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# A mass spectrometry view of stable and transient protein interactions

### Hanna G. Budayeva and Ileana M. Cristea<sup>#</sup>

Department of Molecular Biology, Princeton University, Princeton, NJ 08544

# 1. Overview

Proteins carry out the majority of functions in a cell, and their regulation at a core of health or disease processes. While cells contain a multitude of proteins, of various sizes and abundances, it is almost never the case for one protein to have only one function. Any given one protein usually has the remarkable ability to perform numerous functions. The main tactic through which proteins carry out these diverse functions is through formation of numerous interactions. These interactions can be dynamic, spatially and temporally defined, and stable or transient in nature. For example, one enzyme can have many substrates, and their regulation can have different downstream impacts on cellular pathways. Similarly, one protein can be part of multiple protein complexes that can have distinct functions. Given their fundamental contribution to cellular processes, the study of protein-protein interactions has become an essential part of biological discovery. In this chapter, we discuss one of the most commonly utilized approaches for studying protein interactions-immunoaffinity purification coupled with mass spectrometry analysis (IP-MS). We start by describing the types of optimizations that need to be considered when designing an IP-MS experiment to ensure efficient isolation and accurate characterization of protein complexes. Next, we discuss what controls should we performed and how mass spectrometry data can be used to distinguish specific versus background interactions. Within this context, we cover some of the most frequently implemented label-free and metabolic labeling approaches. Lastly, we describe some of the recent developments in capturing transient associations and measuring the relative stability of interactions. Application of cross-linking approaches for studying protein complex structures and transient interactions is also discussed.

# 2. Methods for isolating protein complexes

## Common workflows for characterization of protein complexes

Immunoaffinity purification (IP) of proteins is a powerful approach for characterizing proteins of interest, their direct and indirect interactions required for formation of complexes, as well as their posttranslational modifications (PTMs). This information provides critical insights into the functions of proteins in different pathways, as well as regulation of their functions by various mechanisms (e.g., inhibiting or activating PTMs).[1,

<sup>&</sup>lt;sup>#</sup>Corresponding author: Ileana M. Cristea, 210 Lewis Thomas Laboratory, Department of Molecular Biology, Princeton University, Princeton, NJ 08544, Tel: 6092589417, Fax: 6092584575, icristea@princeton.edu.

2] A standard workflow for isolating protein complexes is illustrated in Fig.1. This workflow starts with the selection of an appropriate cell line or tissue sample, effective lysis of the sample, isolation and elution of the target protein with its interactions, followed by mass spectrometry analysis and identification and quantification of the co-isolated proteins. Each step of this process can be modified and optimized based on the nature of the protein of interest, its subcellular localization and abundance, and the overall goal of the study. Several important considerations for these optimization experiments are detailed below.

#### Optimizing conditions for immunoaffinity purifications

One of the first questions that needs to be addressed prior to IP is whether the endogenous protein or its tagged version would be a suitable candidate for the study. Endogenous proteins can be purified from tissue or cells at their biological levels, providing the best representation of their functional states. Isolation of an endogenous protein requires availability of antibody with high specificity and affinity to ensure efficient and clean purification. Endogenous protein isolation is extensively utilized in small- and large-scale studies.[3-6] For example, Li et al. isolated the nuclear DNA sensor IFI16 to define its localization-dependent antiviral functions.[5] Large-scale isolation of endogenous transcriptional and signaling proteins and their complexes was used by Malovannaya et al. to provide insight into the composition of human coregulator protein complexes.[3] However, antibody production can be costly and not all antibodies are commercially available or stored in a buffer compatible with IP conditions (e.g., large amounts of glycerol or storage in Tris buffer can interfere with coupling of an antibody to some resins), requiring additional purification steps. Therefore, these antibodies are routinely used in smaller-scale isolations for confirmatory studies. For example, Tsai et al. reported co-isolation of endogenous sirtuin 7 with B-WICH components and Pol I, supporting its role in regulation of Pol I transcription.[4] As an alternative to the use of antibodies for immunoaffinity purification studies, recent reports have proposed the use of small molecules, such as activity-based chemical probes or inhibitors, covalently linked to a resin for isolation of enzymes and their complexes.[7-10] For example, a large-scale study used histone deacetylase inhibitors to assess their affinity to different complexes.[9] Other approaches for isolation of endogenous targets include the use of nucleic acids and engineered binding proteins (reviewed by Ruigrok et al. [11]), which are actively incorporated in various biomedical studies.[12, 13] With their lower cost of production and higher stability than antibodies, these molecules have become valuable tools for isolating and characterizing protein complexes.[14]

