

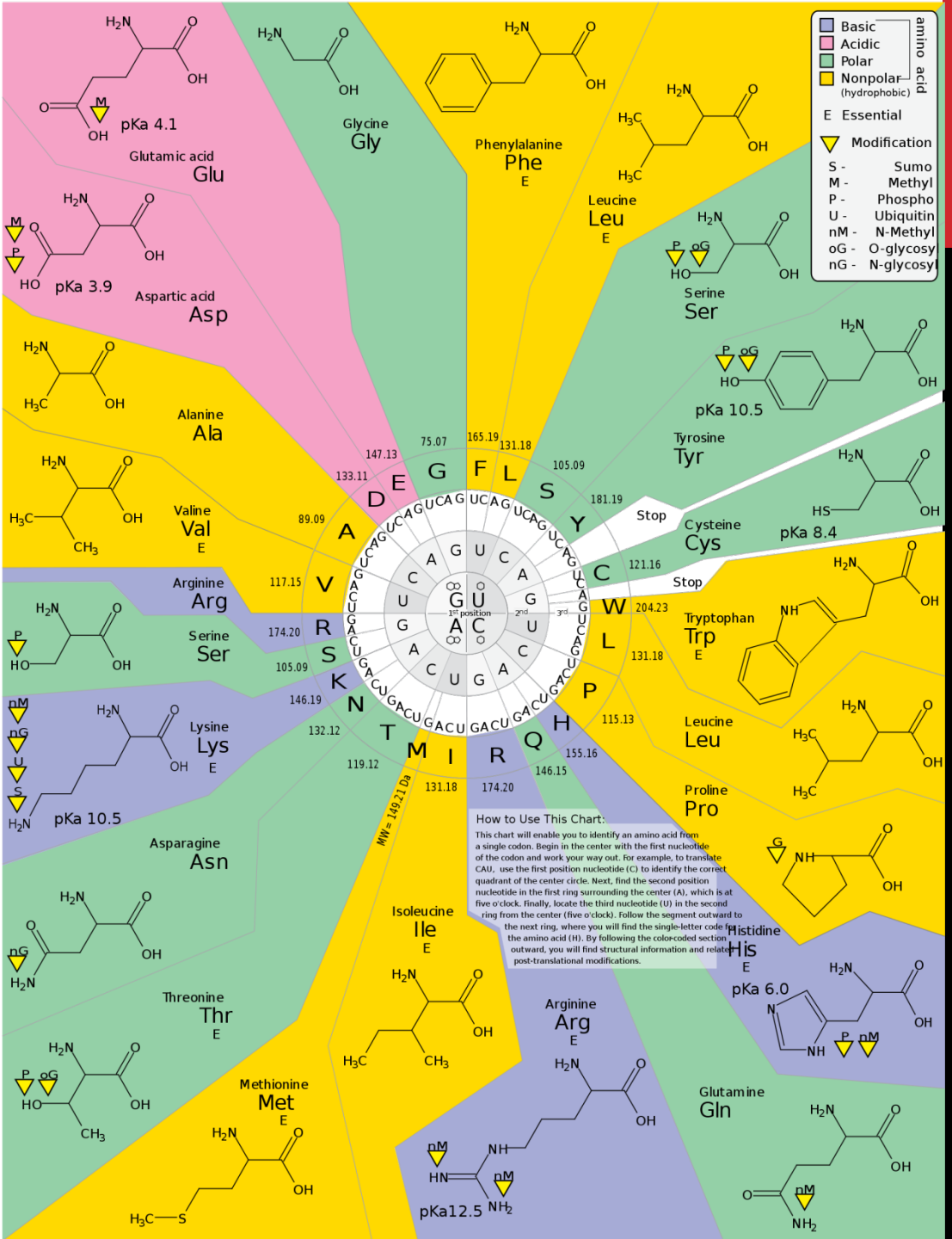
SYSTEMATIC FUNCTIONAL PRIORITIZATION OF PROTEIN POSTTRANSLATIONAL MODIFICATIONS

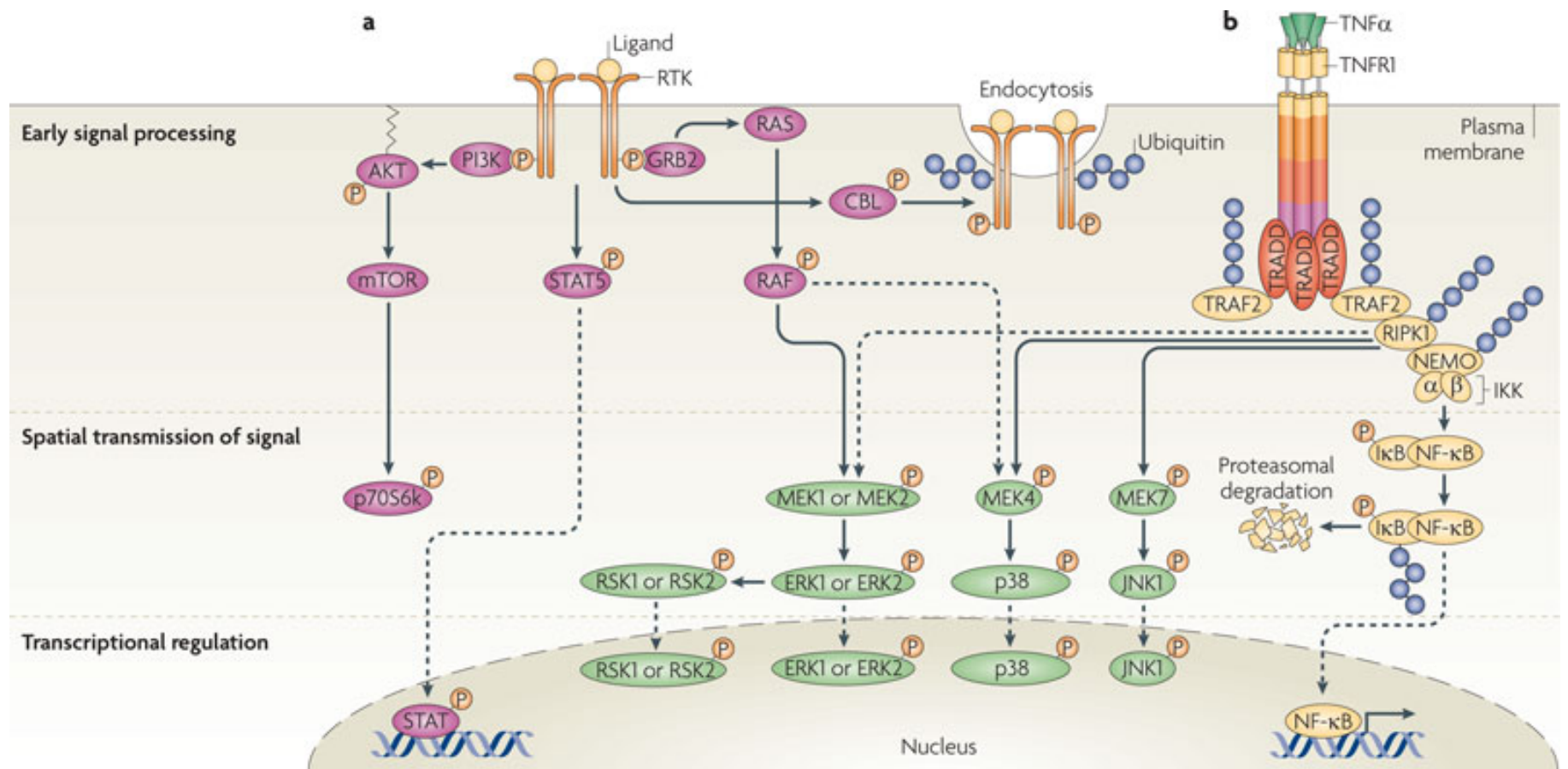
TECHNICAL JOURNAL CLUB – TUE, 23TH JULY 2013

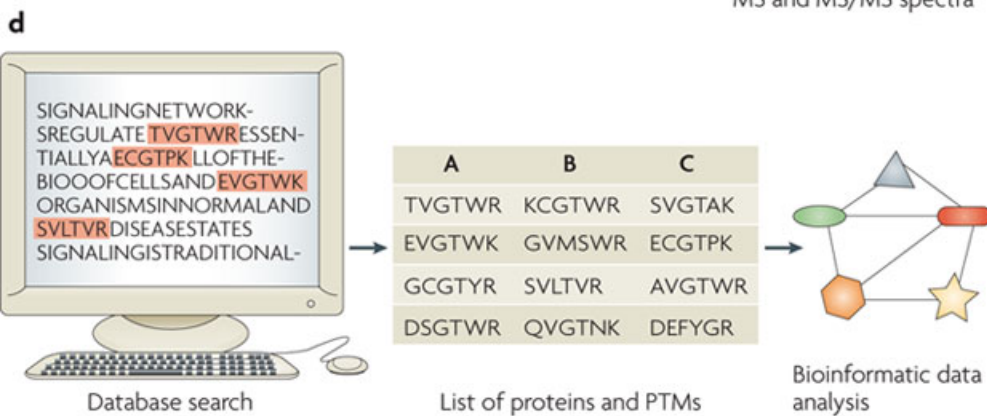
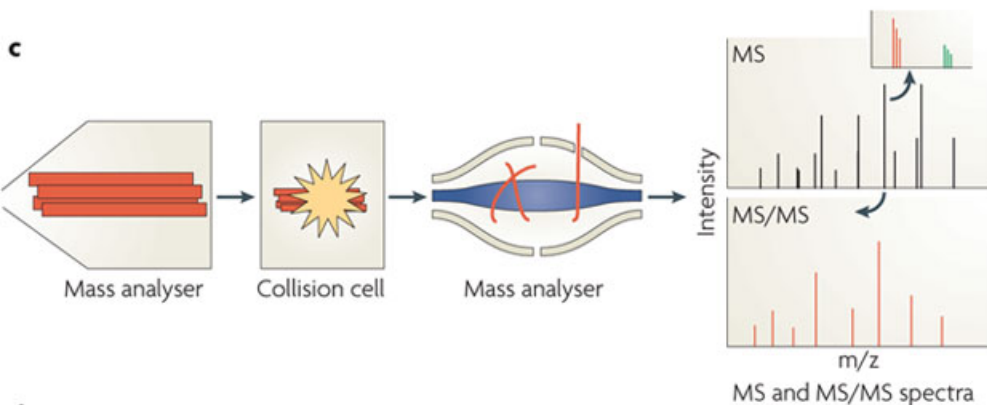
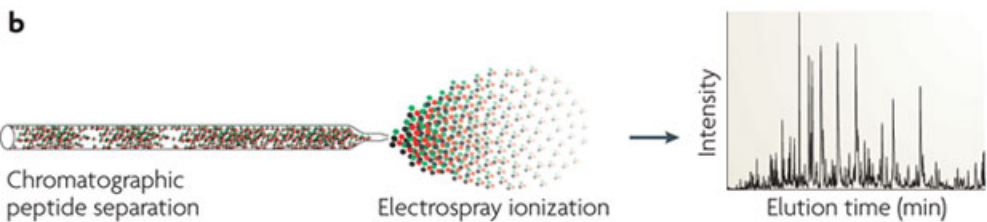
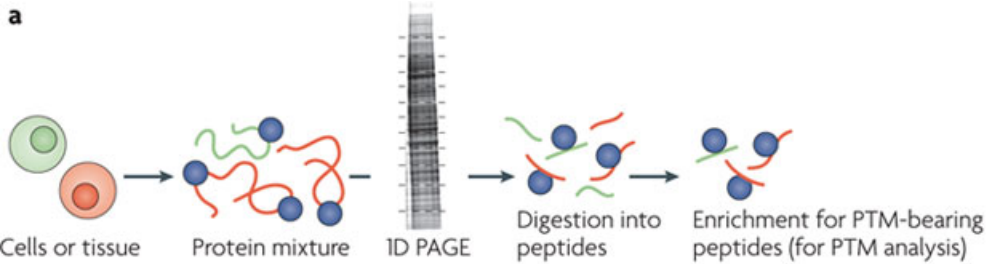
KARL FRONTZEK, INSTITUTE OF NEUROPATHOLOGY

