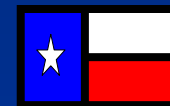


Matrix Factorization of the 2001 Deer Park VOC data for Source Resolution and Apportionment



B. Buzcu
M. P. Fraser



RICE

Receptor Modeling

$$C_{(ij)} = \sum_{k=1}^n \alpha_{(jk)} S_{(ik)} + e_{(ij)}$$

where: **i** = compounds (1, 2, ...)

j = samples (1, 2, ...)

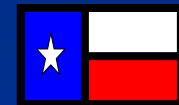
k = sources (1, 2, ...)

C = concentration of species in ambient samples

α = emission source strengths

s = source profiles

e = difference between ambient concentration
and reconstructed source contribution



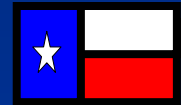
RICE

Univariate versus Multivariate

**Univariate: Supply known source profiles
(Chemical Mass Balancing)**

**Multivariate: Source profiles and number
of sources are unknowns**

***Positive Matrix Factorization: Use physical
limitations on $\alpha_{(jk)}$ and $s_{(ik)}$ to determine number
of sources and source profiles***



RICE

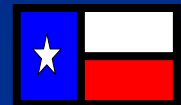
Multivariate Receptor Modeling

More Data  Resolve More Sources

Past Applications of PMF have used multiple years of VOC data to resolve upto 15 sources

Our approach is to use only 1 week of hourly data to focus on the 3 or 4 most important sources

(can still analyze a full year of data)

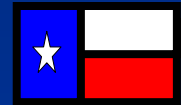


RICE

Dominant Source Profiles

VOC concentrations are dominated by 3 or 4 sources using analyzing hourly data by PMF one week at a time

Using 2001 hourly VOC data from Deer Park, PMF resolves 3 sources in 25% of weekly data and 4 sources in 75% of weeks



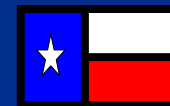
RICE

Dominant Source Profiles

Natural Gas:	100% of weeks
Vehicle Exhaust:	98% of weeks
Petrochemical Prod*:	90% of weeks
Refining Operations:	48% of weeks
Gasoline Vapor:	34% of weeks
Biogenic Emissions:	11% of weeks
Methylcyclohexane**:	2% of weeks

* 90% ethylene rich and 10% propylene rich

** one occurrence

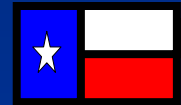


RICE

CASE I

Ethane is excluded

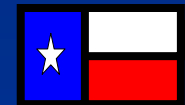
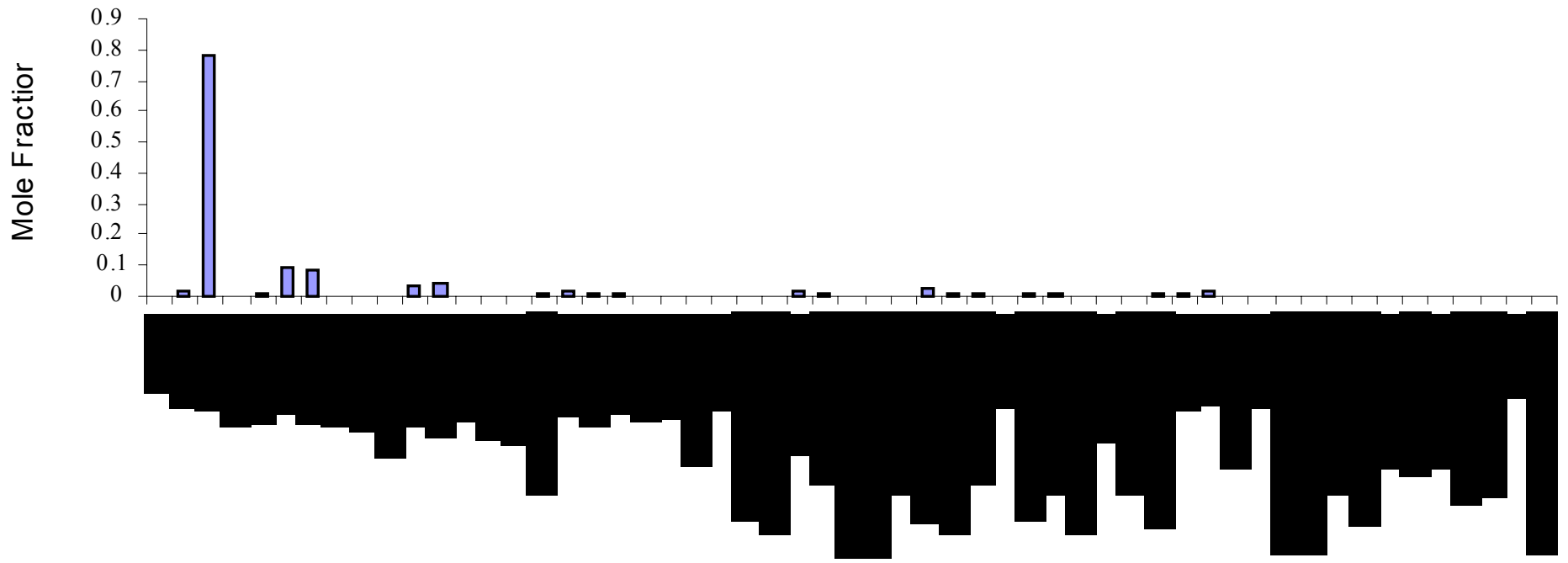
(low reactivity and high concentration)



