### Data Integration and Mining for Synthetic Biology Design

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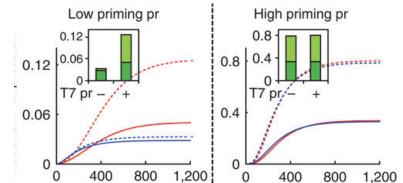


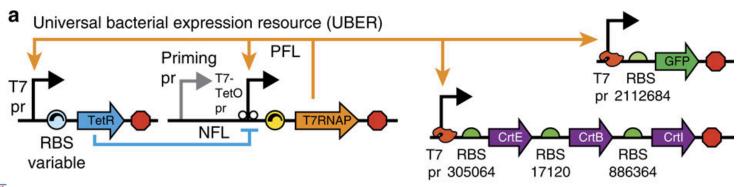


## Engineering biological systems is challenging



Order and layout
Regulatory elements
Molecular interactions
Strain/Host/Chassis
Biological Context
Experimental Conditions





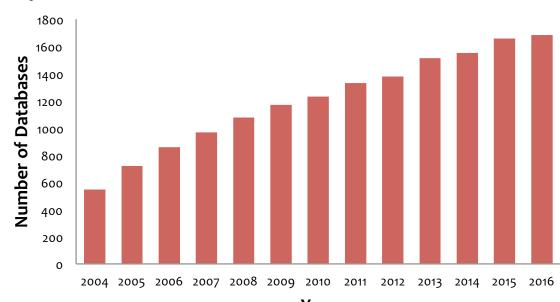
Kushwaha and Salis, 2015





#### Data integration

- \* There is a large amount of information about model organisms such as B. subtilis and E. coli
- \* This information may be spread in
  - Different databases
  - \* Different formats
  - \* Different semantics
- \* This information can be Integrated and used to inform & constrain biological designs





FLOWERS



### What is an ontology?

The representation of the entities of a domain is consistent and unambiguous

An abstract and simplified view of a domain being modelled

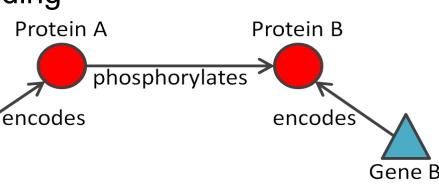
uses

"An explicit and formal specification of a conceptualisation"

Gruber

captures

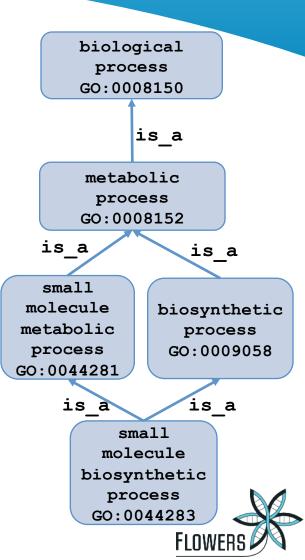
Shared understanding of a domain Prote



### Semantic Web resources for synthetic biology

- \* Gene Ontology
- \* Sequence Ontology
- \* Systems Biology Ontology
- \* Synthetic Biology Open Language
- \* Standard Biological Parts Knowledgebase
- \* SBOL Stack
- \* Ontologies are needed to
  - \* Capture different relationships between biological parts
  - \* Facilitate data mining





#### Synthetic Biology Ontology (SyBiOnt)

### Synthetic Biology-

Research Article

pubs.acs.org/synthbio

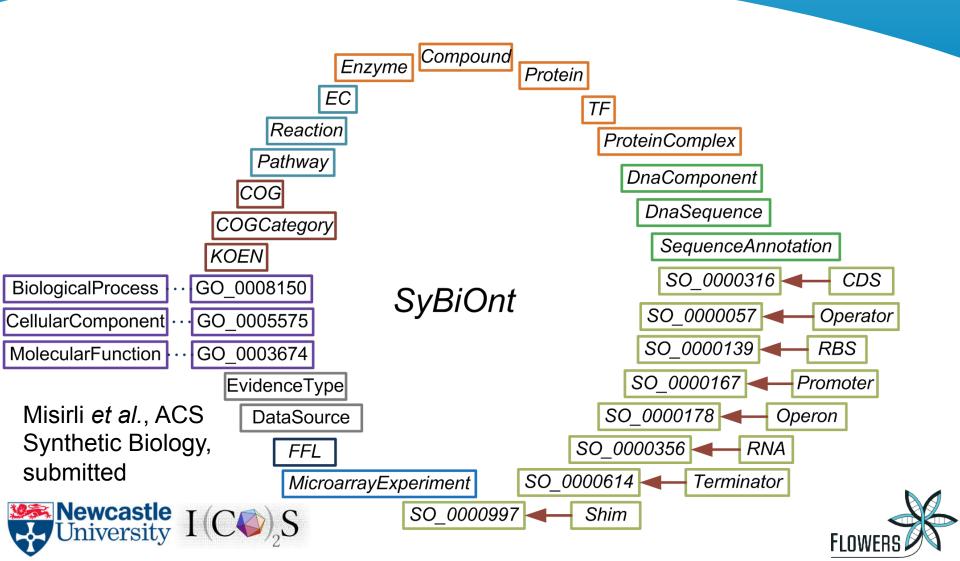
#### Data Integration and Mining for Synthetic Biology Design

