# **Chapter 18**

## **Proteomic Analysis of Protein Turnover by Metabolic Whole Rodent Pulse-Chase Isotopic Labeling and Shotgun Mass Spectrometry Analysis**

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#### **Abstract**

The analysis of protein half-life and degradation dynamics has proven critically important to our understanding of a broad and diverse set of biological conditions ranging from cancer to neurodegeneration. Historically these protein turnover measures have been performed in cells by monitoring protein levels after "pulse" labeling of newly synthesized proteins and subsequent chase periods. Comparing the level of labeled protein remaining as a function of time to the initial level reveals the protein's half-life. In this method we provide a detailed description of the workflow required for the determination of protein turnover rates on a whole proteome scale in vivo.

Our approach starts with the metabolic labeling of whole rodents by restricting all the nitrogen in their diet to exclusively nitrogen-15 in the form of spirulina algae. After near complete organismal labeling with nitrogen-15, the rodents are then switched to a normal nitrogen-14 rich diet for time periods of days to years. Tissues are harvested, the extracts are fractionated, and the proteins are digested to peptides. Peptides are separated by multidimensional liquid chromatography and analyzed by high resolution orbitrap mass spectrometry (MS). The nitrogen-15 containing proteins are then identified and measured by the bioinformatic proteome analysis tools Sequest, DTASelect2, and Census. In this way, our metabolic pulsechase approach reveals in vivo protein decay rates proteome-wide.

**Key words** Proteomics , Mass spectrometry , Protein half-life , Protein decay dynamics , Stable isotope labeling of mammals, Nitrogen-15, SILAC, SILAM, Extremely long-lived proteins

#### **1 Introduction**

To determine the rate of protein decay, new and old versions of each protein must be discernable and ideally both be measurable. Typically cells are initially "pulsed" with a traceable molecular label (such as methionine enriched with sulfur-35 atoms) which are incorporated into newly synthesized proteins and subsequently "chased" with a normal containing methionine (sulfur-32 fraction of 95.0[2](#page-10-0) %)  $[1, 2]$ . By comparing the initial amount of a specific labeled protein to that remaining as a function of time, a measure

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of protein half-life can be obtained  $[3]$ . These analyses can also provide key information on the possibility that different pools of the same protein exist and have dissimilar decay kinetics. Recently, proteomic technologies have been applied to gain insight into the analysis of protein turnover dynamics on a proteome-wide scale. By combining the yeast whole genome tap-tag gene library, translation inhibition with cycloheximide, and epitope tag western blot analysis, it was determined that on average the lifetime of a yeast protein is about 43 min  $[4]$ . In cultured HeLa and C2C12 cells, "pulse-only" stable isotope labeling of cells in culture (SILAC) for several durations with time course mass spectrometry (MS) analysis showed average protein half-life in mouse and human cells <2 days [5]. In mice, by using MS analysis to measure the rate by which isotopes are metabolically incorporated into proteins and modeling it has been suggested that on average proteins in brain tissue have a lifetime of 9.0 days, liver 3.0 days, and blood 3.5 days  $[6, 7]$  $[6, 7]$ .

We have developed a straightforward systematic approach to monitor protein decay dynamics on a global scale in the most relevant biological context, in vivo. Our approach has verified previously reported rapid degradation dynamics for nearly all proteins. Unexpectedly we also find a limited number of intracellular extremely long-lived proteins (ELLPs) which reside in the nucleus and cytoplasm of postmitotic neurons  $[8, 9]$  $[8, 9]$  $[8, 9]$ . Our approach also confirmed the existence ELLPs in the myelin sheath and eye lens  $[10-12]$ . The application of our approach to proteinopathy disease mousemodels (such as Alzheimer's, Parkinson's, and Huntington's disease) could provide new insight into pathogenic mechanisms by identifying disease-specific long-lived proteins.

