

# Evaluating the Temporal Stability of Gene Expression Endpoints with Repeated Sampling Up and Down Stream of a Wastewater Treatment Plant

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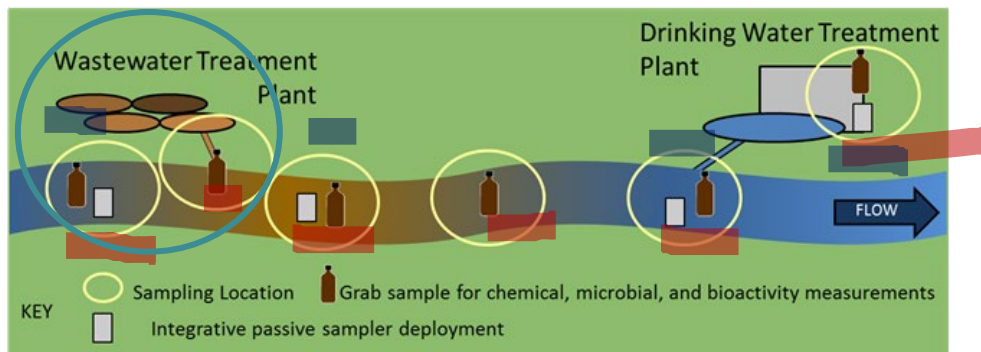
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# Background

- Chemical input into ambient waters
  - Complex mixtures
    - Dynamic
  - Targeted chemical approaches
    - Lamplight effect
  - Toxicity endpoints
    - Uninformative -> MOA
  - Cell-based bioassays
    - Limited coverage
    - Matrix interference
  - Omics approaches
    - False positives
    - Stability/Robustness





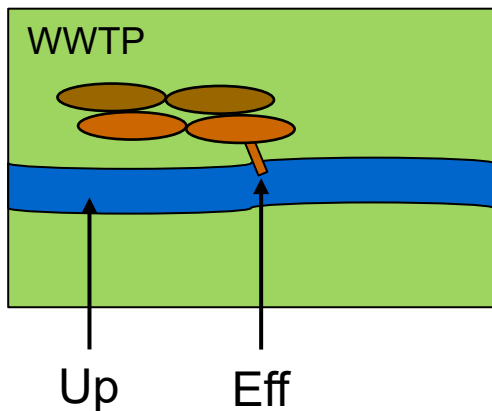
- **Goal:** Determine the consistency of gene expression in effluent exposed organisms over time and with different sampling approaches.
- **Sample Collection:**
  - Collected time matched samples (morning and afternoon) for two consecutive days up and down-stream (Eff) of WWTP.
  - Deploy fish up and down-stream of WWTP during collection period (Field)
- **Gene Expression:** RNA-seq - Compare different commonly used approaches.
  - Direct comparison of Up vs. Eff
  - Compare to clean laboratory control - Indirect comparison of Up vs. Eff

## Wastewater Treatment Plant

- 1.2 MGD
- Serves ~1,700 people
- Advanced secondary treatment with UV disinfection