PROTEIN POSTTRANSLATIONAL MODIFICATIONS (PTM)

Gramatikoff K. in Abgent Catalog (2004-5) p.263







PTM	Mass shift (Δm ; Da)*	Enrichment methods	Largest MS study [†]
Phosphorylation	79.96633	IMAC, TiO ₂ and antibodies	20,443 sites ⁵⁴
Acetylation	42.01056	Pan anti-acetyl-Lys antibodies	3,600 sites ⁵⁰
Ubiquitylation (diGly tag)	114.04292	Tagged ubiquitin	110 sites ⁵⁹
Methylation	14.01565	Anti-methyl-Lys or anti-methyl-Arg antibodies	59 sites ⁵⁵
o-GlcNac	203.07937	Lectin	141 sites ¹²⁴

EVOLUTION OF PHOSPHOSITES

- **phosphosites were shown to be under evolutionary constraint because they are having key roles in protein function**

Boekhorst et al. Genome Biol 2008

Gnad et al., Genome Biol 2007

- **but at the same time a lot of phosphosites were found with a more rapid evolutionary turnover or unknown function (i.e. unspecific phosphorylation <> non-functional phosphorylation)**

Ubersax&Ferrell Jr, Nat Rev Mol Cell Biol 2007

Lienhard, Trends Biochem Sci 2008

Malik et al., Bioinformatics 2008

Weak functional constraints on phosphoproteomes

Christian R. Landry*, Emmanuel D. Levy* and Stephen W. Michnick

Volume 25, Issue 5, May 2009, Pages 193–197

Scientific question:

Does the phosphoproteome (here pS/pT) have a slower evolutionary turnover than the non-phosphorylated proteome (here S/T)?

1. Mapping phosphosites on proteomes

Phosphosites were compiled from several phosphoproteomic experiments and databases (Table S1)

2. Reconstructing ancestral sequences by ML

Alignment of orthologous proteins

Species 1
Species 2
Species 3
.
Species n

Determine ancestral sequences at internal node of the phylogeny

Infer oldest possible age of pS/pT by the oldest node containing S or T.

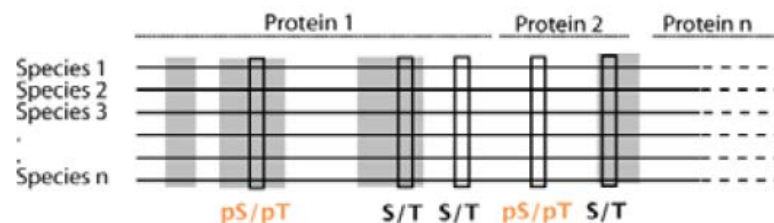
Compare age of pS/pT with age of S/T

3. Mapping unstructured regions on proteomes

Disorder was predicted using DISOPRED

4. Compute the relative evolutionary rates of all residues in the proteomes

Concatenation of all proteins in the proteomes and estimation of relative evolutionary rates using rate4site

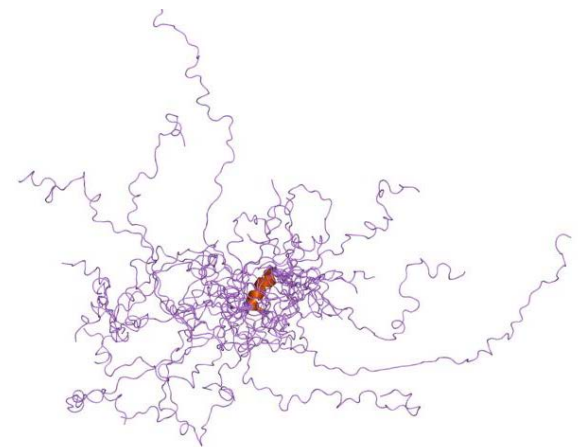


■ Disorder

pS/pT Serines and threonines phosphorylated in species 1

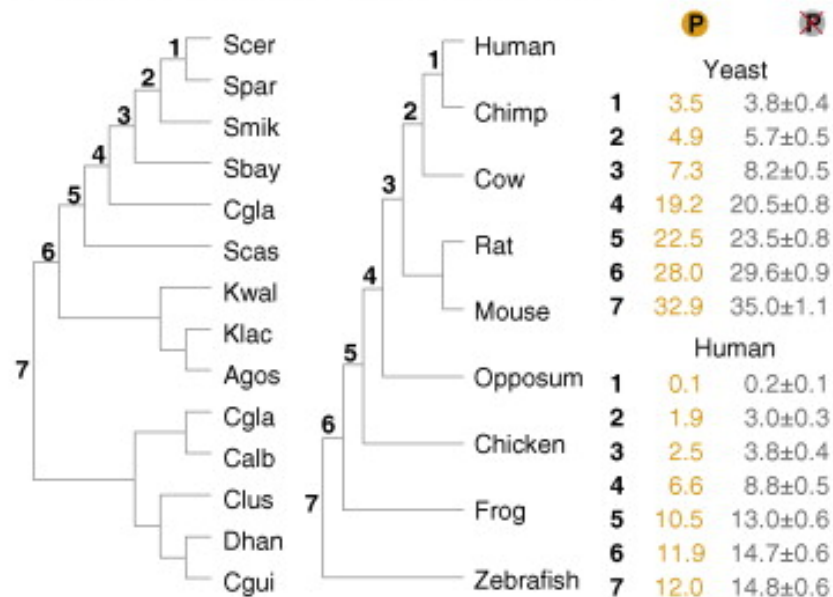
S/T Serines and threonines not phosphorylated in species 1

The rate of evolution of pS/pT positions is compared to **equivalent** S/T positions. Equivalence is achieved by sampling proteins with probability proportional to their number of phosphosites (Sup Methods). The fractions of serines, threonines and disordered regions are also preserved.

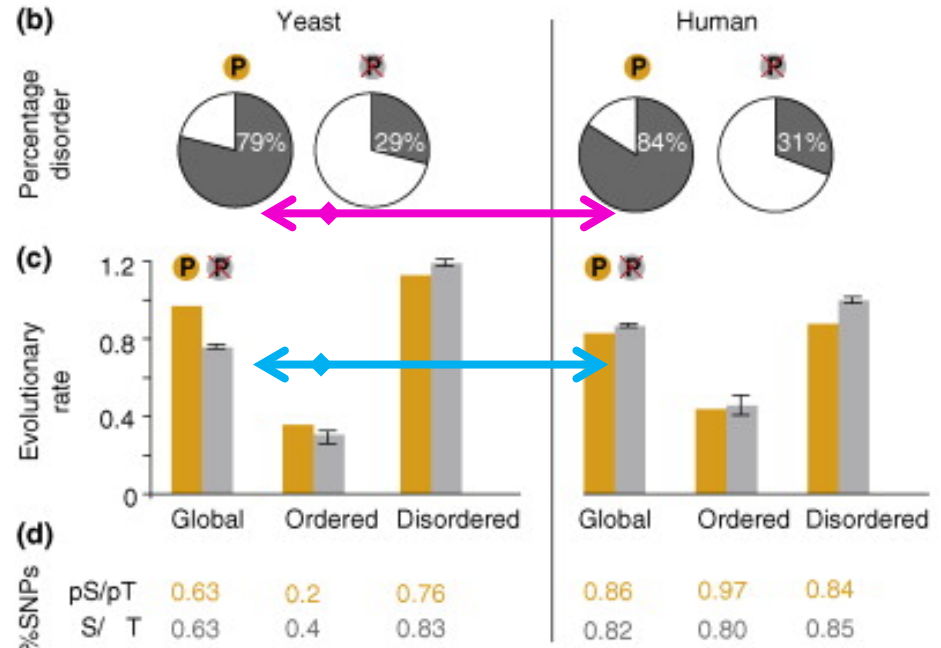


Song et al. Biochemistry 2006

(a) Percentage residues that appeared at each node



(b)

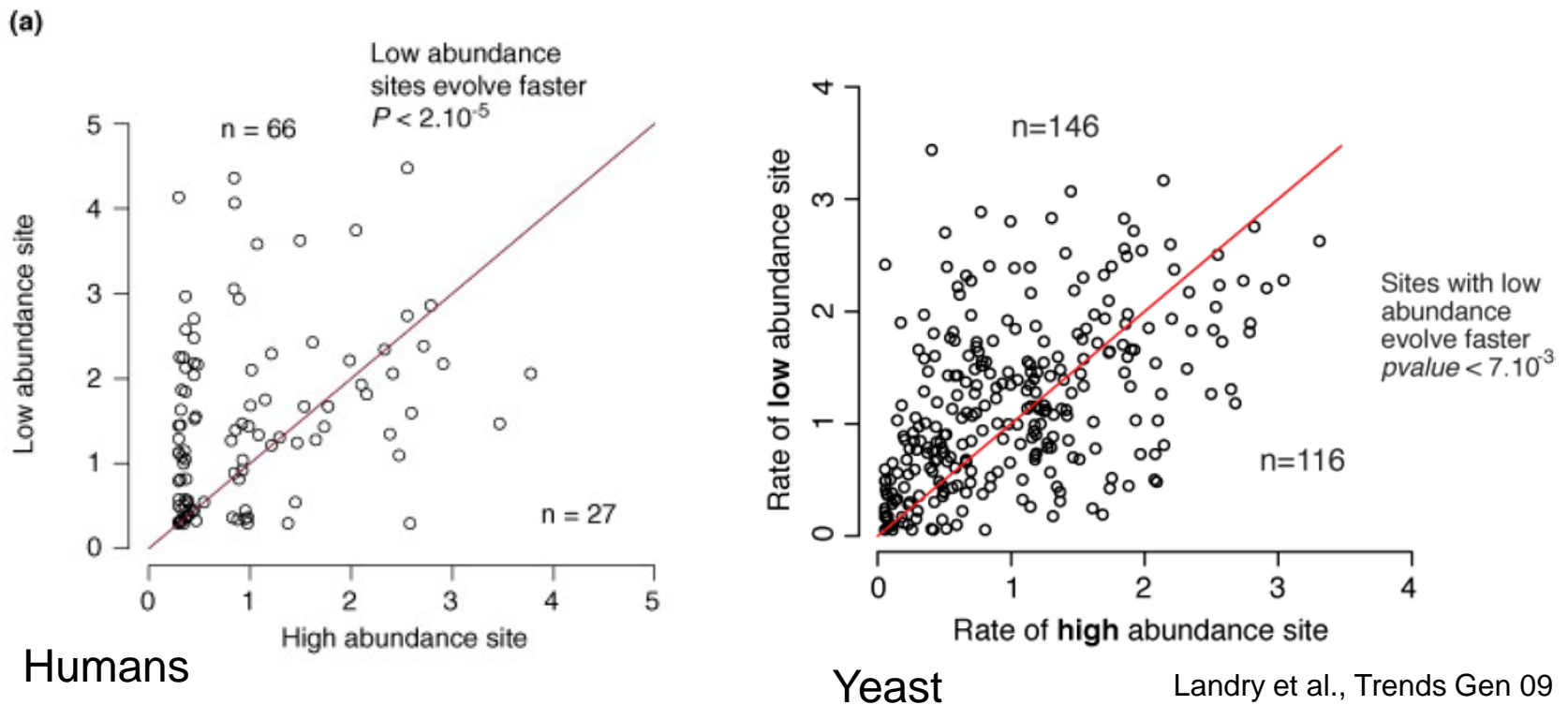


Key: **P** S and T known to be phosphorylated
R S and T not known to be phosphorylated; sampled in same proportion, numbers and proteins

