Rapid, optimized interactomic screening

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We must reliably map the interactomes of cellular macromolecular complexes in order to fully explore and understand biological systems. However, there are no methods to accurately predict how to capture a given macromolecular complex with its physiological binding partners. Here, we present a screening method that comprehensively explores the parameters affecting the stability of interactions in affinity-captured complexes, enabling the discovery of physiological binding partners in unparalleled detail. We have implemented this screen on several macromolecular complexes from a variety of organisms, revealing novel profiles for even well-studied proteins. Our approach is robust, economical and automatable, providing inroads to the rigorous, systematic dissection of cellular interactomes.

High-throughput DNA sequencing facilitates whole-genome characterization within weeks1,2. Likewise, advances in mass spectrometry (MS)3,4 are enabling cellular proteomes to be defined. However, we have yet to exhaustively map any interactome—the cell’s comprehensive biomolecular interaction network5,6; we may have identified less than 20% of the protein interactions in humans, not counting dynamic, tissue- or disease-specific interactions7–9.

A main approach for interactomic exploration is affinity capture10. For this, cells are lysed and their contents extracted into a solution that ideally preserves each target macromolecular complex. Complexes are then specifically enriched from the cell extract using affinity reagents—usually antibodies—that recognize the target, either directly or through an epitope tag, thus permitting subsequent characterization of the complex. However, one of the foremost challenges with affinity capture studies is the precise optimization of the extraction conditions because no single condition is optimal for the preservation of the many different types of interactions found in macromolecular complexes10. As a result, affinity capture experiments either require time-consuming optimization on a case-by-case basis, or a compromise must be made by using unoptimized conditions; the latter is a common strategy but often results in sparse coverage of protein–protein interactions and error-prone data11–13. A variety of advanced bioinformatics tools14,15 and databases of common contaminant proteomes16,17 have attempted to mitigate this problem, but they cannot fully substitute for optimized sample preparation11. Because any given extraction solution influences the complement of copurifying proteins, multiple extractant formulations are required if one intends to broadly sample the interactome, as underscored by a recent high-throughput study of membrane-protein interactions in yeast18.

The problem of maintaining post-extraction protein–complex stability is comparable to that which once hindered protein crystallographic efforts. For crystallography, the answer came with the development of massively parallel crystallization optimization screens19,20 that allow hundreds of conditions to be simultaneously explored. Inspired by this, we have developed improved methods for the rapid processing of cellular material in conjunction with parallelized, multiparameter searches of extraction conditions. Our approach is compatible with both standard lab-scale investigations and high-throughput robotics, and it facilitates the systematic exploration of the interactome of any given protein in a cell.

RESULTS

Designing a large-scale interactomics screen

Our strategy (Fig. 1) starts with the distribution of cryo-milled cell material21,22 to a multiwell plate. To enable the uniform delivery of frozen cell powder to each well in the plate, we designed dispensing manifolds (Fig. 1 and Supplementary Fig. 1a,b). After being dispensed, the powder in the wells is thawed by addition of an array of distinct extractants. The resulting extracts are clarified of insoluble material using a clog-resistant filtration device (Fig. 1 and Supplementary Fig. 1c,d) that provides a filtrate matching the quality of centrifugally clarified cell extract. The remainder of the procedure implements commercially available supplies and equipment (Online Methods and Supplementary Protocol 1). Our screen allowed us to thoroughly explore reagents commonly used in affinity capture experiments: salts, buffers and detergents (Fig. 2a and Supplementary Table 1).
Proteins are labeled in accordance with standard. Duplicate experiments produced identical results (not shown).

The effects of changing affinity capture conditions in a rapid, the composition of affinity-captured samples, faithfully revealing a twofold. First, SDS-PAGE provides a representative readout of low acetate or high citrate/acetate (\(\text{Kap95p, Kap60p and Nup1p-SpA}\))—revealed in most conditions—Kap95p, Kap60p and Nup1p-SpA—arranged in accordance with the most complicated and highly similar profiles, representing the aid of a 96-well magnetic separator. (iv) Elution of the complexes is followed by SDS-PAGE, Coomassie blue staining and (as desired) MS analysis. The resulting copurification profiles are cross-compared to infer interactomes and determine preparative conditions appropriate for further experiments. The gel on the left shows a comparison of SDS-PAGE analysis of yeast Nup53p-SpA immunopurification with both extract clarification methods: centrifugation at 20,000 \(\text{g}\) for 10 min (Cent) and filtration at 3,000 \(\text{g}\) for 5 min (Filt); MW, molecular weight standard. Duplicate experiments produced identical results (not shown).

