

***Part II - Applications of MultiSeq  
Evolution of Translation: Dynamics of  
Recognition in RNA:Protein Complexes***

***Part III – Towards in silico Cells:  
Simulating processes in entire cells***

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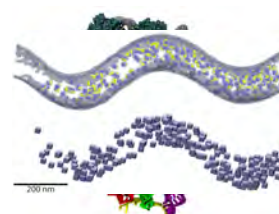
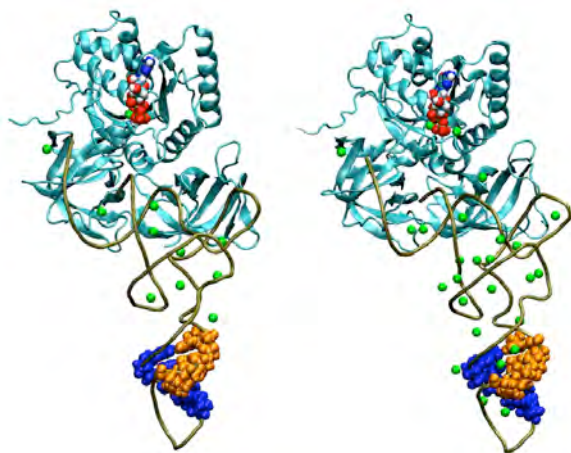
Institute of Genomics Biology

NIH Resource Macromolecular Modeling and Bioinformatics

Pittsburgh Workshop 2011



**Protein:RNA Complexes in Translation**  
**Evolution, Dynamics, Analysis**



**Proteins/RNA  
Polyribosomes  
Ribosome**

"Evolution SepRS/CysRS", *PNAS*, 2005

"Dynamic Signaling Network", *PNAS* 2009

"Exit Strategy Charged tRNA" *JMB* 2010

"Dynamical Recognition Novel

Amino Acids", *JMB* 2008

"Signatures ribosomal evolution"

*PNAS* 2008, *BMC* 2009

"Whole cell simulations on

GPUs" *IEEE* 2009

"Dynamics of tRNA" *FEBS* 2010

## Molecular Dynamics Simulations

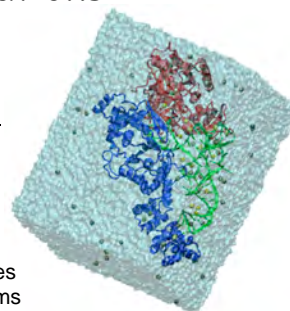
MD performed with NAMD2 (1) - System Setup

### Simulation Parameters

Minimization: 290,000 steps  
 Production run: 108 ns  
 Forcefields: CHARMM27 (2),  
 AMBER (3)  
 Time step: 1 fs  
 VdW frequency: 2 fs  
 VdW cutoff: 12 Å  
 Switching distance: 10 Å  
 Pair list distance: 14 Å  
 Particle Mesh Ewald  
 Full electrostatic update: 4 fs  
 Ensemble: NPT  
 Langevin temperature: 298.15 K  
 Langevin pressure: 1 atm  
 Periodic boundary conditions

### Contents of System(4)

GluRS  
 Glu-tRNA<sup>Glu</sup>  
 EF-Tu  
 GTP  
 Ions: Mg<sup>2+</sup>, K<sup>+</sup>  
 H<sub>2</sub>O: ~27,000 molecules  
 System: ~130,000 atoms

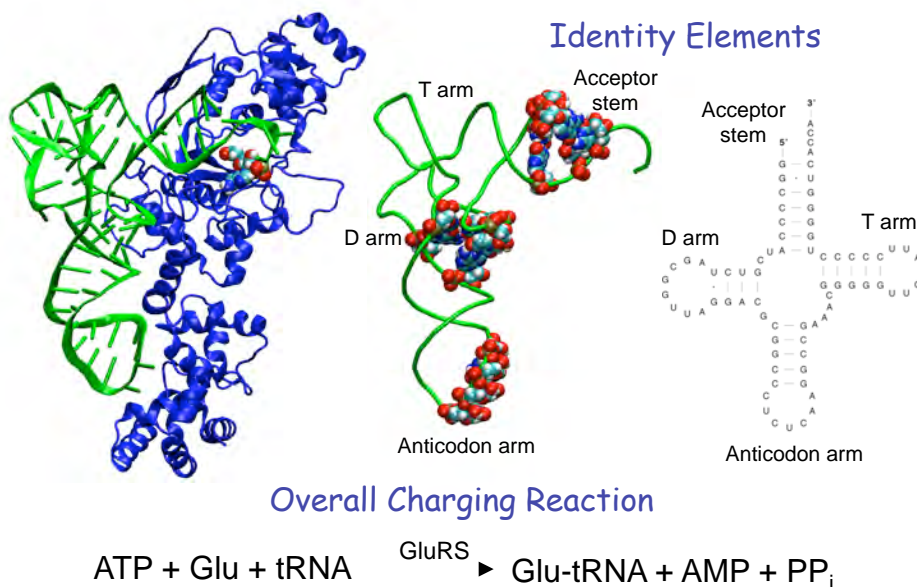


### System Perturbations

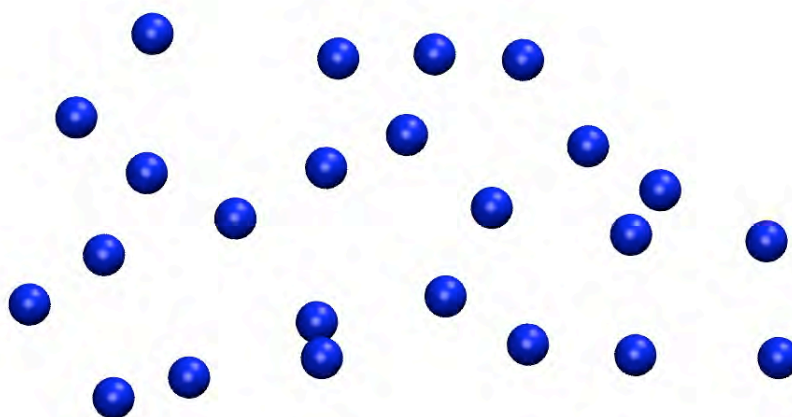
Deprotonation/protonation of reactants (aa,NTs)  
 Changing rotamer states of residues (5)  
 involved in long-lived salt bridges

- (1) Phillips, J.C. et al. *J. Comput Chem*, (2005); (2) MacKerell, A. et al. *Biopolymers* (2001);  
 (4) Case, D. et al. *J. Comput. Chem.* (2005); (4) Eargle, J. et al. *JMB* 2010, *FEBS Let.* 2010;  
 (5) Dunbrack Jr. and Cohen. *Protein Sci.* (1997)