Landry et al., Trends Gen 09

HOW MANY NON-FUNCTIONAL PHOSPHOSITES ARE THERE? #1

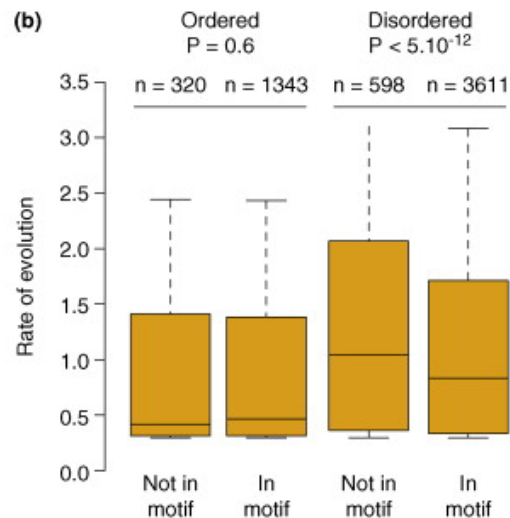
1st assumption: non-functional phosphorylations are likely to represent off-target interactions >> rare molecular events >> should have lower abundance than (stoichiometrically) higher phosphorylated sites



HOW MANY NON-FUNCTIONAL PHOSPHOSITES ARE THERE? #2

2nd assumption: if rapidly evolving sites results from non-functional (supposedly non-specific) phosphorylation events

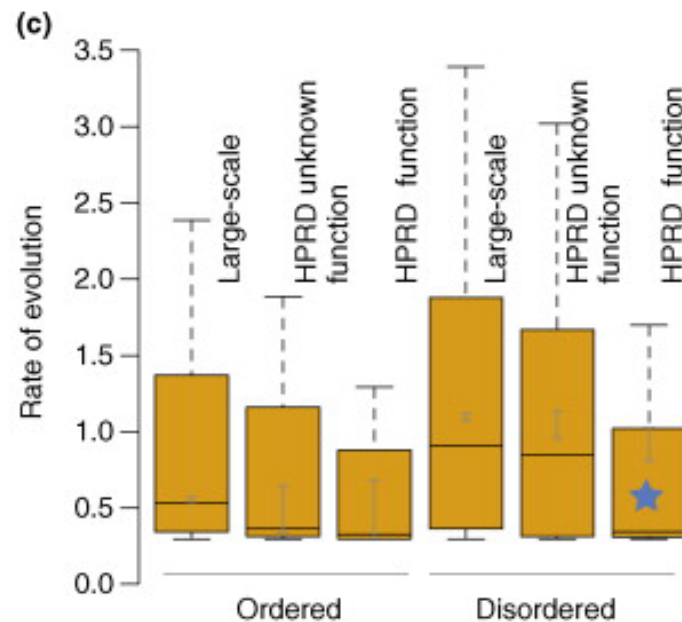
>> underrepresentation in common protein kinase recognition motifs



Humans

HOW MANY NON-FUNCTIONAL PHOSPHOSITES ARE THERE? #3

Last assumption: phosphosites with assigned function (e.g. site-directed mutagenesis and functional assay) evolve slower than those without assigned function



Humans

CONCLUSIONS

1) **Phosphoproteomes evolve at a similar rate to that of non-phosphorylated residues**

Possible explanations:

- Most phosphosites occur in disordered regions and these evolve rapidly
- The experimental setups used to characterized those site are highly sensitive and detect a fraction of non-functional sites

2) **For assessment of potentially meaningful (i.e. functional) phosphosites, more information about the protein should be taken into consideration, like**

- Kinase recognition motifs
- Abundance of phosphosites

Comparative Analysis Reveals Conserved Protein Phosphorylation Networks Implicated in Multiple Diseases

Science Signaling

AAAS

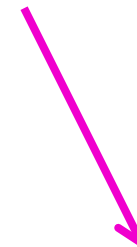
Chris Soon Heng Tan,^{1,2*} Bernd Bodenmiller,^{3*} Adrian Pasculescu,¹ Marko Jovanovic,⁴ Michael O. Hengartner,⁴ Claus Jørgensen,¹ Gary D. Bader,^{1,2} Ruedi Aebersold,^{3,5,6,7} Tony Pawson,^{1,2} Rune Linding^{8†}

(Published 28 July 2009; Volume 2 Issue 81 ra39)

Analysis of conservation of phosphoproteomes from high- & low-throughput mass-spectrometry in yeast (*S. cerevisiae*), fly (*D. melanogaster*) and worm (*C. elegans*) with human reference set

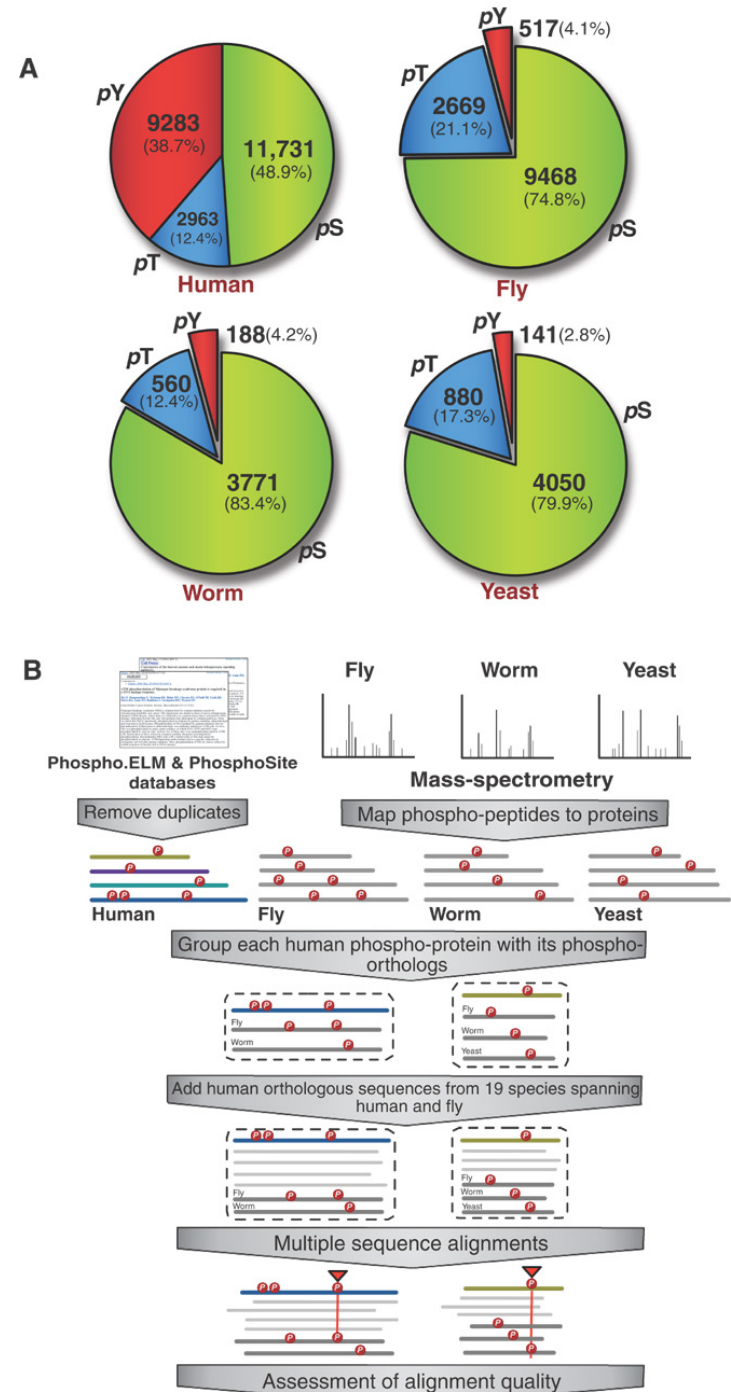


positionally conserved sites



conserved kinase-substrate interactions (not necessarily positionally conserved)

Workflow of the study (similar MS and computational alignment pipelines throughout the groups)



Conserved Phosphorylation Sites

Total number
of sites

S

T

Y

23977

11731

2963

9283

- Human phosphorylated residues

13008

6099

1569

5340

- Human phosphorylated residues in proteins with **orthologs** in at least one target species

9517

4720

1202

3595

- Human phosphorylated residues in proteins with **phosphoorthologs** in at least one target species

4448

1927

539

1982

- Human phosphorylated residues aligned to **phosphorylatable residues** in phospho-orthologs

616

451

105

60

- Human phosphorylated residues **aligned to phosphorylated residues** in phospho-orthologs