Evaluation of affinity capture profiles

Because large amounts of data were generated during screening, we developed a web portal to assist in affinity capture data management. Our software (described in Supplementary Note 1 and publicly accessible at http://www.copurification.org/) accepts images of gels along with experimental metadata. Gel images are automatically sectored lane-by-lane and annotated with the conditions applied to each, respectively. The lanes are also clustered according to protein banding pattern similarity, to ease the discovery of lane-to-lane differences and trends (for example, Fig. 2b). This database provides a platform for the work of different experimentalists to be compared side by side, with instantaneous access to the respective experimental conditions for ease of reproduction.

There are two commonly used approaches for analyzing affinity-captured samples: (i) SDS-PAGE with dye-based visualization and subsequent MS of select conditions and (ii) direct MS of the samples. We compared these two approaches for the 96-well purification of Nup1p, a component of the yeast nuclear pore complex (NPC), exploring a diverse set of extraction conditions. Two replicates were carried out for the comparison: one set resolved by SDS-PAGE and stained with Coomassie blue (Supplementary Fig. 2), the other set processed for liquid chromatography–tandem MS (LC-MS/MS) (Supplementary Table 2 and Online Methods). Dendrograms of the data sets were produced as follows: (i) for SDS–PAGE, we used our software to cluster the lanes on the basis of the intensity rank of bands exhibiting similar apparent molecular masses (Fig. 2b, Supplementary Table 3 and Supplementary Fig. 3); (ii) for MS, we clustered the filtered data according to the presence of common proteins (Fig. 2b and Supplementary Fig. 3). The resulting dendrograms exhibited a statistically significant similarity (\(P < 1 \times 10^{-7}\), permutation test; Supplementary Fig. 4). Three proteins were revealed in most conditions—Kap95p, Kap60p and Nup1p-SpA—and a larger number of proteins were observed in, for example, low acetate or high citrate/acetate (Fig. 2b). Our conclusions are twofold. First, SDS–PAGE provides a representative readout of the composition of affinity-captured samples, faithfully revealing the effects of changing affinity capture conditions in a rapid, robust and inexpensive fashion. Second, with sufficient resources, direct sample-to-MS analytical approaches may be used.

Exploring the molecular organization of a 50-MDa complex

The yeast NPC is \(\sim 50\) MDa and consists of multiple copies of \(\sim 30\) different proteins. It presents an excellent test bed for our screen because it comprises a diverse physicochemical landscape and has a modular architecture consisting of subcomplexes of different sizes. Moreover, an extensive catalog of already existing affinity capture results enabled us to assess our findings and the quality of results produced by the screen. On the basis of the above-described initial results, we further modified our conditions matrix to test other reagents and applied three optimal conditions to SpA-tagged NPC proteins Nup1p, Nup53p and Pom152p (Fig. 3a).

Interestingly, all three proteins responded similarly to the extraction conditions (Online Methods), exhibiting improvements in yield, background and hierarchical coverage compared to the best results previously obtained: condition (i) gave small complexes with few interactors for all three and no common components; condition (ii) gave more complicated profiles that partially overlapped in composition with each other; and condition (iii) gave the most complicated and highly similar profiles, representing almost the entirety of the NPC (Supplementary Data). Although distinctive, the profiles were in agreement with the established arrangement of proteins in the NPC, constituting interaction shells of increasing size and degree of overlap (Fig. 3b).

Figure 1 | Schematic representation of the parallelized affinity capture procedure. (i) Cells expressing a tagged protein of interest are cryo-milled, and precise aliquots of the resulting frozen powder are deposited into a multiwell plate using an in-house–made dispensing manifold of adjustable well volume. A diverse set of extraction solvents is rapidly added in parallel, and the powder is resuspended completely by mechanical agitation and brief sonication. (ii) Rapid removal of insoluble material is achieved either by centrifugation or using a novel deep-bed filtration device. (iii) Magnetic bead–based affinity capture is performed on the clarified extract; affinity medium is collected, washed and eluted with the aid of a 96-well magnetic separator. (iv) Elution of the complexes is followed by SDS-PAGE, Coomassie blue staining and (as desired) MS analysis. The resulting copurification profiles are cross-compared to infer interactomes and determine preparative conditions appropriate for further experiments. The gel on the left shows a comparison of SDS-PAGE analysis of yeast Nup53p-SpA immunopurification with both extract clarification methods: centrifugation at 20,000 \(\text{g}\) for 10 min (Cent) and filtration at 3,000 \(\text{g}\) for 5 min (Filt); MW, molecular weight standard. Duplicate experiments produced identical results (not shown). Proteins are labeled in accordance with Figure 3a. See Online Methods for extraction solvent composition.
Taken together, these results demonstrated that this screen could be used for the systematic interrogation of optimized purification conditions and comprehensive interactomic mapping of different macromolecular complexes.

