# Phenomic profiling of *E. coli*

Koon-Kiu Yan 2/3/2011

#### Resource

### Phenotypic Landscape of a Bacterial Cell

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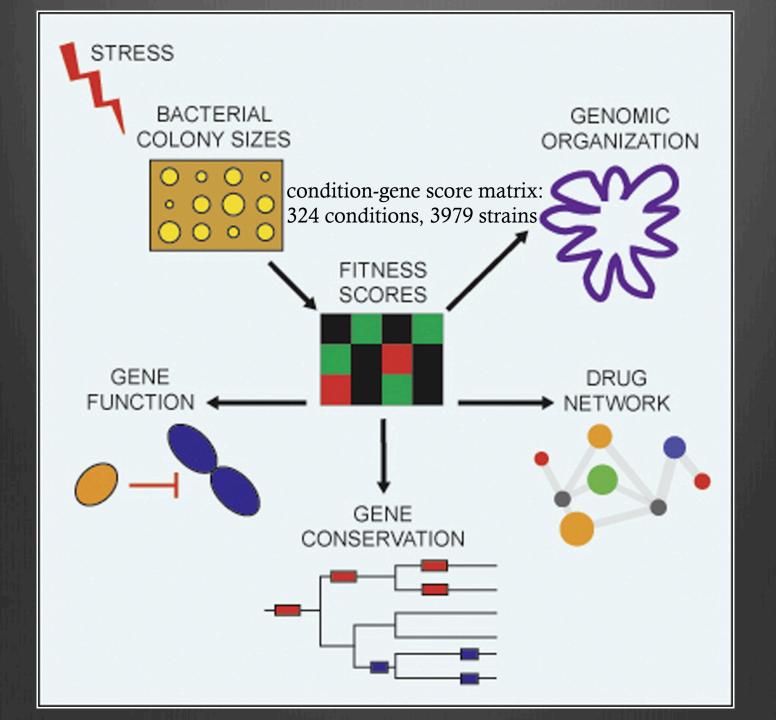
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#### Examples of conditions

16C 18C 20C 40C 42C 43.5C

45.5C 45C PH10 PH4 PH4.5 PH5 PH6 PH8 PH9

PH9.5

BENZALKONIUM-1 BENZALKONIUM-10 BENZALKONIUM-25 BICYCLOMYCIN-1 BICYCLOMYCIN-10

OXACILLIN-0.5 OXACILLIN-40.0 OXACILLIN-5.0 PARAQUAT-0.2 PARAQUAT-1.0 PARAQUAT-10.0 PARAQUAT-18.0 PARAQUAT-5.0 PEROXIDE-0.1 PEROXIDE-0.5