A more commonly utilized approach in studies of protein-protein interactions involves the tagging of the protein of interest, followed by its isolation using a tag-specific antibody. This method can be customized for the use of different tags (e.g., FLAG, EGFP, HA) and expression of the fusion protein from endogenous (genomic) or exogenous (e.g., tetracycline-inducible) promoters. For example, Quantitative BAC InteraCtomics (QUBIC) approach utilizes expression of tagged proteins from native promoters, followed by IP and quantitative MS analysis, which aids the identification of specific interacting partners.[15] The use of a fluorescent tag, such as green fluorescent protein (GFP), allows combining information regarding protein localization and interactions [16] and provides a complementary validation of protein-protein interactions, as shown for virus-host protein

interactions.[17, 18] Tandem affinity purification (TAP) strategies, which use multiple isolation steps via different tags, are useful for achieving cleaner purifications, leading to the isolation of fewer non-specific interactions, however, at the expense of weaker interacting partners.[19-21] A variation of TAP tagging can be used, where two proteins that are known to be present in a complex are tagged and purified simultaneously (bimolecular affinity purification), allowing for the specific isolation of a homogeneous population of protein complexes.[22] For all these approaches, one major concern that has to be addressed when using tags for protein IP is whether tagging alters protein function. To verify its functional state, the localization and function (e.g., enzymatic activity) of the tagged protein can be compared against endogenous control (e.g., [2]).

The choice of the affinity resin also has an impact on the success of the IP experiment, influencing the efficiency of the isolation and level of non-specific interactions. Common choices include sepharose and agarose beads, as well as the steadily growing in popularity magnetic beads.[22-24] The surface area of the bead determines not only its capacity for the number of antibody molecules that it can bind to, but also the non-specific associations to the resin itself. Resins with various chemistries are available for antibody binding (i.e., antibody-binding proteins, primary amines reactive groups, crosslinking to affinity ligands) and can help reduce the amount of eluting immunoglobulin molecules, limiting the interference in MS analysis. In the "Determining specificity of interactions" section in this chapter, the impact of the resin choice on the amount of non-specific interactions is discussed in detail.

The lysis of the selected cells or tissue is the first step of an IP experiment, and it can impact the preservation of protein-protein interactions. Therefore, the procedure selected for lysis and the composition of the lysis buffers require careful considerations. Mechanical disruption can be performed on wet or frozen samples. For example, cryogenic lysis was shown to provide an effective and reproducible disruption of cellular organelles and membranes, while helping to maintain protein complexes and PTMs.[25, 26] This method is appropriate for different cell types and was successfully applied in studies in bacteria, yeast, mammalian cells and tissues, as well as following viral infection (as reviewed in [27]). If it is necessary to preserve intact intracellular structures, fractionation steps can be added to the protocol. For example, nuclear-cytoplasmic fractionation was used for assessment of localization-dependent protein-protein interactions of HDAC5 mutated at different phosphorylation sites that regulate its nuclear-cytoplasmic shuttling.[1] Importantly, the stringency of the lysis buffer in an IP experiment determines the nature of isolated interactions. Low salt concentrations and mild detergents may allow preservation of weak interactions, while isolation in a more stringent buffer will enrich for strongly bound interacting partners. [28] Miteva et al. compared the presence of distinct SIRT6 interactions under mild or stringent lysis conditions, which allowed determining their relative stability, as well as validation of specificity.[6] Addition of sonication step and RN/DNases to the lysis buffer can help remove interactions dependent on nucleic acid binding. It is also important to consider the compatibility of the lysis buffer detergents with the downstream sample analysis by MALDI or ESI/LC-MS/MS. For example, analysis of membrane-bound proteins can be hindered by the necessity to use harsh detergents that are detrimental for MS analysis, although it was shown that *n*-octylglucoside detergent is compatible with MALDI-MS.[29]

Another solution is to use cleavable detergents that can be removed from the sample prior to the analysis.[30, 31] Of course, the composition of lysis buffer and duration of lysis has a profound impact on the level of observed non-specific interacting partners, as discussed in detail in the "Determining specificity of interactions" section.

Following the isolation of the protein of interest, the elution conditions from the beads can also be optimized for different purposes, such as to reduce immunoglobulin contamination, to preserve native protein folding, or to assess the stability of interactions. Most commonly utilized elution buffers are sodium dodecyl sulfate- or lithium dodecyl sulfate-based, which denature the isolated proteins and are suitable for in-solution digest prior to MS analysis. [32] Basic (e.g., ammonium hydroxide and ethylenediaminetetraacetic acid) or acidic (e.g., trichloroacetic acid) elutions are also denaturing, but reduce the amount of background protein contamination.[26] For analysis of native proteins and their complexes, non-denaturing conditions can be used, such as competitive binders.[33, 34]

Isolated protein complexes can be analyzed by bottom-up, middle-down, or top-down MS approaches.[35-37] For reduction of sample complexity, protein mixtures can be resolved by gel electrophoresis prior to digestion. Combination of different proteases can be used to improve sequence coverage and identification of PTMs.[5] Separation by liquid chromatography, performed either offline or online with the mass spectrometer, is also used to decrease the sample complexity and provide an in-depth analysis. Different types of peptide fragmentation, such as collision induced dissociation (CID), electron transfer dissociation (ETD), and higher energy C-trap dissociation (HCD), have also significantly enhanced the current ability to characterize proteins (as reviewed in [38]). Targeted mass spectrometry-based approaches, such as selective reaction monitoring (SRM), further help the identification and quantification of low levels of proteins.[39]