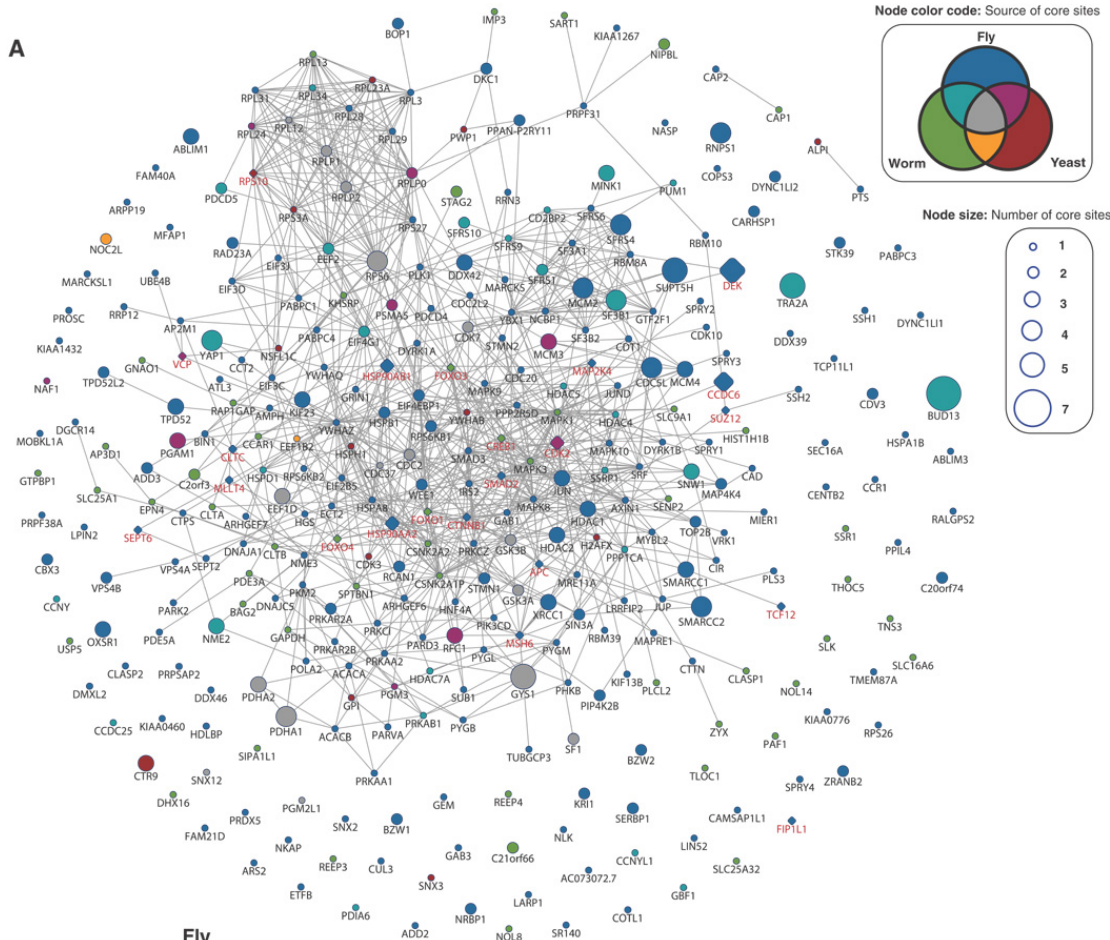
479

353

81

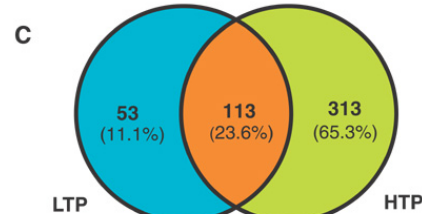
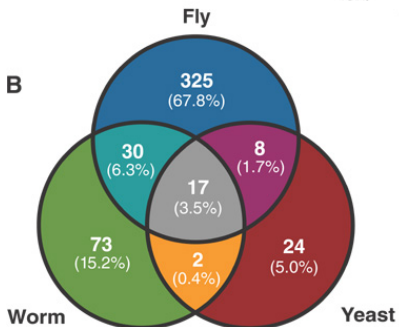
45

- Core sites: Human phosphorylated residues aligned to phosphorylated residues **after assessment of local sequence alignment (bootstrap analysis)**



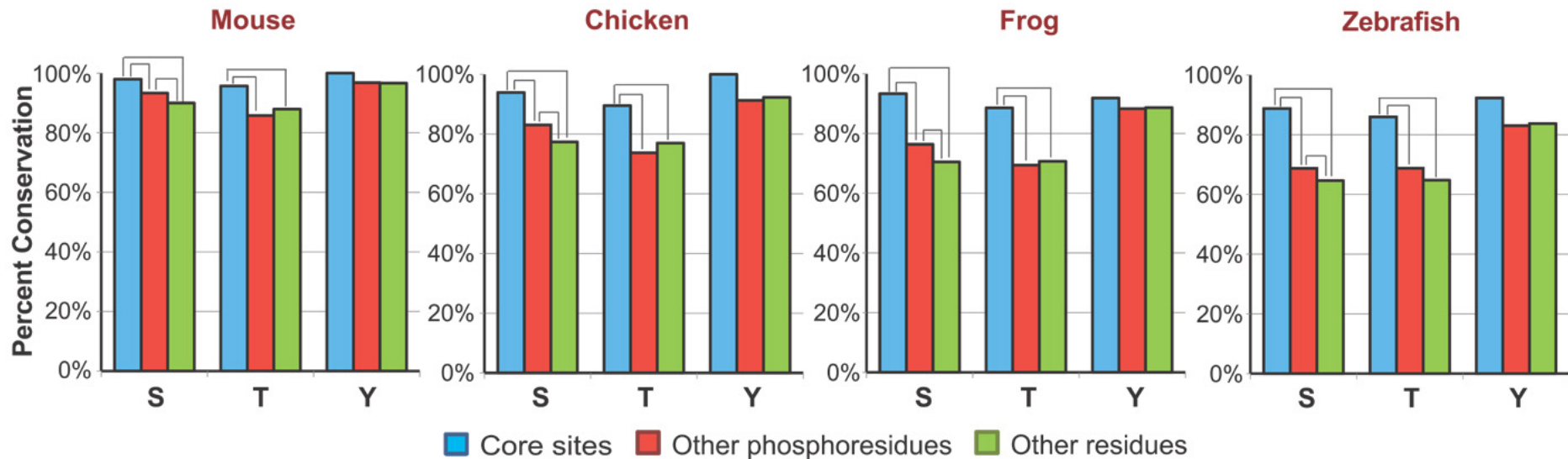
Conservation between compared species and human reference set, of all sites in 75 protein domain families:

- 57 at least in 2 target species
- 17 in all 3 target species



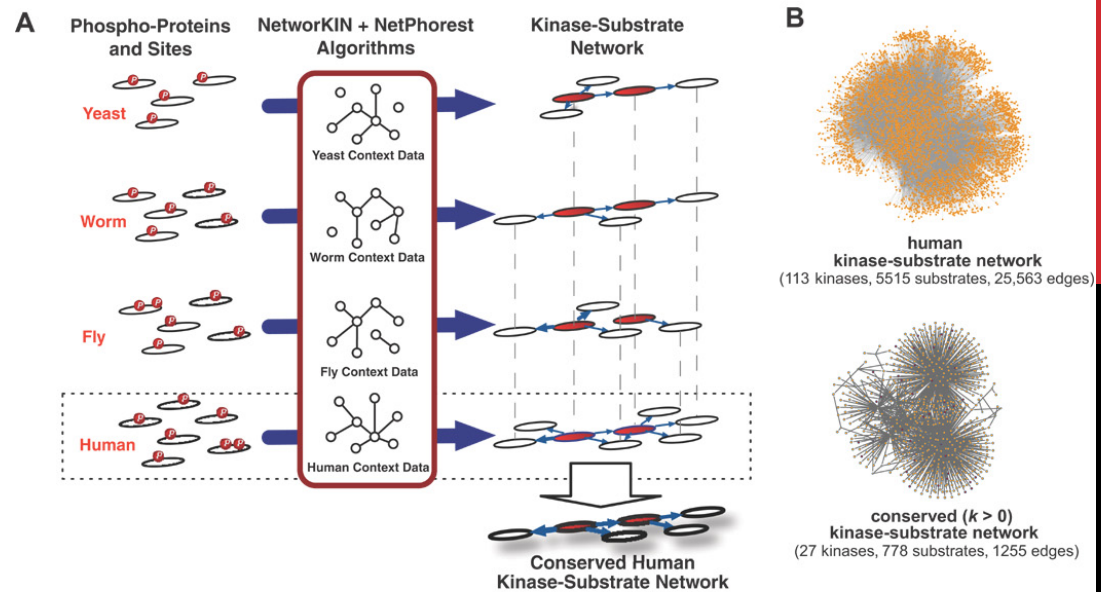
For kinase specificity, CDK1+CDK2 as well as casein kinase 2 were amongst most frequently predicted kinases

SEQUENCE HOMOLOGY IN OTHER SPECIES



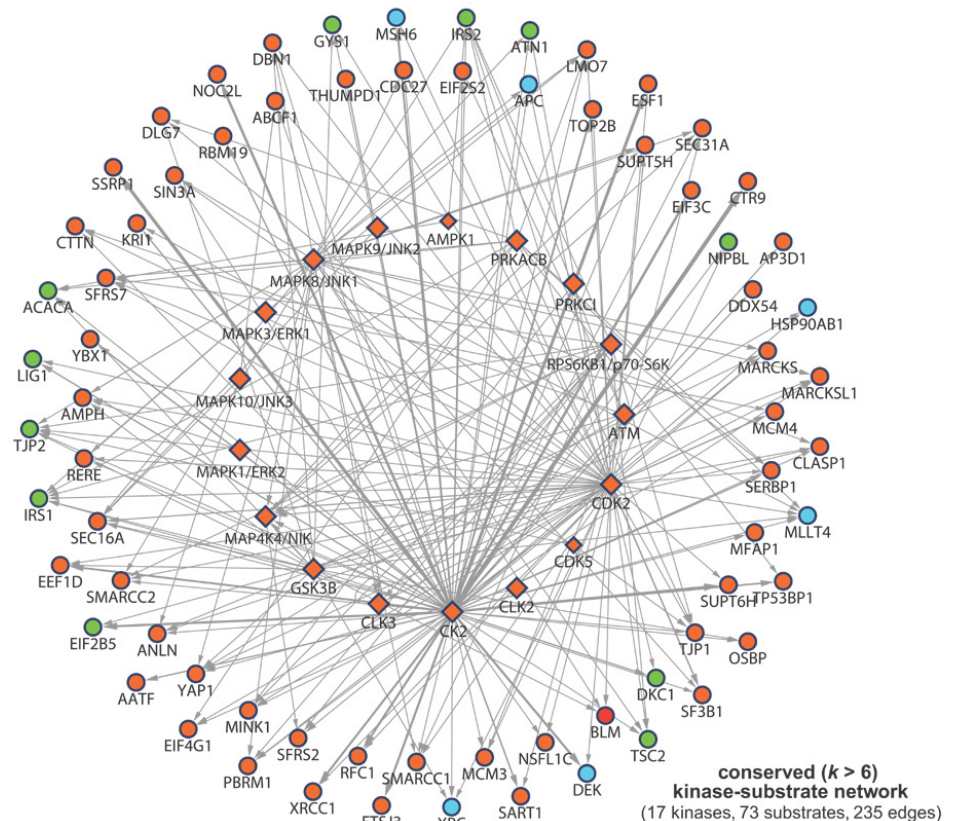
>> High rates of conservation concerning phosphorylated sequence motifs across species