**Robotic automation for higher throughput**

Translation to automation has several advantages, including increased throughput and reproducibility. Using a liquid-handling robot, we developed a version of the screen that includes automated production of extractant matrices and sample handling from the addition of affinity medium to clarified extracts through to the final wash. Given the intriguing results observed using trisodium citrate to purify nuclear pore subcomplexes (for example, Fig. 3a), we implemented automation to systematically explore the effect of this reagent on Nup53p-SpA affinity capture profiles over 48 increments from 50 to 300 mM. We observed three distinct profiles: copurification with Nup170p and Kap121p (iv); dimer with Nup170p (v); and a larger subcomplex of the NPC—Nup192p, Nup188p, Nup170p, Nup116p, Nup120p, Nsp1p and Nic96p (vi) (Fig. 3c and Supplementary Note 2). These results demonstrated that the automated procedure was precise and revealed systematic changes in the copurification pattern specific to trisodium citrate, which involved the loss of Kap121p and the increased retention of a large number of NPC components as the concentration increased.

**Simultaneous mapping of distinct interaction networks**

We tested the screen on many different types of macromolecular complexes. We examined four proteins with two different tags acquired from commercial collections. These proteins (Arp2p-GFP, Csl4p-TAP, Snu71p-TAP and Rtn1p-GFP) exhibit distinct subcellular localization patterns and functions. Each protein was subjected to a 32-condition screen (Supplementary Figs. 5–8), which allowed us to assay multiple proteins within the same 96-well plate. High-quality copurification profiles were obtained (Fig. 4a and Supplementary Data), including the observation of novel and distinctive copurification patterns for proteins already extensively subjected to affinity capture MS strategies.

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**Figure 2** | Extraction condition design and copurification pattern analysis. (a) Diagram showing mixtures of components in select extraction solvent formulations. The main components are a pH buffer, one or two salts, an additive and a detergent. Some examples of useful formulations discovered through screening are indicated (right; refer to Fig. 4 to view the associated copurification patterns, indicated by Roman numerals). (b) Comparison of SDS-PAGE (left) and LC-MS/MS (right) clustering analysis of Nup1p-SpA 96-well purification. For comparison, MS data are represented as a pseudo-gel, where each band corresponds to a protein above a certain intensity threshold (see Online Methods). Known Nup1p-interacting proteins are indicated with blue bands; the rest are labeled black. Coclustering conditions with identical or highly similar components producing distinct copurification profiles over 48 increments from 50 to 300 mM. We observed increased throughput and reproducibility. Using a liquid-handling robot, we developed a version of the screen that includes automated production of extractant matrices and sample handling from the addition of affinity medium to clarified extracts through to the final wash. Given the intriguing results observed using trisodium citrate to purify nuclear pore subcomplexes (for example, Fig. 3a), we implemented automation to systematically explore the effect of this reagent on Nup53p-SpA affinity capture profiles over 48 increments from 50 to 300 mM. We observed three distinct profiles: copurification with Nup170p and Kap121p (iv); dimer with Nup170p (v); and a larger subcomplex of the NPC—Nup192p, Nup188p, Nup170p, Nup116p, Nup120p, Nsp1p and Nic96p (vi) (Fig. 3c and Supplementary Note 2). These results demonstrated that the automated procedure was precise and revealed systematic changes in the copurification pattern specific to trisodium citrate, which involved the loss of Kap121p and the increased retention of a large number of NPC components as the concentration increased.

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The Arp2/3 complex is a conserved actin nucleator that participates in multiple actin-dependent processes, including endocytosis. Screening revealed a putative novel macromolecular assembly composed of clathrin (Chc1p) with its adaptor protein (Ent2p) and actin (Act1p) with its recruiting and activating proteins (Pan1p, End3p and Arp2p/GFP, i). Of these, however, only Act1p and Pan1p are known to physically interact with Arp2p. As End3p is linked to Arp2p genetically and no direct links between Arp2p and Ent2p have been demonstrated, we chose to perform a secondary affinity capture for GFP-tagged versions of these proteins. The results (Fig. 4a, Ent2p-GFP, Ent3p-GFP and Arp2p-GFP, i) supported the role of Pan1p as a core scaffold that couples actin and clathrin with the rest of the endocytic machinery in an interaction network involved in the early stages of actin-dependent clathrin-mediated endocytosis.