## Charging tRNA through allosteric signaling

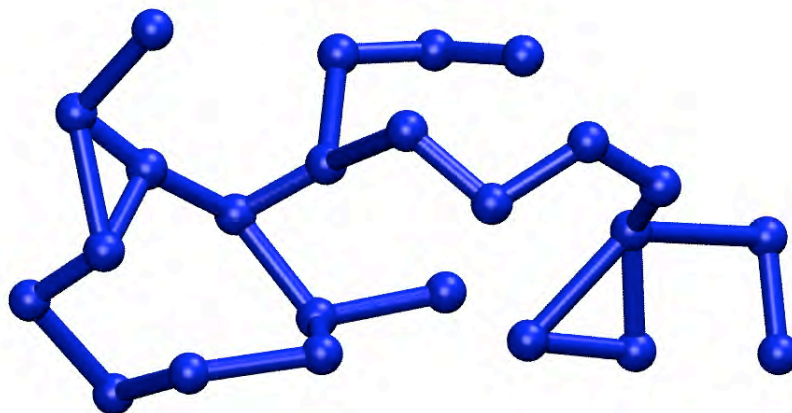


## How to Construct a Network?



Nodes - defined at C<sub>α</sub> (protein) and P (nucleotide) atoms

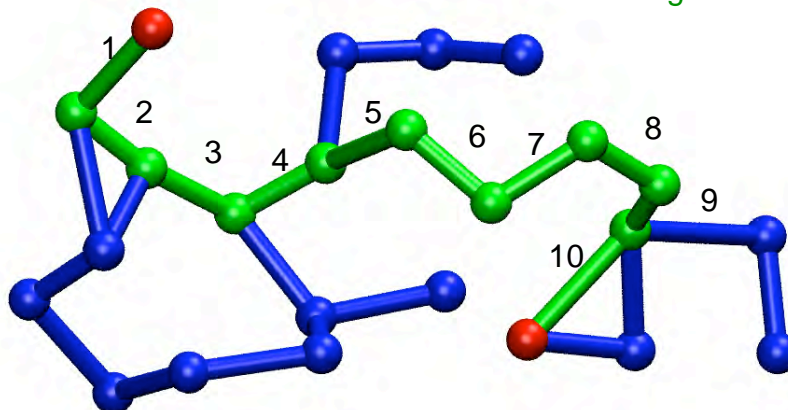
## How to Construct a Network?



Edges - connect nodes that are within a contact distance threshold for more than 75% of an MD trajectory

## Communication between **Identity** Elements and **Site** of Chemistry

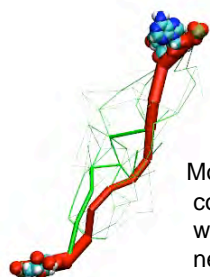
Different Paths can have Different Lengths



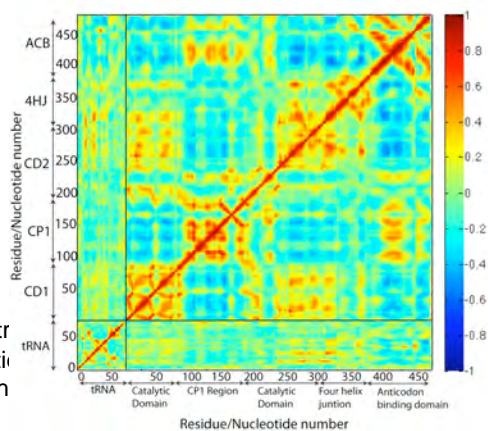
Path length = 10 (*unweighted*)

Information transfer? **Weight contacts/links by correlations !**

## Correlations ( $C_{ij}$ ) define signaling pathways in GluRS:tRNA

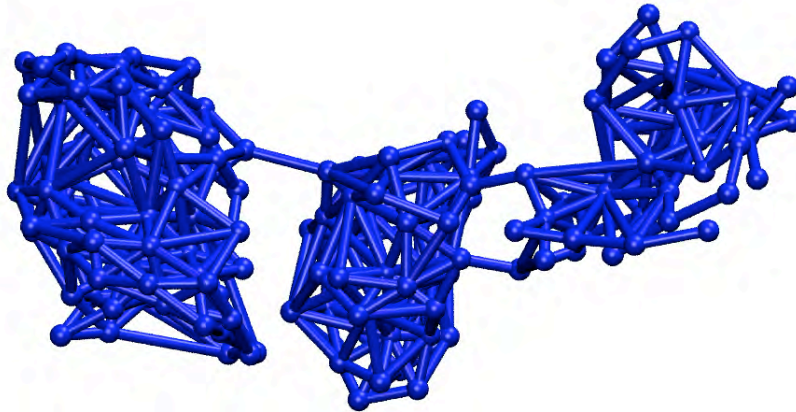


Modular str  
communiti  
with weigh  
network

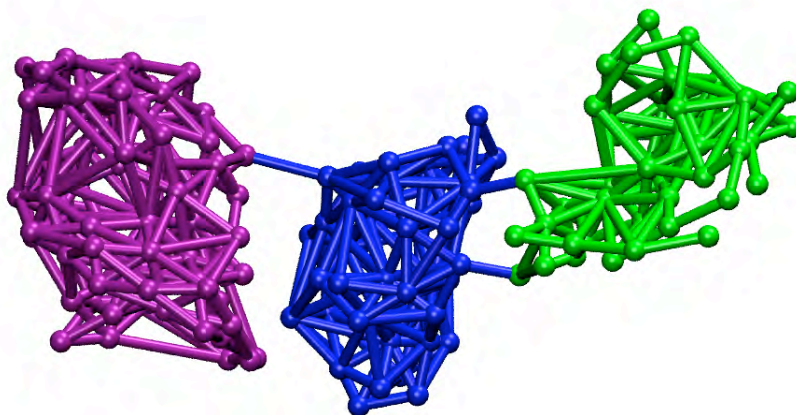


- MD simulations run with NAMD
- NTP ensemble
- Neutralized with  $Mg^{2+}$  and  $K^+$
- $C_{ij}$  values calculated over a 16-ns window