CREATING A PHOSPHORYLATION-INTERACTION-NETWORK



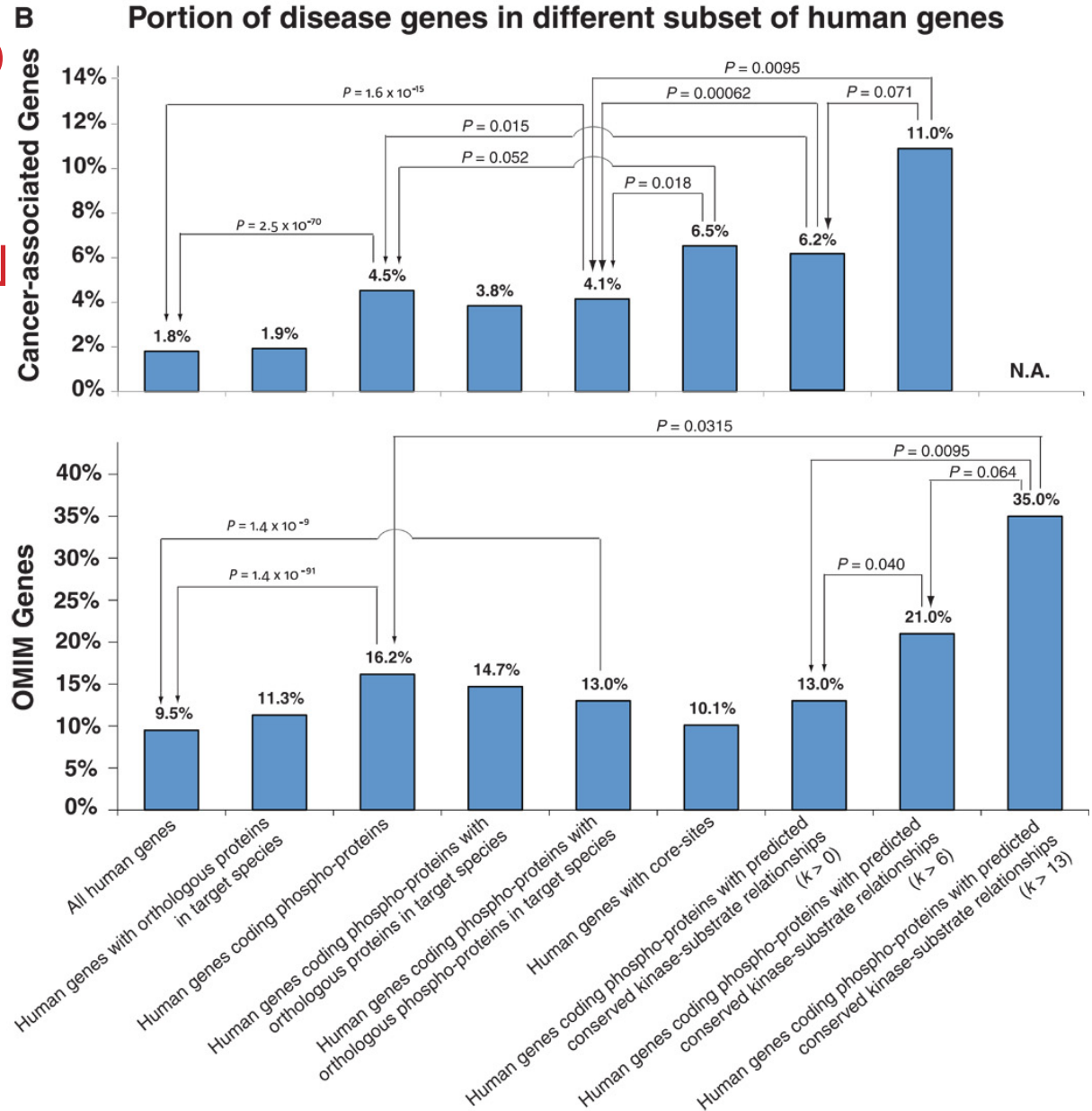
Randomized network analysis showed that those interactions were unlikely to have been occurring by chance

C



ENRICHED CORE-SITES/CONSERVED KINASE-SUBSTRATE RELATIONSHIPS IN CANCER GENES?

*Enriched genes
(amongst others)*
FOXO1,3,4
CREB1
SMAD2
HSP90



CONCLUSIONS

- ***Pro:*** Comparing phosphorylation patterns between humans (reference set) and multiple target species provides clues to dysregulated phosphorylation hubs in cancer and other human diseases
- ***Contra:*** no functional validation provided

Systematic Functional Prioritization of Protein Posttranslational Modifications

Pedro Beltrao,^{1,3,*} Véronique Albanèse,⁴ Lillian R. Kenner,^{1,3} Danielle L. Swaney,⁵ Alma Burlingame,^{2,3} Judit Villén,⁵ Wendell A. Lim,^{1,3,6} James S. Fraser,^{1,3} Judith Frydman,⁴ and Nevan J. Krogan^{1,3,7,*}

¹Department of Cellular and Molecular Pharmacology

²Department of Pharmaceutical Chemistry

University of California, San Francisco, San Francisco, CA 94107, USA

³California Institute for Quantitative Biosciences, QB3, San Francisco, CA 94107, USA

⁴BioX Program, Biology Department, Clark Center, Stanford, CA 94305, USA

⁵Department of Genome Sciences, University of Washington, Seattle, WA 98195, USA

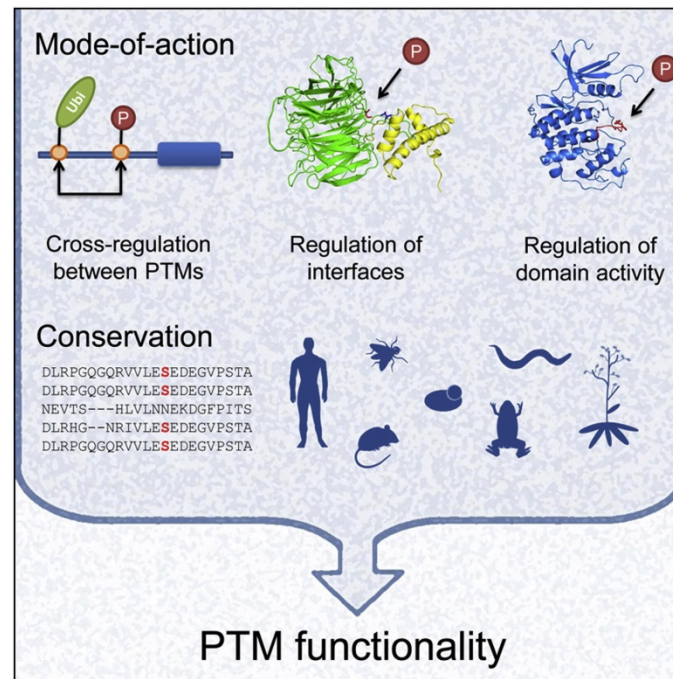
⁶Howard Hughes Medical Institute, University of California, San Francisco, San Francisco, CA 94158, USA

⁷J. David Gladstone Institute, San Francisco, CA 94158, USA

Scientific question: How to refine and identify functionally relevant protein posttranslational modifications (PTM) – «most significant bottleneck in proteomic studies of posttranslational modification»

SYSTEMATIC FUNCTIONAL PRIORITIZATION OF PROTEIN POSTTRANSLATIONAL MODIFICATIONS

- **Compilation of ~ 200.000 phosphorylation, acetylation and ubiquitination sites from 11 eukaryotic species (incl. *H. sapiens* and *M. musculus*)**
- **Experimental determination of ~ 2.500 ubiquitination sites for *S. cerevisiae***



DATA SETS

- Phosphorylation data set

3 fungi (*S. cerevisiae*, *Schizosaccharomyces pombe*, and *Candida albicans*)

2 plant species (*Arabidopsis thaliana* and *Oryza sativa*)

3 mammals (*Homo sapiens*, *Mus musculus*, and *Rattus norvegicus*)

+ *Xenopus laevis*, *Drosophila melanogaster*, and *Caenorhabditis elegans*

- 13,133 lysine acetylation sites

H. sapiens, *M. musculus* and *Drosophila melanogaster*

- 22,000 human ubiquitylation sites

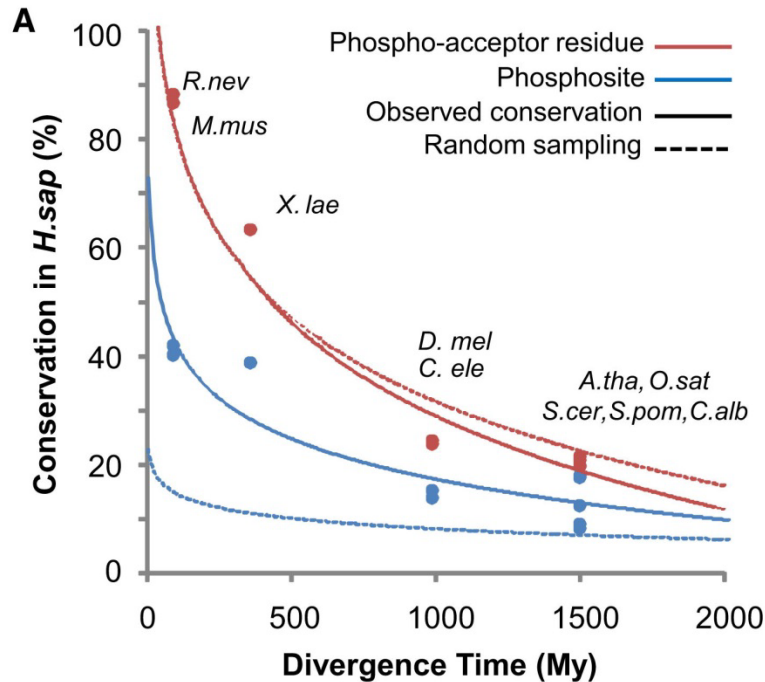
- MS approach to experimentally determine 2,500 ubiquitylation sites in *S. cerevisiae* to facilitate comparative studies.

Using a set of 12 different *S. cerevisiae* phosphoproteomics experiments, estimated false discovery rate < 4% of false-positive sites

