# SCIENTIFIC DATA

### DATA DESCRIPTOR

## **OPEN** Characterization of a human liver reference material fit for proteomics applications

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The National Institute of Standards and Technology (NIST) is creating new, economical, qualitative reference materials and data for proteomics comparisons, benchmarking and harmonization. Here we describe a large dataset from shotgun proteomic analysis of RM 8461 Human Liver for Proteomics, a reference material being developed. Consensus identifications using multiple search engines and sample preparations demonstrate a homogeneous and fit-for-purpose material that can be incorporated into automated or manual sample preparation workflows, with the resulting data used to directly assess complete sample-to-data workflows and provide harmonization and benchmarking between laboratories and techniques. Data are available via PRIDE with identifier PXD013608.

#### **Background & Summary**

NIST has a long history of developing reference materials (RMs)<sup>1</sup> and advancing the measurement science used to characterize advanced materials. The advancement of non-targeted analysis (e.g. identification analysis, post-translational modification identification, differential analysis) and the need for RMs that are suitable for these types of measurements have fueled the generation of new materials and their associated data. With the rapid forward progress of instrumental technologies and continued innovations in bioinformatics, qualitative RMs and reference data sets directly linked to the RMs are a valuable resource for developing, improving, and assessing performance of methods, instrumental capabilities, and data processing tools<sup>2-4</sup>.

Linking data<sup>5</sup> directly with a stable homogeneous material allows for the potential development of benchmarks of quality control metrics for peptide identification, bioinformatics, and systematic workflow evaluation. The development and availability of a common material for quality control purposes would significantly improve the critical evaluation of sample comparisons and processing and the variability of results<sup>6-8</sup>.

We report a data set of peptide identifications from RM 8461 Human Liver for Proteomics, a cryogenically homogenized and freeze-dried liver tissue developed as a material for complex proteomic analysis. The data set was collected using high resolution LC/MS instrumentation typically utilized in top-down and bottom-up protein analysis. The data set can serve as a resource for learning and training those new to the field as well as serve as a representative baseline proteomics data set for workflow analysis and bioinformatics. This data represents general laboratory preparation methods that can be used for evaluation of new or more complex methods (e.g. different enzyme digestions, depletion strategies, 1D or 2D LC). Additionally, since the processed data set used simple search parameters, the raw data can be re-analysed for additional peptide modifications and post-translational modifications.

There were three main concerns we sought to address in this analysis: homogeneity (reproducible protein inference via peptide identification), degradation of the proteome due to material preparation, and fit-for-purpose of the material for proteomic analysis. To address homogeneity, a stratified random sampling plan from across the RM production consisting of eight vials of RM 8461 were selected for analysis. Both 1 mg and 10 mg sub-sampling of the material from each of the eight vials was used, and the commonly identified peptides (and protein inference) evaluated using bottom-up proteomic analysis from a random stratified sample scheme across the RM production. Sampling and sample preparation at both the 1 mg and 10 mg sample size demonstrates the utility of the material for complex proteomic analysis. Semi-tryptic analysis with both Sequest HT and Mascot show

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relatively low sample decomposition and a high degree of protein integrity. Byonic-Preview also showed low levels of ragged N-term and C-term peptides as well as percentages that are similar to a commonly used commercial HeLa digest standard. Relative spectral abundance at both the peptide and protein level were highly correlated (e.g. reproducible) within all sample preparations utilized. The protein mass fraction, estimated by spectral abundance, yields detection and identification of peptides and protein inference of over several orders of magnitude within the sample. Despite the sample complexity, sample mass, or digestion method, there was a large number of commonly identified proteins (2,055) between all of the Fusion Lumos runs. Comparison of the 1 mg sample runs with multiple search algorithms also showed a large number of commonly identified proteins (2,703). The high level of commonly identified peptides and proteins and low level of proteome degradation demonstrate the fit-for-purpose of the material for proteomics analysis.

These results show that the RM is fit for purpose to perform QC when proteome coverage is being assessed. The material is complex enough to be used by other laboratories to assess performance of the sample preparation protocol, instrument performance, and database search parameters. Raw data will also prove valuable in development of specialized spectral libraries and software. As more data become publically available, users will be able to compare and assess protein measurements. This includes an improved ability to identify current best practices and challenges, ideally moving the fields toward harmonization.

#### **Methods**

**Sample material.** Human liver tissue was harvested from volunteer donors with proper ethical approval at the time of collection. The liver material was pooled and cryogenically homogenized, freeze-dried, and radiation sterilized, limiting any proteolytic enzyme activity. The liver material was mixed, and aliquoted into approximately 0.5 g portions. Two sets of 8 vials were randomly selected across the production batch and tested for the new candidate RM 8461 Human Liver for Proteomics. Candidate RM 8461 Human Liver for Proteomics will be available from the NIST Office of Reference Materials (https://www.nist.gov/srm).