# 3. Determining specificity of interactions

The complex and dynamic nature of protein-protein interactions co-existing in a cell presents challenges for any IP study. During cell lysis, proteins lose their intracellular localizations, triggering an opportunity for numerous non-specific interactions to occur. Additionally, non-specific associations can occur with the resin, tags, or antibodies used for the study. In this section, we discuss some of the sources of non-specific interactions and how these can be minimized when designing the IP workflow, as well as approaches used for determining the specificity of observed interactions following data analysis.

### Sources of non-specific interactions

The presence of background proteins in affinity purified protein mixtures is determined by multiple factors (Fig.2). Non-specific interactions can include proteins that bind to resin (e.g., magnetic beads), to immunoglobulin molecules, to the tag, and to other isolated proteins. For instance, although polyclonal antibodies have higher affinities and provide more efficient isolations, they also tend to accumulate more non-specific associations than monoclonal antibodies. As for the choice of the IP resin, it was observed that it can also differentially impact the level and type of non-specific binders.[24, 40] Sepharose beads seemed to preferentially isolate non-specific nucleic acid binding factors, while magnetic

beads are prone to association with cytoskeletal and structural proteins.[24] However, magnetic beads can be collected on a magnet, removing the need for a centrifugation step, which reduces sample loss and effectively removes flow-through. Additionally, magnetic beads were preferred for isolating organelles or larger structures or macromolecules, given their feature of surface binding.[41, 42]

Proteins that non-specifically associate with isolated protein complexes are a significant source of background contamination that can be reduced by optimizing IP conditions (Fig. 2). For instance, the composition of the lysis buffer and the incubation period with the beads/ resin and the antibody greatly influence non-specific binding. More stringent buffers that contain higher concentrations of salts and detergents can be used to focus on the isolation of strong interactions, helping to reduce non-specific interactions that tend to be weaker. On the other hand, very stringent buffers that are used to improve extraction of proteins from membranes and intracellular vesicles can lead to protein denaturation, which introduces additional surfaces for non-specific binding (e.g., to heat shock proteins[43]). In addition, Cristea et al. demonstrated that the length of time used for the incubation of cell lysates with the beads affects the number and abundance of non-specific interactions.[16] It was suggested to keep the incubation periods as short as possible, ranging from several minutes up to one hour, depending on the abundance of the targeted protein and the affinity of the antibody. Therefore, optimization of lysis buffer composition and immunoaffinity purification period allows achieving cleaner isolations, while preserving specific interactions (Fig.2). Additionally, non-specific interactions can occur upon cell disruption and mixing of proteins from different intracellular compartments. This type of background can be avoided by performing a fractionation step prior to the IP workflow and the lysis/time optimizations mentioned above.

#### Designing appropriate control experiments and validating interactions

Suitable controls have to accompany every IP experiment because, even with optimized conditions, low levels of non-specific binders will still be present in the final isolation. Control experiments have to be carefully designed to follow the same conditions as the IP of the protein of interest. For instance, when isolating a tagged protein, a suitable control would be a cell line that expresses only the tag. If the targeted protein is localized within a particular cellular compartment, the control cell line should be designed to afford localization of the tag alone within the same compartment (e.g., by addition of a nuclear localization signal for expression within the nucleus[18]). Similarly, isolation of an endogenous protein requires a control incubation done in parallel using beads coupled to immunoglobulin molecules, which will capture proteins that associate non-specifically to the antibody. If isolations are performed at different stages of a biological process, such as cell cycle or viral infection, it is necessary to introduce a control experiment for each time point. [17] This will account for variations in the type and abundance of non-specific interactions throughout the process. Altogether, these control isolations will help differentiate non-specific associations that occur via the tag, the antibody, and the resin type.

In a collaborative effort, several proteomic laboratories have provided their data from numerous control isolations performed in different cell types and using various resins, tags,

and antibodies to generate a repository freely available to the scientific community.[40] This resource, termed the CRAPome database, allows users to determine the frequency of appearance of a protein of interest in control IPs or to analyze their own datasets in comparison to controls available online and assess the presence of common background contaminants. This repository is continuously expanding with new data submitted and processed according to the established workflow.