Csl4p is a component of the eukaryotic exosome, a modular multiprotein RNase with compartment-specific components. Screening revealed a putative novel macromolecular assembly composed of clathrin (Chc1p) with its adaptor protein (Ent2p) and actin (Act1p) with its recruiting and activating proteins (Pan1p, End3p and Arp2p/GFP, i). Of these, however, only Act1p and Pan1p are known to physically interact with Arp2p. As End3p is linked to Arp2p genetically and no direct links between Arp2p and Ent2p have been demonstrated, we chose to perform a secondary affinity capture for GFP-tagged versions of these proteins. The results (Fig. 4a, Ent2p-GFP, Ent3p-GFP and Arp2p-GFP, i) supported the role of Pan1p as a core scaffold that couples actin and clathrin with the rest of the endocytic machinery in an interaction network involved in the early stages of actin-dependent clathrin-mediated endocytosis.

Csl4p is a component of the eukaryotic exosome, a modular multiprotein RNase with compartment-specific components. Screening revealed that selectively destabilized the compartment-specific components Rrp6p, Lrp1p, and Ski7p (Fig. 4a, Csl4p-TAP, iii and iv), compared with the canonical exosome, profile ii), while retaining the component Dis3p. Owing to the relative stabilities of these different components in established purification conditions, yeast strains with genetic deletions have been necessary to obtain comparable complexes in previous experiments (for example, ref. 33). In a separate profile, we observed components of the cytoplasmic exosome cofactor Ski complex (Fig. 4a, Csl4p-TAP, i), which are considered recalcitrant to copurification.

Snuf1p is a component of the U1 small nuclear ribonucleoprotein (snRNP) complex, a constituent of the spliceosome. Of interest, we purified U1 snRNP (Fig. 4a, Snuf1p-TAP, ii) with nuclear mRNA–associated proteins Sto1p and Pab1p and the major coat protein of SceVLA virus, which is known to covalently bind the mRNA cap (Fig. 4a, Snuf1p-TAP, i). We also noted a profile demonstrating a direct interaction between Snuf1p and Prp40p (Fig. 4a, Snuf1p-TAP, iii). Despite more than a decade of research on the composition of this complex, this dimer was unambiguously shown only recently by the introduction of a deletion mutation to a third constituent of this 17-component ribonucleoprotein. Here, it was obtained within a single screen.

Rtn1p, an integral endoplasmic reticulum (ER) membrane component, embodies many of the challenges to affinity capture approaches: it is spread between multiple localizations and functions, is expected to form particularly dynamic or transient interactions, and is often difficult to purify due to its high abundance in the cell. Despite these challenges, Rtn1p was successfully purified using affinity capture approaches, demonstrating the versatility and power of these methods for the study of intracellular protein–protein interactions.
Figure 4 | Affinity capture strategy implementation on different protein complexes, affinities tags and model organisms. (a–c) Affinity capture profiles for *Saccharomyces cerevisiae* (a), *Escherichia coli* (b) and *Homo sapiens* (c). Representative SDS-PAGE profiles are shown. The cell schematics indicate the localization of the tagged proteins; the different tagged proteins screened are indicated in black; each lane corresponds to a different purification and is assigned an arbitrary roman numeral (see Supplementary Table 1 and Online Methods for extraction solvent compositions).

Some of the newly identified putative interactors were subjected to affinity capture (labeled in brown), and the resulting profiles are indicated by arced arrows originating from the profiles in which they were identified. Copurifying protein bands identified by MS are marked next to each profile (see Supplementary Data). Protein names in blue are previously characterized physical interactors; those in red are select novel physical interactors or proteins of interest discussed in the main text; and those in gray are contaminants or proteins of indeterminate specificity on the basis of their high frequency of copurification or as determined by I-DIRT analysis (Fig. 5a). Asterisks indicate heavy and light chains of the antibody used for affinity capture.
Adaptability of the screen for diverse model organisms

Different model organisms often exhibit idiosyncrasies associated with affinity capture experiments. Our screen allows alternatives to be explored at each step. For example, an issue found with *Escherichia coli* was the high viscosity of cell extracts due to high concentrations of released genomic DNA. We therefore modified our procedure to include a short low-energy sonication using a multtiprobe, sufficient to resuspend the frozen cell powder during extraction and reduce viscosity to levels compatible with affinity capture. Similarly, low quantities of starting material may present an issue when working with tissue culture cells. Thus, we also modified the screen for a 24-well format in order to economize on cell usage. In our procedure, the mass of yeast cell pellet required per purification was reduced from the typical order of grams to the range of tens to hundreds of milligrams; similarly, we consumed only 50 mg of cryo-milled human cells per profile, an approximately eightfold reduction from the amounts used in contemporary high-throughput studies. These modifications therefore enabled economical interacomic screens in diverse model organisms.

