

# BioIndustry 4.0

Lars Keld Nielsen



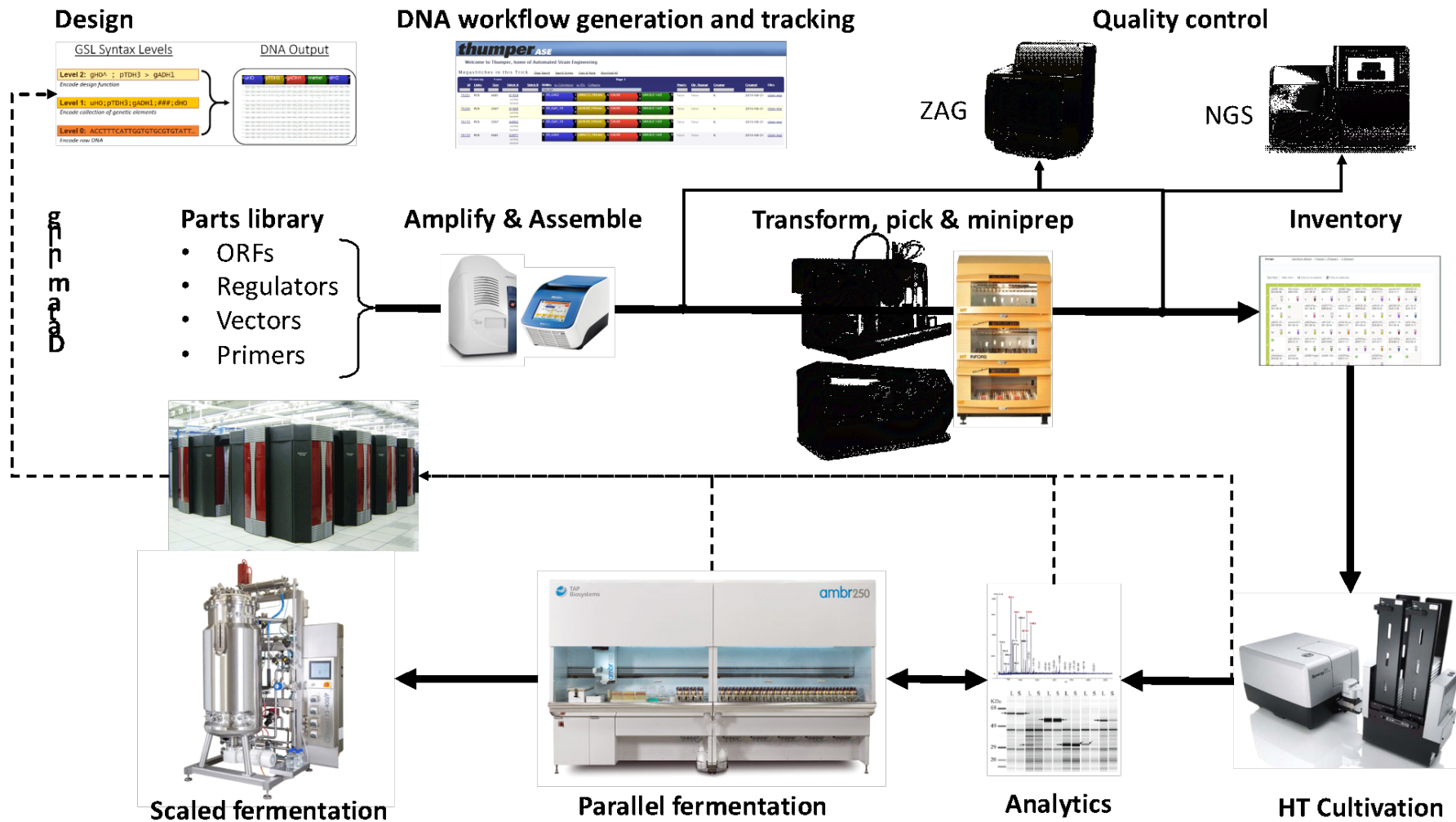
**DTU Biosustain**

The Novo Nordisk Foundation Center for Biosustainability

**AIBN** Australian Institute for  
Bioengineering and Nanotechnology



# Queensland Strain Factory





DARPA Living Foundries  
1000 molecules

Amyris: 450 molecules

Zymergen: 450 molecules

MIT Broad: 100 molecules

Year 1: 450 @ mg quant

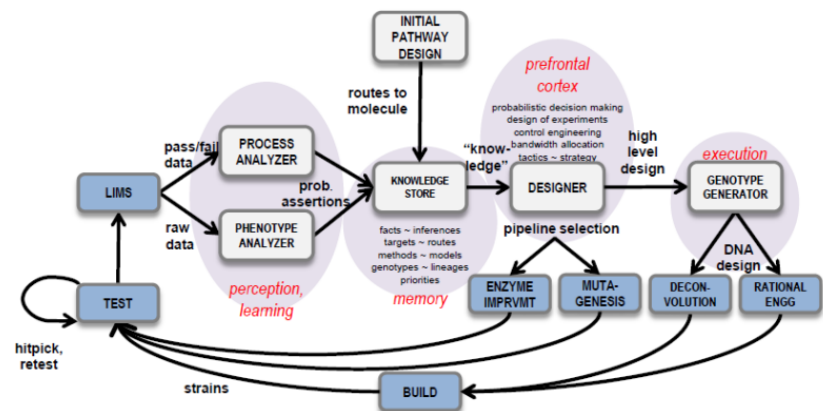
Year 2: 150 @ g quant