Validation of isolated interactions is another critical step in all studies aimed at characterizing protein-protein interactions. Such experiments include reciprocal isolations, where an identified prey protein of interest is used as bait in a follow-up IP experiment to confirm the co-isolation of the initial targeted protein. However, it is necessary to keep in mind that reciprocal IPs might prove challenging in identifying a target protein that has low levels of expression. As a consequence, its signal in the prey IP might be suppressed by the presence of more abundant interactions. On the other hand, the prey IP might not be feasible if an antibody is not available for it, but the use of tagging can overcome this problem. Co-localization studies using confocal microscopy or simple binary approaches (e.g., yeast two-hybrid) are also successfully applied for validating interactions.[4, 6, 44]

#### Label-free methods for determining interaction specificity

Qualitative and quantitative data derived from MS analysis of co-isolated proteins contain valuable information regarding the specificity of identified interactions. Therefore, several algorithms were developed for this purpose.

Various scoring systems, such as the socio-affinity index and purification enrichment score, were utilized for the analysis of interactions isolated from large-scale IP studies in yeast. [45-48] Their purpose was to decrease the number of identified false-positive interactions, while retaining abundant interactions that are frequently assigned as false-negatives. For example, V-ATPase, an abundant and common contaminant in numerous studies, can be selectively rescued if assigned as a possible specific interaction.[45] Computational approaches were also applied in studies of mammalian interactomes. Among them is the interaction reliability score that was derived for the study of transcription and RNA processing complexes to assign high-confidence interactions.[49]

Quantitative data generated by MS analysis in the form of spectral counts (total number of spectra observed per protein) are becoming increasingly utilized for predicting the specificity of interactions.[2, 50-52] In this approach, the number of spectra observed for a particular protein in the bait versus control IP indicates whether this interaction is likely specific for the targeted protein. For further analysis, normalized spectrum abundance factor (NSAF) was introduced by Paoletti et al. to account for the number of amino acids that a protein contains, with larger proteins expected to generate a higher number of spectral counts in MS analysis.[53] When combined with the protein abundance factor (PAX) [54] that reflects total protein abundance in a cell, resulting NSAF/PAX ratio becomes a good indicator of the enrichment of a particular interaction among co-isolated proteins.[4] However, it should be kept in mind that PAX values are not yet derived for all cell types and can change drastically under different environmental conditions or under stress (e.g., during viral infection).

The SAINT (significance analysis of interactome) algorithm was developed by Nesvizhskii et al. to generate a probability model for distributions of false-positives and false-negatives in IP data and to assign confidence scores to identified interactions.[52] For example, SAINT was utilized in a large-scale interactome study of the insulin receptor/target of rapamycin pathway in Drosophila, helping the identification of interactions important in controlling cell growth upon stimulation with insulin.[55] More recently, the SAINT algorithm was further optimized to account for the large dynamic range of spectral counts that is frequently observed in human interactomes, such as in the global interaction network of all eleven human histone deacetylases.[2] This study led to the identification of numerous HDAC-containing protein complexes, as well as a previously unrecognized function for HDAC11 in mRNA splicing. The CRAPome database mentioned above also utilized the SAINT algorithm for analyzing the collection of control IPs derived from different cell types and performed in various laboratories.[40] Another spectral counting-based program, called CompPASS, uses several scoring systems to derive confidence scores for interactions found in multiple parallel non-reciprocal IPs, without the use of control IPs.[51] Algorithms that utilize other MS data, such as MS1 signals (MasterMap) and peak intensities (MiST) are also being developed with the goal of overcoming some of the limitations of spectral counting approaches, such as dependence of interaction abundances on bait and prey levels, efficiency of IP, and detection by MS.[56, 57]. A more complete summary of available algorithms is reported in [27].

The label-free approaches mentioned above have several advantages over labeling approaches that will be discussed in the next section. They do not require expensive reagents, can be used for the analysis of tissue samples, and can be applied in both small- and large-scale studies. However, these approaches have certain limitations. For example, protein abundance has a significant impact on the assessment of specificity (i.e., cannot reliably quantify changes for proteins with low spectral counts). Additionally, as is the case for most methods, these approaches cannot fully segregate background proteins from specific interactions within the multitude of co-isolated proteins.

## Labeling methods for determining interaction specificity

Metabolic and chemical labeling approaches were introduced into MS analysis workflows to provide absolute or relative protein quantification. During the last decade, the application of these approaches within targeted or global studies has revolutionized the field of proteomics and its ability to contribute to critical biological discoveries. These labeling methods have certain limitations, such as their challenging application to tissue samples and variations in sample processing prior to chemical labeling. Nevertheless, in recent years, the application of these approaches was expanded to include their incorporation into IP workflows for the downstream analysis of interaction specificity.