**Evaluation of sample preparation methods.** RapiGest/DTT/IAA. Approximately 1 mg (exact mass known) of candidate RM 8461 Human Liver for Proteomics was subsampled in triplicate from a single jar into 1.5 mL LoBind microcentrifuge tubes. The proteins were solubilized (pipet mixing) with an appropriate amount of 0.1% mass fraction RapiGest (Waters, lot # 163011) in 50 mmol/L ammonium bicarbonate (Fluka) resulting in a  $10 \,\mu\text{g/}\mu\text{L}$  solution. Next,  $5 \,\mu\text{L}$  of each solution was added to  $35 \,\mu\text{L}$  of 0.1% mass fraction RapiGest and sonicated for 15 min, cooled on ice for 1 min, and then sonicated for another 15 min followed by the addition of  $40 \,\mu L$ 50 mmol/L ammonium bicarbonate (Fluka). The samples were reduced with 10 µL of 45 mmol/L dithiothreitol (DTT; Sigma Aldrich; final concentration of 5 mmol/L) and incubated in an incubating shaker at 60 °C for 30 min then allowed to cool to room temperature. The mixture was alkylated using 3.75 µL of 375 mmol/L iodoacetamide (IAA, Pierce, Thermo Scientific; final concentration of 15 mmol/L) and incubated in the dark at room temperature for 30 min. Prior to trypsin addition, 100 µL of 50 mmol/L ammonium bicarbonate was added. A 1 µL aliquot of trypsin (Pierce Scientific, MS-Grade; 1 µg/µl in 50 mmol/L acetic acid; Fisher Scientific) was added (final mass ratio of 1:50 trypsin:protein) to each sample and incubated overnight at 37 °C. The digestion was halted and RapiGest cleaved with the addition of 100 µL 3% volume fraction trifluoroacetic acid (TFA, Sigma Aldrich; 1% final concentration) and incubated at 37 °C for 30 min before centrifugation and removal of the supernatant. Samples were desalted and concentrated using Pierce C18 spin columns (8 mg of C18 resin; Thermo Scientific) according to manufacturer's instructions. Each sample was processed in duplicate yielding at maximum 60 µg peptides. These solutions were evaporated to dryness in a vacuum centrifuge and the samples were reconstituted in 50 µL 95% water 5% acetonitrile for analysis.

*RapiGest/DTT/CAA.* Approximately 1 mg (exact mass known) of RM 8461 Human Liver for Proteomics was subsampled in triplicate from a single jar into 1.5 mL LoBind microcentrifuge tubes and processed exactly as described above with the exception of sample alkylation, which was accomplished with  $10 \,\mu$ L of 400 mmol/L 2-chloroacetamide (CAA, Thermo Scientific; final concentration of 40 mmol/L).

RapiGest/TCEP/CAA. Approximately 1 mg (exact mass known) of RM 8461 Human Liver for Proteomics was subsampled in triplicate from a single jar into 1.5 mL LoBind microcentrifuge tubes and processed exactly as described above with the exception of sample reduction, which was accomplished with 10 µL of 200 mmol/L Tris(2-carboxyethyl)phosphine hydrochloride (TCEP, Thermo Scientific; final concentration of 20 mM).

*SDC/TCEP/IAA.* Approximately 1 mg (exact mass known) of RM 8461 Human Liver for Proteomics was subsampled in triplicate from a single jar into 1.5 mL LoBind microcentrifuge tubes. The proteins were solubilized (pipet mixing) with an appropriate amount of 1% mass fraction sodium deoxycholate (SDC; Thermo Scientific, lot # SJ2450944) in 50 mmol/L ammonium bicarbonate resulting in a 10µg/µL solution. Next, 5µL of each solution was added to 20µL of 1% mass fraction SDC in 50 mmol/L ammonium bicarbonate and sonicated for 15 min, cooled on ice for 1 min, and sonicated for another 15 min and then placed in an incubating shaker at 60 °C for 10 min. The samples were reduced with 2µL of 200 mmol/L TCEP (final concentration of 14.8 mmol/L) and incubated at room temperature for 30 min. The mixture was then alkylated using  $3.75 \,\mu$ L of 375 mmol/L IAA (final concentration of 37.5 mmol/L) and incubated in the dark at room temperature for 30 min. Prior to addition of trypsin, 170 µL of 50 mmol/L ammonium bicarbonate was added. A 1 µL aliquot of trypsin (1 µg/µl in 50 mmol/L acetic acid) was added (1:50 trypsin:protein) to each sample and incubated overnight at 37 °C. The digestion was halted with the addition of 100 µL 3% volume fraction TFA (1% final concentration). SDC removal was performed by four subsequent liquid-liquid extractions with 300 µL of ethyl acetate (Fisher Scientific), shaking by hand, centrifugation to promote phase separation, and removal of the upper ethyl acetate layer with the final removal of ethyl acetate performed with a vacuum centrifuge. Samples were processed using Pierce C18 spin columns according to manufacturer's instructions. Each sample was processed in duplicate yielding at maximum 60  $\mu$ g of crude peptides. These solutions were evaporated to dryness in a vacuum centrifuge then the samples were reconstituted in 50  $\mu$ L 95% water 5% acetonitrile for analysis.