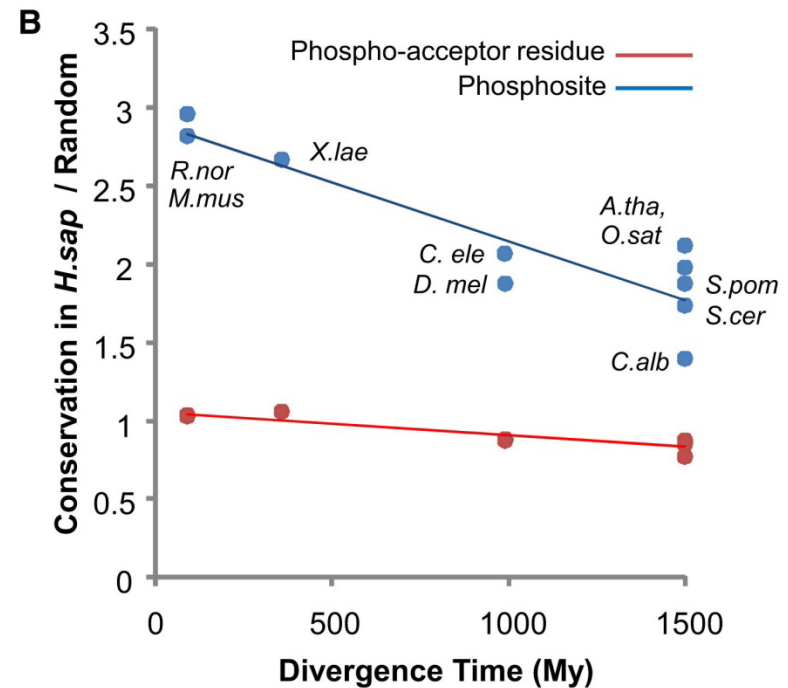
Human data set = reference data set

PHOSPHORYLATION DATA SET

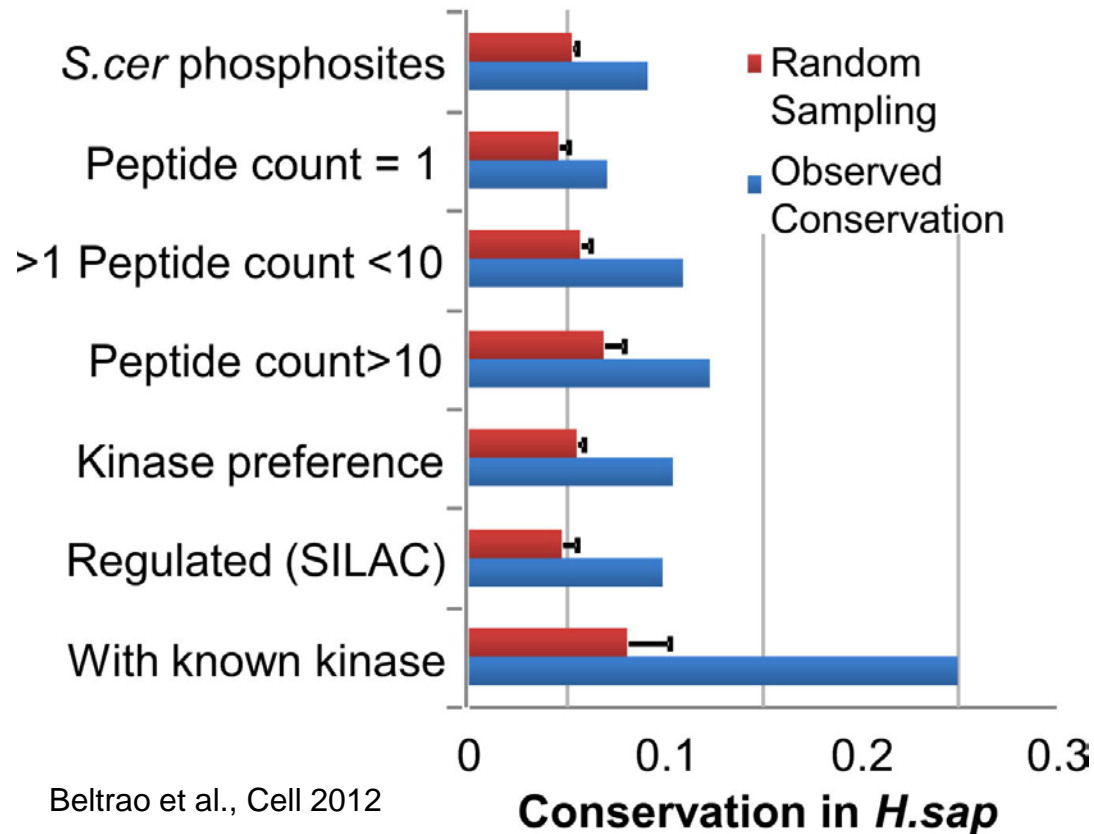
observed conservation



ratio observed/random conservation



OBSERVED VS EXPECTED PHOSPHOSITES

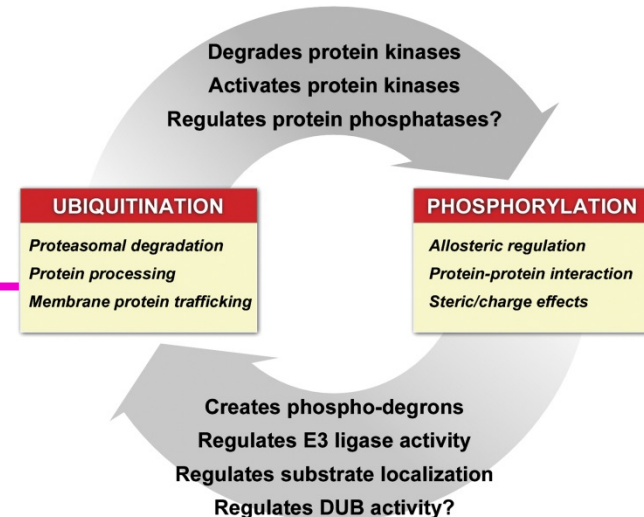


Conclusion: more functional assignments to PTMs are needed to improve data quality

error bars = 1 s.d.

FUNCTIONALITY OF PTMs IN UNSTRUCTURED DOMAINS

Species	PTM type	PTM total	Within PFAM domains	% Outside PFAM domain
<i>H. sapiens</i>	Phosphorylation	31165	11726	62.4
	Acetylation	8042	4604	42.8
	Ubiquitylation	22057	11079	49.7
<i>M. musculus</i>	Phosphorylation	24921	6825	72.6
	Acetylation	3384	2298	32.1
<i>R. norvegicus</i>	Phosphorylation	1885	913	51.6
<i>X. laevis</i>	Phosphorylation	470	149	68.3
<i>C. elegans</i>	Phosphorylation	6715	1074	84.0
<i>D. melanogaster</i>	Phosphorylation	17535	2081	88.1
	Acetylation	1707	858	49.7
<i>S. pombe</i>	Phosphorylation	2540	636	75.0
<i>S. cerevisiae</i>	Phosphorylation	15144	3747	75.3
	Acetylation	657	433	34.1
	Ubiquitylation	2499	1426	42.9
<i>C. albicans</i>	Phosphorylation	2910	532	81.7
<i>A. thaliana</i>	Phosphorylation	4527	648	85.7
<i>O. sativa</i>	Phosphorylation	3140	633	79.8

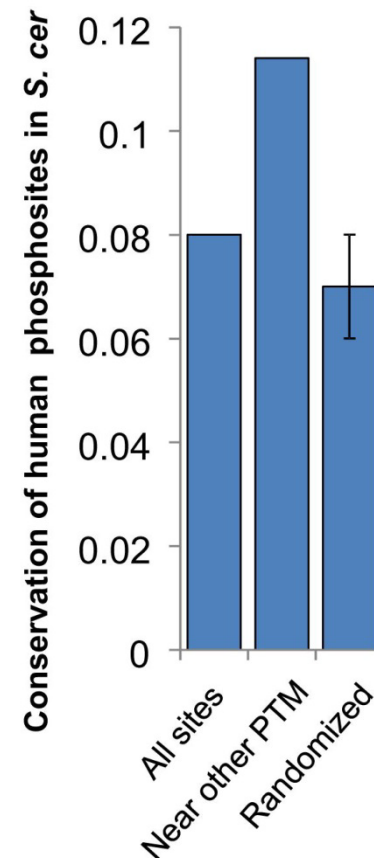
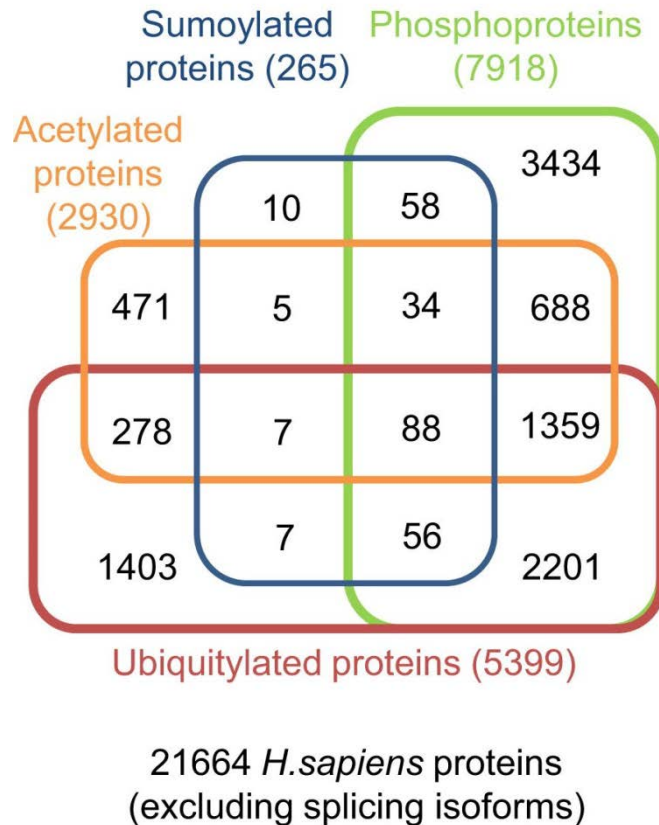


Hunter, Mol Cell 2007

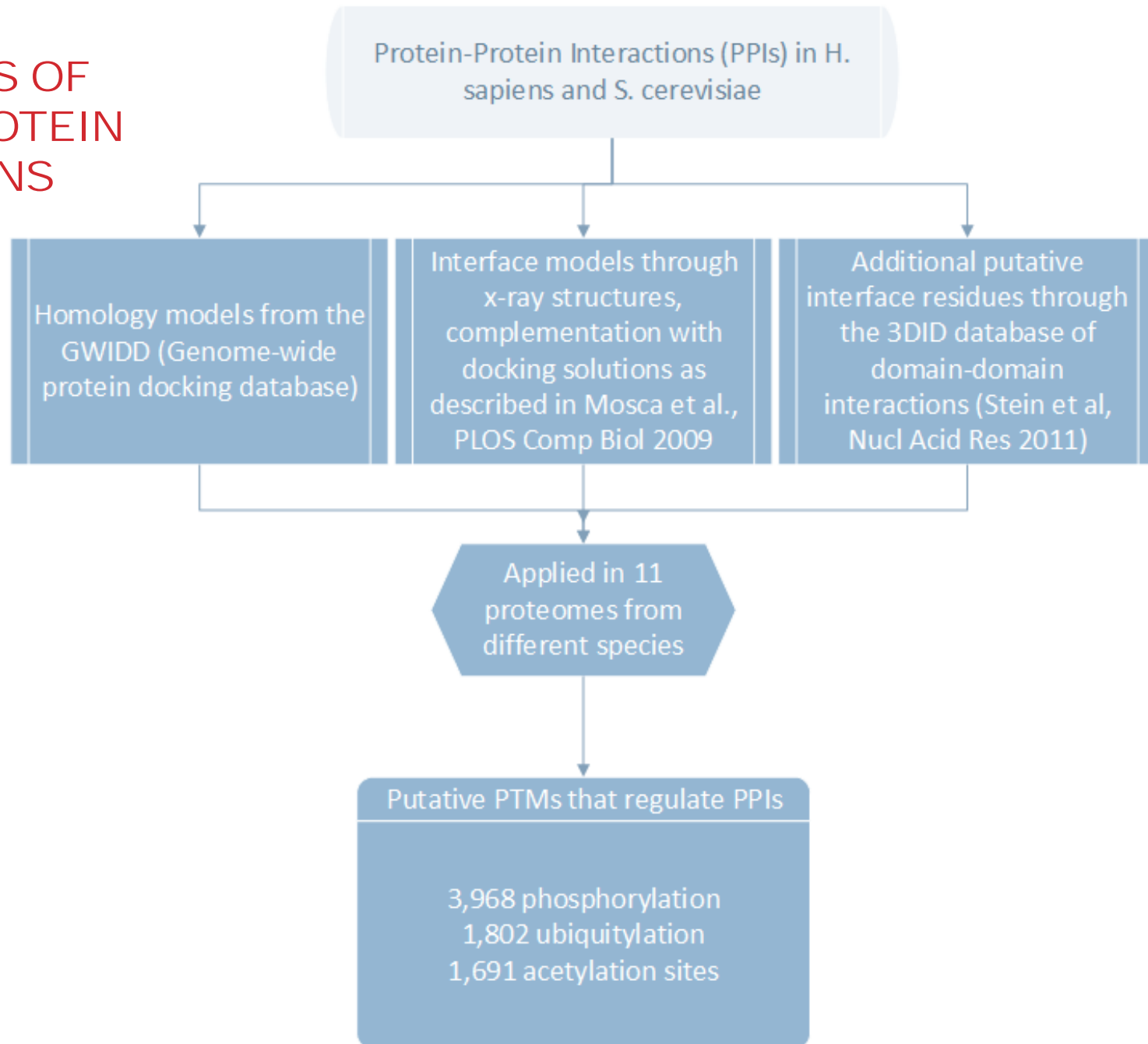
Beltrao et al., Cell 2012 (supplemental data)

Question: can functionality be assigned to PTM sites that are multiply posttranslationally modified?