From *E. coli* we purified the RNA polymerase complex corresponding to the e70 containing holoenzyme in complex with RapA and RpoC-SPa isolated away from RNA polymerase (Supplementary Data and Fig. 4b, RpoC-SPa, i and ii), demonstrating that the implemented modifications provide affinity capture results comparable in quality to those from yeast (Supplementary Fig. 9). Using human cells, we revisited the RNA exosome, conducting purifications via a 3×Flag-tagged hRRP6 (EXOSC10) and thereby adding another common tag variety to those tested thus far (Supplementary Fig. 10). Among our observations, we noted the stable retention of SKIV2L2 (hMTR4) in numerous interaction profiles (Supplementary Data; see also Supplementary Note 2). SKIV2L2 is also a member of the nuclear-specific human exosome cofactor NEXT complex, along with ZCCHC8 and RBM7. We also observed ZCCHC8, in human exosome profiles (for example, Fig. 4c RRP6-3×Flag, i and ii), raising the question as to whether a single copy or multiple copies of SKIV2L2 are present in the combined exosome/NEXT-containing fractions. To extend our exploration, we applied this screen to the NEXT complex itself, purified via LAP-tagged RBM7 (Supplementary Fig. 11). We observed NEXT in association with NCBP1 (CBP80), SRRT (AR52) and ZC3H18 (NHN1) (Supplementary Data and Fig. 4c, RBM7-LAP, i; see also Supplementary Note 2). A parallel study demonstrated the physiological relevance of these interactors via a suite of functional assays. We also made the novel observation of a direct interaction between RBM7 and ZCCHC8 (Fig. 4c, RBM7-LAP, ii vs. iii), demonstrating that these interactors form a stable dimer.

**DISCUSSION**

The solvent environment of the extractant plays a crucial role in dictating the stability of both real and artificial protein–protein interactions during affinity capture; and finding extractants that maximally explore the real interactome while minimizing artifacts can be difficult. Our approach addresses this limitation, providing a fast, efficient and cost-effective means to scan many conditions for their ability to preserve physiological interactions and minimize noise. This is particularly important for researchers that hope to go beyond protein identifications and obtain high-quality protein preparations for biochemical and structural studies.

Doubtless because of the huge diversity of interaction types, we do not observe one set of conditions that works well for all the protein interactomes we have studied, thus underscoring the need for our screen. However, encouragingly, our results suggest that the optimal set of extraction conditions determined for a subset of constituents in a given complex will suffice for the interactomic exploration of all the components in that complex (for example, Fig. 3a). Moreover, we observed that during the secondary affinity capture of putative interactors identified in a primary screen (i.e., biochemical validation), copurification profiles containing both overlapping and distinct proteins were frequently obtained (see, for example, Figs. 3a and 4a, Arp2GFP and Rtn1p-GFP, and Fig. 4c, RRP6-3×Flag and RBM7-LAP)—highlighting...
the potential of this screen to uncover local (sub)complexes as well as the broader interactome. These combined attributes are particularly important given the current efforts to create a “human proteome encyclopedia”56, which will undoubtedly require rigorous attention by any investigator to the preparation of the highest-quality samples for affinity capture MS analyses.

For general purposes, we favor SDS-PAGE with protein staining for sample quality assessment followed by band excision and MS to determine protein identities. Our findings, time and again, reinforced the notion that high-quality affinity capture experiments are typified in SDS-PAGE profiles by a discrete pattern of sharp, abundant and roughly stoichiometric bands as well as a paucity of background staining from other fainter bands (see, for example, refs. 23, 36 and Figs. 3a and 4). The existence of increasingly sensitive general protein stains provides gel-based visualization options even for very low-abundance samples57. These criteria in turn allow for the judicious application of MS analyses to only the most potentially informative samples.

When tens to hundreds of SDS-PAGE protein copurification profiles are viewed in parallel, patterns of common and changing proteins and their solvent dependencies typically become readily apparent, and several promising conditions reveal themselves. A typical 96-well screen, as a consequence of being thorough, may yield many gel lanes with comparable banding profiles (Fig. 2b) and many that do not meet the criteria for further analysis. To modulate between throughput and screen breadth, one can adjust the total number of conditions (presented here in multiples of 96, 32 and 24).

A promising protein copurification profile accompanied by high-quality MS-based protein identifications provides a strong basis for a hypothesis regarding the existence of a physically associated protein complex in vivo. Such data should encourage the design of orthogonal experiments intended to rigorously test this hypothesis. Hence, in one sense, the presented screen can be considered a rapid and efficient hypothesis-generation machine for physical interactions.

Our procedure is also compatible with direct sample-to-MS analyses (Fig. 2b) and can be implemented using robotic automation (Fig. 3c), which greatly enhances throughput. Future data-mining opportunities will include the development of unsupervised, machine-based classification schemes to further improve our ability to identify promising samples, thus augmenting high-throughput interactomic studies.