SDC/TCEP/CAA. Approximately 1 mg (exact mass known) of RM 8461 Human Liver for Proteomics was subsampled in triplicate from a single jar into 1.5 mL LoBind microcentrifuge tubes and processed exactly as described above with the exception of sample alkylation, which was accomplished with 3  $\mu$ L of 400 mmol/L CAA (final concentration of 40 mmol/L).

10 mg Samples. A stratified random sampling plan of eight vials from across the candidate RM 8461 production run were selected for analysis. Approximately 10 mg (exact mass known) of RM 8461 was subsampled from eight randomly selected vials into individual 1.5 mL LoBind microcentrifuge tubes. The proteins were solubilized (pipet mixing) with an appropriate amount of 1% mass fraction SDC in 50 mmol/L ammonium bicarbonate resulting in a  $10 \,\mu$ g/µL solution. Next,  $5 \,\mu$ L of each solution was added to  $20 \,\mu$ L of 1% mass fraction SDC in  $50 \,$ mmol/L ammonium bicarbonate and sonicated for 15 min, cooled on ice for 1 min, sonicated for another 15 min and then incubated in an incubating shaker at 60 °C for 10 min. The samples were reduced with 2 µL of 200 mmol/L TCEP (final concentration of 14.8 mmol/L) and incubated at room temperature for 30 min. The mixture was then alkylated using 3 µL of 400 mmol/L CAA (final concentration of 40 mmol/L) and incubated in the dark at room temperature for 30 min. Prior to addition of trypsin, 170 µL of 50 mmol/L ammonium bicarbonate was added. A 1 µL aliquot of trypsin (1µg/µl in 50 mM acetic acid) was added (1:50 trypsin:protein) to each sample and incubated overnight at 37 °C. The digestion was halted with the addition of 100 µL 3% volume fraction TFA (1% final concentration). SDC removal was performed by four subsequent liquid-liquid extractions with 300 µL of ethyl acetate, shaking by hand, centrifugation to promote phase separation, and removal of the upper ethyl acetate layer with the final removal of ethyl acetate performed with a vacuum centrifuge. Samples were processed using Pierce C18 spin columns, washed with 5% volume fraction acetonitrile, and eluted with 70% volume fraction acetonitrile. Each sample was processed in duplicate yielding at maximum 60 µg peptides. These solutions were evaporated to dryness in a vacuum centrifuge then the samples were reconstituted in 50 µL 95% water 5% acetonitrile for analysis.

*1 mg Samples.* In order to evaluate the homogeneity on a smaller sample scale, triplicate preparations of 1 mg (exact mass known) of RM 8461 was subsampled from the eight randomly selected vials into individual 1.5 mL LoBind microcentrifuge tubes. The proteins were solubilized (pipet mixing) with an appropriate amount of 1% mass fraction SDC in 50 mmol/L ammonium bicarbonate resulting in a  $10 \,\mu\text{g}/\mu\text{L}$  solution and processed as the 10 mg samples described above.

*NIST gaithersburg samples.* An additional set of eight vials randomly sampled across the candidate RM 8461 production run were selected for analysis to further assess the materials homogeneity. The digestion procedure was adapted from the protocol provided with Promega trypsin and is described below. Fifty mmol/L TCEP was prepared in 50 mmol/L Trizma buffer at pH 8.0 (adjusted with 5 mol/L NaOH). Trifluroethanol (TFE) was diluted to 56% by volume in 50 mmol/L Trizma buffer, pH 8.3. One mg of liver was removed from each vial, weighed, and placed into low binding tubes (Eppendorf, Hauppauge, NY). Twenty  $\mu$ L of 50 mmol/L Trizma buffer (pH 8.3), 4.4 $\mu$ L of 50 mmol/L TCEP and 20 $\mu$ L of 56% TFE were added. The samples were heat denatured at 60 °C for 60 min. Four  $\mu$ L of 300 mmol/L iodoacetamide was added and samples were vortexed and incubated in the dark for 45 min. Trypsin was prepared by adding 200 $\mu$ L of Trizma buffer to 20 $\mu$ g of trypsin. The 20 $\mu$ g of trypsin was added to each sample. Digestions were performed at 37 °C for 20 hours. Digestions were stopped by adding 5 $\mu$ L of a volumetric ratio of 50% TFA (final concentration was 0.5% by volume). Final protein concentrations were estimated to be approximately  $6\mu$ g/ $\mu$ L.