RICE

Natural Gas

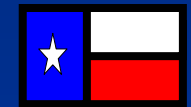
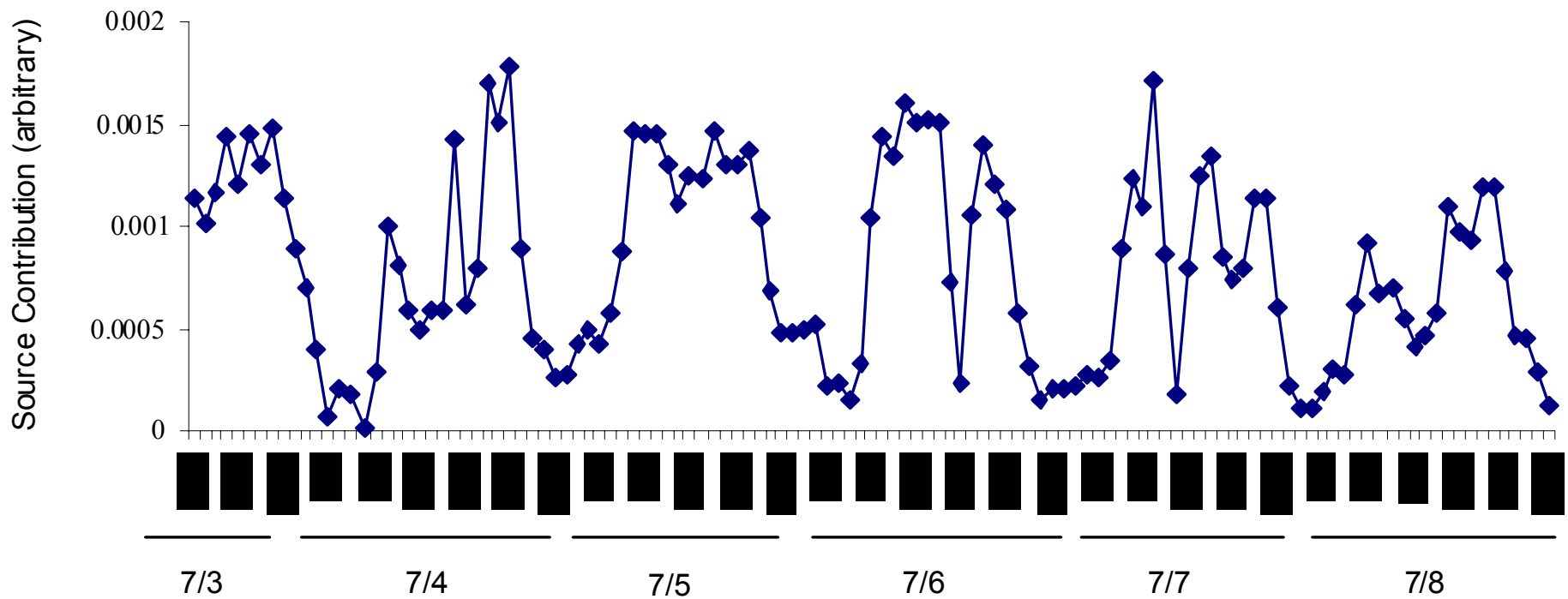
Natural Gas
Week 22 (6/25 - 7/1)



RICE

Natural Gas

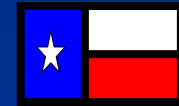
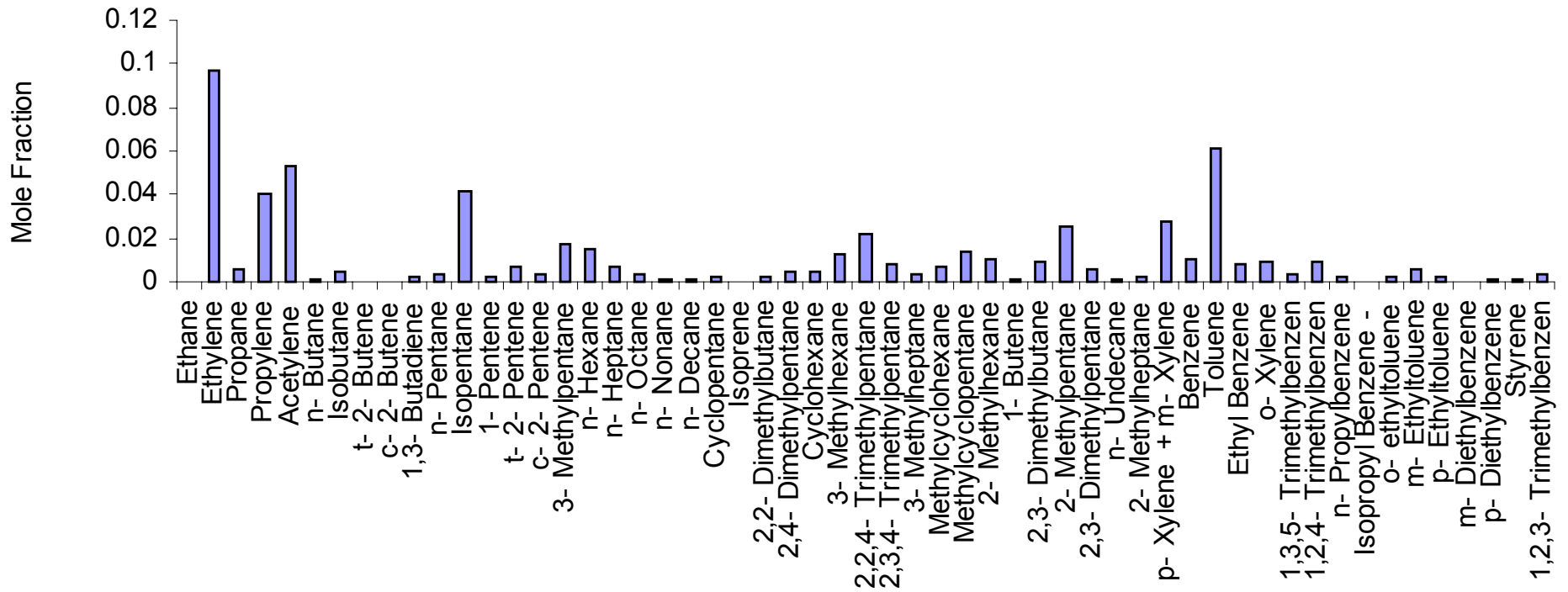
Natural Gas
Week 23 (7/3-7/8)



RICE

Vehicle Exhaust

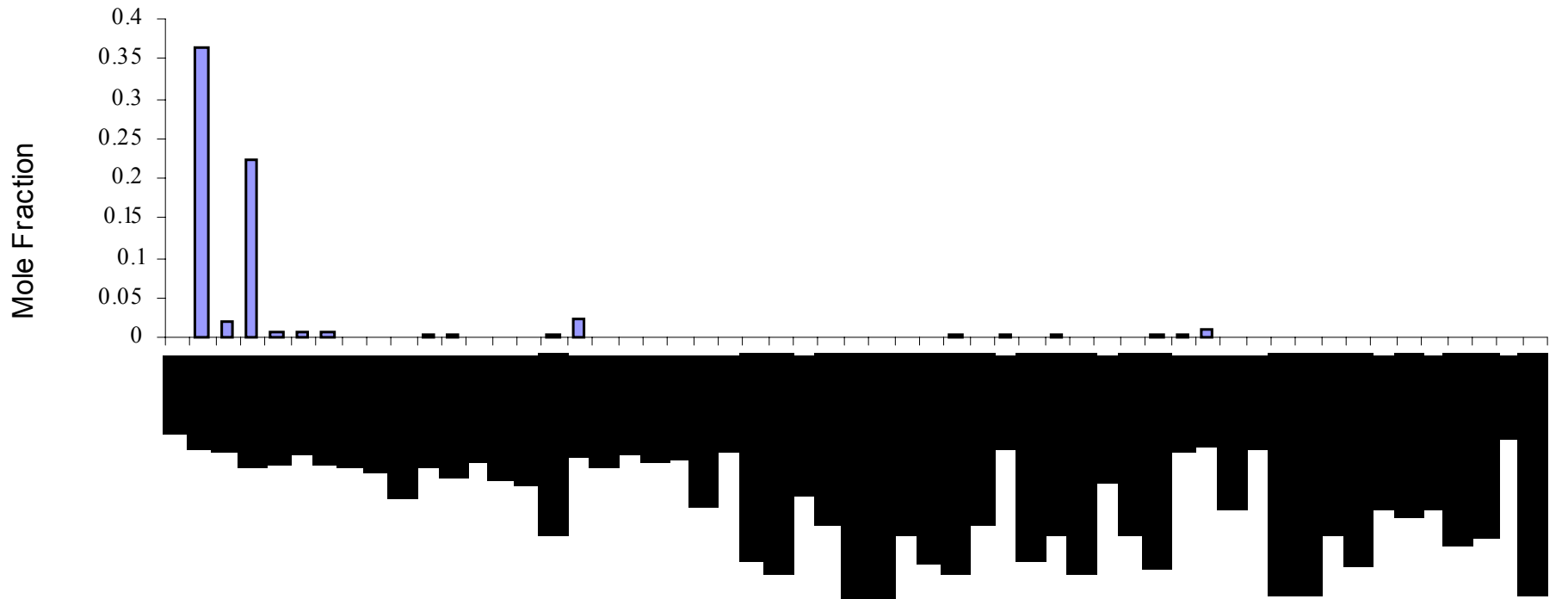
Vehicle Exhaust
Week 17 (5/21 - 5/27)