METHODS

Methods and any associated references are available in the online version of the paper.

Note: Any Supplementary Information and Source Data files are available in the online version of the paper.

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AUTHOR CONTRIBUTIONS

J.L. and M.P.R. conceived the screening strategy; J.L. carried out proof-of-concept experiments, assisted by L.E.H. and V.S., designed manifolds, which were fabricated by V.S. and tested by L.E.H., J.L. and Z.H.; filters were designed by A.A.O., A.R.O. and J.L., fabricated by A.A.O. and A.R.O., and tested by J.L. and Z.H.; J.L., Z.H. and M.D. designed experiments, executed screens and further developed procedures—with yeast work primarily carried out by Z.H. and human cell line work primarily carried out by M.D.; MS analyses were carried out by J.L., Z.H. and K.R.M., with I-DIRT done by Z.H.; transposing the procedure to robotic automation was carried out by D.J.D. assisted by J.L., J.L., Z.H. and D.F. conceived of the protein copurification gel database and software, which was built by S.K. and D.F. with testing and feedback from J.L. and Z.H.; J.D.A., D.F., B.T.C., T.H.J., M.P.R. and J.L. supervised the project; Z.H., B.T.C., M.P.R. and J.L. wrote the paper.

COMPETING FINANCIAL INTERESTS

The authors declare competing financial interests: details are available in the online version of the paper.

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ONLINE METHODS

Affinity capture. All cell lines and strains used in this study are listed in Supplementary Table 5. Yeast, *E. coli* and human cell lines were cultured using standard procedures and were cryo-milled and affinity captured essentially as previously described21,22, except we adapted the experiments for 96-well plates as described in the text and elaborated stepwise in Supplementary Protocol 1. Human cell lines were not subjected to mycoplasma testing during the course of the study. Rabbit IgG used for purifying TAP and SpA tagged proteins was purchased from Innovative Research. Anti-GFP polyclonal antibodies were prepared and conjugated as previously described22, except the concentration of ammonium sulfate used during the conjugation was 1.5 M. In all cases, proteins were eluted from the affinity medium by the addition of 1× NuPAGE LDS sample loading solution (Life Technologies); elution of GFP-tagged proteins included incubation at 70 °C for 10 min. Extraction solvent working solutions were mixed from concentrated stock solutions in 2.5-ml deep-well plates (VWR) for (i) was 0.3 mM Sarkosyl, 40 mM Tris, pH 8; for (ii) was 250 mM trisodium citrate, 10 mM Brij58, 300 mM NaCl, 0.1% (v/v) Tween-20, 2 mM EDTA, 40 mM Tris, pH 8; for (iii) was 1.5 M ammonium acetate, 1% (v/v) Triton X-100. In Supplementary Figure 13, shows the bead-dispensing manifold used in yeast affinity capture experiments. Custom-manufactured filters (Fig. 1, ii and Supplementary Fig. 1c,d Orochem Technologies) were used to clarify yeast cell extracts for screens; otherwise, extracts were clarified by centrifugation at 14,000 r.p.m. and 4 °C for 10 min in a benchtop microcentrifuge. To ensure reproducibility, we repeated all purifications presented (and processed for MS) individually in microcentrifuge tubes using an otherwise comparable procedure except that extracts were clarified via centrifugation. Polycrylamide gels were stained either with a homemade colloidal Coomassie brilliant blue G-250 solution58 or with Imperial protein stain (Thermo Fisher Scientific). Gel images were recorded in TIFF using a Fujifilm LAS-3000 or an Epson Photo v700. In addition to the cited publications, detailed protocols for many preparatory procedures used in this study can be obtained at http://www.ncdir.org/public-resources/protocols/.

Affinity capture solvent compositions for immunopurifications in the main figures. Extractant formulations referenced in the figure legends are provided below. The remaining extractant formulations are presented in Supplementary Table 1.

In Figure 1, iv, Nup53p-SpA, the composition was 40 mM Tris-Cl, pH 8, 250 mM trisodium citrate, 150 mM NaCl, 1% (v/v) Triton X-100. In Figure 3a, Nup1p-SpA, Nup53p-SpA and Pom152p-SpA, the composition for (i) was 50 mM trisodium citrate, 300 mM NaCl, 0.1% (v/v) Tween-20, 2 mM EDTA, 40 mM Tris, pH 8; for (ii) was 250 mM trisodium citrate, 10 mM Brij58, 0.3 mM Sarkosyl, 40 mM Tris, pH 8; and for (iii) was 1.5 M ammonium acetate, 1% (v/v) Triton X-100. In Figure 3c, 40 mM Tris-Cl, pH 8, 1% (v/v) Triton X-100 are common to all lanes; trisodium citrate was present at 50–300 mM concentration in 5 mM increments. In Figure 4a, Ent2p and End3p, the composition was 40 mM Tris-Cl, pH 8, 150 mM NaCl, 250 mM trisodium citrate, 10 mM deoxy-BigCHAP; and for Tcb1p, Tcb2p, Tcb3p and Dpm1p was 40 mM Tris-Cl, pH 8, 150 mM NaCl, 50 mM trisodium citrate, 5 mM CHAPS.

