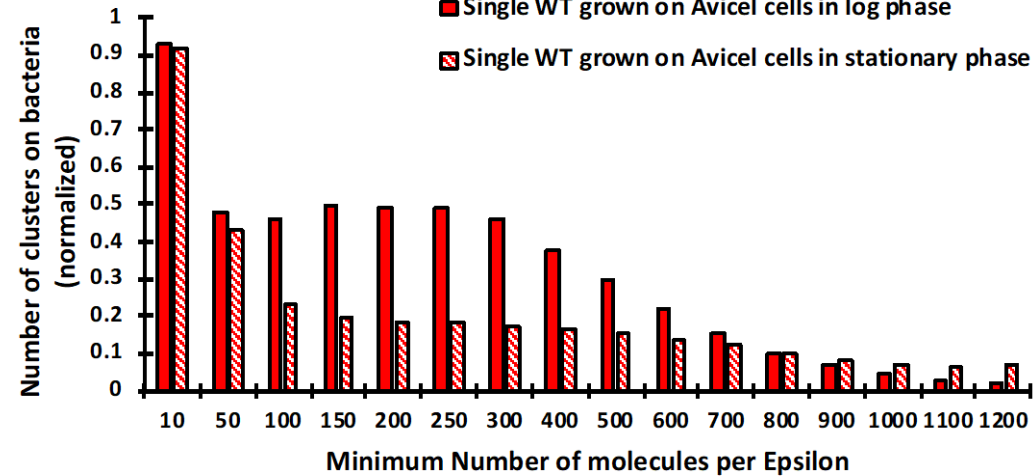


# DBSCAN analysis on *C. therm* grown on Avicel: Averaging through the individual cells and Avicel particles



## DBSCAN results on individual bacteria cells grown in the presence of Avicel

- 73 individual bacteria cells analyzed in log phase grown on Avicel
- 62 individual bacteria cells analyzed in stationary phase grown on Avicel
- All DBSCAN results for each bacteria cell are normalized and the average of the normalized number of clusters are plotted



## DBSCAN results Avicel particles with bacteria attached

- 6 individual Avicel particles analyzed in log phase grown
- 8 individual Avicel particles analyzed in stationary phase grown
- All DBSCAN results for each Avicel particle are normalized and the average of the normalized number of clusters are plotted

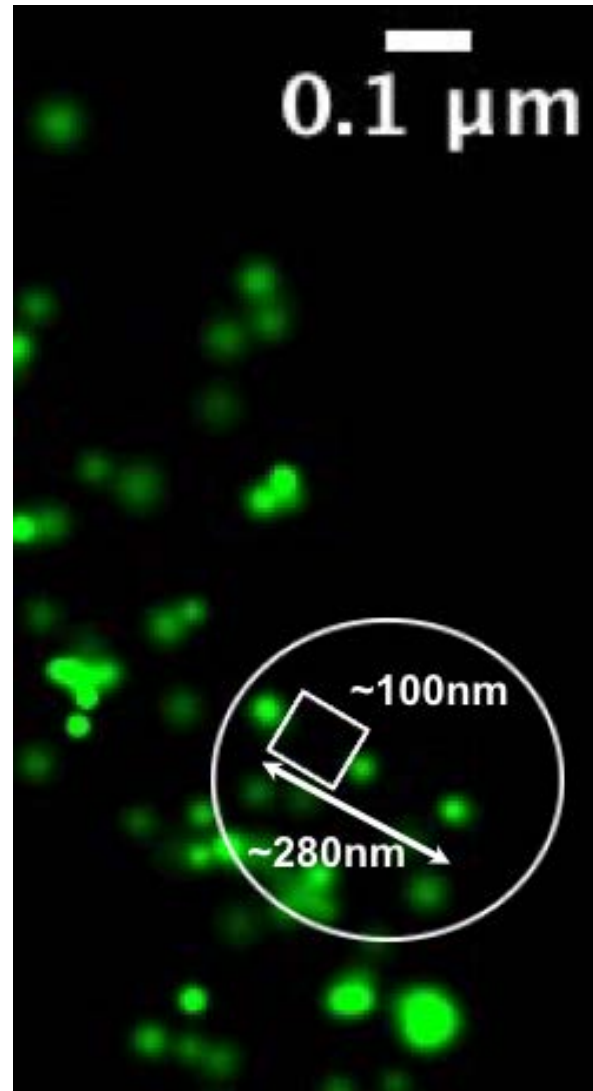
# Conclusions for *C. thermocellum* and Avicel



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- Utilizing PALM and STORM super high resolution imaging enables us to get optical resolution down to <40nm
- Can be used to study biomass deconstruction by *C. thermocellum* and finally understand the enzyme-microbe-substrate interaction region, cellulosome formation, and the evolution of cellulosomes during growth.
- Polycellulosomal protuberance distribution CBM3
  - Wild Type in Log Phase
    - Clusters with larger minimum number of molecules per epsilon
  - While Type in Stationary Phase
    - Clusters with smaller minimum number of molecules per epsilon
- Clear difference in how the bacteria cells look during different growth phases
- Higher clustering of cellulosomes on Avicel as the cells progress from log phase to stationary phase
  - Suggest the bacteria is shuttling the cellulosomes onto the surface of Avicel
  - Significant increase in the number of cellulosomes at the interaction zone – increases the anchoring of the bacteria to the surface of Avicel



PALM imaging



# Thank you



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# Questions

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