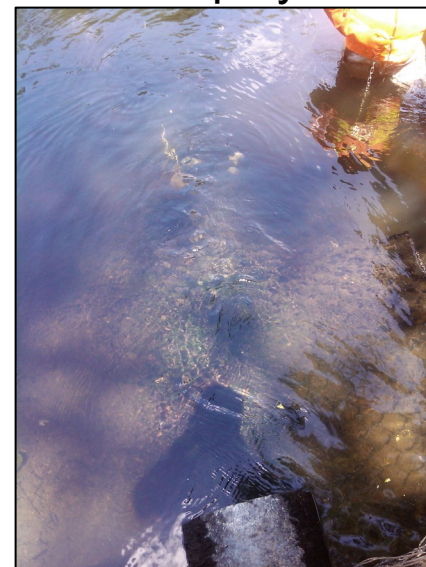


# Sampling



Effluent pipe sampling

## Deployment



Effluent pipe

### Day 1

- TS 1 – morning
- TS 2 - evening

Time



### Day 2

- TS 3 – morning
- TS 4 - evening





# Analysis

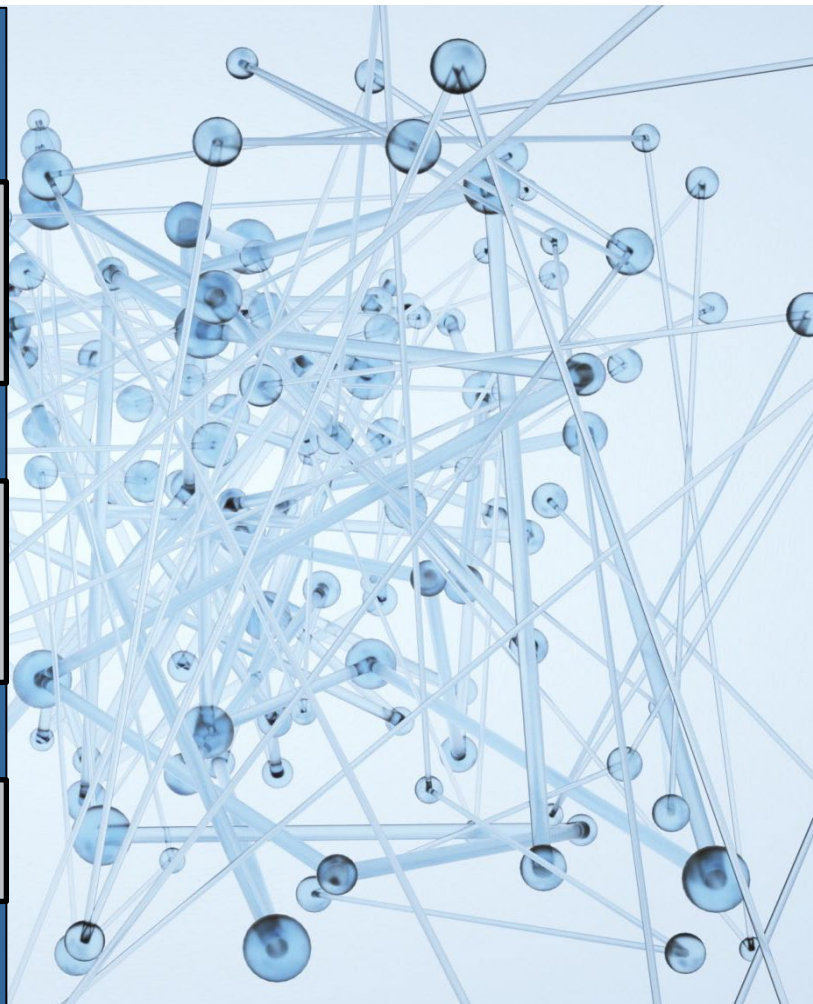
DEGs – overlap

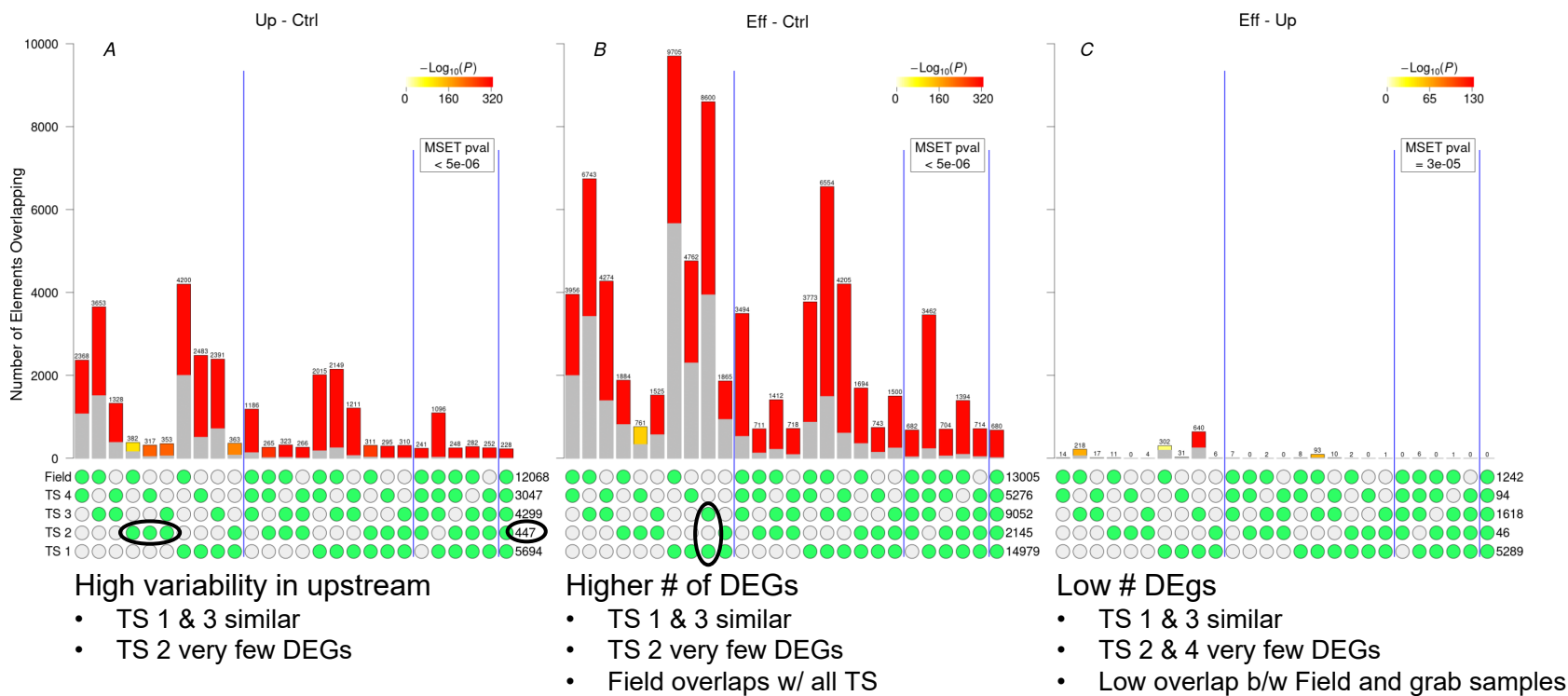
- Super Exact test

Functional Enrichment

- Semantic Analysis

Classification



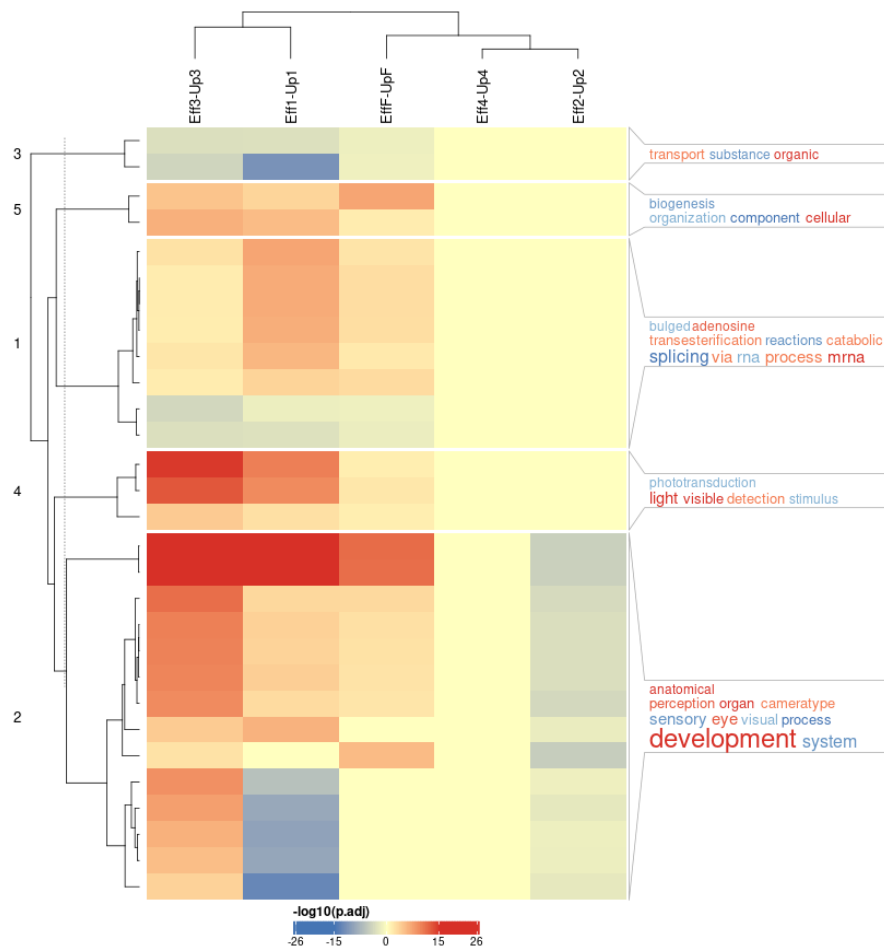