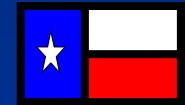
RICE

Petrochemical Production

Petrochemical Production
Week 19 (6/4 - 6/10)



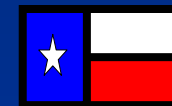
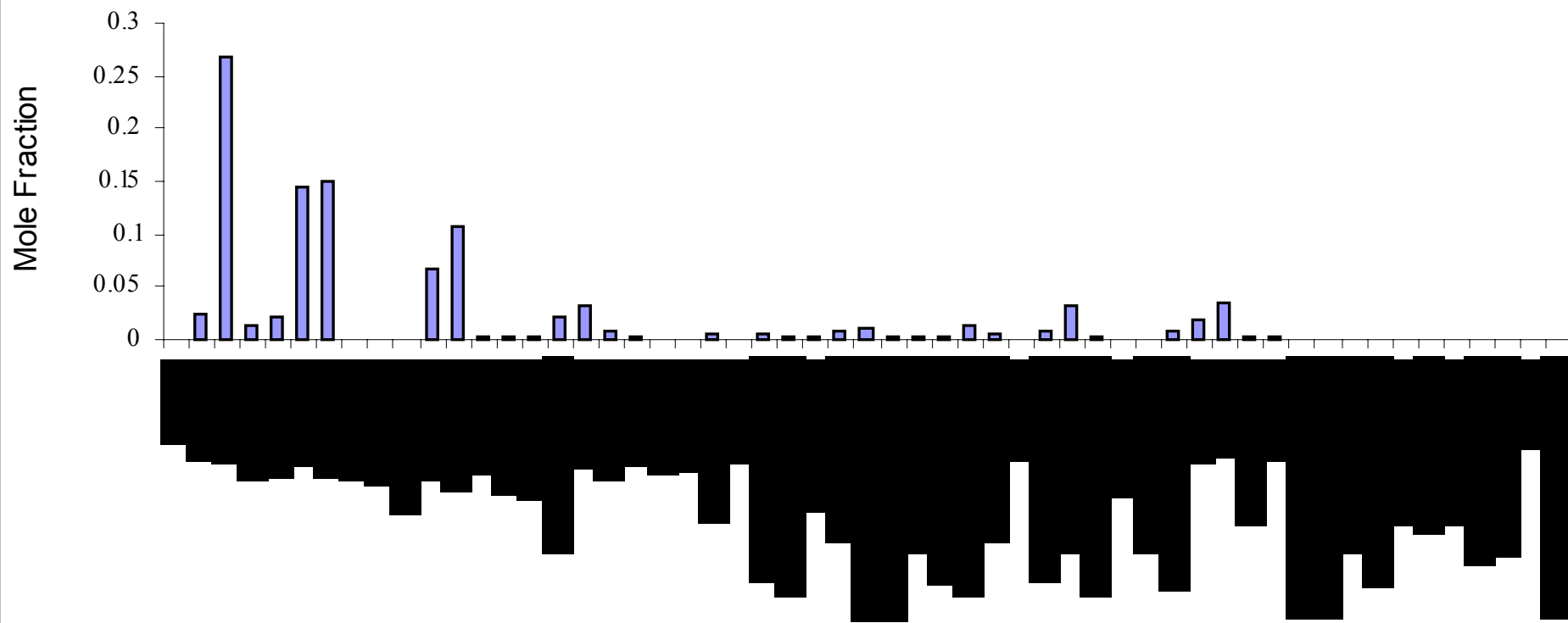
Related source profile with propylene dominant occurs in 10% of the data



RICE

Refining Operations

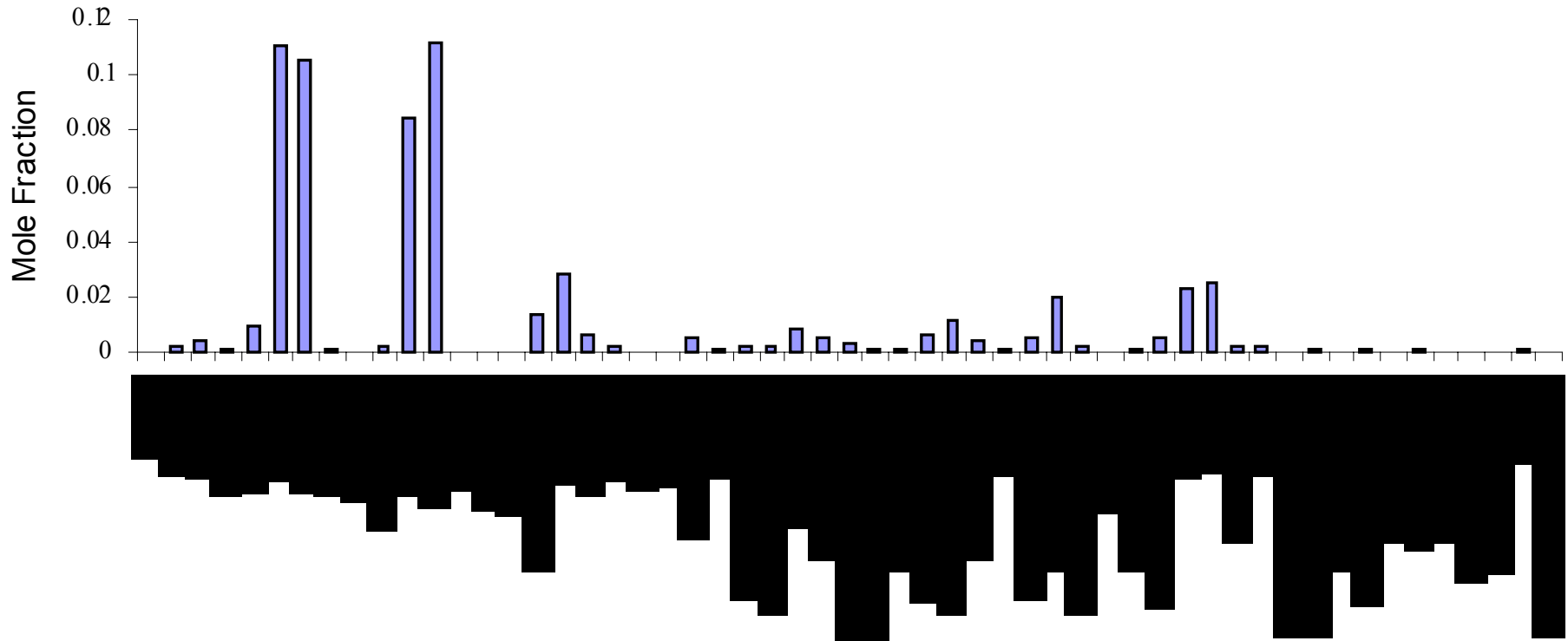
Refinery
Week 28(8/6 - 8/12)