PEROXIDE-1.0

PEROXIDE-2.0

GENTAMICIN-0.05 GENTAMICIN-0.1 GLUCOSAMINE GLUCOSE GLUFOSFOMYCIN-0.05 GLUFOSFOMYCIN-0.2 GLYCEROL

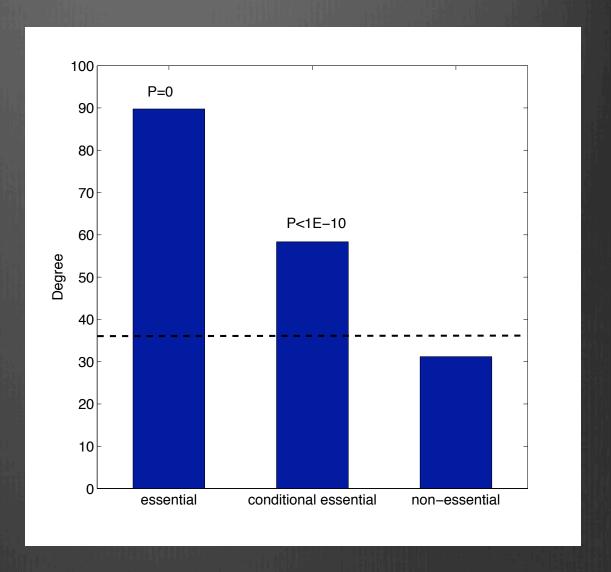
UV-12SEC UV-18SEC UV-24SEC UV-6SEC

#### Several novel concepts

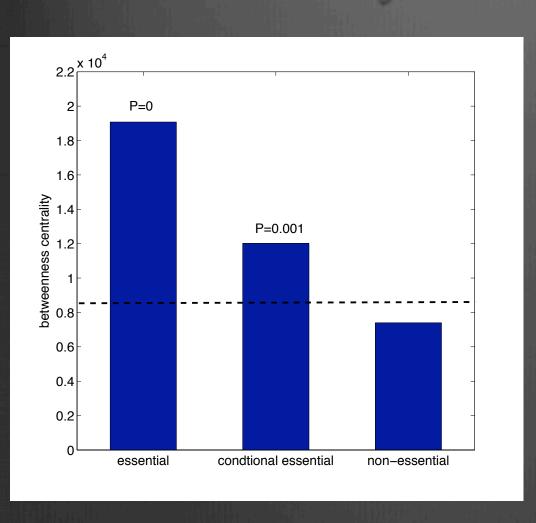
- Responsive genes (1957 strains)
- Multi-stress responsive genes (94 strains)
- Conditional essential (116 strains)
- Where are these guys located in various networks: PPI, transcription regulatory network, metabolic network?
  - e.g. MSR genes tend to be hubs in PPI (deg=62.9, cf 36.4)

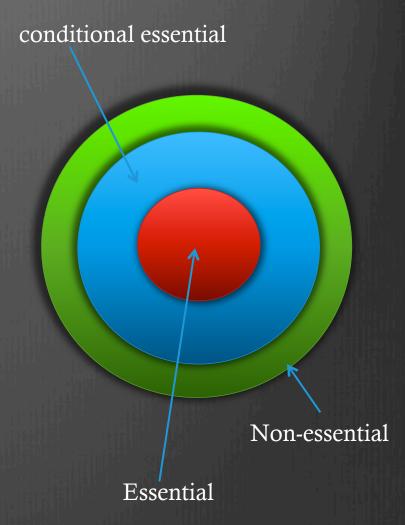
#### Essentiality versus centrality

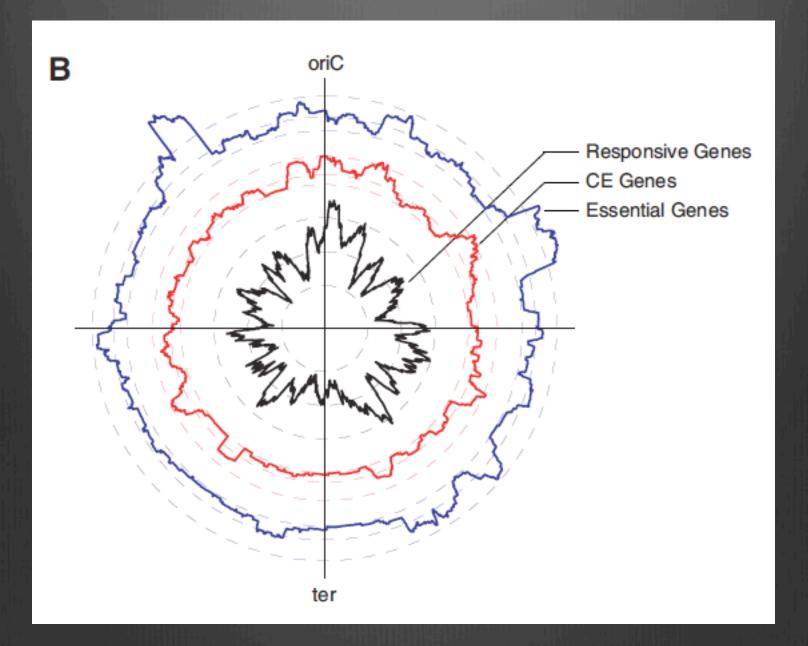
PPI network for E. coli 4100 nodes, 75000 edges (Hu et.al. PLoS Biol 2009)



#### Essentiality versus centrality

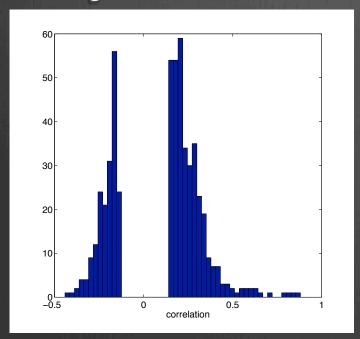






## Phenotypic signatures of regulator and target pairs

- The knockout of TFs shows weaker phenotypic response
  - Out of 224 TFs, only 6 of them are conditional essential, and 4 are MSR
  - Making use of RegulonDB, 2600 TF-target pairs, only 540 pairs show significant correlation between the signatures



Signs of correlation NOT entirely agree with signs of regulatory interactions

#### Next steps

- Group enzymes into pathways, and look at the effects of TF knockouts on pathways
- A framework to assign TFs to different pathways. May be better, or at least complementary to look at the transcription regulatory network
- Understand the regulation of metabolic activities

#### Noise

- Taniguchi et.al. Science 2010: Single cells level protein abundance
- \* MSR genes, conditional essential genes, and essential genes are less noisy in general
- \* Where are the noisy guys? Are they responsive to different conditions?