## Nodes Cluster Together in Modules called Communities

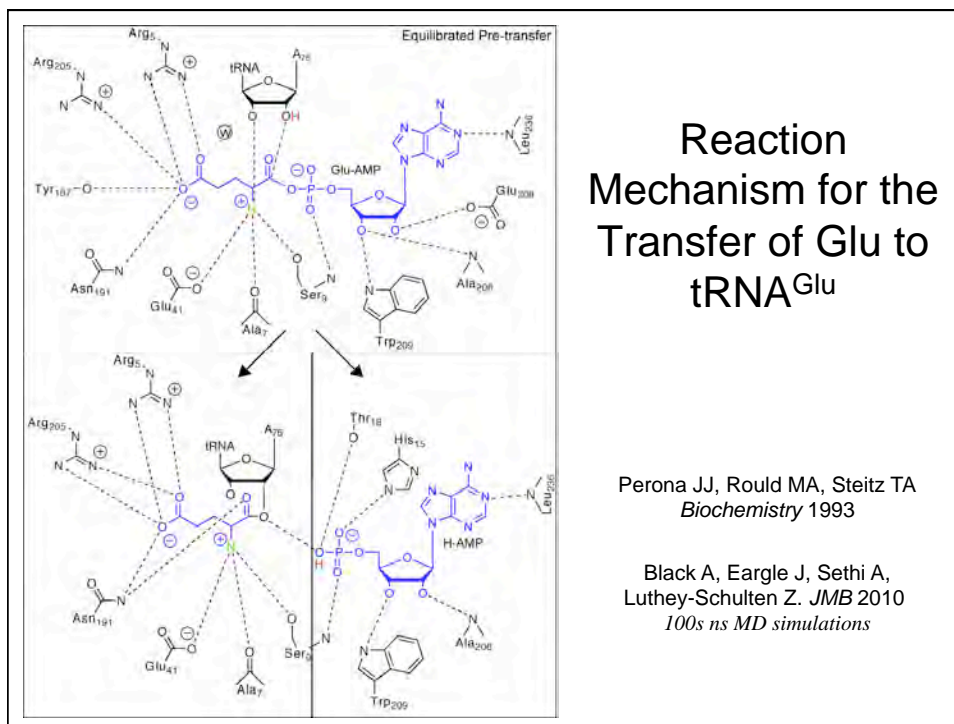


## Nodes Cluster Together in Modules called Communities



Communities are subnetworks with many intracommunity edges but few intercommunity edges.





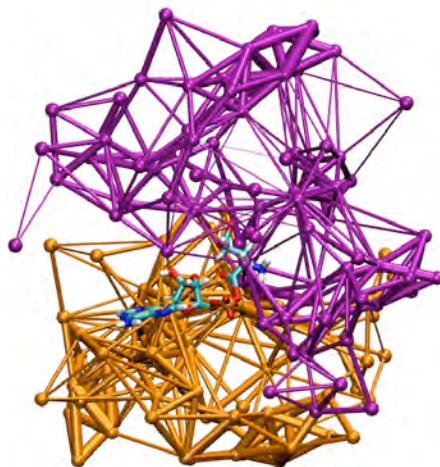
## Community Structure Reveals Function in GluRS



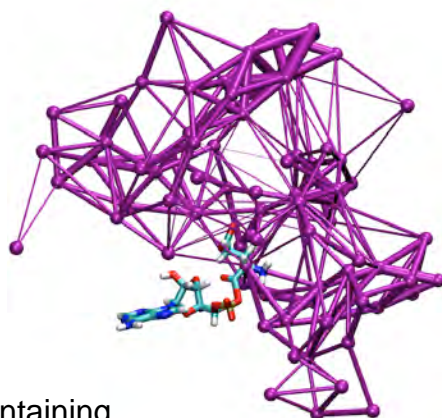
## Community Structure Reveals Function in GluRS



## Community Structure Reveals Function in GluRS



## Community Structure Reveals Function in GluRS



community containing  
amino acid moiety

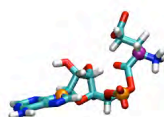
## Community Structure Reveals Function in GluRS



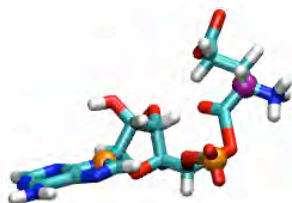
community containing  
AMP moiety



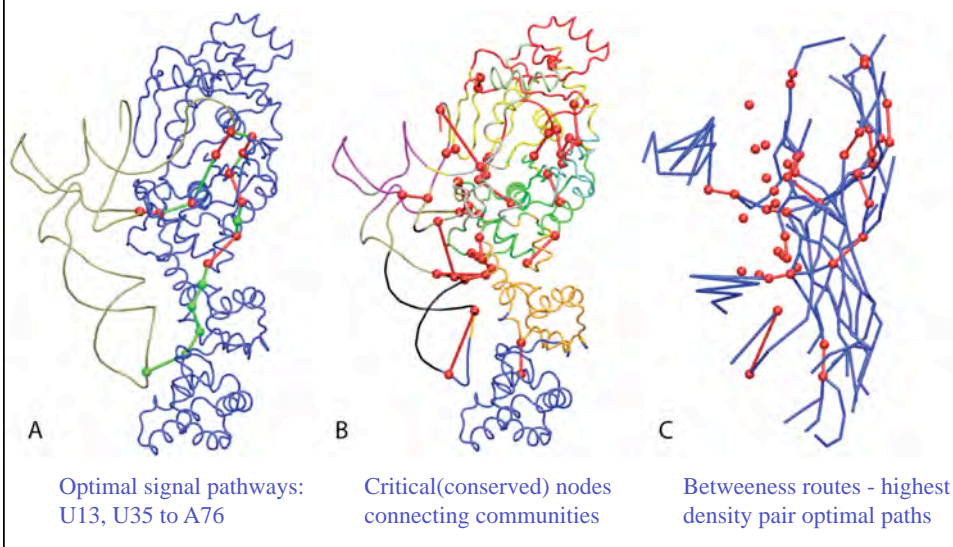
## Community Structure Reveals Function in GluRS



## Community Structure Reveals Function in GluRS



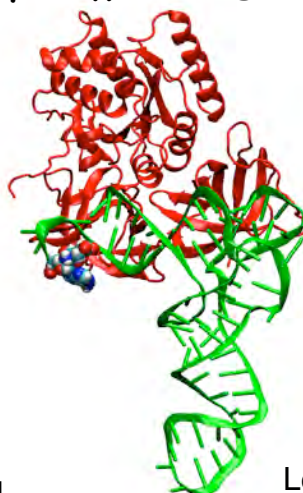
## Dynamical Networks, Conservation, and Betweenness



## Changing Networks: tRNA Migration from GluRS to EF-Tu

>2-fold increase  
in  $k_{cat}$  for  
CysRS:tRNA:EF-Tu

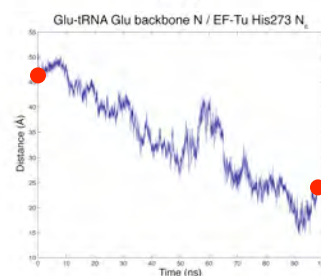
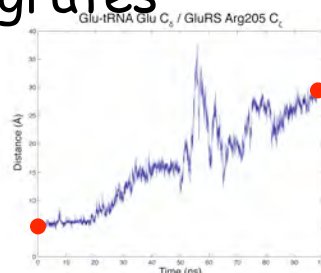
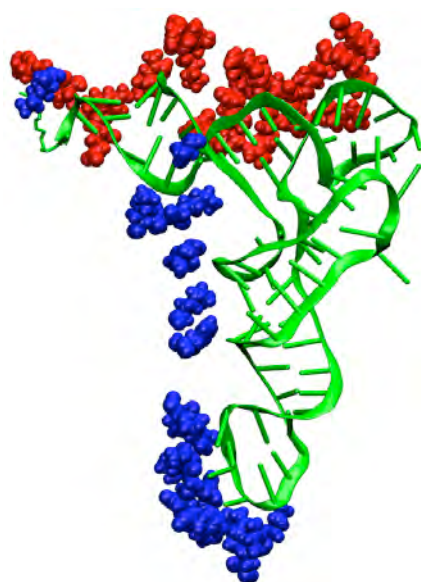
Zhang C, Perona J, Kang R,  
Francklyn C, Hou Y. *JMB* 2006