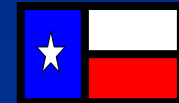
RICE

Gasoline Vapor

Gasoline Vapor
Week 33 (9/10 - 9/16)



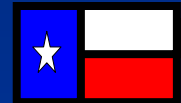
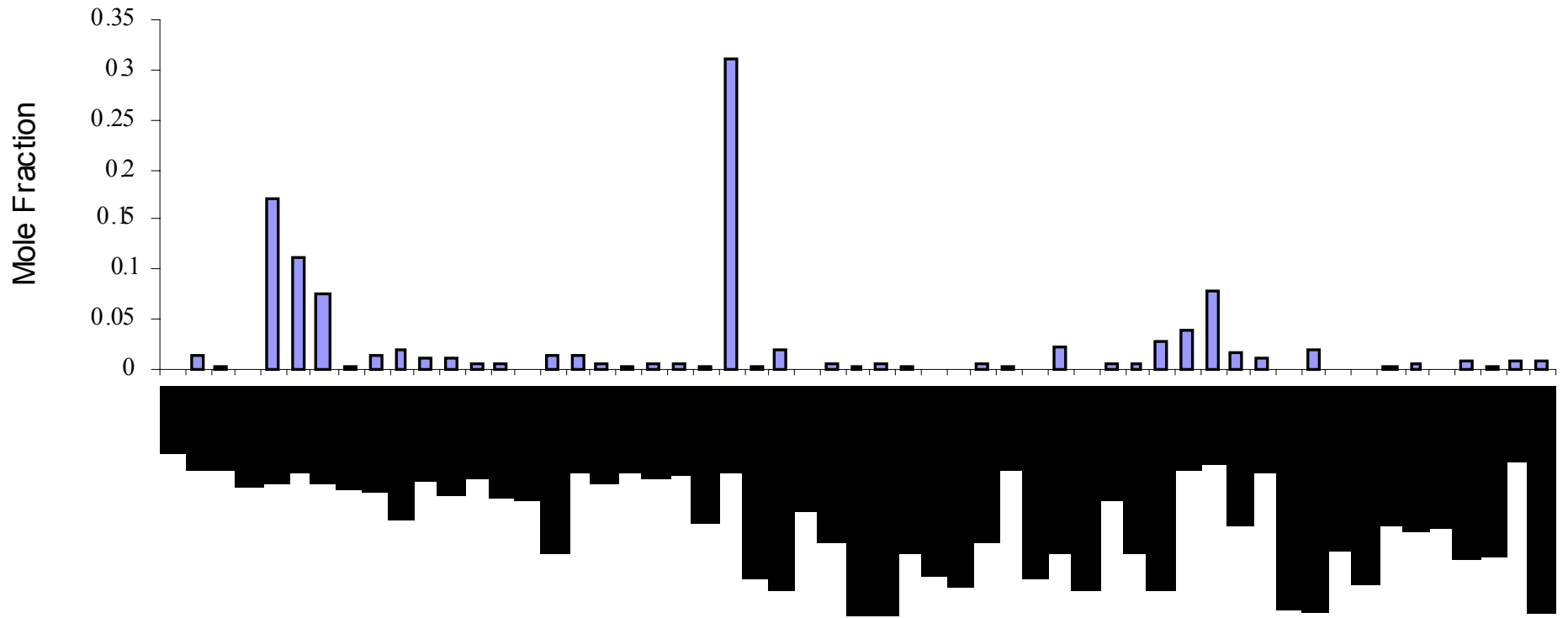
*Does not have acetylene (in vehicle exhaust)
or propane (in refining operations)*



RICE

Biogenics

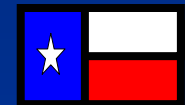
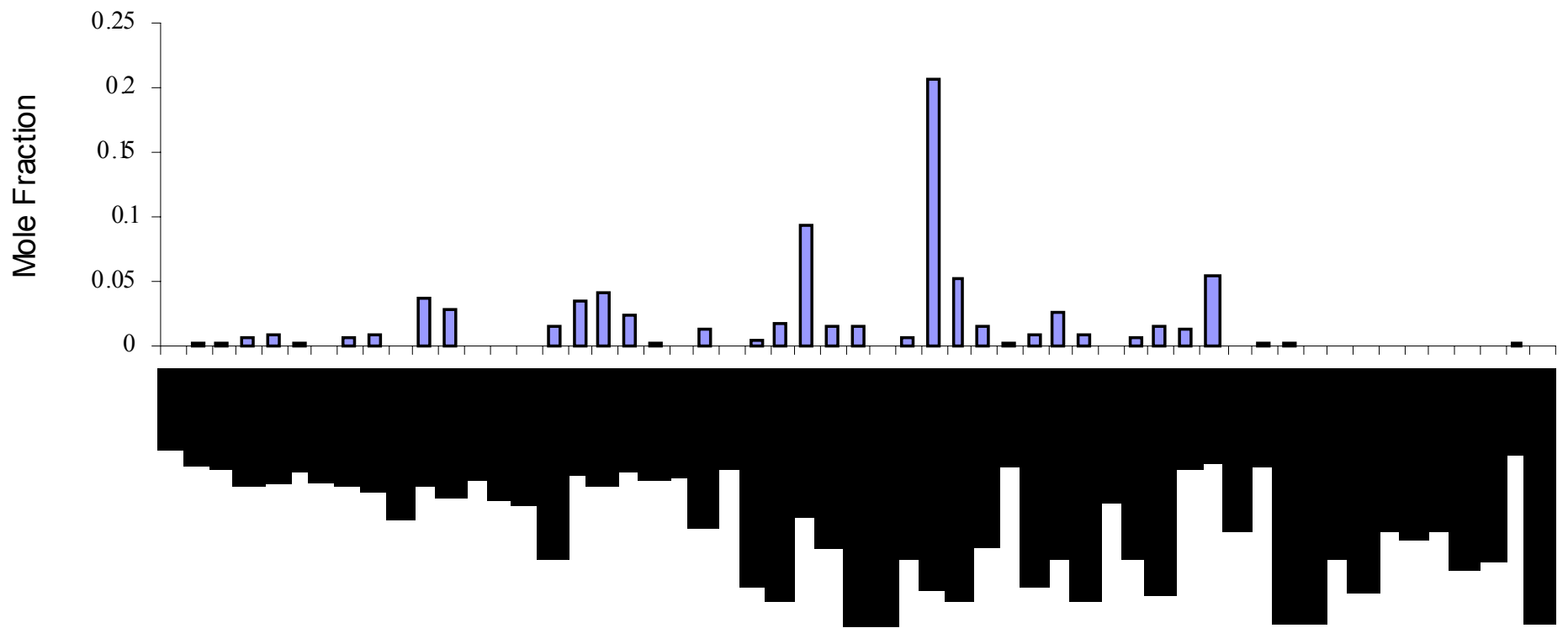
Biogenic Emissions
Week 24 (7/9 - 7/15)