*High-pH samples.* Two full sets of the triplicate sample preparations were combined after 1D LC/MS/MS analysis and processed for 2D high-pH/reverse phase LC/MS/MS. Briefly, the combined sample was analysed using a Dionex LC coupled to Foxy 200 fraction (Isco) collector. The peptide mixture ( $100 \mu$ L) was loaded onto a Zorbax 300 Extend C18 column (2.1 mm id × 150 mm length, 3.5 µm particle size; Agilent Scientific) separated along a 70 min gradient of 100% mobile phase A (5% acetonitrile 10 mmol/L ammonium bicarbonate pH 8) and 0% to 45% mobile phase B (80% acetonitrile 10 mmol/L ammonium bicarbonate pH 8) over 50 min, followed by a ramp to 100% mobile phase B over 10 min at a flow rate of 250 µL/min with fractions collected every 90 s. Each fraction was then evaporated to dryness in a vacuum centrifuge and reconstituted in 20 µL 95% water 5% acetonitrile for LC/MS/MS analysis.

Instrumental methods. For the LC/MS/MS analysis, the samples were analysed using an UltiMate 3000 Nano LC coupled to an Orbitrap Fusion Lumos mass spectrometer. Resulting peptide mixtures (1  $\mu$ L) were loaded onto a PepMap 100 C18 trap column (75  $\mu$ m id  $\times$  2 cm length; Thermo Fisher Scientific) at 3  $\mu$ L/min for 10 min with 2% acetonitrile and 0.05% TFA followed by separation on an Acclaim PepMap RSLC 2  $\mu$ m C18 column (75  $\mu$ m id  $\times$  25 cm length; Thermo Fisher Scientific) at 40 °C. Peptides were separated along a 130 min gradient of 5% to 27.5% mobile phase B (80% acetonitrile, 0.08% formic acid) over 105 min followed by a ramp to 40% mobile phase B over 15 min and lastly to 95% mobile phase B over 10 min at a flow rate of 300 nL/min. The mass spectrometer was operated in positive polarity and data dependent mode (topN, 3 sec cycle time) with a dynamic exclusion of 60 sec (with 10 ppm error). The RF lens was set at 30%. Full scan resolution was set at 120,000 and the mass range was set to m/z 375–1500. Full scan ion target value was 4.0  $\times$  105 allowing a maximum injection time of 50 ms.

Monoisotopic peak determination was used, specifying peptides and an intensity threshold of  $1.0 \times 10e4$  was used for precursor selection. Data-dependent fragmentation was performed using higher-energy collisional dissociation (HCD) at a normalized collision energy of 32 with quadrupole isolation at m/z 0.7 width. The fragment scan resolution using the orbitrap was set at 30,000, m/z 110 as the first mass, ion target value of  $2.0 \times 105$  and 60 ms maximum injection time.

*Protein search parameters.* Resulting raw files were processed and searched with Mascot (v2.6.2) for public upload and data archival on PRIDE<sup>9</sup> via ProteomeXchange<sup>10</sup>. Raw files were additionally processed using all, or a combination of Sequest HT, Mascot, MSPepSearch, MSAmanda 2.0<sup>11</sup>, and Byonic (ProteinMetrics; v3.2.0) algorithms via Proteome Discoverer (PD; v2.2.0.388).

Resulting raw files were processed and searched with PD using Sequest HT, Mascot, MSAmanda 2.0, Byonic, and MSPepSearch algorithms. Since some of the fractions following reverse phase high pH contained little to no peptides, only fractions 2 through 42 were used for searching. For Mascot searches, the UniProtKB SwissProt and SwissProt varsplic database (2018\_06 release) were used and *Homo sapiens* was specified in the search parameters. For Sequest HT, MSAmanda 2.0, and Byonic searches, the *Homo sapiens* database (taxon ID: 9606) was retrieved from the 2018\_06 release of the UniProtKB SwissProt database along with the SwissProt varsplic database. For Sequest HT, Mascot, MSAmanda 2.0, and Byonic searches, a cRAP database (common Repository of Adventitious Proteins, v 2012.01.01; The Global Proteome Machine) was used as well. For the MSPepSearch searches, three different spectral libraries available from NIST were used: the 2014\_05\_29\_human, a CID ion trap based library; human\_hcd\_selected\_part1 and human\_hcd\_selected\_part2, and an HCD library compiled in 2016.

The following search parameters were used with all algorithms with the exception of MSPepSearch: trypsin was specified as the enzyme allowing for two mis-cleavages (or semitryptic with up to 9 missed cleavages for the tissue decomposition analysis); carbamidomethyl (C) was fixed and acetylation (protein n-term), deamidation (NQ), pyro-Glu (n-term Q), and oxidation (M) were specified as variable modifications; 10 ppm precursor mass tolerance and 0.02 Da fragment ion tolerance. Within Sequest the peptide length was specified as a minimum of 6 and maximum of 144 amino acids. Resulting peptide spectral matches (PSMs) from both Mascot and Sequest searches were validated using the percolator algorithm, based on q-values at a 5% false discovery rate (FDR) at both the peptide and protein level. For MS Amanda 2.0, a target decoy PSM validator node with a specified  $\Delta$  Cn of 0.05 while Byonic results used the built in 1% protein FDR. For MSPepSearch searches the following search parameters were used: 40 ppm precursor mass tolerance and 0.5 Da fragment ion tolerance, and a minimum match factor of 300. The spectral library-based results were further processed using a fixed value PSM validator node with a specified  $\Delta$  Cn of 0.05. All results were filtered in PD at 5% FDR at the peptide and protein levels.