#### **2 Materials**

Buffers and solutions for MS analysis should be prepared with analytical chromatography grade solvents, and for biochemical experiments we prepared buffers with ultra-pure water (Milli- $Q^{\circ}$  Water Purification Systems, 18-megohm-cm deionized water). Solutions should be stored at room temperature unless otherwise indicated. To minimize keratin contamination gloves should be worn during the preparation of all buffers and samples.

#### *2.1 Nitrogen-15 or Nitrogen-14 Spirulina Rodent Chow*

- 1. Nitrogen-15 enriched spirulina algae: Nitrogen-15 enriched (>94 %) spirulina were purchased from Cambridge Isotopes [13], Cambridge, MA, USA, or can be grown and prepared in-house as previously described  $[14-16]$ .
	- 2. Rodent chow: Rodent chow has been prepared by mixing nitrogen- 15 or nitrogen-14 spirulina with protein-free diet mixture powder (Harlan TD 93328) in a 1 to 3 ratio. Pellets were

prepared by adding ultra-pure water to the power mixture and working the mixture into dough shaped into cylinders. Individual  $\sim$ 2-cm discs we cut from the cylinders and dried at 60 °C for 2–4 h and then at 35 °C overnight on screen trays in an Excalibur food dehydrator [ [17\]](#page-11-0). Alternatively, nitrogen-15 spirulina containing chow can be purchased pre-prepared from CIL/Harlan Laboratories Inc. with 22 % protein/65 % carbohydrate (carbon, hydrogen, oxygen as CHO), 13 % fat composition ( *see* **Note 1**).

- 1. Tissue homogenization buffer: 0.32 M sucrose, 4 mM Hepes (pH 7.4), 1 mM MgCl<sub>2</sub>, and protease inhibitors (Sigma) (*see* **Note 2**). 1 M Hepes, add 600 mL water to a glass beaker, weigh and add 238.3 g of Hepes, add stir bar to dissolve on a stir plate. Determine pH and adjust with HCl or NaOH to pH 7.4 final. Transfer to a graduated cylinder and add water to 1 L. Store at 4 °C. 1 M  $MgCl<sub>2</sub>$ , add 500 mL water to a glass beaker, weigh and add 203.3 g of  $MgCl<sub>2</sub> 6H<sub>2</sub>O$ , add stir bar to dissolve on a stir plate. Transfer to a graduated cylinder and add water to 1 L. To a 250 mL glass beaker, a stir bar, add 50 mL of water, 5 mL of 1 M Hepes (pH 7.4), 0.1 mL of 1 M  $MgCl<sub>2</sub>$ , and 10.9 g of Sucrose. Transfer to a 100 mL graduated cylinder and add water to  $100 \text{ mL}$  [ $18$ ]. *2.2 Representative Protein Fractionation*
	- 2. Sucrose gradient buffers (0.85 M/1.0 M/1.2 M/2.0 M): Weigh 28.9, 34.0, 40.9, 69.1 g and prepare 100 mL of buffer as described above except substitute the indicated amount of sucrose for each buffer.
	- 3. 2,2,2-Trichloroacetic acid (TCA) buffer: prepare a 100 % (wt/ vol) TCA solution with water.
- 1. Urea protein denaturation buffer: Dissolve 0.395 g of solid Ammonium bicarbonate (AMBC) in 100 mL of water to prepare 50 mM adjust to pH 7.5 as described above; aliquot and store at −20 °C. Add 0.240 g of urea to 320 μl of AMBC buffer to prepare 8 M solution ( *see* **Note 3**). *2.3 Protein Digestion*
	- 2. ProteaseMAX surfactant buffer: Dissolve solid ProteaseMAX in 500 μl of AMBC to prepare 0.2 % solution or 100 μl for 1 % ( *see* **Note 4**).
	- 3. Reduction buffer: Dissolve solid Tris (2-carboxyethyl) phosphine hydrochloride (TCEP) in AMBC to prepare 0.5 M solution ( *see* **Note 5**).
	- 4. Alkylation buffer: Dissolve solid Iodoacetamide in AMBC and prepare 1 M solution.
	- 5. Trypsinbuffer: Dissolve 20 μg vial of lyophilized trypsin (Promega) in 40 μl of buffer ( *see* **Note 6**).