Standard mass spectrometric identification of proteins. The major bands observed in SDS-polyacrylamide gels were excised and analyzed either by MALDI-TOF-MS essentially as previously described22 or by nanoLC-ESI-MS/MS on an LTQ Orbitrap XL, Orbitrap Velos, Q Exactive Plus or Orbitrap Fusion mass spectrometer (Thermo Fisher Scientific). For analysis of excised protein bands using the LTQ Orbitrap XL or Orbitrap Velos, the dry peptides were resuspended in 0.5% (v/v) acetic acid, pressure loaded on a self-packed C18 column and subjected to a 10-min gradient: 8 min 0–43%, 2 min 43–100% solvent B (solvent A = 0.1 M acetic acid in water; solvent B = 0.1 M acetic acid, 70% (v/v) acetonitrile in water, flow rate 200 nl/min). As peptides eluted, the top ten peaks were selected for fragmentation, without dynamic exclusion. For analysis on the Q Exactive Plus and Orbitrap Fusion, peptides were resuspended in 0.1% (v/v) formic acid and separated using a 10-min gradient (8 min 0–30%, 2 min 30–100%) on an EASY-Spray column (Thermo Fisher Scientific) using an EASY-nLC 1000 (Thermo Fisher Scientific; solvent A = 0.1% (v/v) formic acid in water, solvent B = 0.1% (v/v) formic acid in acetonitrile, flow rate 300 nl/min). The three most abundant ions in each full scan were fragmented by HCD on the Q Exactive Plus. On the Orbitrap Fusion, a fixed duty cycle of 3 s was used. The RAW files were converted to MZXML format with the MM File Conversion tool (http://www.massmatrix.net/mm-cgi/downloads.py/) or MGF format by ProteoWizard59 and searched against the yeast protein database with X! Tandem60.

For the analysis of whole affinity captured fractions in Figures 2b and 5b, protein samples were run ~4–6 mm into an SDS-polyacrylamide gel (gel plug), and gels were stained with Coomassie blue. Stained gel regions were excised, cut into 1-mm cubes, destained and digested for 6 h with 120 μl of 3.1 ng/μl trypsin (Promega) in 25 mM ammonium bicarbonate. An equal volume of 2.5 mg/ml POROS R2 20-μm beads (Life Technologies) in 5% (v/v) formic acid, 0.2% (v/v) trifluoroacetic acid was added, and the mixture was incubated at 4 °C for 24 h. Digests were desalted on C18 tips, eluted, dried by vacuum centrifugation, resuspended in 0.1% formic acid and separated using a 10-min gradient on an EASY-Spray column (as above). The 12 most abundant ions were selected from each full scan and fragmented by HCD; dynamic exclusion was enabled. RAW files were converted and searched as above. In order to determine the molecular functions of constituent proteins (Fig. 5b), we searched the gene descriptions for key words (as for I-DIRT analysis; see below).

Gel and MS data clustering and correlation analysis. The details of the gel image analysis are provided in the Supplementary Note 1; the source code is publicly available at https://github.com/Fenyolab/copurification/. Once the lanes were sectored and bands identified, quantified and assigned an apparent molecular weight, they were categorized as dark, light or not observed (Fig. 2b and Supplementary Fig. 3).

Supplementary Table 2 contains the unfiltered search results of 96 LC-MS/MS runs. For each sample, we extracted the intensities of all the hits, filtered out exogenous and endogenous contaminants (Supplementary Table 3) and considered the hits that...
were at least 10% as intense as the most intense hit (after initial contaminant filtering). We used a modified version of a source code available at the GPM repository ftp://ftp.thegpm.org/ to output the resulting protein sets as a pseudo-gel (Fig. 2b and Supplementary Fig. 3).

For both data sets, the Ward method was used for hierarchical clustering with distance between data points calculated as Euclidean distance61. To perform the correlation, we calculated the cophenetic distance for the gel and MS dendrograms62. The cophenetic correlation was then calculated, which is defined as the Pearson correlation between the cophenetic distance matrices of the dendrograms63. A P value was obtained by a permutation test; the labels of the MS dendrogram were shuffled 10 million times, and a correlation calculated between the MS and gel dendrograms for each random shuffle (see Supplementary Fig. 4 for frequency distribution). A P value of <1 × 10−7 was calculated as a proportion of the random distribution equal to or greater than the actual correlation (0.53).