#### **Data Records**

Each dataset was acquired with the goal of determining measureable and reproducible identifications in the candidate RM. All raw proteomics MS data files (in Thermo .raw file format) used for protein identification and relative quantification have been deposited to  $PRIDE^9$  via the ProteomeXchange Consortium<sup>10</sup> and can be accessed with the dataset identifier  $PXD013608^5$  (Table 1 – data files).

**Evaluation of RM 8461 Integrity.** Semi-tryptic analysis of the 10 mg samples was performed with both the Sequest HT and Mascot search algorithms. The searches included up to eight missed cleavages in order to simulate and detect potential protein degradation. Trypsin cleaves peptides on the C-terminal side of lysine and arginine (if a proline is on the carboxyl side of the cleavage site, the cleavage will not occur) and the semi-tryptic search allows for the identification of degraded peptides that do not "end" with a lysine and arginine residue. For both Sequest HT and Mascot search results, a lower total number of PSMs, peptide groups, proteins, and protein groups were found in the semi-tryptic analysis than in the fully tryptic analysis (Table 2). Byonic-Preview was also used to quickly evaluate sample integrity and digestion completeness which are shown in Table 3 along with a standard HeLa digest (Pierce Scientific) standard used as a routine instrumental QC check. While the tryptic digestions of the RM are higher in the percentage of missed cleavages, both the ragged N-term and ragged C-term percentages are similar. Though biologically different materials, the comparison of the degree of ragged N-term and C-term demonstrates the materials utility for the determination of sample integrity as well as software validation.

**Reproducibility of identified PSMs utilizing label-free quantification.** The label free quantification node within PD 2.2 allows for relative peptide and protein quantification by integrating the extracted ion chromatogram from identified peptides (within 10 ppm mass error of peptide precursor m/z) and summing up individual peptide areas to a protein spectral abundance. Non-unique peptides belonging to multiple proteins are treated as such and their sums added to all resulting protein matches. This node allows for the qualification of not only the identified protein based on the precursor mass and fragment score to a primary sequence, but also a relative standard deviation (rsd) on replicate injections and sample preparations of the integrated peak areas determined by the extracted ion chromatograms. This allows for a filter of confidence on the reproducibility of instrument detection, and not just an algorithm derived identification. Triplicate injections of the 1 mg sample preparations show that 2,374 of the 3,682 commonly identified proteins have an integrated peak area from the resulting PSMs of less than 20% rsd. In fact, the rsd across the triplicate injections from the triplicate sample preparations show 1,136 of the commonly identified proteins with an integrated peak area from the PSMs of less of less than 20% (Fig. 1).

**Common identifications – NIST Charleston and NIST Gaithersburg.** Sample prepared from two sets of stratified random sampled vials across the production batch and replicate sample preparations identified 2055

ID	MS Files Proteomics	Raw Data LC/MS
1 mg Sample Set	$\begin{array}{c} \mathrm{Img}\_1\_A\_1 - \mathrm{Img}\_1\_A\_3\\ \mathrm{Img}\_1\_B\_1 - \mathrm{Img}\_1\_B\_3\\ \mathrm{Img}\_2\_C\_1 - \mathrm{Img}\_1\_C\_3\\ \mathrm{Img}\_2\_A\_1 - \mathrm{Img}\_2\_B\_3\\ \mathrm{Img}\_2\_C\_1 - \mathrm{Img}\_2\_C\_3\\ \mathrm{Img}\_3\_A\_1 - \mathrm{Img}\_3\_A\_3\\ \mathrm{Img}\_3\_B\_1 - \mathrm{Img}\_3\_C\_3\\ \mathrm{Img}\_3\_C\_1 - \mathrm{Img}\_3\_C\_3\\ \mathrm{Img}\_3\_C\_1 - \mathrm{Img}\_5\_A\_3\\ \mathrm{Img}\_3\_C\_1 - \mathrm{Img}\_5\_A\_3\\ \mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\\ \mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\_3\_ \mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_1\\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_1 - \mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_3\_C\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_3\_C\_3\_\mathrm{Img}\_3\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_3\_\mathrm{Img}\_5\_C\_3\_\mathrm{Img}\_5\_C\_3\_3\_\mathrm{Img}\_3\_\mathrm{Img}\_3\_3\_\mathrm{Img}\_3\_3\_\mathrm{Img}\_3\_3\_\mathrm{Img}\_3\_3\_3$	PDX013608
10 mg Sample Set	10mg_1_A_1 - 10mg_1_A_3 10mg_2_A_1 - 10mg_2_A_3 10mg_3_A_1 - 10mg_3_A_3 10mg_4_A_1 - 10mg_4_A_3 10mg_5_A_1 - 10mg_5_A_3 10mg_6_A_1 - 10mg_6_A_3 10mg_7_A_1 - 10mg_7_A_3 10mg_8_A_1 - 10mg_8_A_3	PDX013608
Gaithersburg Sample Set	G_Liver_RM_9_A_1 G_Liver_RM_10_A_1 G_Liver_RM_11_A_1 G_Liver_RM_12_A_1 G_Liver_RM_13_A_1 G_Liver_RM_14_A_1 G_Liver_RM_14_A_1 G_Liver_RM_15_A_1 G_Liver_RM_16_A_1	PDX013608
High pH Sample Set	Liver_RM_High_pH_01 - Liver_RM_High_pH_48	PDX013608
Sample Preparation Comparison Set	Liver_RM_Rapigest_DTT_CAA_1 - Liver_RM_Rapigest_DTT_CAA_3 Liver_RM_Rapigest_DTT_IAA_1 - Liver_RM_Rapigest_DTT_IAA_3 Liver_RM_Rapigest_TCEP_CAA_1 - Liver_RM_SDC_TCEP_CAA_1 - Liver_RM_SDC_TCEP_CAA_3 Liver_RM_SDC_TCEP_CAA_3 Liver_RM_SDC_TCEP_IAA_1 - Liver_RM_SDC_TCEP_IAA_3	PDX013608