- 5. Once pups are weaned, feed with exclusively nitrogen-15 containing spirulina chow for additional 3–4 weeks.
- 6. Start chase period by switching to regular nitrogen-14 rodent chow ( *see* **Note 12**) .

#### 1. Sacrifice time = 0 animal with  $CO<sub>2</sub>$  as the primary mechanism and secondarily by decapitation. *3.2 Tissue Harvest*

- 2. Harvest all tissues with standard dissection procedures and carefully label and freeze each tissue in a separate tube in liquid nitrogen and then store at −80 °C.
- 3. Sacrifice littermates at additional time points and repeat dissection and tissue harvesting as needed ( *see* **Note 13**) (Fig. 1).

*3.3 Representative Protein Fractionation from Brain Tissue*

- 1. Homogenize rat brain in 12 mL of tissue homogenization buffer on ice and centrifuge at  $4 °C$ ,  $1500 \times g$  for 15 min, and the supernatant was collected (postnuclear supernatant).
- 2. Centrifuge supernatant at  $4 °C$ ,  $18,000 \times g$  for 20 min, collect the resulting supernatant (cytosol) and pellet (crude membrane).



**Fig. 1** Metabolic pulse chase labeling of rats workflow to measure protein turnover dynamics in vivo. Freshly weaned female rat (first generation) is obtained and the diet is switched completely to nitrogen-15 containing food for 10–16 weeks. Male rat is introduced and female rat remains on nitrogen-15 diet while pregnant and during the nursing of her pups. Pups (second generation) are sacrificed at several time points including  $time = 0$ , before switching to nitrogen-14 chow. For the identification and analysis of extremely long-lived proteins, we found 6 month and 12 month reliable chase durations. As a negative control, we analyze an unlabeled pup after feeding regular nitrogen-14 chow. After the animals are sacrificed, their tissues are dissected, proteins solubilized and then fractionated. The proteins are then digested to peptides prior to LC-MS and bioinformatic analysis

- 3. Resuspend pellet in homogenization buffer and load it onto a  $0.85$  M/1.0 M/1.2 M sucrose gradient and centrifuge at 4 °C, 78,000 × *g* for 120 min, and collect the material focused at the 1.0 M/1.2 M interface (synaptosomes).
- 4. Add Triton X-100 to 0.5 % final concentration and extract at 4 °C, by end-over-end agitation for 20 min.
- 5. Centrifuge the extract at  $4^{\circ}$ C,  $32,000 \times g$  for 20 min, and collect the supernatant (soluble synaptosome).
- 6. Resuspend pellet in homogenization buffer and load onto a 1.0 M/1.5 M/2.0 M sucrose gradient and centrifuge at 4  $^{\circ}C$ ,  $170,000 \times g$  for 120 min [18].
- 7. Collected material at the 1.5 M/2.0 M interface (postsynaptic density, PSD).
- 8. Add 0.5 % Triton X-100 and detergent soluble material extracted at 4 °C, by end-over-end agitation for 10 min.
- 9. Centrifuge extract at 4 °C,  $100,000 \times g$  for 20 min, and resuspend the pellet in homogenization buffer (purified PSD).
- 1. To each fraction (100  $\mu$ g) add TCA to 20 % (vol/vol) final concentration, vortex, incubate on ice at  $4^{\circ}$ C for  $4$  h to overnight ( *see* **Note 14**). *3.4 Protein Digestion and Peptide Preparation*
	- 2. Centrifuge at  $14,000 \times g$  for 45 min at 4 °C.
	- 3. Discard supernatant and wash the pellet with 1 mL of ice-cold acetone.
	- 4. Centrifuge the tube at  $14,000 \times g$  for 10 min at 4 °C.
	- 5. Remove the acetone and wash the pellet with 1 mL of ice-cold acetone (two washes in total).
	- 6. Centrifuge the tube at  $14,000 \times g$  for 10 min at 4 °C.
	- 7. Remove supernatant and air-dry the pellet at room temperature.
	- 8. Add 50 μl of urea buffer and resuspend dry protein pellet and vortex for at least 1 h.
	- 9. Add 50 μl of 0.2 % (wt/vol) ProteaseMAX and vortex for at least 1 h.
	- 10. Add 1 μl of TCEP buffer and vortex the mixture for at least 1 additional hour.
	- 11. Add 2 μl of IAA buffer, mix well, and incubate in the dark for 20 min.
	- 12. Squelch alkylation reaction by adding 5 μl of TCEP buffer.
	- 13. Add 150 μl of AMBC and mix well ( *see* **Note 15**).
	- 14. Add 2.5  $\mu$ l of 1 % (wt/vol) proteaseMAX and briefly vortex.