## Cluster Analysis of Enriched Categories – Up vs. Eff



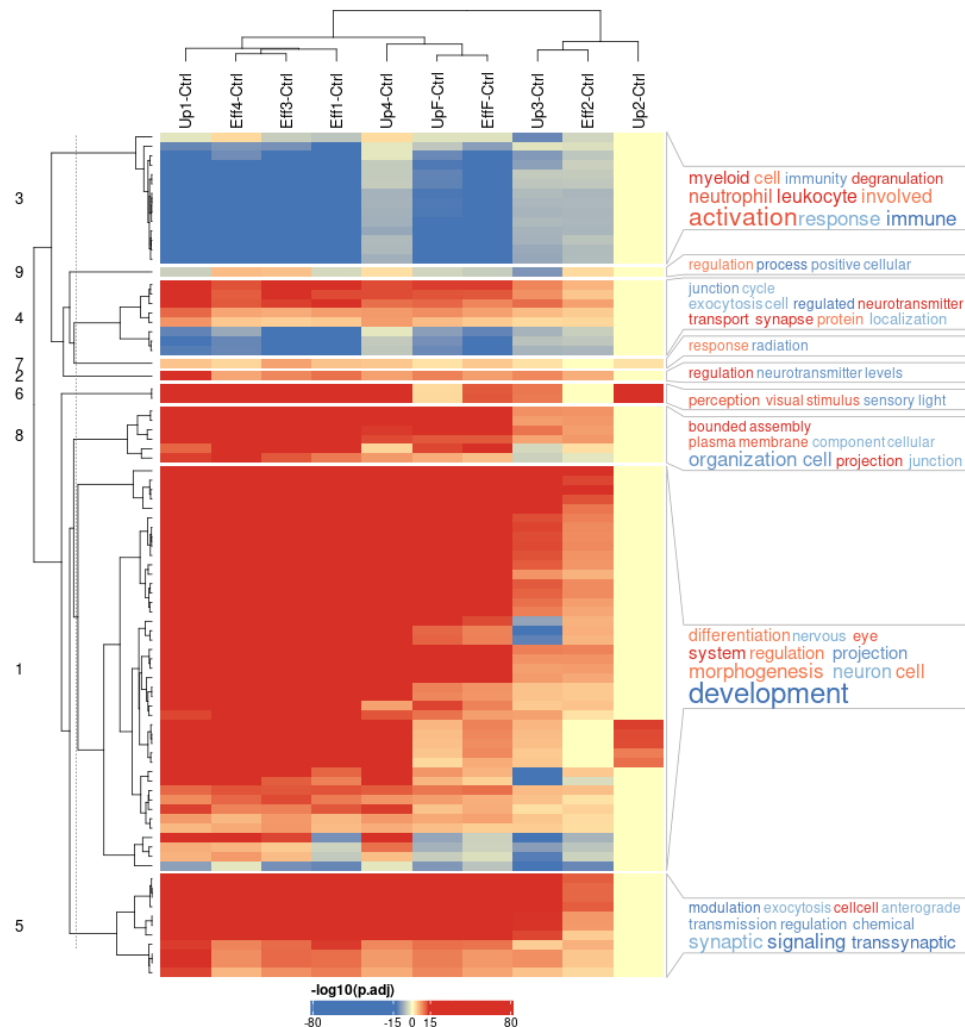
- Overall transcriptional levels were low
  - Upstream – highly variable across time
- Little to none in TS 2 & TS 4
- TS 1 & 3 cluster