Table 1. Samples and experimental files in the dataset.

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Search Algorithm (Mode)	Protein Groups	Proteins	Peptide Groups	PSMs
Sequest HT (tryptic)	3,994	9,766	48,495	673,177
Sequest HT (semi-tryptic)	3,720	9,466	48,004	659,803
Mascot (tryptic)	3,808	9,581	47,742	670,879
Mascot (semi-tryptic)	3,686	9,247	47,498	653,478

Table 2. Comparison of semi-tryptic and tryptic digestion results with Sequest HT and Mascot search algorithms.

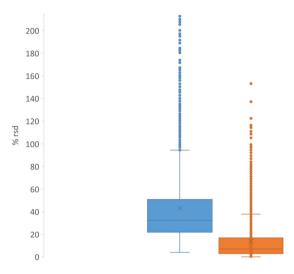
common proteins using Sequest HT and analysed on the same instrument (Fig. 2). While some of the individual 1D LC/MS results can yield between 3,000 and 3,500 protein identifications, the differing sample masses, sample preparation methods, and the number of vials sampled shows a significant correlation of identification homology and sample homogeneity. In addition, the protein intensity correlations between replicate sample preparations (Fig. 3) is also well correlated and demonstrate relative quantitative similarities across samples.

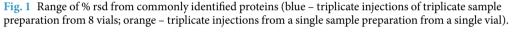
**Search algorithm comparison for peptide and protein identification.** Simultaneous and combined search results using the Sequest HT, Mascot, MSAmanda 2.0, MSPepSearch, and Byonic algorithms produced at

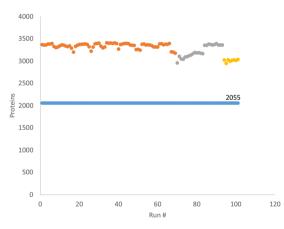
Sample	Missed Cleavage	Semi-tryptic Peptides ragged C-term	Semi-tryptic Peptides ragged N-term	Non-tryptic Peptides
RM 8461 (n=8)	15.0%	7.4%	1.1%	0.4%
HeLa Digest Standard (n=4)	5.8%	6.6%	2.4%	0.2%

 Table 3. Byonic-Preview results of trypsin digestion from 10 mg sample preparations.









<sup>•</sup> Exp Wide Shared • Total ID (1 mg) • Total ID (10 mg) • Total ID Gaithersburg

Fig. 2 Total number of protein identifications and experiment-wide shared protein identifications.

total of 9,153,280 PSMs, 553,908 peptide groups, 19,778 proteins, and 7,873 protein groups resulting from over 591 hours of search time. The overlap of identified peptides (Fig. 4) and proteins (Fig. 5) among all of the search algorithms is quite significant. Upwards of 25,000 peptides are commonly identified resulting in almost 3,000 common proteins. This number is reduced to 2,693 proteins when an additional constraint of a minimum of 3 unique peptides are required for identification.

MSPepSeach results tend to give fewer identifications compared to standard search algorithm results due to the inherent difference in what is being searched and matched. MS/MS library identification matches are based on pairing an experimental peptide MS/MS with a MS/MS in the library and any differences between the reference and experimental spectra allowing for very rapid generation of search results. However, the results are restricted to annotated spectra in the reference library, which severely limits the identification of modified peptides (static and/or post-translational modifications).