299



Census software within IP2 [\[ 26– 28](#page-11-0)] ( *see* **Note 20**) (Fig. [3](#page-7-0)).

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 **Fig. 2** Bioinformatic spectral analysis paradigm. Theoretical representation of a zoomed MS1 spectral scan, *starred peaks* are selected for MS2 and indicate identifi cation of both the abundant nitrogen-14 light ( *starred peak* ) and the low abundance nitrogen-15 heavy ( *starred peak* ) isotopic peaks. MS1 ion abundance is analyzed as reconstructed chromatograms based on the identification of the light or heavy peak (*grey bar*). To determine the peptide abundances, the area under *each curve* is calculated and compared to determine the relative abundances of the light "new" and heavy "old" peptides



**Fig. 3** Incorporation of MS1 isotopic envelope shape measurement into protein turnover analysis workflow increases confidence and shows system-wide protein degradation dynamics. (a) Theoretical MS1 isotopic spectral envelope after 0 or 30 day nitrogen-14 chase periods, both showing identification of the fully heavy labeled peptide species (100 % of nitrogen atoms are nitrogen-15). The corresponding "light" isotopic envelope enrichment is determined by comparing the acquired  $m/z$  isotopic envelope shape to a broad range of predicted enrichment peak patterns to determine the percentage of nitrogen-15 atoms. ( **b** ) Binned peptide nitrogen-15 enrichment distribution from synaptosome extracts after 0, 2, 7, 30, or 180 days of nitrogen-14 chase

#### **4 Notes**

- 1. Spirulina algae have been successfully grown on nitrogen-15 salts in research labs or can be purchased commercially  $[7, 29]$  $[7, 29]$  $[7, 29]$ . We have found it to be most efficient to purchase the nitrogen-15 spirulina already prepared as ready to eat chow.
- 2. We present here a representative protein fractionation scheme to enrich for postsynaptic density proteins. Any protein fractionation or enrichment procedure (that is compatible with MS analysis) could be utilized for the investigation of protein turnover dynamics depending on the protein's specific localization characteristics.
- 3. We find that 50 mM AMBC is best aliquoted into single-use tubes and stored at −20 °C and 8 M urea should be prepared fresh for each experiment.
- 4. ProteaseMax can be freeze thawed a few times without any significant decrease in efficacy.
- 5. TCEP should be aliquoted into single-use tubes at 20 μl per tube.
- 6. IAA should be aliquoted into single-use tubes at 10 μl per tube.
- 7. We believe that for success the MS instrument used for these experiments must be clean, high resolution, and fast scanning. It is our experience that older instruments such as Orbitrap XL do not have the necessary analytical power required for these experiments. The MS should be maintained, cleaned, tuned, and calibrated regularly and as described by the manufacturer.
- 8. Acquire a recently weaned animal in accordance with the university policies and IACUC approval. All animal use must be performed in compliance with the relevant regulations and governmental guidelines. Make sure all the lab members who will be handling animals are capable and proficient with all animal procedures prior to starting this work.
- 9. We suggest providing the nitrogen-15 rodent chow ad libitum. It has been our experience that mice will eat 2–3 g and rats will eat 5–6 g of spirulina per day. These are rough guidelines and the animals will eat less or more depending on their age and if they are pregnant.
- 10. As a cost-saving measure to reduce the amount of nitrogen-15 chow necessary for these experiments, we have found that introducing the male rodent only at night into the female's cage during labeling to be sufficient for sucessful breeding. Each morning we remove the male animal and re-introduce at the end of the day.
- 11. Identifying a litter of pups on the day of birth is critical for the time = 0 time point; thus we suggest checking for pups every day