RICE

Methylcyclohexane

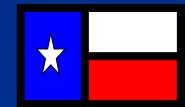
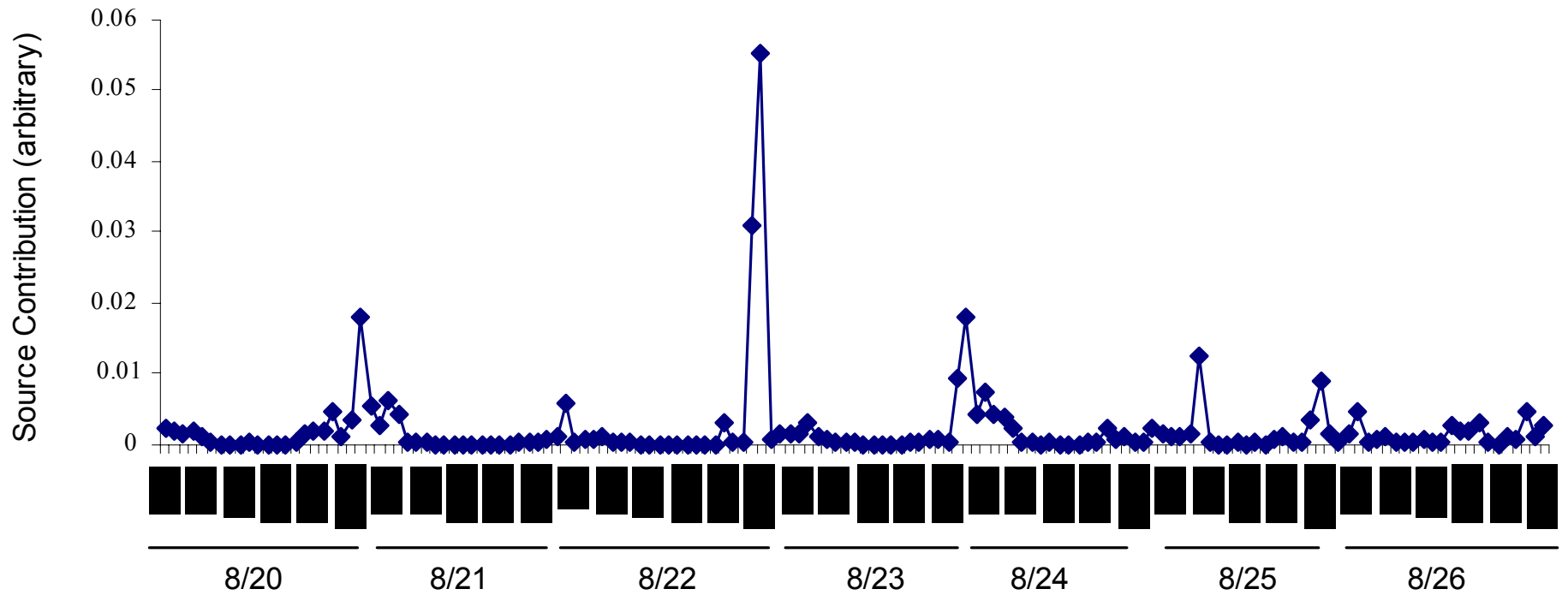
Methylcyclohexane
Week 30 (8/20 - 8/26)



RICE

Methylcyclohexane

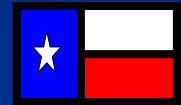
Methylcyclohexane
Week 30 (8/20 - 8/26)