Labeling with stable isotopes, such as <sup>15</sup>N, and later with heavy amino acids in cell culture (SILAC) were among the first metabolic labeling methods to be introduced within mass spectrometry-based workflows.[58, 59] For identification of interaction specificity using metabolic labeling, Chait and colleagues developed the I-DIRT (Isotopic Differentiation of Interactions as Random or Targeted) approach and applied it to the study of DNA

polymerase e complex in yeast.[60] In their workflow, cells expressing the affinity-tagged protein are grown in medium containing naturally-occurring amino acids, termed isotopically light medium. In contrast, wild type cells are grown in isotopically heavy medium that contains amino acids labeled with heavy isotopes (e.g., <sup>13</sup>C). Proteins are immunoaffinity purified from a 1:1 mixture of these light and heavy cell lysates, and the specific interacting partners can be recognized as having only or predominantly light isotopic peaks (Fig.3A). An "SRM-like" I-DIRT approach, in which the specificity of interaction for selected proteins of interest can be assessed using targeted MS/MS, may be utilized to analyze low abundance interactions.[4] To assess interaction specificity in studies of endogenous protein complexes, QUICK (quantitative immunoprecipitation combined with knockdown) strategy was developed.[61-64] In this workflow, light-labeled cell cultures are treated with RNAi against the protein of interest, while heavy-labeled cells serve as non-targeted controls. In subsequent MS analysis, light and heavy peptide intensities are compared to assign non-specific (1:1 heavy to light rations) and specific (heavy isotopic peaks with higher intensity than light) interactions. QUICK can also be combined with cross-linking to stabilize protein complexes in cell extracts prior to IP, as demonstrated for VIPP1 complex functioning in chloroplast biogenesis.[65] Some of the disadvantages of the QUICK approach include SILAC-associated costs, arginine-to-proline conversions that produce difficulties in data interpretation, and uncontrollable alterations in protein expression due to RNAi knockdown. These concerns were addressed in an alternative QUICK method utilizing <sup>15</sup>N labeling and affinity modulation of protein-protein interactions.[66] SILAC approaches in the form of PAM (purification after mixing) SILAC and MAP (mixing after purification) SILAC were also used to assess the interaction specificity in several studies.[67, 68] These methods allow distinguishing between stable and transient interactions, which will be further discussed in the next section. Affinity purification of integral membrane proteins using nanodiscs, which circumvent the need for stringent detergents, was combined with SILAC in the analysis of interacting partners of bacterial channel, transporter, and integrase proteins.[69] In the study of phosphatase and tensin homologue (PTEN) interactions, IPs from two different cell lines using three different approaches (two tags and one endogenous) were combined in parallel affinity purification (PAP) SILAC approach to assign specific interactions with minimum number of false positives.[70]

Chemical labeling was also successfully applied for the analysis of protein interactions, and is typically done after IP, at either the protein or peptide level. In ICAT (isotope-coded affinity tag) approach, cysteine residues of intact proteins in bait and control experiments are labeled with heavy or light ICAT reagents, respectively.[71, 72] Therefore, specific interaction partners would produce peptide spectra with higher intensities for heavy isotope-containing peaks. Inherent to this method is the quantification of only cysteine-containing peptides. The iTRAQ multiplex labeling method [73], which tags peptides at N-terminal and lysine amines, was also applied to distinguish true interactions within co-isolated protein mixtures when comparing differentially labeled bait and control IPs, as shown for grb2.[74] Isotope coded protein labeling (ICPL) was also recently combined with IP-MS to analyze native  $\beta$ -tubulin complexes in bovine retinal tissue.[75] Besides being compatible with analysis of tissue samples, this method allows for simultaneous analysis of several control

samples, which can account for non-specific binders to the beads and immunoglobulin molecules. Currently, chemical labeling is not as widely applied as metabolic labeling to the analysis of interaction specificity. However, its compatibility with tissue samples and its multiplexing feature that allows direct comparison of multiple samples and diverse controls makes it a useful tool, expected to continue to aid the discovery of protein complex compositions relevant in biomedical research.

# 4. Cross-linking methods

In MS studies of protein complexes, cross-linking is used for covalent joining of two or more molecules. Chemical cross-linking reagents have various chemistries (e.g, amino-, sulfhydryl-, carboxyl-reactive), sizes that determine the distance between cross-linked peptides, and add-on features for easier detection and identification (e.g, reversible crosslinkers). In this section, the use of cross-linking in studies of protein complex structures is discussed, while its application to capturing transient protein interactions is described in the section on "Determining stability of interactions".

#### Solving protein complex structures

Continuous advances in cross-linking methodologies, the improved sensitivity of MS instrumentation, and the development of automated algorithms for database searching have significantly expanded the use of cross-linking for characterization of protein complexes. Examples of elegant structures resolved using cross-linking methodologies include the yeast 19S proteasome lid, RNA Pol II, phage DNA packaging machinery, human protein phosphatase 2A (PP2A) complexes, INO80 nucleosome complex, TRiC/CCT chaperonin to name a few. [76-80] These cross-linking strategies are powerful at defining the exact points of contacts between proteins of interest. One caveat to keep in mind is that proteins can be part of multiple protein complexes that can have common components. For example, the histone deacetylases HDAC1 and HDAC2 are known to form the core of several distinct complexes, such as NuRD and Sin3A complexes.[2] Therefore, even after identifying the point of contact between two proteins, one may not know where the interaction takes place, i.e., which complex or which conformational state of the complex in represented. To partly address this issue, cross-linking is frequently combined with knowledge from X-ray crystallography studies. Nevertheless, as crystallography results usually reflect a more static or stable conformation of a protein, these issues should still be kept in mind.