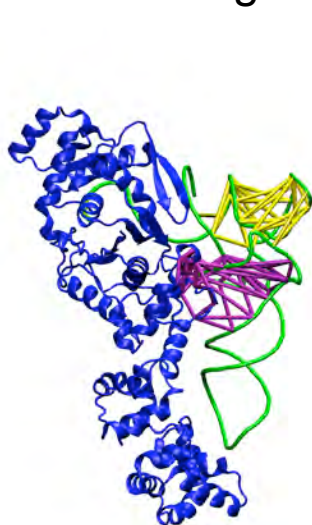
8-fold increase  
in  $k_{cat}$  for  
LeuRS:tRNA:EF-Tu

Hausmann C, Praetorius-Ibba M,  
Ibba M. *NAR* 2007

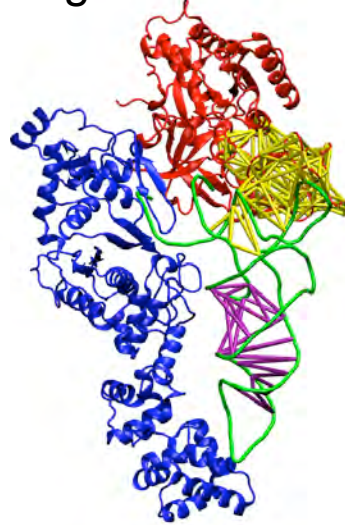
## Change in Protein:RNA Contacts as tRNA Migrates



## Change in Protein:RNA Contacts During tRNA Migration

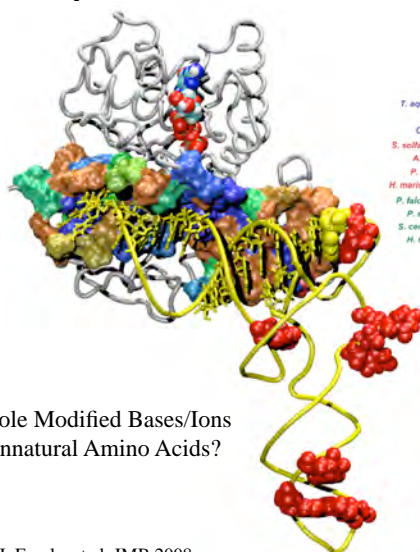


purple - D arm community



yellow - T arm community

## Evolution of Protein/RNA Interfaces: Dynamics of EF-Tu/tRNA Recognition



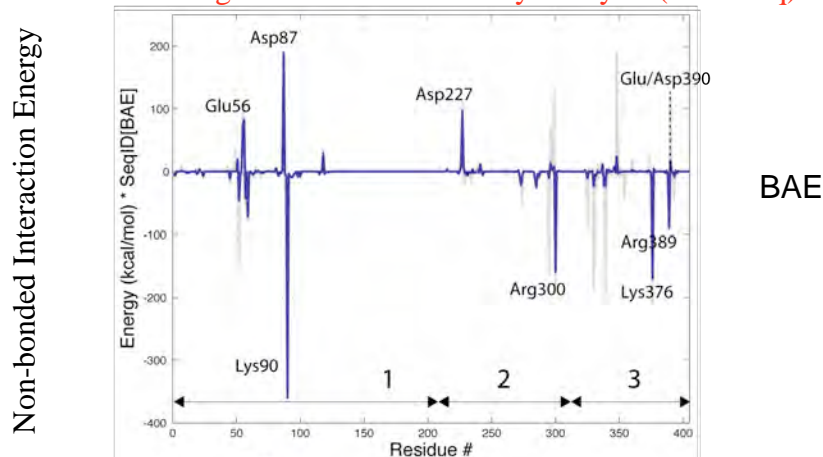
## Role Modified Bases/Ions Unnatural Amino Acids?

J. Eargle, et al. JMB 2008

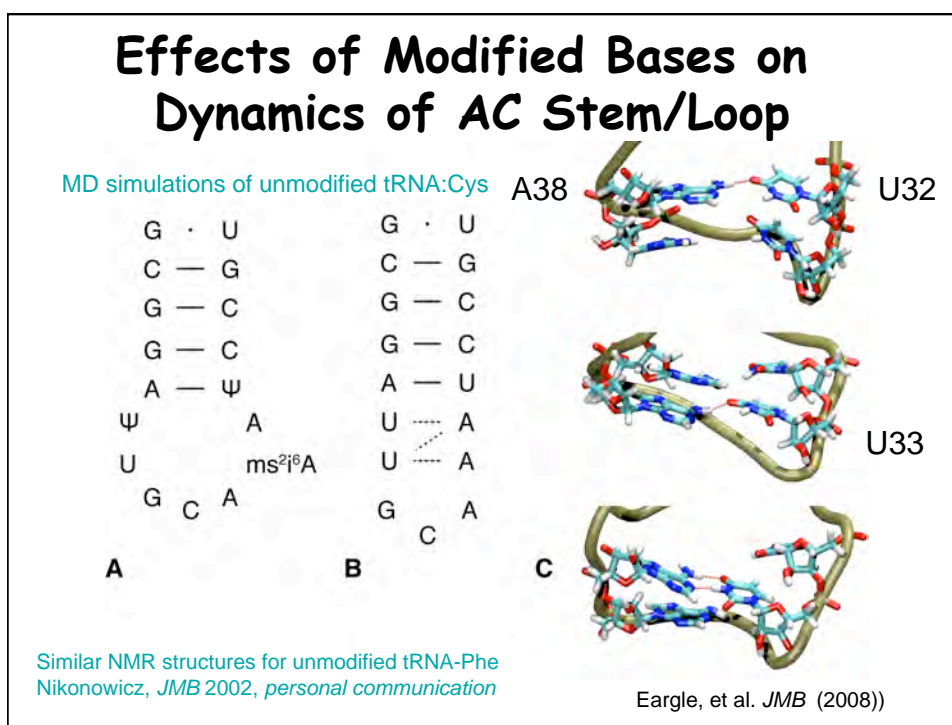
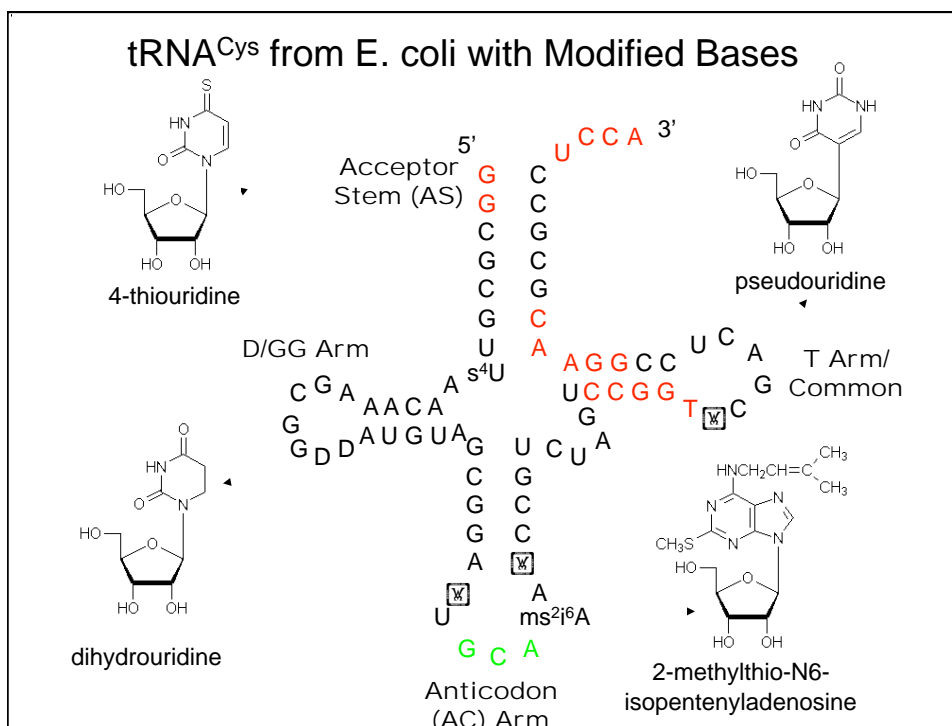
[illegible]