RICE

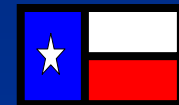
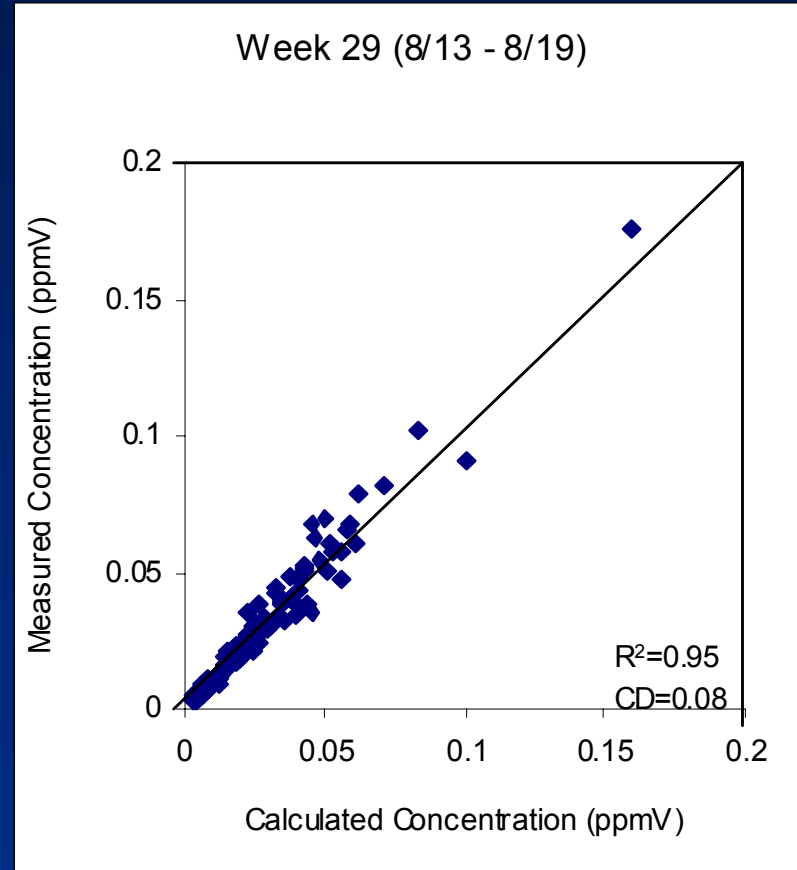
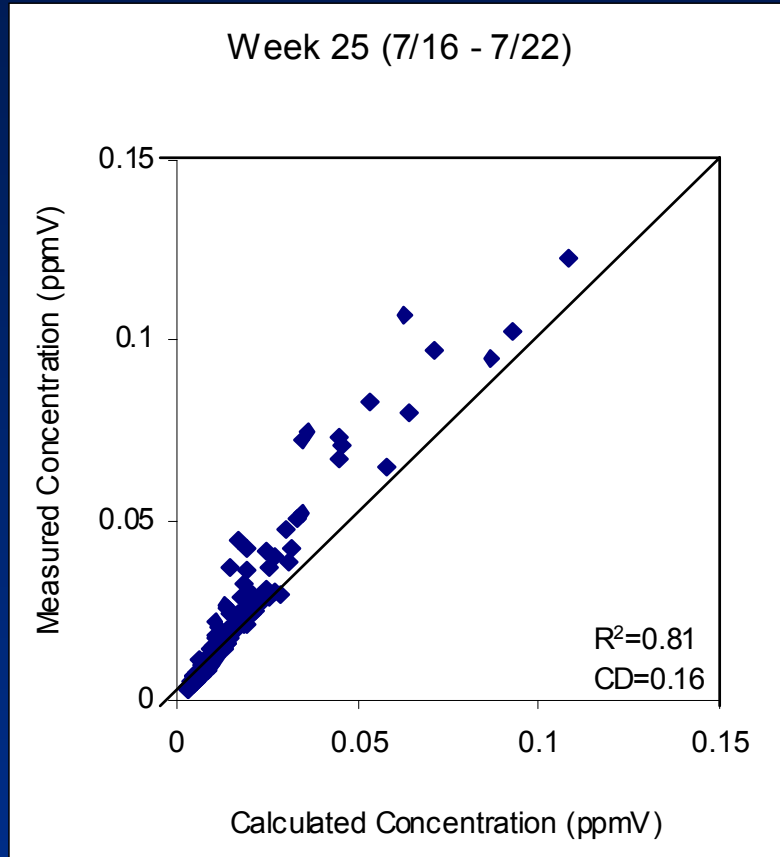
Source Contributions

Using factorized source contributions from PMF, can perform a multiple linear regression between contribution factor and measured concentration to get overall source contributions



RICE

Source Contributions

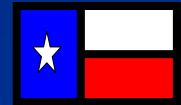


RICE

CASE II

Ethane is included

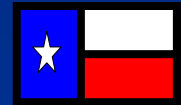
*Suggested as an important species to differentiate
natural gas and refining emissions.*



RICE

Dominant Source Profiles

Using 2001 hourly VOC data from Deer Park, PMF resolves 3 sources in 40% of weekly data and 4 sources in 60% of weeks



RICE

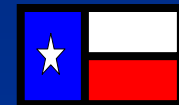
Dominant Source Profiles

Natural Gas:	100% of weeks
Vehicle Exhaust:	89% of weeks
Petrochemical Prod*:	79% of weeks
Refining Operations**:	37% of weeks
Gasoline Vapor:	16% of weeks
Biogenic Emissions:	13% of weeks
Methylcyclohexane***:	2% of weeks
Industrial Isoprene***:	2% of weeks

* 90% ethylene rich and 10% propylene rich

** resolve two separate types of refining emissions: fugative and refining feedstock

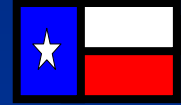
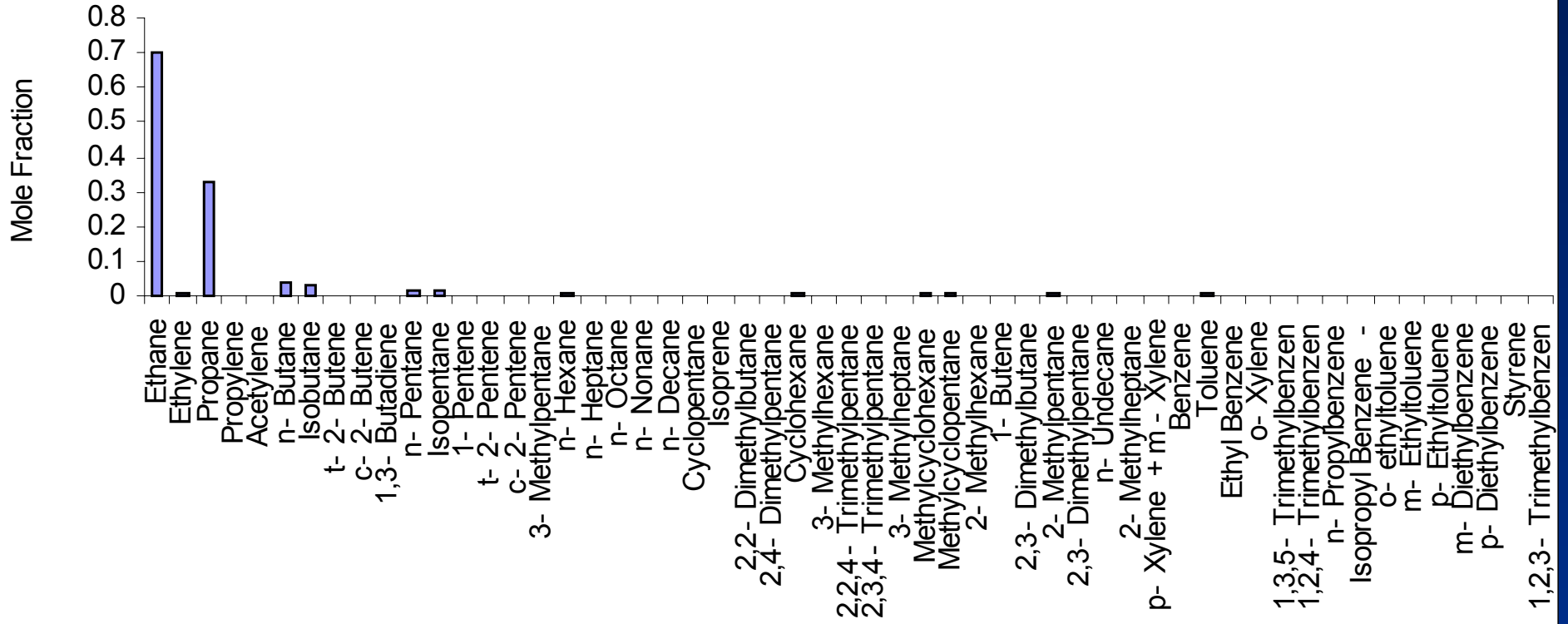
*** one occurrence