Cross-linking was also integrated with other biochemical or mass spectrometry tools to help define protein structures and interactions within macromolecular assemblies. For example, a combination of cross-linking with hydrogen/deuterium exchange was used to decipher intersubunit interactions critical in the assembly of HIV-1 capsid protein, which complemented studies performed using X-ray crystallography and cryo-electron microscopy.[81] In another study, the folding of the immune receptor NKR-P1C was resolved using cross-linking, molecular modeling, and ion mobility mass spectrometry.[82]

One common limitation of cross-linking when combined with MS analysis is the possible low abundance of resulting cross-linked peptides, which can make spectra interpretation challenging. To solve this problem for the analysis of the 12-subunit Pol II complex

structure, Chen *et al.* utilized a strong cation exchange chromatography to enrich for crosslinked peptides that have multiple charges.[76] For isotopic labeling, Zelter et al. digested cross-linked peptides in the presence of  $H_2^{18}O$ , which were then identified by their characteristic isotopic peak distribution in MS spectra.[83] Several strategies were proposed that utilize modifications of the cross-linker itself to provide easier enrichment, detection, and identification. These include affinity tags, reporter tags, isotopic and fluorescence labeling, and cleavable cross-linking, all of which can be used in combination.[84] For example, Chowdhury et al. combined an alkyne enrichment tag and NO<sub>2</sub> detection tag when constructing a CLIP (click-enabled linker for interacting proteins) cross-linking reagent.[85] For the study of the 20S proteasome complex in yeast cells, Kao et al. designd a disuccinimidyl sulfoxide (DSSO) cross-linker that is cleavable by collision-induced dissociation and can be identified at the MS<sup>3</sup> level.[86]

The expansion in types of cross-linking strategies and applications places demands on the developments of streamlined procedures for MS data interpretation. To make this process more automated, Herzog et al. utilized specialized xQuest search engine. [79, 87] In this workflow, isotopic pairs of cross-linked peptide ions were matched against a database of candidate peptides, upon which their sequences were assigned. This algorithm was used to solve the structures of human PP2A, INO80 nucleosome, TRiC/CCT eukaryotic chaperonin, and other complexes. [79, 80, 88, 89] However, this process has a laborious scoring procedure that requires manual verification of the cross-linked peptide spectra. In addition, reliable identification of isotopically labeled cross-linked peptides in this method can suffer from incomplete labeling. To overcome this limitation, Goodlett and co-workers developed an alternative cross-linking strategy that uses Popitam search engine[90] and can identify unlabeled cross-linkers.[91] In their workflow, cross-linked peptides are considered as complementary pairs of peptides modified by an unknown mass. The spectra are interpreted by matching to theoretical spectra of single linear peptides, and further analyzed against the masses of precursor tryptic peptides and manually validated. SEQUEST [92] searching was also further optimized for the identification of cross-linked peptides from a database containing all possible products of cross-linking, which allowed matching complex spectra of cross-linked peptide pairs more efficiently.[93] For automatic validation of database search results, Walzthoeni et al. introduced the xProphet software that uses a target-decoy strategy to estimate false discovery rates in large datasets derived from cross-linking studies. [94] Many other database processing algorithms and bioinformatics tools are being continuously developed and released to address challenges associated with deciphering complex cross-linked peptide spectra.[95-100] Overall, further improvements in crosslinking strategies for easier detection and identification, as well as in the software for analysis of MS spectra of cross-linked peptides are required. However, the combination of cross-linking strategies with crystallography studies, computational modeling, and other quantitative mass spectrometry methods provides powerful approaches in proteomics that will continue to shed light on the structures of heterogeneous protein complexes.

# 5. Studying transient and fast-exchanging interactions

Coupling of efficient IP strategies with highly sensitive MS analysis leads to identification of numerous interactions, direct and indirect, transient and stable, which provide valuable

information about protein function. Several methods can be used to distinguish between direct and indirect interactions, such as yeast two-hybrid and protein arrays.[101] These methods do not utilize mass spectrometry analysis and are not discussed in this review. The identification of transient and fast-exchanging interactions, such as enzyme-substrate interactions, presents challenges in mass-spectrometry proteomic workflows. These interactions can be either lost during the IP process or can be falsely assigned as non-specific in metabolic labeling experiments. Therefore, methods are continuously being developed to help the capture and identification of these interactions in MS-based experiments.