Graphical representation of NPC subcomplexes. We used the density maps for individual nucleoporins available at http://salilab.org/npc/ and the UCSF Chimera package63 to graphically represent the NPC subcomplexes.

I-DIRT data analysis. I-DIRT was carried out essentially as previously described64: the Rtn1-GFP strain was grown in synthetic complete minimal medium lacking lysine and supplemented with 50 mg/l of isotopically light lysine, and a wild-type DF5Δ strain was grown in the same medium but supplemented with 50 mg/l of isotopically heavy lysine (l-lysine:2HCl 13C6, Cambridge Isotopes). Both were frozen, mixed and cryo-milled. Rtn1-GFP was affinity captured from the mixed powder extracted in 40 mM Tris-Cl pH 8, 50 mM trisodium citrate, 150 mM NaCl and 5 mM CHAPS. The eluted sample was reduced, alkylated and precipitated with 50 mM ammonium bicarbonate, 0.1% (w/v) RapiGest (Waters) via bath sonication with heating (20 min at 70 °C, followed by 2 min at 95 °C). The proteins were digested with trypsin (Promega) overnight. RapiGest was depleted following the manufacturer’s instructions, and the digest was desalted over C18 Omix tips (Agilent Technologies). The eluted fractions were analyzed on LTQ Orbitrap XL as described before except with 1-h gradient and dynamic exclusion enabled. The output data were processed with MaxQuant65 (http://maxquant.org/) using essentially the default parameters (for the light sample, all amino acids were set to light; for the heavy sample, 6-Da heavy lysine was selected; the yeast translated ORF sequences (http://www.yeastgenome.org/), reversed sequences and contaminants database were searched) to identify and measure the intensity of heavy and light peptides. The “Evidence.txt” file containing all the peptide identifications and heavy/light measurements was used in the final analysis. Peptides mapped to contaminants, constituents of a reversed sequence database or those containing no lysine were excluded from the analysis. We further excluded nonunique peptides and peptides with a single MS/MS fragmentation event. For the remaining peptides, I-DIRT ratios were calculated by dividing the intensity of the peptide with light lysine by the total intensity (light and heavy). To calculate the I-DIRT ratio of proteins, we averaged the I-DIRT ratios of its constituent peptides. Proteins with a single peptide contributing to the I-DIRT ratio measurement were excluded from the analysis as unreliable. For proteins with four or more peptides contributing to the I-DIRT ratio measurement, those peptides with outlying I-DIRT ratios were filtered out (no more than one peptide removed per protein) using the following criteria: if the calculated I-DIRT ratio for a peptide was <Q1 (first quartile) to 1.5 × IQR (interquartile range) or >Q3 (third quartile) + (1.5 × IQR), that peptide was excluded. All statistical calculations and plotting were done with R (http://www.r-project.org/)66. To assess the normality of protein I-DIRT ratio distribution, we constructed a Q-Q plot, which revealed a notable deviation from the y = x line, implying that the data were not normally distributed (Supplementary Fig. 14). To assess the shape of the distribution, we binned the data in 5% intervals (Supplementary Fig. 15). Despite a low bimodality coefficient67,68 (0.2956), the distribution deviates significantly from unimodal by the Hartigan’s dip test69 (P value = 0) and has a positive Akaike’s information criterion difference70 (0.1061)—suggesting bimodality. We used the Mixtools package in R71 to fit two normal distributions to the data (Supplementary Fig. 15). We accepted a cutoff of mean ± 2 s.d. of the second distribution as stable interactors of Rtn1p (≥85%). We considered anything below 85% to constitute interactions indistinguishable from those formed post-extraction. In order to determine the molecular functions of constituent proteins, we searched the gene descriptions for key words. The following were the categories and key words searched: Endoplasmic reticulum—“er”/“endoplasmic reticulum”; Sugar metabolism—“glycolysis”/“gluconeogenesis”/“glucose”/“glycolytic”/“pentose”; Vacuole—“vacuol”; Ribosome/translation — “ribosom”/“translat”; Lipid metabolism—“lipid”/“fatty acid”/“choline”/“sterol”/“ceramide”; Mitochondrion—“mitochond”; Other—everything that didn’t match. All searches were case insensitive. Once a gene description matched a key word, the protein encoded by the gene was put into the corresponding category, allowing us to count the number of proteins in each category and construct a pie chart of the distribution of molecular functions and localization for a given protein set (Fig. 5).

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