once a pregnancy is detected. We have found that on occasion it is difficult to identify pregnant rodents if the litter size is very small; however standard practices (such as checking for a plug) can provide some guidance. When the litter size is large  $(>4)$ , it is easy to identify the pregnancy, at which time the male rat should not be introduced any more.

- 12. For the chase period we have found that using "normal chow" (chow containing a nitrogen-14 fraction of 99.636 %) to be sufficient for these experiments. The alternative of using special food specifically composed with enriched nitrogen-14 would be a more perfect yet more expensive approach.
- 13. We have used several chase period time points to protein decay /turnover and to identify extremely long-lived proteins. It has been suggested that a log scale should be used since it will provide a broad range of analytical coverage  $\lceil 30 \rceil$ .
- 14. We recommend determining the protein concentration and aliquoting 100 μg for each MS analysis prior to precipitating the proteins or digesting to peptides.
- 15. It is critical that the urea concentration be  $\leq 2$  M so that trypsin activity will not be inhibited.
- 16. We find that once the proteins are digested to peptides they can be stored at −80 °C for up to 3 months. Note, peptides should be frozen before the addition of the FA. Addition of FA prior to freezing will result in degradation and significantly compromised protein identifications.
- 17. We find that direct loading of samples onto LC columns is the most sensitive approach since peptide loss is certainly minimized. Details on bomb loading have been previously described  $[20, 21, 31]$  $[20, 21, 31]$ . However if the proteins of interest are sufficiently enriched by fractionation autosampler loading should be sufficient for the analysis of low abundance proteins.
- 18. MudPIT analysis has been previously described  $\lceil 32-34 \rceil$ . Briefly in **step 1** the peptides are eluted from the RP trap to the SCX section with increasing percentages of buffer B. Each of **steps 2**– **11** starts with an increasingly large salt pulse (10, 20, 30, 40, 50, 60, 70, 80, 90, 100 %) of 5 min followed by a shallow linear gradient of increasing buffer B. **Steps 2**– **11** provide orthogonal peptide separations which facilitates very deep MS based analysis of complex peptide mixtures. **Step 1** is typically 45 min and **steps 2**– **11** are 2 h each. The exact settings on the MS will vary but we recommend a full-MS from 500 to  $1800 \frac{m}{z}$  and a minimum intensity threshold of 500 for MS/MS. We reject unassigned and +1 charged precursor ions and use a rolling exclusion list of 20 ions. For these experiments, we recommend using 15–20 MS/MS per MS precursor scan.
- <span id="page-10-0"></span> 19. The protein database is critically important since in order to identify a protein with shotgun proteomics the protein sequence must be present in the protein database. We recommend using Uniprot protein databases.
- 20. For the nitrogen-15 stable isotope enrichment calculation, we used the Census program to perform 15N enrichment ratio calculation. Census uses the amino acid elemental composition to calculate corresponding isotopic distributions of nitrogen-15 enriched peptides. As nitrogen-15 labeling shifts the mass of peptide based on the number of nitrogen atoms present, Census uses all possible theoretical isotope distributions and maps to experimental ones to find the best match by using Linear regression. Census performs the atomic percent enrichment calculation for each peptide independently, as this can vary depending on a protein's turnover rate. A detailed description of the Census enrichment calculation analysis has been previously described  $[14]$ .

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