# Cluster Analysis of Enriched Categories – Up and Eff vs. Control



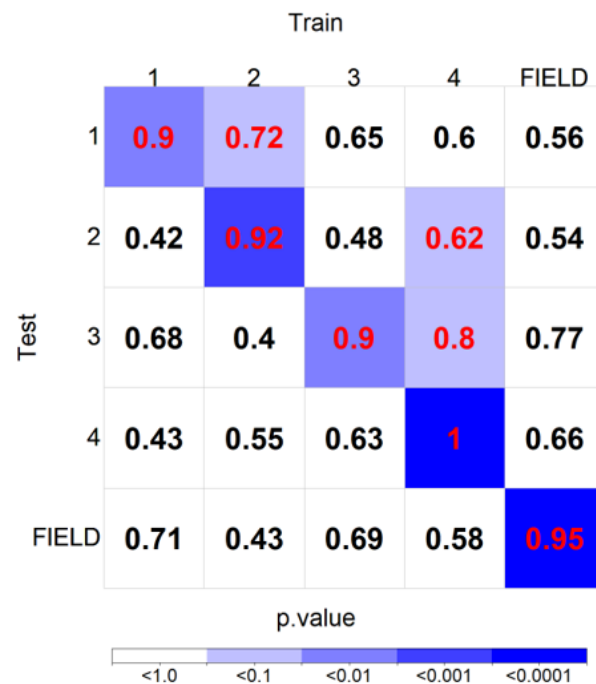
- ☐ GO Biological Function Enrichment analyses
- ☐ Filtered
  - ☐ terms present in at least 9 treatment groups
- ☐ Semantic analysis of clusters
- ☐ Eff grab samples clustered
- ☐ Up samples did not cluster
  - ☐ Changing background
- ☐ Field samples clustered
  - ☐ Suggested deployment is a complicating factor
    - ☐ Stress
- ☐ Up 2 few DEGs -> few GO terms



# Classification

- Alternative approach to similarity
  - Not based on DEGs
  - Negative Binomial Linear Discriminant Analysis
- Effluent -> DEGs -> classification
- Permutations to determine p value
  - Only TS 4 able to classify other TS
- TS 1 and 3
  - Reciprocal -> higher AUC
  - High AUC w/ Field
    - Reciprocal (train on Field)
      - TS 3

**Cross-timestep AUCs, Perm. Test pvals**



# Conclusions

- Reference comparison
  - Up vs. Eff
    - High variability in Up – changing background
      - Independent of WWTP
      - Reference changes at each TP and field vs. grab
- Field vs. Grab Samples
  - Grab samples
    - Random noise – TS 2
    - Intra-daily differences (TS 1 & TS 3)
    - Can approximate field
      - Time dependent -> Composite sampling

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