## Dynamical Recognition EF-Tu/tRNA (E.coli)

## Combining MD with Evolutionary Analysis (MultiSeq)

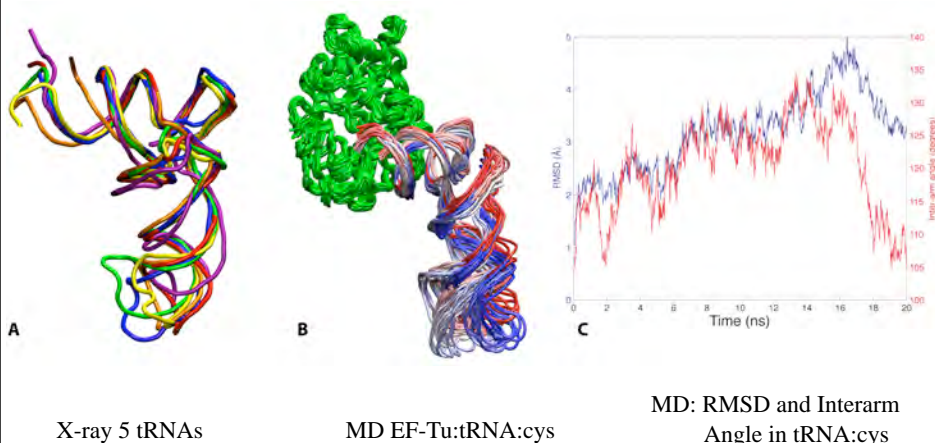


*J. Eargle, A. Sethi, A. Black, L. Trabuco & Z. Luthey-Schulten. JMB  
"Dynamics of Recognition in EF-Tu/tRNA Complex" (2008)*



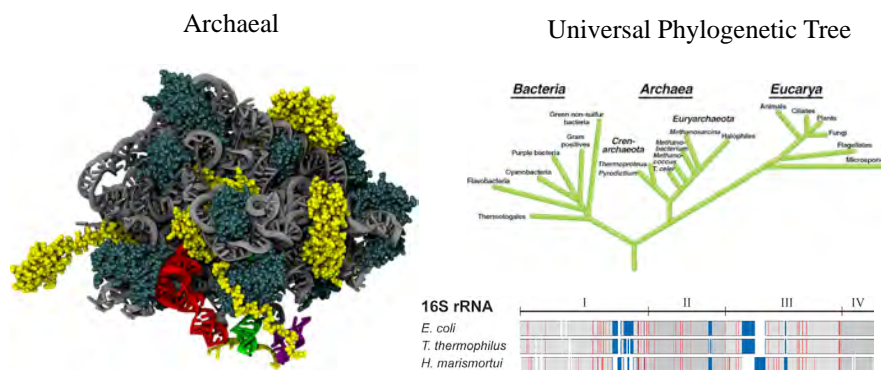


## Flexibility in tRNA structures observed in crystallography and simulations



*JMB 2008 & FEBS Let. 2010*

## Molecular Signatures in Ribosome Evolution

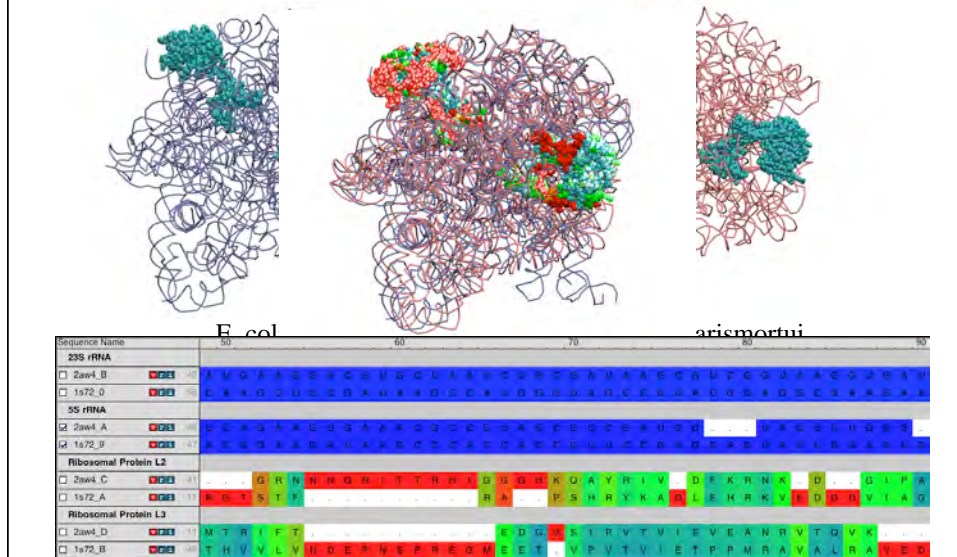


Dynamical function of ribosomal signatures: idiosyncrasies in ribosomal RNA and/or proteins characteristic of the domains of life