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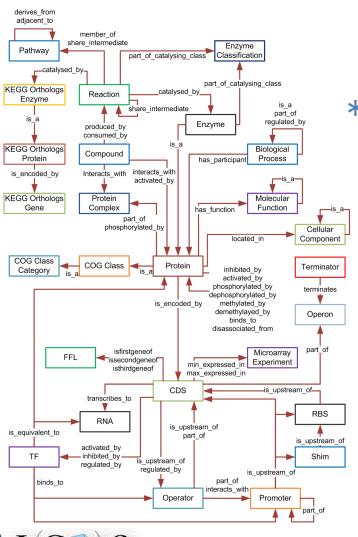
Open Access, available from ACS Synthetic Biology

w3id.org/synbio/ont

#### Synthetic Biology Ontology (SyBiOnt)



#### SyBiOntKB knowledge base



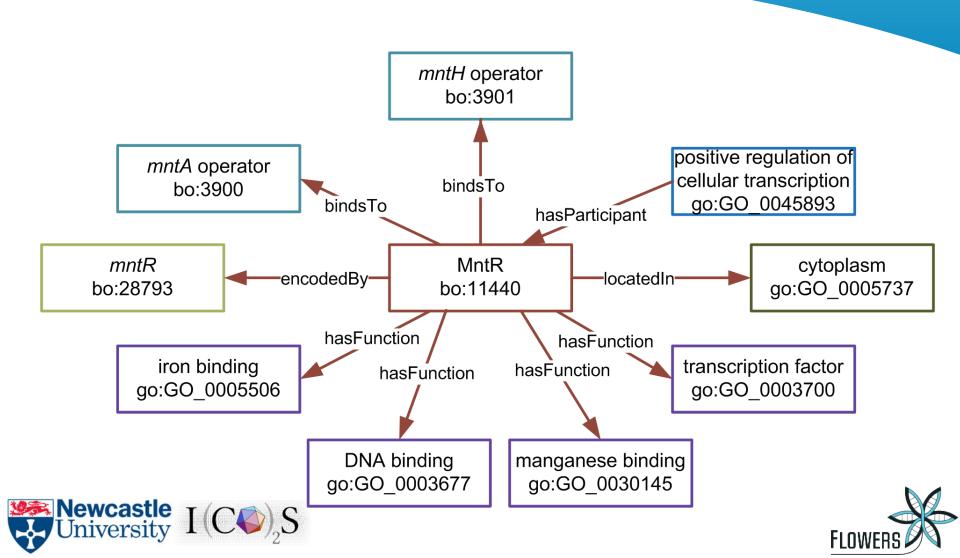
- \* The knowledge base includes information about
  - \* Sequences, annotations
  - \* Metabolic pathways
  - \* Gene regulatory networks
  - \* Protein-protein interactions
  - \* Gene expression

Misirli *et al.*, the Journal of Integrative Bioinformatics, 2013





#### An example network from SyBiOntKB



# Testing the ontology with competency questions

- \* Which parts can be used as inducible promoters?
- \* Operators have regulation type restrictions to indicate whether they are used positively or negatively in regulating gene expression. A Promoter with one Operator part that has the 'Positive' regulation type restriction is an Inducible Promoter.



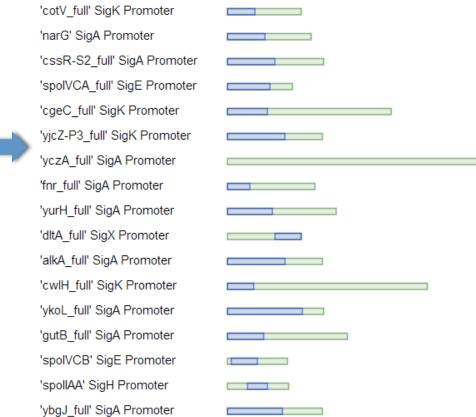


#### InduciblePromoter query and the results

```
Promoter
QUERY: and (has part exactly 1 Operator)
            (has part exactly 1 PositivelyRegulatedOperator)
       and
```

'rocA' SigL Promoter

**RESULTS**: In total, 51 promoters were classified





## Examples about the automated identification of biological parts

Part type	Count	Part type	Count
Activator sites	222	SigA promoters	465
Repressor sites	333	SigB promoters	67
Inducible promoters	51	Constitutive promoters	311
Repressible promoters	85	Repressor encoding CDSs	55
Inducible promoters with two inputs (AND/OR gates)	15	Activator encoding CDSs	44
		Response regulator encoding CDSs	40
Repressible promoters with two inputs (NAND/NOR gates)	25	Kinase encoding CDSs	38





#### More examples

- \* Which pathways should be targeted for the over-production of ammonium?
- 'Ammonium' is **produced by Reaction**s that are **member of** 'Arginine and proline metabolism' and 'Purine metabolism' **Pathway**s.
- \* Which parts can be used to upregulate the production of ammonium?
- The Compound 'Ammonia' with the accession of 'Cooo14' is produced by the Reaction 'RN:Roo131', which consumes the Compound 'Carbamide' (Cooo86). 'Carbamide' is produced by a Reaction that is catalysed by an Enzyme, which is a subclass of a Protein encoded by the argl CDS with the accession of 'BSU40320'.
- \* How can the SpooA protein, the master regulator of sporulation, be phosphorylated to trigger sporulation?
- 'SpooA' is **phosphorylated** by the 'KinC' and 'SpooB' **Protein**s. The 'SpooB' **Protein** is **phosphorylated** by 'SpooF' **Protein** which is further **phosphorylated** by the 'KinA' and 'KinB' **Protein**s.





#### Summary

- \* SyBiOnt to capture complex biological data for synthetic biology computationally
- \* Facilitates semantic reasoning
- \* Complementary to existing standards and ontologies
- \* Open access and available at w3id.org/synbio/ont
- \* Extendible with new terms





#### Thanks

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Dr Jennifer Hallinan



Dr Matthew Pocock



Dr Phillip Lord



James McLaughlin



Prof. Herbert Sauro