#### Determining interaction stability using metabolic labeling

As mentioned in the earlier section, time-controlled PAM SILAC and MAP SILAC approaches have also been used for identification of specific interactions that are dynamic in nature.[102] In PAM SILAC approach, samples are mixed prior to purification, which allows for transient interactions to exchange quickly between light and heavy forms, resulting in equivalent levels of heavy and light ions. However, with decreased incubation time during purification, the level of heavy ions will increase. Moreover, if mixing of heavy and light-labeled samples is done after purification (MAP SILAC), same interactions will have predominant heavy ions because there will be no "light" labeled proteins present in the isolated sample. The MAP SILAC approach also allows for identification of fast-exchanging interactions, which would require short incubation times in order to be accurately assigned as specific when using the PAM SILAC approach. This approach was applied in studies of 26S proteasome and COP9 signalosome complexes.[67, 68]

A combination of spectral counting (SAINT) and metabolic labeling (I-DIRT) approaches was utilized by Joshi et al. to measure relative interaction stabilities within HDACcontaining protein complexes (Fig.3).[2] In their workflow, unlabeled bait samples were analyzed against control IPs to generate a list of interactions using SAINT scores, with scores >0.8 reflective of likely specific interactions. In parallel experiments, metabolic labeling of cells expressing tagged HDACs was performed, and an I-DIRT approach was used as described above. By integrating SAINT and I-DIRT scores for each isolated protein, stability profiles could be assigned to specific interacting partners. Proteins with >0.8SAINT scores and ~0.5 I-DIRT scores corresponded to fast-exchanging proteins, while proteins with >0.8 SAINT scores and I-DIRT scores closer to 1.0 indicated stable interactions. For example, HDAC5 and HDAC7 interact transiently with the NCoR complex due to their nucleo-cytoplasmic shuttling, while HDAC3 is a stable component of this complex. Similarly, HDAC1 was shown to be an integral component of several chromatin remodeling complexes, while transiently associating with transcription factors and DNA binding proteins. Therefore, this approach allows confident identification of novel specific interacting partners and assignment to transient or stable associations.

#### Detecting transient interactions using cross-linking

Several cross-linking methods were incorporated into IP-MS workflows to study stable and transient interactions in cell culture. The main requirement for a cross-linking reagent to be used for such analysis is its cell permeability. One of the most widely utilized reagent in

these studies is formaldehyde. For example, tandem affinity purification (TAP) of formaldehyde cross-linked SCF ubiquitin ligase complex under denaturing conditions was utilized by Tagwerker et al. to preserve and characterize novel ubiquitination targets, as well as identify transient or weak interacting partners.[103] For a more quantitative analysis, Guerrero et al. combined TAP, formaldehyde cross-linking, and SILAC approaches to characterize 26S proteasome interactions in yeast.[104] Zero distance cross-linking using photo-inducible amino acids[105] introduced into growing mammalian cells allowed identification of a direct interaction between endoplasmic reticulum stress protein MANF and GRFP78 that regulates stress-induced cell death.[106] One of the disadvantages of irreversible cross-linking is that, following the immunoaffinity purification of a protein complex, there is a low accessibility for trypsin at the core of the isolated complex, hindering the identification of selected proteins by MS. To resolve this issue, as well as other challenges connected to irreversible crosslinking, numerous studies employ reversible crosslinking. For example, reversion of formaldehyde cross-links was used in the SPINE method for detection of interacting partners of Strep-tagged membrane proteins in bacteria.[107] Another reversible cross-linking methodology—ReCLIP—utilizes thiol-cleavable crosslinks and was used in the study of p120-catenin and E-cadherin complex.[108, 109]

To capture transient interactions and address specificity of interactions within the same experiment, a transient I-DIRT approach was reported. This approach used cross-linking combined with isotopic labeling in yeast culture and was applied to the study of NuA3 multi-subunit complex.[110] In this workflow, cells expressing the tagged protein are grown in light media, while wild type cells are grown in heavy media. Upon mixing cross-linked heavy and light cell cultures and purifying the target protein, MS analysis is performed and used to assign stable specific (~100% light peptides), non-specific (1:1 light:heavy peptide ratio), and transient (intermediate ratios) interacting partners.[111]

Recent years have also seen significant developments in cross-linking reagents. To overcome the challenge of identifying cross-linked peptides in the mixed spectra generated from a complex mixture of cross-linked proteins with various intermediate products, Bruce laboratory developed Protein Interaction Reporter (PIR) technology.[112] In their methodology, the cross-linking reagent is designed to contain two labile bonds that can be cleaved during MS/MS analysis. Upon cleavage, a reporter ion is released to mark the presence of a cross-linked peptide, while cleavage of the second labile bond generates single peptides from the cross-linked pair for further fragmentation and sequencing. This technology was utilized in the study of the Potato leafroll virus capsid structure and in defining interactions of bacterial chaperones and membrane proteins.[113-115]

Cross-linking with formaldehyde has also been utilized in mouse models, where the reagent was introduced via transcardiac perfusion in a time-controlled manner.[116] This method was applied in combination with isotopic labeling with iTRAQ to assign interaction specificity in studies of cellular prion protein (PrP<sup>c</sup>), oxidative stress sensor DJ-1, and amyloid precursor protein interactomes.[116-119] In addition to identifying specific interactions of PrP<sup>c</sup>, Watts et al. also suggested that information derived from the MS/MS analysis of cross-linked proteins could be used to distinguish direct and indirect interactions.