Roberts, Sethi, Montoya, Woese, Luthey-Schulten (2008) *PNAS* 105:13953  
 Chen, Eargle, Sarkar, Gruebele, Luthey-Schulten (2010) *Biophysical Journal*

## Structural Overlaps with STAMP

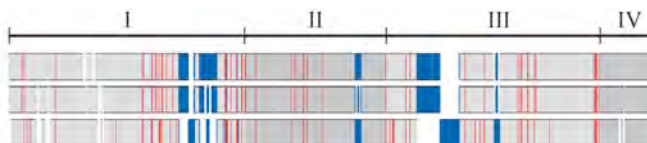
Comparing ribosomal large subunit with r-proteins L2 and L3  
180,000 atoms in 4 rRNAs and 58 proteins



# Sequence and Structure Signatures in Ribosomal RNA

16S rRNA

*E. coli*  
*T. thermophilus*  
*H. marismortui*

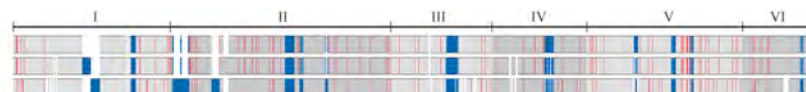


## Ribosomal Signatures: Idiosyncrasies in rRNA and/or rproteins characteristic of the domains of life

69 ( 119) & 6 (14) in 16S ( 23S)

**23S rRNA**

*E. coli*  
*T. thermophilus*  
*H. marismortui*

Roberts, Montoya, Sethi, Woese, ZLS, *PNAS* 2008

## Signature analysis

- Signatures are sequence and/or structural features that are characteristic of a domain of life\*.
- Identify the sequence signatures in the 16S rRNA and proteins using MultiSeq
- MultiSeq has a coloring based on signatures, but use Scripts to collect quantitative data about the signatures: position, composition.
- Signature analysis can be applied to any set of sequences/groupings

\* E. Roberts, A. Sethi, J. Montoya, C. Woese, Z. Luthey-Schulten (2008) *PNAS*

## Signature analysis script

```
proc get_taxa_signatures {args} {
    initializeMultiSeqEnvironment

    # Load the alignment.
    set sequenceIDs [::SeqData::Fasta::loadSequences $alignmentFilename]

    # Find the reference species.
    set refSequenceIDs {}
    foreach species $referenceSpecies {
        set found 0
        foreach sequenceID $sequenceIDs {
            if {[string toupper [::SeqData::getScientificName $sequenceID]] == [string toupper $species]} {
                lappend refSequenceIDs $sequenceID
                set found 1
                break
            }
        }
    }

    # Group the sequence ids.
    array set groupData {names {}}
    foreach sequenceID $sequenceIDs {
        set group ""
        if {$rankName == "domain"} {
            set group [::SeqData::getDomainOfLife $sequenceID]
        } else {
            set group [::SeqData::getLineageRank $sequenceID $rankName]
        }
        if {[info exists groupData($group)]} {
            lappend groupData($group) $sequenceID
        } else {
            set groupData($group) {}
            lappend groupData($group) $sequenceID
        }
    }
}
```

## Signature analysis script (cont)

```
# Calculate the signatures for the groups.
set signatures [::SeqEdit::Metric::Signatures::calculateSignatures $sequenceGroups $groupConsensusCutoff \
    $otherGroupMaxCutoff $otherGroupMaxGapFraction $maxConservedBlockDistance $minConse]

# Print the signatures.
puts ""
puts "Ordered Signatures"
printSignatureHeader $groups $refSequenceIDs
for {set position 0} {$position < [llength [lindex $signatures 0]]} {incr position} {

    # Get the signature for each of the groups.
    set isSignature 0
    for {set groupIndex 0} {$groupIndex < [llength $groups]} {incr groupIndex} {
        set groupSignature [lindex [lindex $signatures $groupIndex] $position]
        if {[string length $groupSignature] == 1} {
            set isSignature 1
        }
    }

    if {$isSignature} {
        printSignatureLine $position $groups $refSequenceIDs $signatures $sequenceGroups
    }
}
}
```

## Signature analysis script (cont)

```
proc getCompositionString {sequenceIDs position} {

    # Go through each group to count the elements.
    array set counts {values {}}
    foreach sequenceID $sequenceIDs {
        set element [::SeqData::getElement $sequenceID $position]
        if {[info exists counts($element)]} {
            lappend counts(values) $element
            set counts($element) 1
        } else {
            incr counts($element)
        }
    }

    set ret ""
    foreach element $counts(values) {
        set percentage [expr round(100.0*double($counts($element))/double([llength $sequenceIDs]))]
        if {$percentage > 5} {
            if {$ret != ""} {
                append ret "/"
            }
            append ret "${element}($percentage%)"
        }
    }

    return $ret
}
```

# Signature script output

Ordered Signatures					
Pos	E._coli	T._therm	H._maris	Archaea	Bacteria
35	33	33	27	U(28%)/C(72%)	*A(96%)
42	39	39	33	*U(100%)	*G(95%)
51	47	47	42	*G(97%)	C(85%)/U(7%)/G(8%)
59	53	53	49	*C(100%)	A(83%)/G(14%)
222	113	106	87	*C(100%)	*G(95%)
661	248	243	227	*G(97%)	C(75%)/G(9%)/U(11%)
749	314	309	293	*G(100%)	*C(97%)
753	317	312	296	*G(97%)	*U(91%)/G(7%)
777	338	333	317	*G(97%)	A(89%)/N(9%)
779	339	334	318	*G(97%)	*C(98%)
780	340	335	319	*C(94%)	*U(92%)/A(6%)
790	349	344	328	G(86%)/N(11%)	*A(92%)
791	350	345	329	C(67%)/U(19%)/N(11%)	*G(98%)
800	358	353	337	*G(100%)	*U(91%)/C(7%)
802	359	354	338	*C(97%)	G(59%)/U(9%)/C(9%)/A(20%)
804	361	356	340	*C(94%)	G(84%)/A(14%)
809	365	360	344	*A(92%)/U(8%)	*U(97%)
811	367	362	346	C(83%)/G(14%)	*U(97%)
823	377	372	356	C(89%)/U(11%)	*G(92%)
833	386	381	365	*G(94%)	C(89%)/U(6%)
840	393	388	372	G(83%)/C(14%)	*A(97%)
851	403	398	382	*A(100%)	C(89%)
920	447	441	416	C(31%)/U(67%)	*G(92%)
990	487	471	424	G(89%)/A(8%)	*A(91%)
1083	508	491	446	*A(97%)	*U(92%)
1085	510	493	448	*G(97%)	*A(97%)
1087	512	495	450	*C(92%)/U(8%)	*U(97%)
1089	514	497	452	*G(92%)/N(6%)	C(89%)/U(8%)
1101	523	506	461	*C(94%)/A(6%)	*A(96%)
1119	537	520	475	*C(100%)	*G(91%)/A(8%)
1121	539	522	477	*G(92%)/A(6%)	A(89%)/G(10%)
1134	549	532	487	*U(94%)	*C(99%)