**High pH 2D LC/MS/MS.** In order to achieve a more comprehensive identification of proteomes, two-dimensional (2D) chromatography has been an invaluable tool  $^{12-14}$ . The 2D method demonstrate feasibility

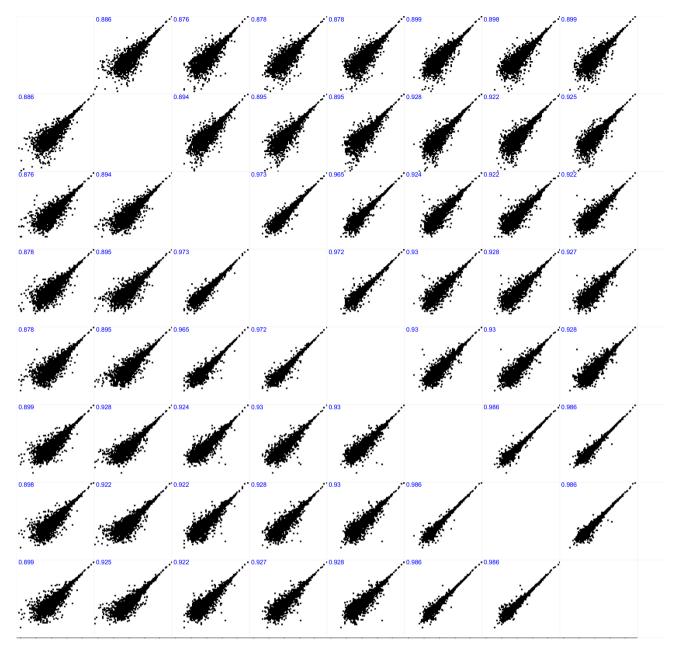


Fig. 3 Protein abundance plots for single injections of replicate sample preparations (10 mg) from stratified random sampling of 8 vials from RM 8461 production.

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of HpH workflow using a small sample masses yielding high proteome coverages. Utilizing the 2D sample processing workflow show increases in all aspects of analysis resulting in the identification of 109,342 peptide groups corresponding to 21,847 proteins from 8,407 protein groups with 1,047,269 PSMs. Figure 6 shows the abundance range of identified proteins over 7 orders of magnitude from the 2D analysis.

#### **Technical Validation**

Development of the liver material was intended to serve as QC material for bottom-up proteomic measurements utilizing standard processes and instrumentation. Identified proteins were selected at 5% FDR, identified PSMs with reproducibility of less than 20% rsd in replicate sample preparations, and multiple search algorithms to ensure data quality and material robustness. Instrument and LC separation parameters as well as data validation were checked for system suitability using HeLa standard protein digest standard. Homogeneity, in terms of reproducible protein inference via peptide identification, was assessed at 10 mg and 1 mg sample masses across the production batch using random stratified samples and shows a high degree of commutability as well as between sample preparation methods. The sample integrity of the materials was assessed and validated by semi-tryptic analysis with multiple search algorithms and is comparable to the commercially available HeLa digest.

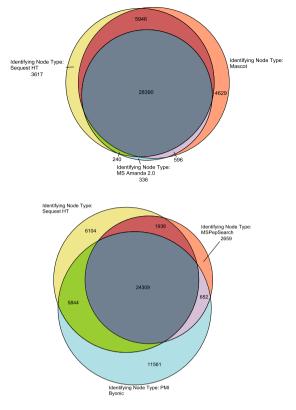
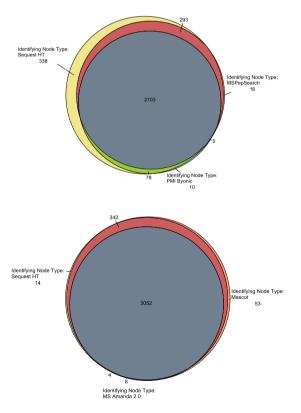
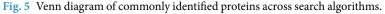


Fig. 4 Venn diagram of commonly identified peptides across search algorithms.





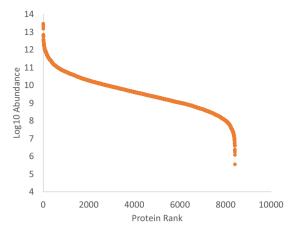


Fig. 6 Protein abundance ladder for high pH 2D LC/MS/MS analysis.

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Despite a much higher total number of identifications utilizing the high pH method (21,847 proteins), an overly stringent identification criteria was used to finalize a list of proteins whose prevalence and identification are assured in the sample regardless of approaches/platforms. First, commonly identified proteins from the 1 mg triplicate preparations from box 31- jar 29 and replicate injections with a spectral abundance reproducibility of less than 20% CV were considered (1,891). Additionally, only proteins identified with Sequest HT, Mascot, MSAmanda 2.0, and Byonic algorithms and having a minimum of 3 unique peptides were considered. When combined, a total of 1,619 proteins met all of the above criteria (Table 3). This identification criteria threshold could be considered unusually stringent. However, the reason for utilizing such a threshold was to determine a set of highly commutable inferred protein identifications from peptide identifications regardless of the search algorithm used.