[118] For instance, proteins that have high sequence coverage and share similar domain structures were most likely to represent direct interacting partners.

The task of identifying transient, stable, direct, and indirect interactions is not trivial. However, metabolic labeling and cross-linking approaches incorporated into IP-MS workflows discussed above have significantly aided these studies. There is no doubt that studies of protein-protein interactions and resulting macromolecular complexes will continue to expand our understanding of critical biological processes. Further methodological developments are needed. Approaches that specifically capture one moment in a cellular process, temporally and spatially defined, are continuously being developed and improved. While studies in cell systems provide simple models with extraordinary specificity and insight into concrete cellular pathways, expansion of interaction studies to animal models allow for in vivo validation and a systems view of the changes caused by perturbations in a single protein functions. As protein interactions are at the core of cellular, tissue, and organ functions, their study will continue to shed light onto fundamental questions in both basic science and clinical research.

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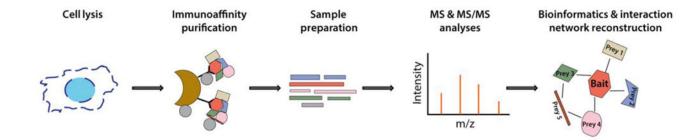
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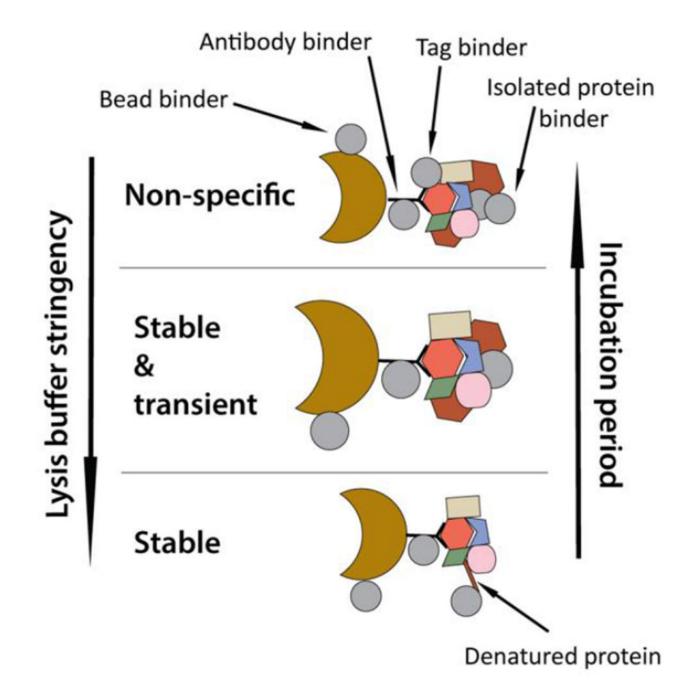
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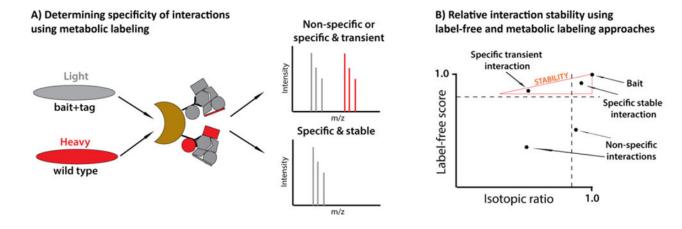
# Figure 1. Common workflow for immunoaffinity purification mass spectrometry experiments

Cells expressing the protein of interest are lysed and protein complexes are isolated by immunoaffinity purification. Eluted proteins are processed for MS analysis. MS spectra are analyzed to identify proteins within isolated complex(es) and bioinformatics tools are implemented to generate protein interaction networks.



#### Figure 2. Dependence of interaction specificity on IP conditions

Optimized lysis and incubation conditions, such as stringency of lysis buffer and incubation time with beads and antibodies, allow retention of specific stable and transient interactions, while reducing the number of non-specific associations. The latter include proteins that bind to beads, tag, immunoglobulin molecules, or to specific isolated proteins.



# Figure 3. Determining specificity and relative stability of interactions using label-free and metabolic labeling approaches

A) In the I-DIRT approach, wild type cells grown in "heavy" medium and cells expressing the tagged protein of interest grown in "light" medium are mixed prior to IP. Isolated complexes are analyzed by MS and isotopic ratios for each protein are indicative of the specificity and stability of the interaction. B) When label-free quantification (e.g., SAINT) is combined with a metabolic labeling approach (e.g., I-DIRT), the relative stability of interactions can be assessed. Specific transient interactions can be observed with high SAINT scores and low I-DIRT ratios.