## Draw signature figure

- Want to create a graphical representation of the signatures.
- Can use the TCL graphics object to draw figures.

```

proc draw_one_d_alignment {args} {
    # Load the alignment.
    set alignment [::SeqData::Pasta::loadSequences $alignmentFilename]
    set numberSequences [llength $alignment]
    set numberPositions [::SeqData::getSeqLength [lindex $alignment 0]]
    puts "Loaded $numberSequences sequences of length $numberPositions"

    # Create the drawing canvas.
    set canvasWidth [expr $draw(xBorder)+($numberPositions*$draw(positionWidth))+$draw(xBorder)]
    set canvasHeight [expr $draw(yBorder)+($numberSequences*$draw(sequenceHeight))+(($numberSequences-1)*\
        $draw(sequenceSpacing))+$draw(yBorder)]
    set g [canvas .drawing -width $canvasWidth -height $canvasHeight]

    # Draw the alignment.
    for {set i 0} {$i < $numberSequences} {incr i} {
        set sequenceID [lindex $alignment $i]
        set y1 [expr $draw(yBorder)+($i*$draw(sequenceHeight))+$draw(sequenceSpacing)]
        set y2 [expr $y1+$draw(sequenceHeight)]
        drawSequencePositions $g $draw(xBorder) $y1 $y2 $sequenceID 0 [expr $numberPositions-1] \
            $draw(positionWidth) $draw(sequenceColor) $dra
    }

    # Save the canvas.
    $g postscript -x 0 -y 0 -width $canvasWidth -height $canvasHeight -file $outputFilename

    cleanupMultiSeqEnvironment
}

```



## Draw signature figure (cont)

```

proc drawSequencePositions {g x y1 y2 sequenceID firstPosition lastPosition positionWidth sequenceColor borderColor
                           borderWidth}
{
    set startPosition ""
    for {set j $firstPosition} {$j <= $lastPosition} {incr j} {
        set element [::SeqData::getElement $sequenceID $j]

        # If this is the beginning of a sequence block, record that one started.
        if {$element != "-" && $startPosition == ""} {
            set startPosition $j
        }

        # If this is the end of a sequence block, draw the block.
        if {($element == "-" || $j == $lastPosition) && $startPosition != ""} {
            if {$element == "-"} {
                set endPosition [expr $j-1]
            } else {
                set endPosition [expr $j]
            }
            set x1 [expr $x+($startPosition*$positionWidth)]
            set x2 [expr $x+($endPosition+1)*$positionWidth]
            $g create rectangle $x1 $y1 $x2 $y2 -fill $sequenceColor -outline $sequenceColor -width $borderWidth
            $g create line $x1 $y1 $x2 $y1 -fill $borderColor -width $borderWidth
            $g create line $x1 $y2 $x2 $y2 -fill $borderColor -width $borderWidth
            set startPosition ""
        }
    }
}

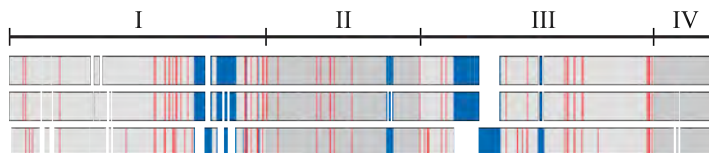
```

### 16S rRNA

*E. coli*

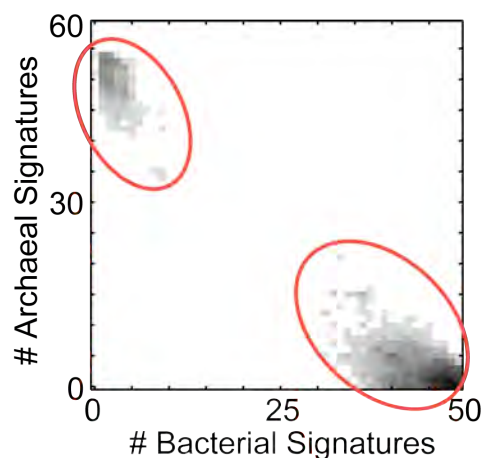
*T. thermophilus*

*H. marismortui*



## 90,000 Environmental 16S rRNA Distinct A & B Sequence Signatures

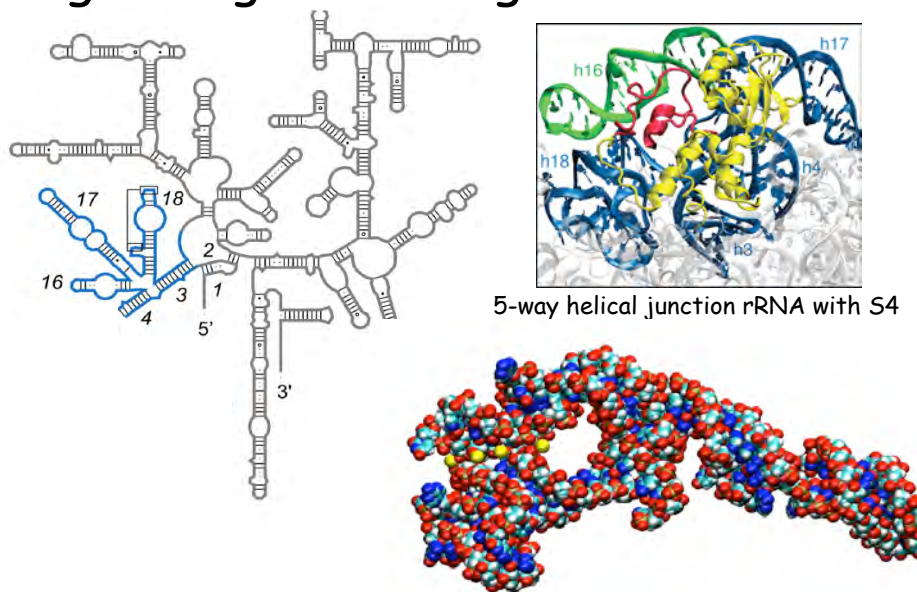
- Analysis of the ribosomal signatures in 90,000 new environmental samples shows that no “gray” area exists: a ribosome is either bacterial or archaeal in nature.
- Split across cluster: 10,000 sequence on each node