Year 3: 50 @ g/L/h

Year 4: 10 @ 1 kg

M2K

Do we need humans?



The automated scientist

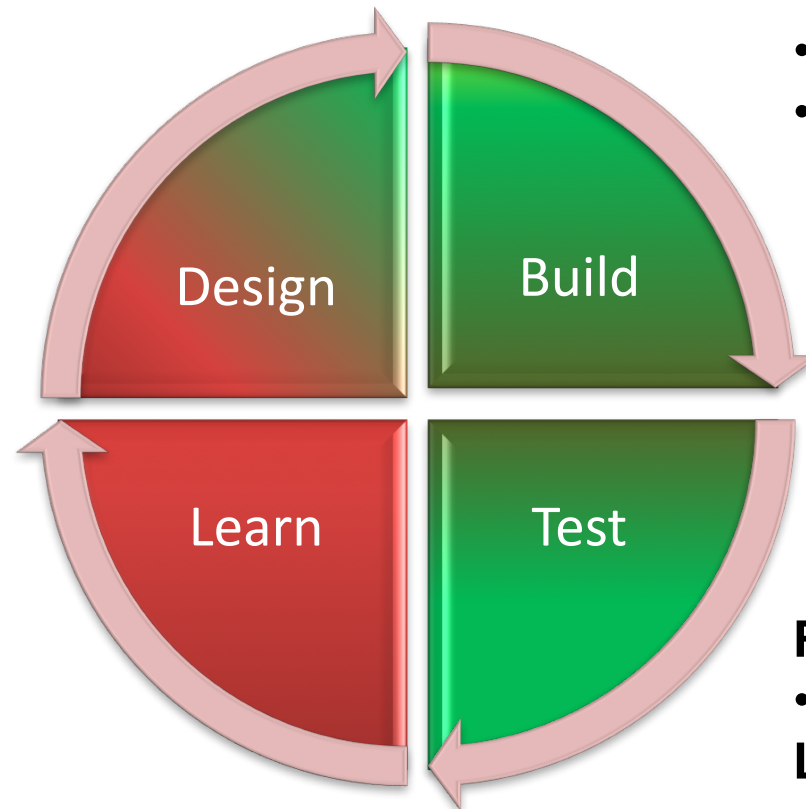
# Strain engineering

## First generation

- BNICE
- OptKnock
- M → ME

## Rational

- 10 promoter strengths
- 20 genes
- 1000 strains/month



## Robotics

- Accurate growth & titre
- Low cost HT Chemistry**
- Transcriptomics (RNAseq)
  - Proteomics (SRM/PRM)
  - Metabolomics



# Strain engineering

## Possible designs

20 genes, 10 levels:

- $10^{20} = 2 \times 10^{15}$  years

1000 candidates/gene

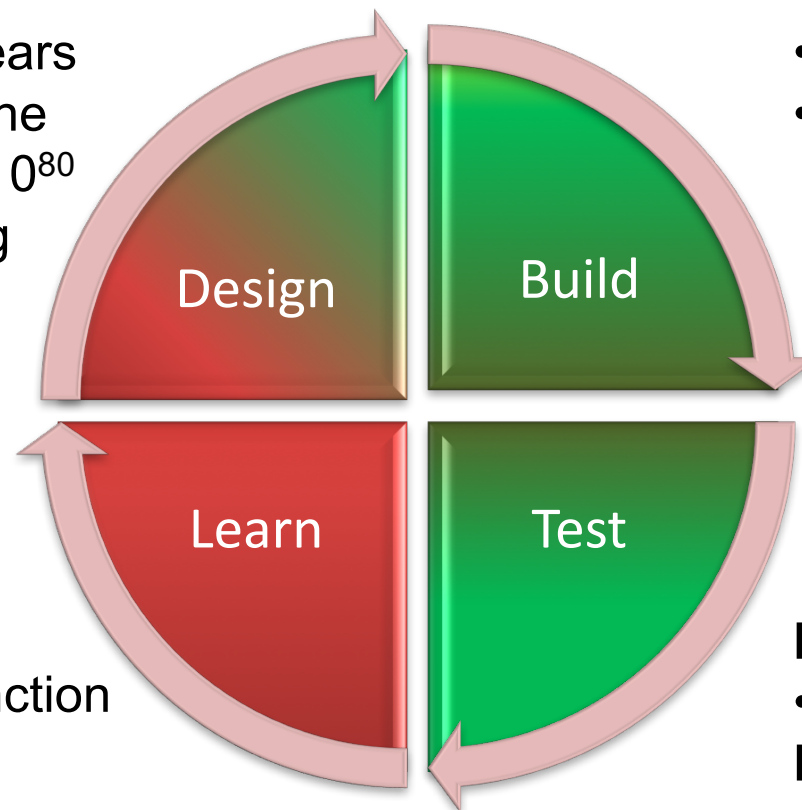
- $(10)^{20}(1000)^{20} = 10^{80}$

Enzyme engineering

- $20^{400}$  sequences

## Rational

- 10 promoter strengths
- 20 genes
- 1000 strains/month



## Naïve statistical design

- Complex response function
- Poor performance

## Naïve “Big Data” mining

- Extrapolation essential
- Poor performance

## Robotics

- Accurate growth & titre

## Low cost HT Chemistry

- Transcriptomics (RNAseq)
- Proteomics (SRM/PRM)
- Metabolomics

# Strain engineering

## First generation

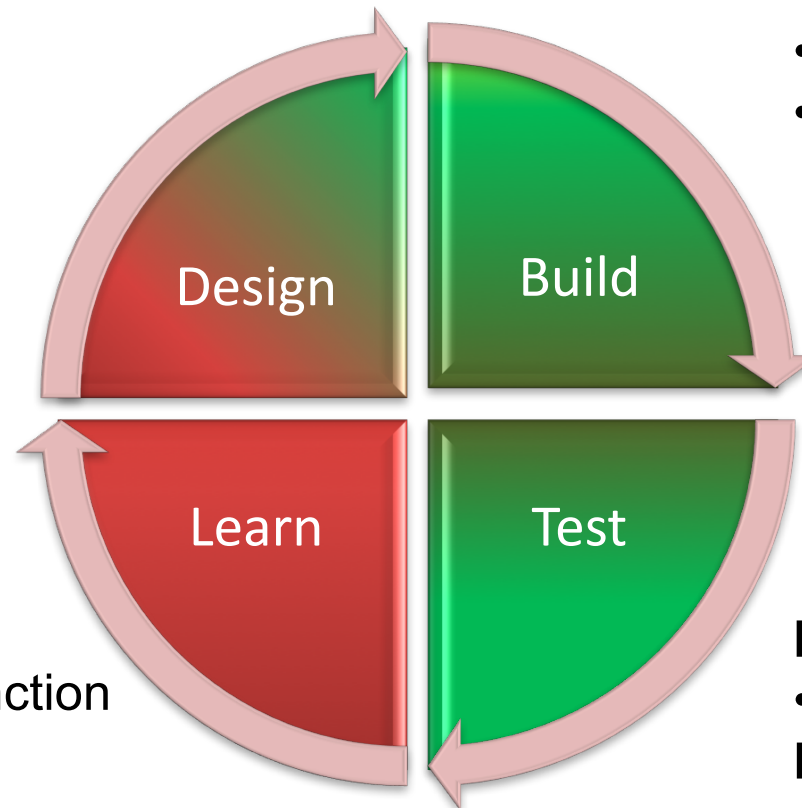
- BNICE
- OptKnock
- $M \rightarrow ME$

## Second generation

- Slow progress

## Rational

- 10 promoter strengths