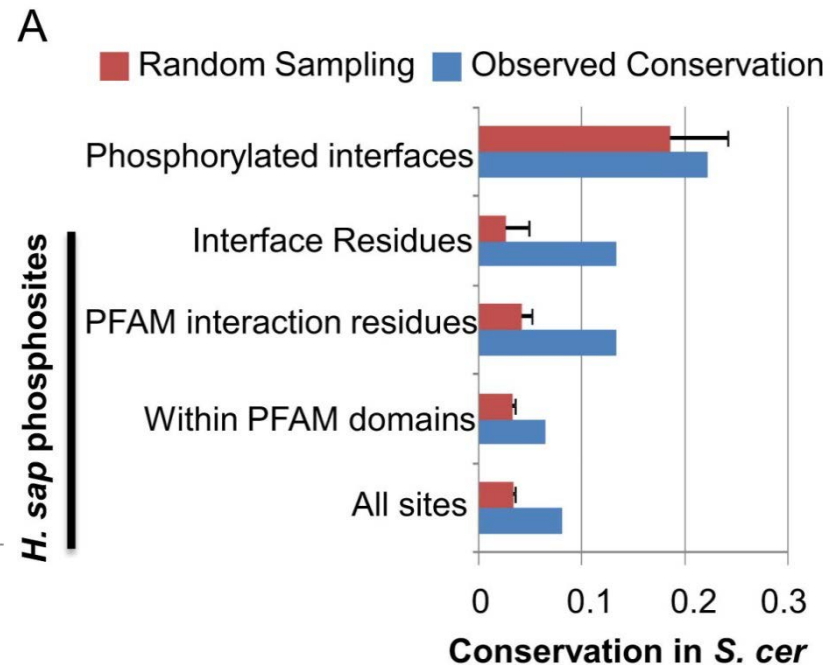
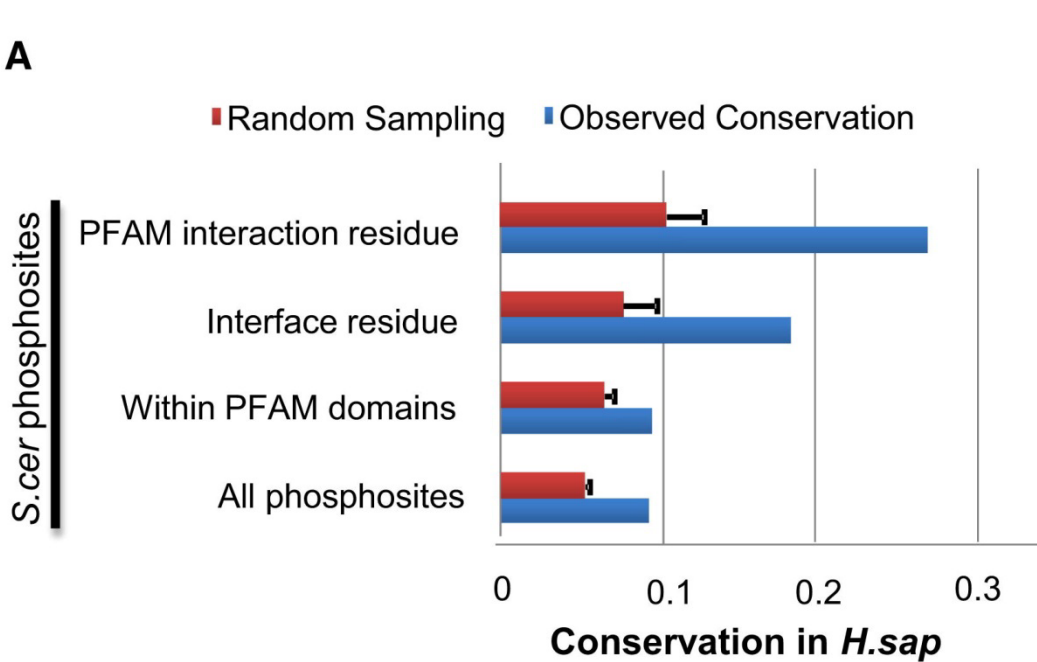
ASSOCIATION OF PROTEIN PHOSPHORYLATION WITH LYSINE POSTTRANSLATIONAL MODIFICATIONS



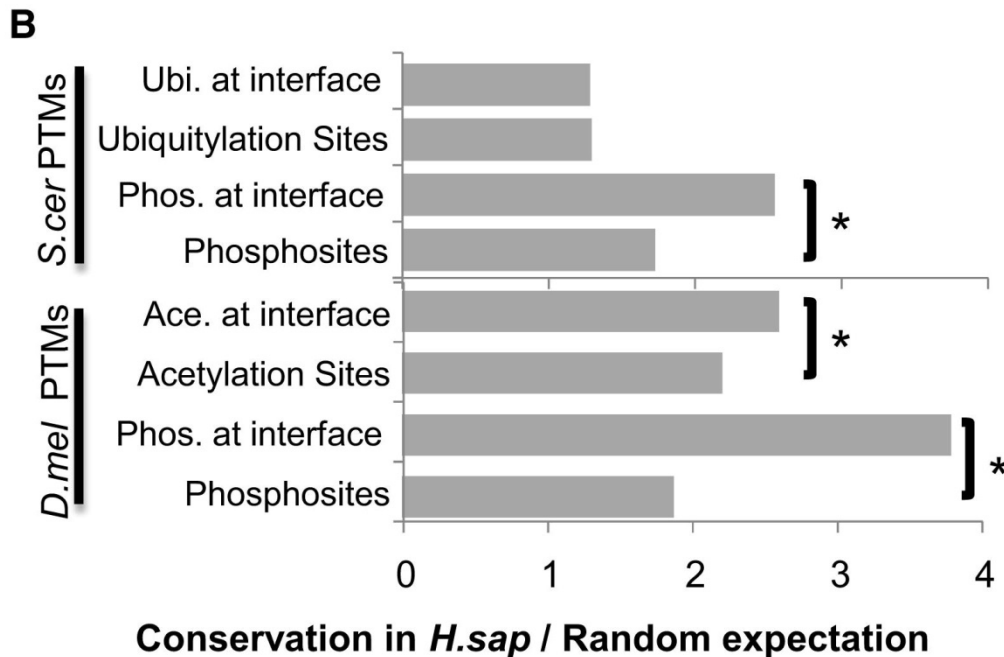
PTMs AS REGULATORS OF PROTEIN-PROTEIN INTERACTIONS



S. CEREVISIAE PHOSPHOSITES ARE MORE LIKELY TO BE CONSERVED AT INTERFACE RESIDUES THAN AVERAGE PHOSPHOSITES

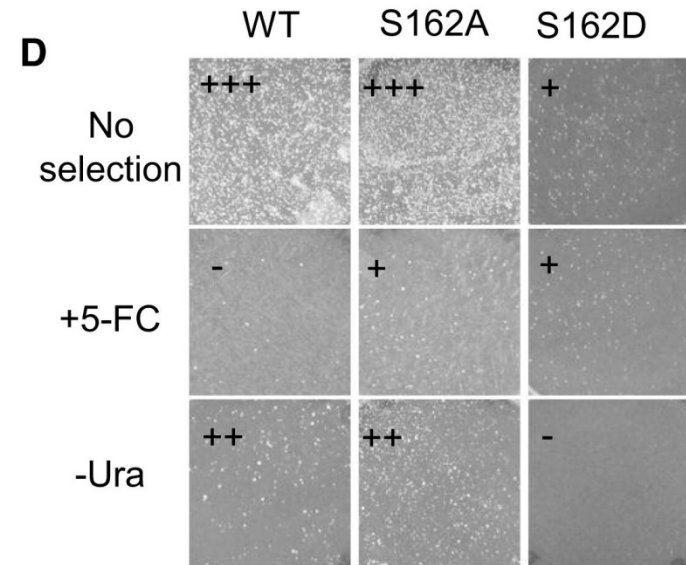
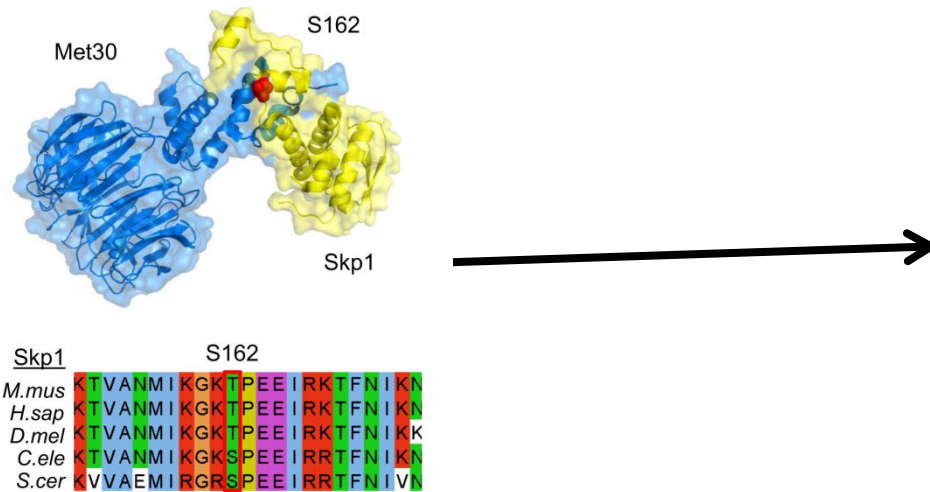


OTHER PTMS ARE ALSO MORE LIKELY TO BE CONSERVED WHEN RESIDING AT INTERFACE RESIDUES



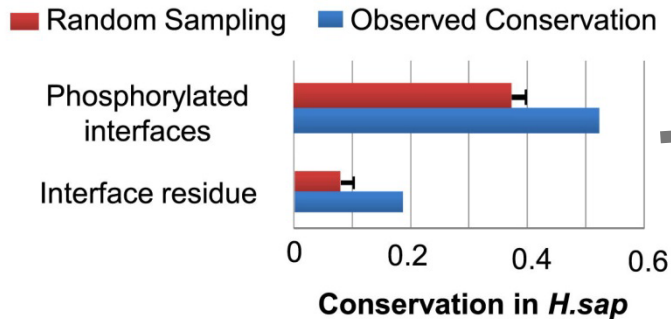
Conclusion: acetylation and phosphorylation, but not ubiquitylation are regulators of binding affinity of protein interactions

TESTING PROTEIN-PROTEIN INTERACTION DEPENDENCY ON PHOSPHORYLATION STATUS



PHOSPHOSITE SIMILARITY

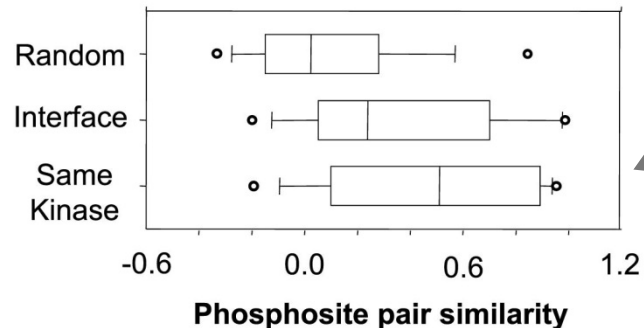
A



~ 50% of phosphorylated interfaces in *S. cerevisiae* are conserved in *H. sapiens* while only ~ 18% of the interface residues (i.e. AA) are conserved.

True observation? Lack of coverage?