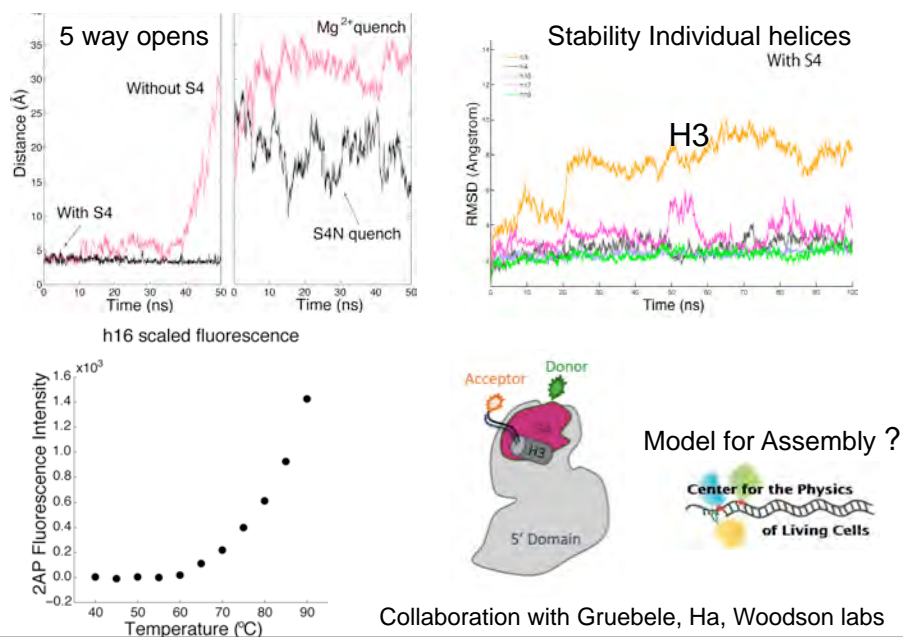
Roberts, et al. *PNAS* 2008

Data: “Greengenes”, Lawrence Berkeley

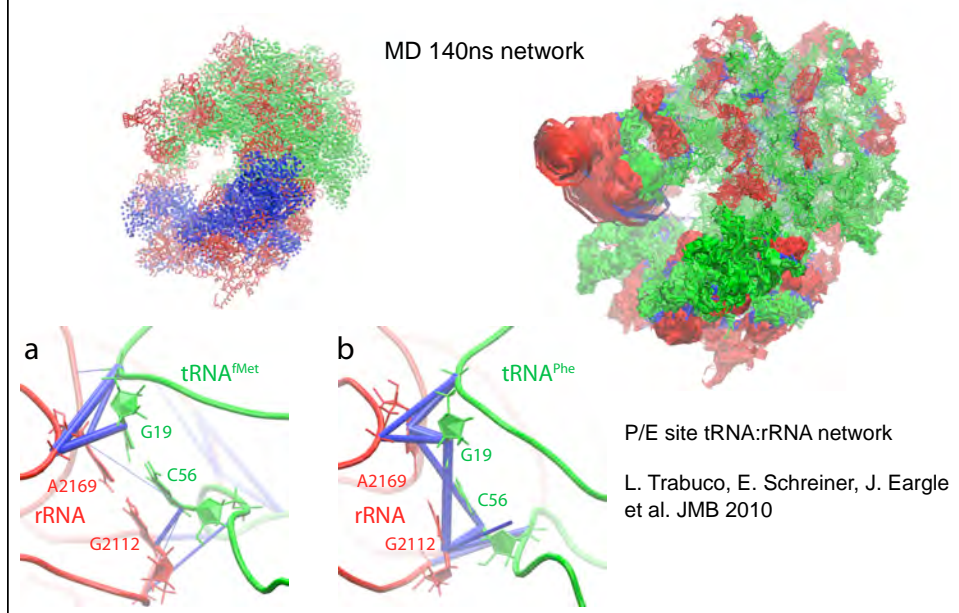
## Largest signature region in the SSU



## Stability of 5-way junction helices with/without S4



# Signaling Networks in LSU & SSU



## New Tools in VMD/MultiSeq

Protein / RNA  
Sequence Data

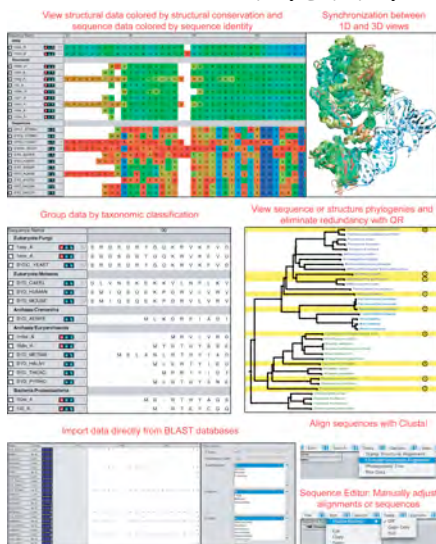
SwissProt DB (400K),  
Greengenes RNA (100K)  
Signatures, Zoom

Metadata Information,  
Clustal &  
Phylogenetic Trees

RAXml Trees,  
Genomic Content,  
Temperature DB

Blast & PsiBlast

Sequence Editor



Sequence /Structure  
Alignment

Protein & RNA  
secondary structure

QR non-redundant  
seq / str sets

Cluster  
analysis /  
Bioinformatics  
scripting  
Tutorials MultiSeq/  
AARS  
EF-Tu/Ribosome

J. Eargle, D. Wright, Z. Luthey-Schulten, *Bioinformatics*, 22:504 (2006)  
E. Roberts, J. Eargle, D. Wright, Z. Luthey-Schulten, *BMC Bioinformatics*, 7:382 (2006)

## VMD/MultiSeq Tutorials

1. Evolution of Translation: AARS:tRNA
2. Evolution of Translation: EF-Tu:tRNA
3. Evolution of Translation: Ribosome
4. Dynamical Network Analysis
5. Participant's project

## Acknowledgements

### Collaborators

**Carl Woese**  
Mike Heath

Martin Gruebele  
Taekjip Ha  
Sarah Woodson  
Susan Martinis  
Wen-Mei Hwu  
John Stone  
Julio Ortiz, W. Baumeister



### Students/Postdocs

Alexis Black  
**Ke Chen**  
**John Eargle**  
**Li Li**

Piyush Labhsetwar  
Jonathan Montoya  
**Elijah Roberts**  
**Anurag Sethi**  
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NIH Resource for Macromolecular Modeling and Bioinformatics, Beckman  
Institute, UIUC – John Stone, Kirby Vandivort

***Part III Towards in silico cells:  
Simulating processes in entire  
bacterial cells***

**See also Mcell**

**Fast Monte Carlo simulation methods  
for biological reaction-diffusion systems  
in solution and on surfaces**

RA Kerr, TM Bartol, B Kaminsky, M Dittrich, JC Chang, SB  
Baden, TJ Sejnowski, and JR Stiles

*SIAM J Sci Comput* 30,3126 (2008)