- 20 genes
- 1000 strains/month



## Naïve statistical design

- Complex response function
- Poor performance

## Naïve “Big Data” mining

- Extrapolation essential
- Poor performance

## Robotics

- Accurate growth & titre

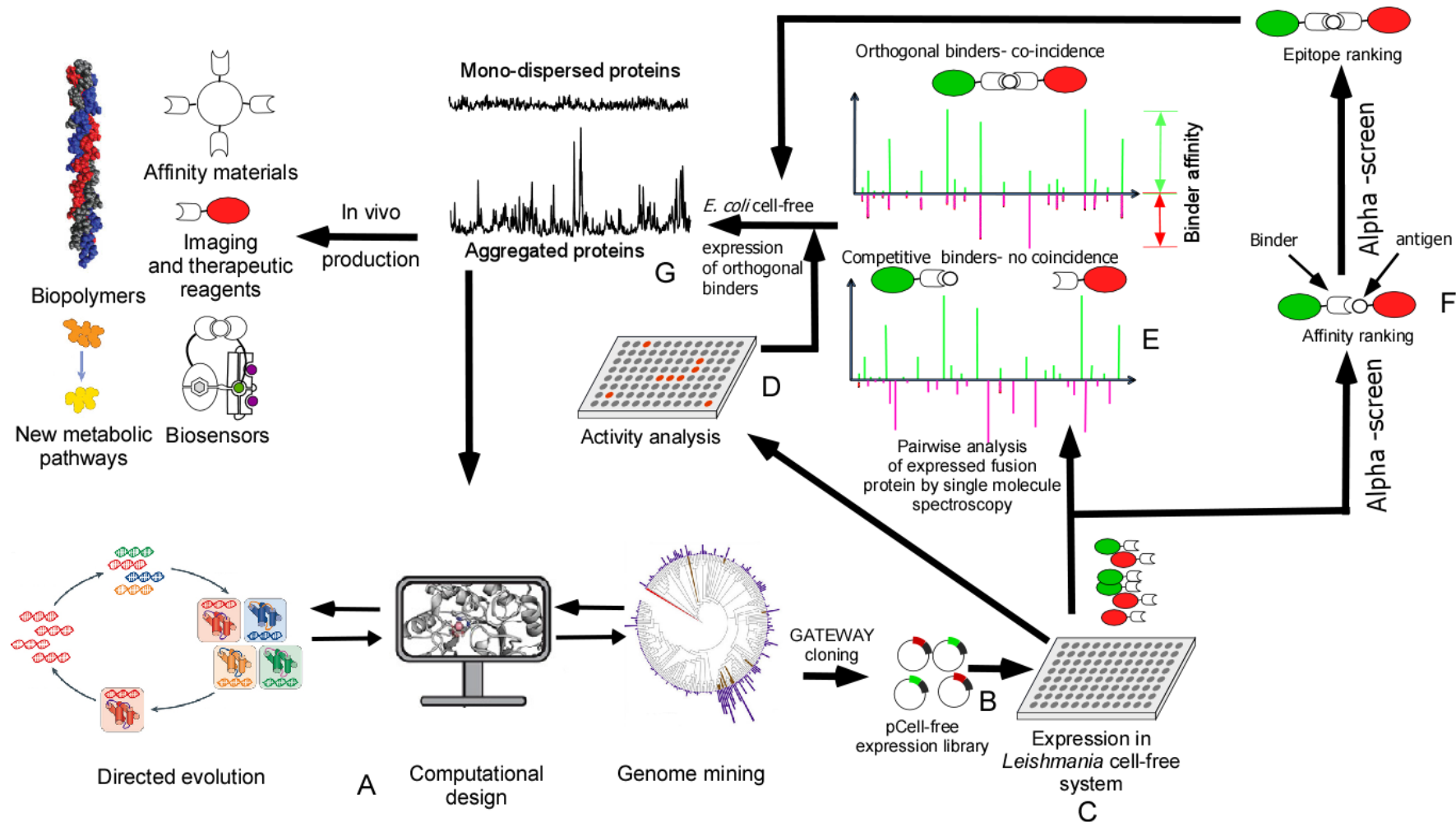
## Low cost HT Chemistry

- Transcriptomics (RNAseq)
- Proteomics (SRM/PRM)
- Metabolomics





# Queensland Protein Foundry





# Conclusion

*The emergence of inexpensive, base-perfect genome editing is revolutionising biology. Modern industrial biotechnology exploits the advances in genome editing in combination with automation, analytics and data integration to build high-throughput automated strain engineering pipelines.*

Lars Keld Nielsen, 2016