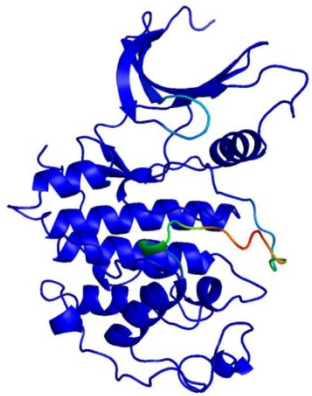
B



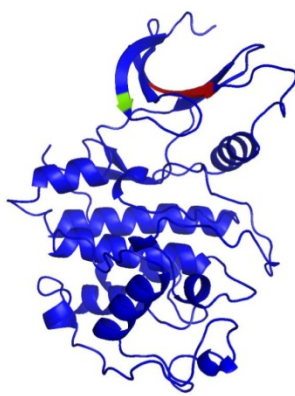
POSTTRANSLATIONAL HOT SPOTS WITHIN DOMAIN FAMILIES

PFAM id	Domain name
Pkinase	Protein kinase
Pkinase_Tyr	Protein tyrosine kinase
HSP70	Heat shock proteins, Hsp70
RRM_1	RNA recognition motif
UCH	Ubiquitin carboxyl-terminal hydrolase
Ras	Ras domain
HSP90	Heat shock proteins, Hsp90
PH	Pleckstrin homology domain
MFS_1	Major Facilitator Superfamily (MFS) transporters
Mito_carr	Mitochondrial carrier

Protein Kinase
Phospho-hot spots



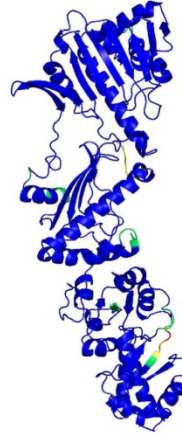
Protein Kinase
Acetylation-hot spots



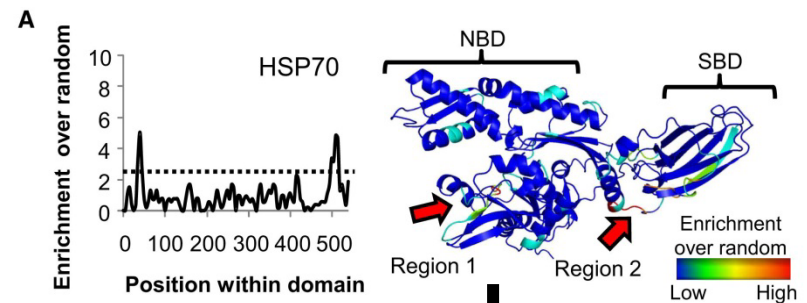
Enrichment
over random

Low High

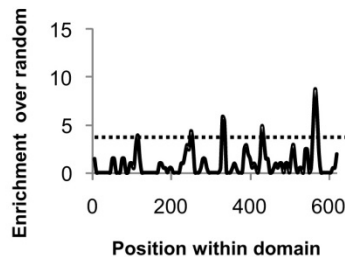
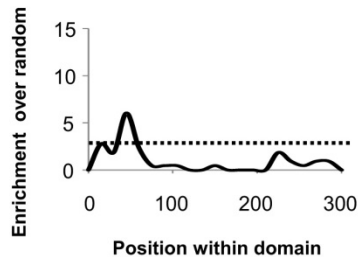
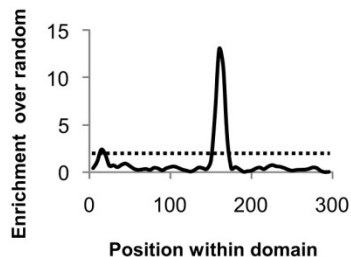
HSP90
Phospho-hot spots



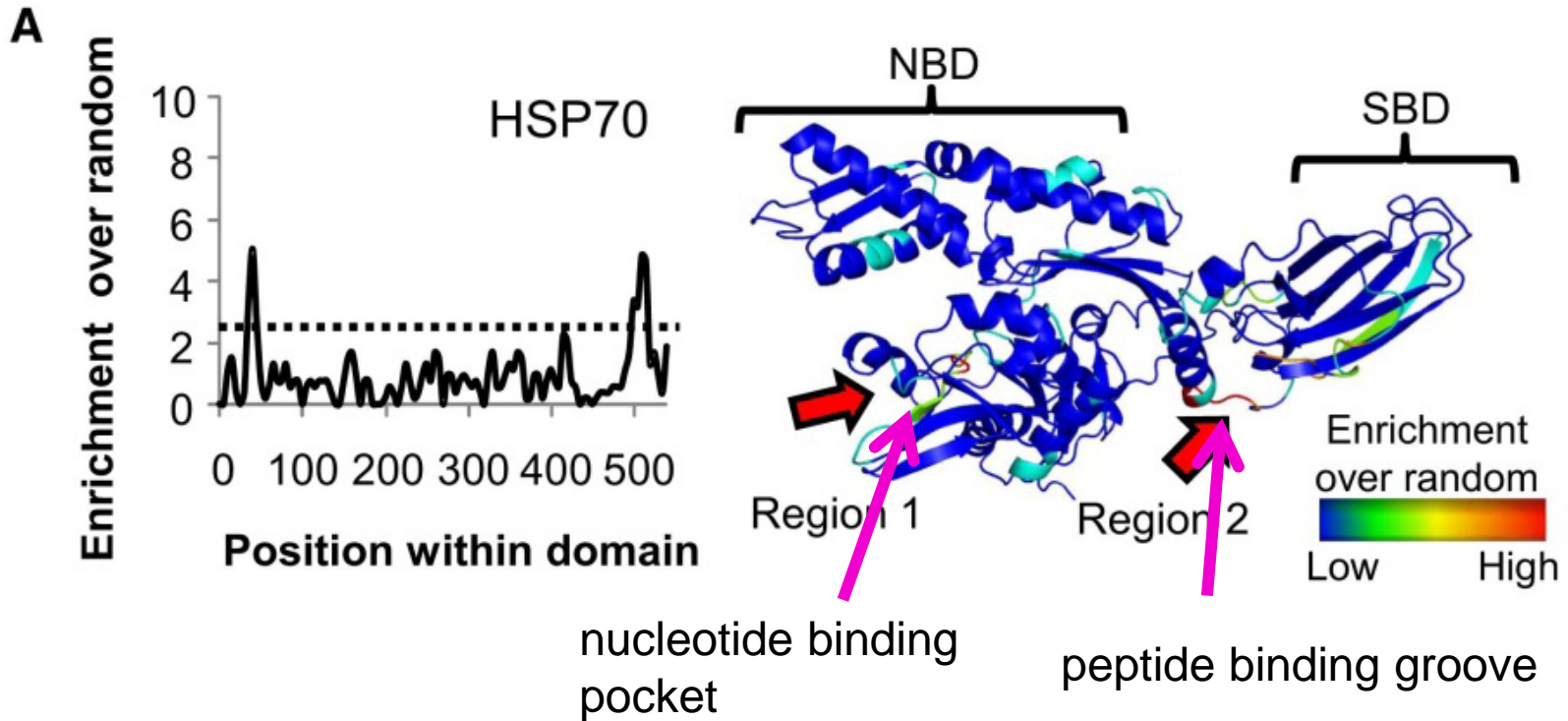
enrichment of PTM hot spots
across 11 species above
random expectation



HSP70 was taken for further
experiments

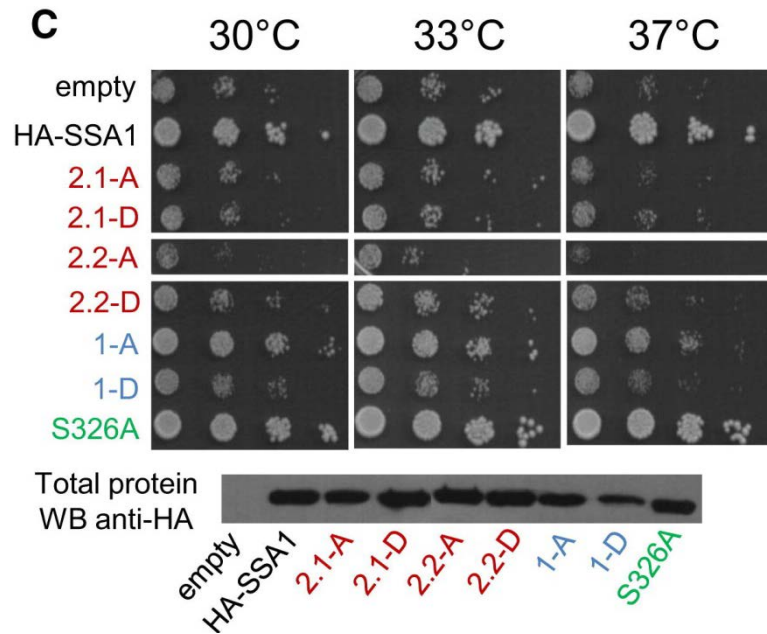


HSP70

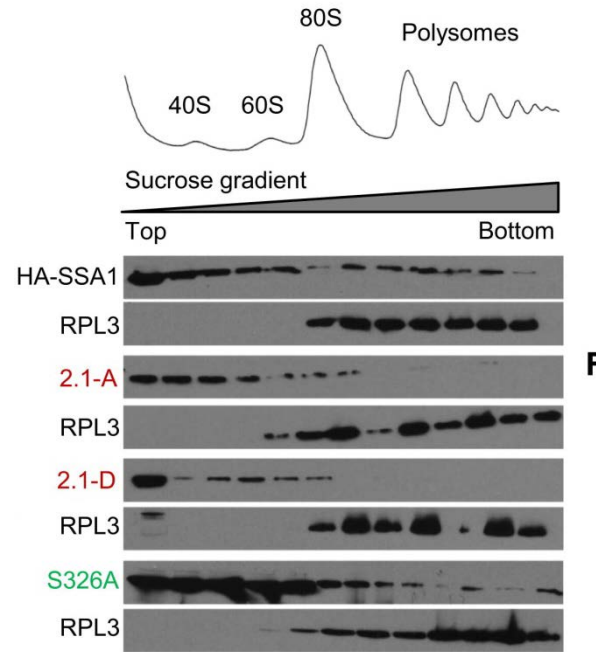


SSA1 is a cytosolic HSP70 in yeast >> D and A mutations in phosphosite hotspots

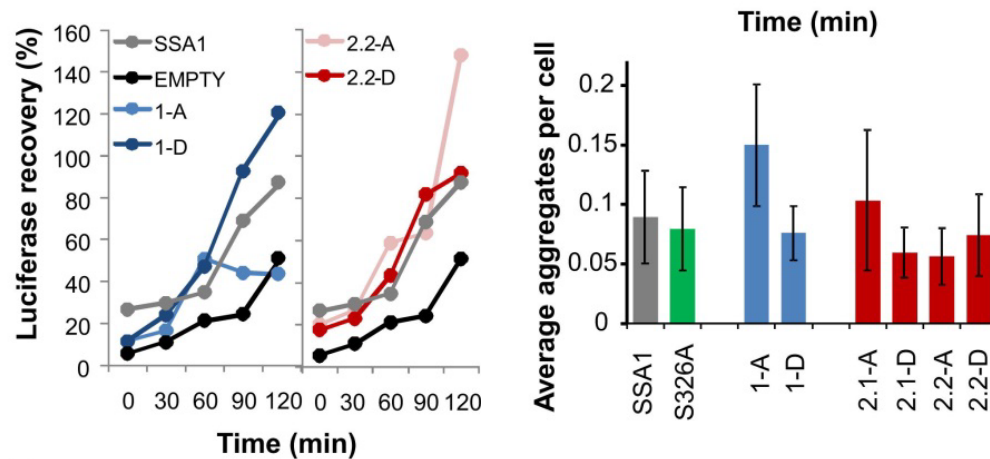
Yeast spotting assay



Binding of HSP70 to polysomes



HSP70 assist the refolding of denatured proteins



CONCLUSIONS

- **Robust source of nearly 200.000 PTMs across 11 different species to investigate PPIs through protein-interfaces or domain activity**
- **Practical&theoretical example of functional prioritization of PTMs**
- **Could also be used to study the evolution of posttranslational regulation**