#### **Usage Notes**

Though the main goal of the project was to develop qualitative reference materials and data for proteomics comparisons, benchmarking and harmonization and demonstrating fit-for-purpose of the material and data to serve as a benchmark for laboratories and users across platforms and methods. The data set can be re-searched with any bottom up bioinformatics platform, workflow, and with additional modifications (e.g., phosphorylation, glycosylation, ubiquitination, etc.) to glean more information on both the sample and data.

#### **Code availability**

Raw data was processed using all, or a combination of Sequest HT, Mascot (v2.6.2), MSPepSearch, MSAmanda 2.0, and Byonic (ProteinMetrics; v3.2.0) algorithms via PD (v2.2.0.388).

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#### References

- 1. Standard Sample No. 1, Argillaceous Limestone. (United States Department of Commerce, Bureau of Standards, 1910).
- Bittremieux, W. et al. Quality control in mass spectrometry-based proteomics. Mass Spectrometry Reviews 37, 697–711, https://doi. org/10.1002/mas.21544 (2018).
- 3. Sempos, C. T. *et al.* Vitamin D status as an international issue: National surveys and the problem of standardization. *Scandinavian Journal of Clinical & Laboratory Investigation* **72**, 32–40, https://doi.org/10.3109/00365513.2012.681935 (2012).
- Beasley-Green, A., Bunk, D., Rudnick, P., Kilpatrick, L. & Phinney, K. A proteomics performance standard to support measurement quality in proteomics. *Proteomics* 12, 923–931, https://doi.org/10.1002/pmic.201100522 (2012).
- Davis, W. C., Kilpatrick, L. E., Ellisor, D. L. & Neely, B. A. NIST Candidate RM 8461 Human Liver for Proteomics. PRIDE, https:// identifiers.org/pride.project:PXD013608 (2019).
- Ludwig, K. R., Schroll, M. M. & Hummon, A. B. Comparison of In-Solution, FASP, and S-Trap Based Digestion Methods for Bottom-Up Proteomic Studies. *Journal of Proteome Research* 17, 2480–2490, https://doi.org/10.1021/acs.jproteome.8b00235 (2018).
   Glatter, T., Ahrne, E. & Schmidt, A. Comparison of Different Sample Preparation Protocols Reveals Lysis Buffer-Specific Extraction
- Glatter, T., Ahrne, E. & Schmidt, A. Comparison of Different Sample Preparation Protocols Reveals Lysis Buffer-Specific Extraction Biases in Gram-Negative Bacteria and Human Cells. *Journal of Proteome Research* 14, 4472–4485, https://doi.org/10.1021/acs. jproteome.5b00654 (2015).
- Piehowski, P. D. et al. Sources of Technical Variability in Quantitative LC-MS Proteomics: Human Brain Tissue Sample Analysis. Journal of Proteome Research 12, 2128–2137, https://doi.org/10.1021/pr301146m (2013).
- Vizcaino, J. A. et al. update of the PRIDE database and its related tools. Nucleic Acids Research 44, D447-D456, https://doi. org/10.1093/nar/gkv1145 (2016).
- Vizcaino, J. A. *et al.* ProteomeXchange provides globally coordinated proteomics data submission and dissemination. *Nature Biotechnology* 32, 223–226, https://doi.org/10.1038/nbt.2839 (2014).
- Dorfer, V. et al. MS Amanda, a Universal Identification Algorithm Optimized for High Accuracy Tandem Mass Spectra. Journal of Proteome Research 13, 3679–3684, https://doi.org/10.1021/pr500202e (2014).
- Dwivedi, R. C. et al. Practical implementation of 2D HPLC scheme with accurate peptide retention prediction in both dimensions for high-throughput bottom-up proteomics. Analytical Chemistry 80, 7036–7042, https://doi.org/10.1021/ac800984n (2008).

- Bekker-Jensen, D. B. et al. An Optimized Shotgun Strategy for the Rapid Generation of Comprehensive Human Proteomes. Cell Systems 4, 587-+, https://doi.org/10.1016/j.cels.2017.05.009 (2017).
- Kulak, N. A., Geyer, P. E. & Mann, M. Loss-less Nano-fractionator for High Sensitivity, High Coverage Proteomics. *Molecular & Cellular Proteomics* 16, 694–705, https://doi.org/10.1074/mcp.O116.065136 (2017).

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#### **Author contributions**

W.C.D. designed experiments, performed LC/MS proteomics sample processing, data acquisition, data analysis, and wrote the manuscript. L.E.K. designed experiments, performed LC/MS proteomics sample processing, data acquisition, data analysis, and wrote the manuscript. D.L.E. was responsible for pre-analytical work on the RM material, designed experiments, and wrote the manuscript. B.A.N. designed experiments, performed LC/MS proteomics data analysis, and wrote the manuscript.

#### **Competing interests**

The authors declare no competing interests.

#### **Additional information**

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