RICE

Natural Gas

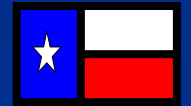
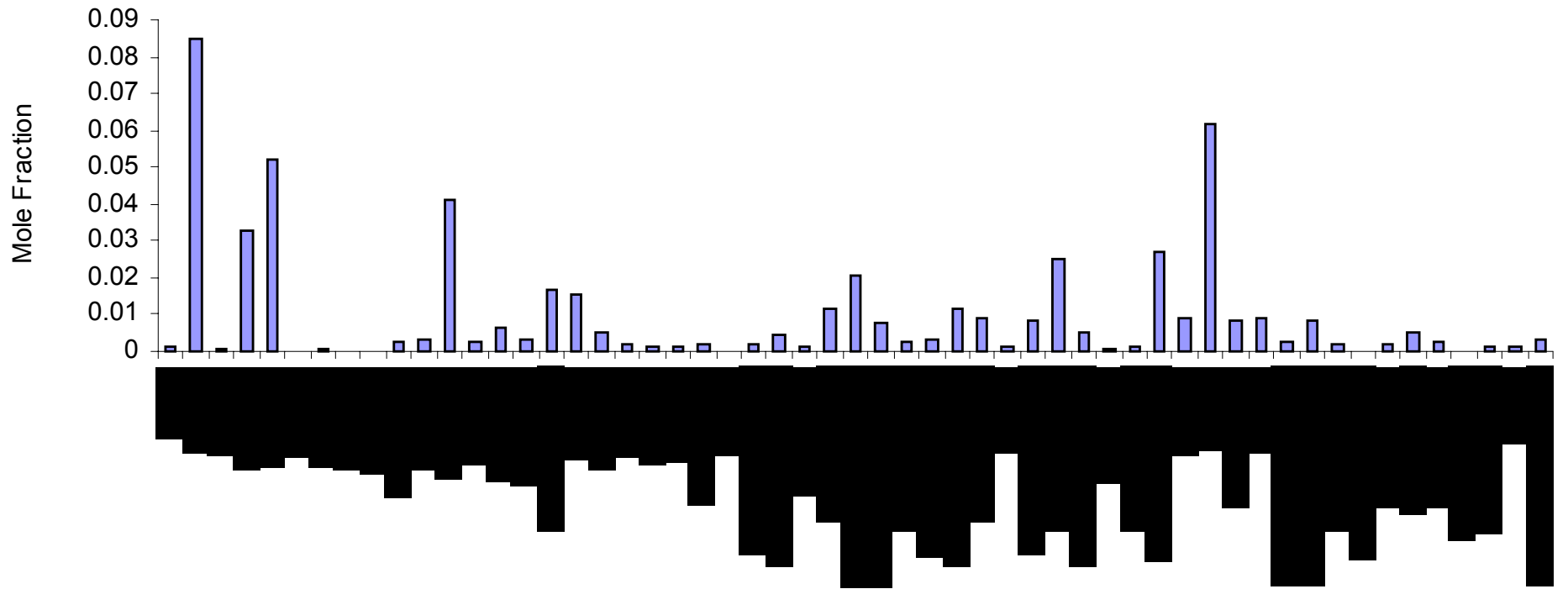
Natural Gas
Week 22 (6/25-7/1)



RICE

Vehicle Exhaust

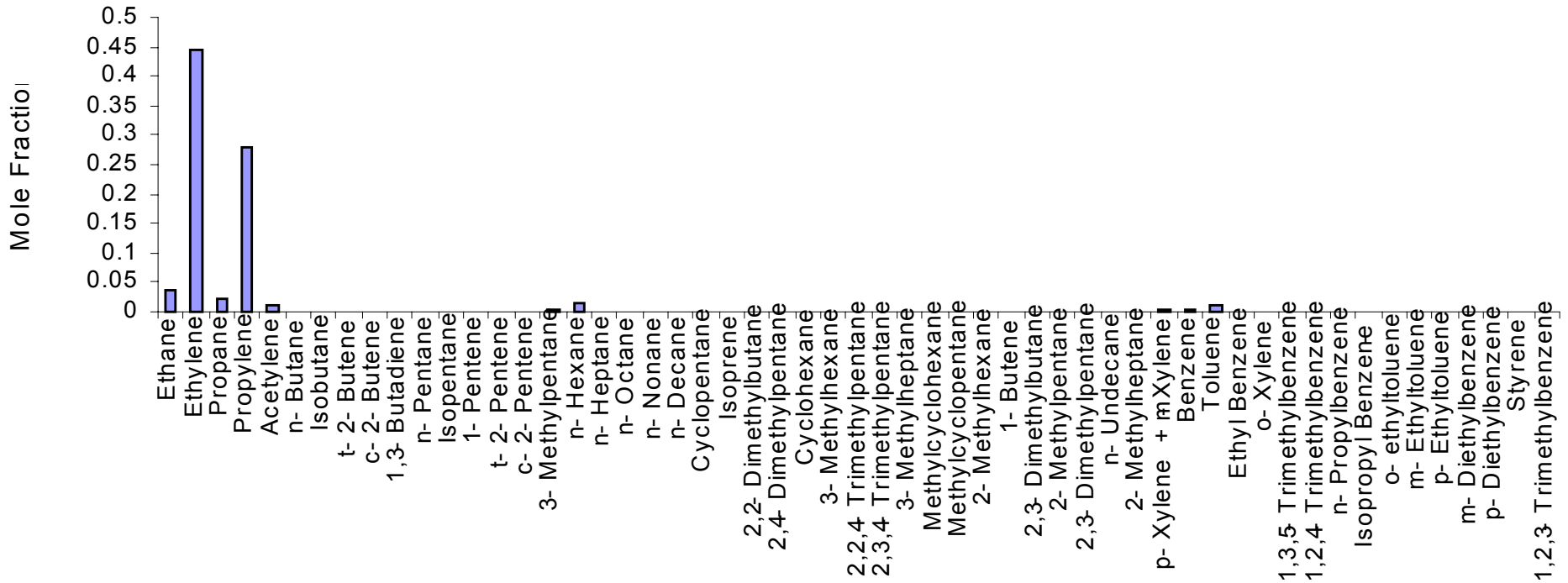
Vehicle Exhaust
Week 17 (5/21 - 5/27)



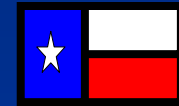
RICE

Petrochemical Production

Petrochemical Production
Week 37 (10/8 - 10/14)



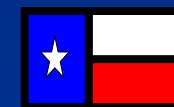
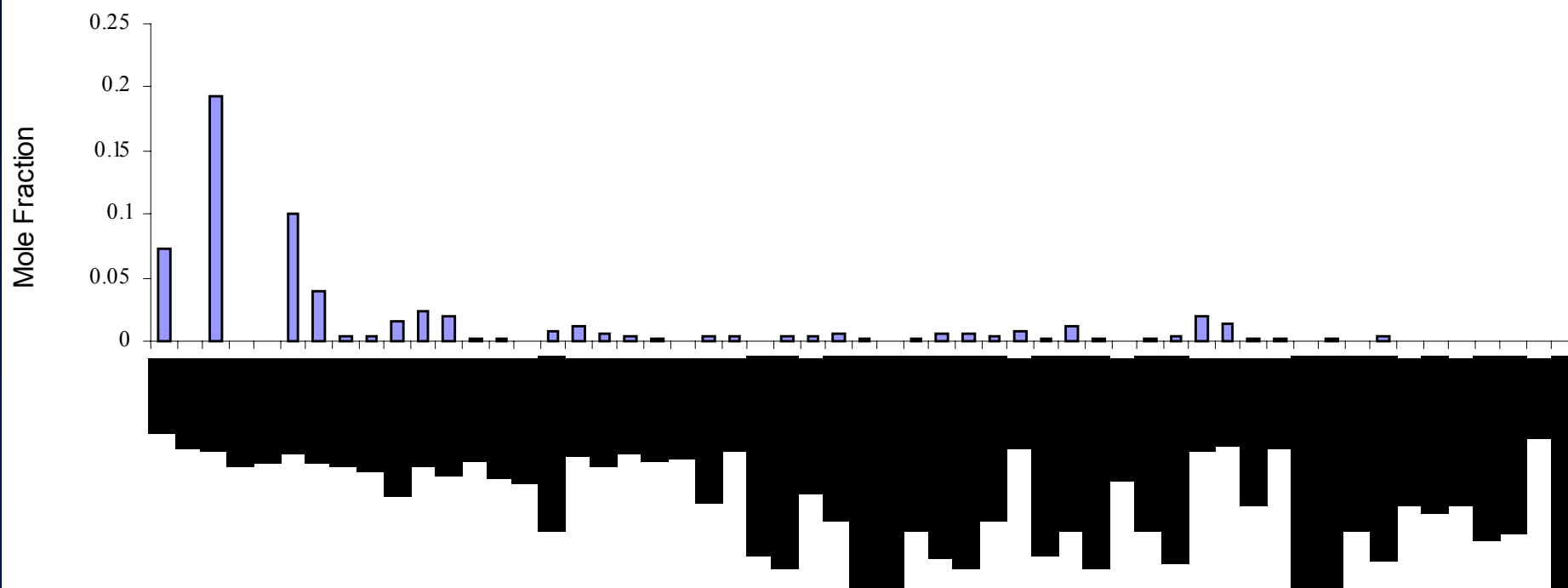
Related source profile with propylene dominant occurs in 10% of the data



RICE

Refining Operations

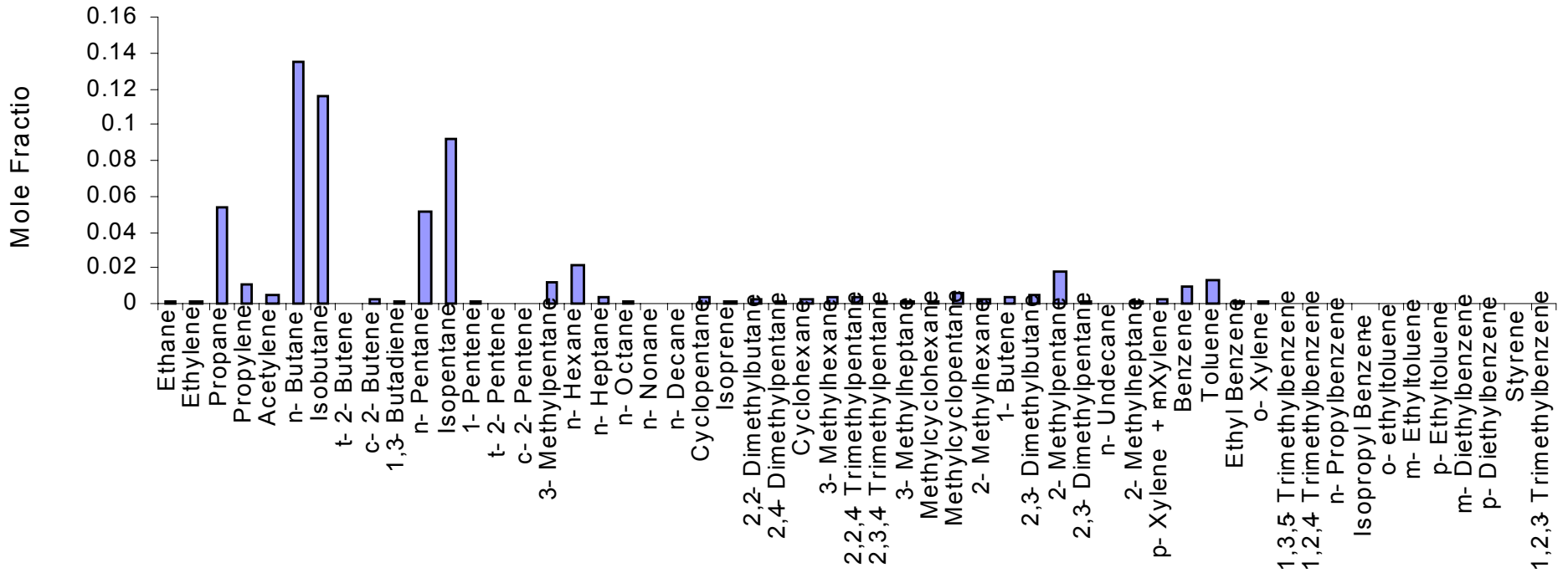
Refinery Feedstock Emissions
Week 1 (1/29 - 2/4)



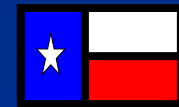
RICE

Refining Operations

Refinery Fugitive Emissions
Week 34 (9/17 - 9/23)



Fugitive refining profile is more prevalent in the data than the feedstock refining emissions profile



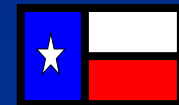
RICE

**Same profiles for the following
sources:**

Gasoline Vapor

Biogenics

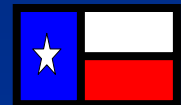
Methylcyclohexane



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On-Going Project:

- **Will determine source contributions for rest of the year**
- **Will determine bias in exclusion of other sources**
- **Will investigate correlations between source contributions and wind direction, other parameters**
- **Will compare results to existing inventories**



RICE