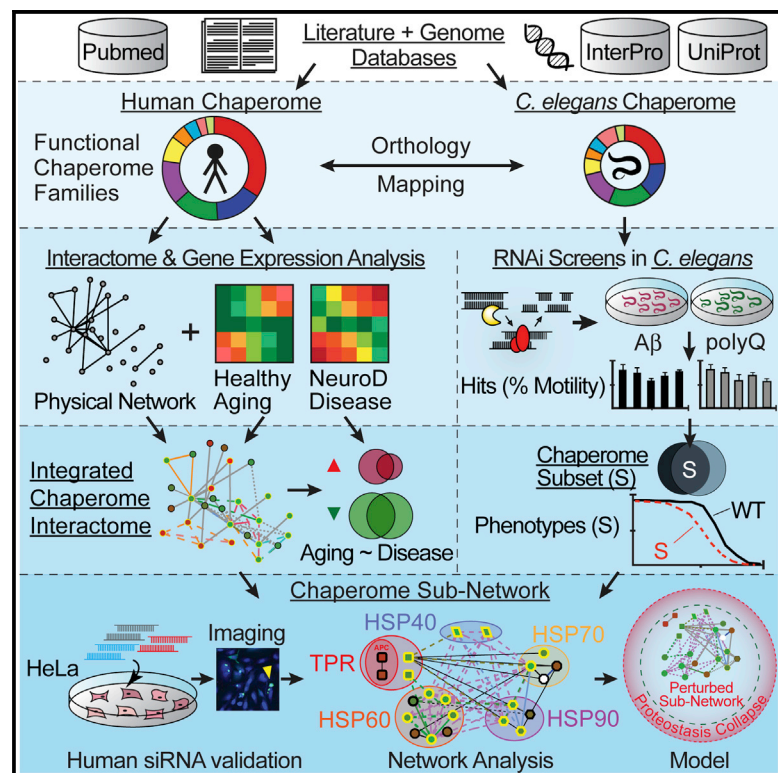


# A Chaperome Subnetwork Safeguards Proteostasis in Aging and Neurodegenerative Disease

## Graphical Abstract



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## In Brief

Brehme et al. have examined the chaperome from *C. elegans* to humans using functional assays and expression as well as protein-interactome analysis. The authors identify a conserved *C. elegans* chaperome subnetwork of 16 chaperone genes, corresponding to 28 human orthologs that are affected in brain aging and diseases associated with protein aggregation.

## Highlights

Chaperome expression is dramatically affected in human brain aging

Chaperome dynamics correlate with aging and neurodegenerative disease

Functional analysis identifies a chaperome subset that safeguards proteostasis

# A Chaperome Subnetwork Safeguards Proteostasis in Aging and Neurodegenerative Disease

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## SUMMARY

Chaperones are central to the proteostasis network (PN) and safeguard the proteome from misfolding, aggregation, and proteotoxicity. We categorized the human chaperome of 332 genes into network communities using function, localization, interactome, and expression data sets. During human brain aging, expression of 32% of the chaperome, corresponding to ATP-dependent chaperone machines, is repressed, whereas 19.5%, corresponding to ATP-independent chaperones and co-chaperones, are induced. These repression and induction clusters are enhanced in the brains of those with Alzheimer's, Huntington's, or Parkinson's disease. Functional properties of the chaperome were assessed by perturbation in *C. elegans* and human cell models expressing A $\beta$ , polyglutamine, and Huntingtin. Of 219 *C. elegans* orthologs, knockdown of 16 enhanced both A $\beta$  and polyQ-associated toxicity. These correspond to 28 human orthologs, of which 52% and 41% are repressed, respectively, in brain aging and disease and 37.5% affected Huntingtin aggregation in human cells. These results identify a critical chaperome subnetwork that functions in aging and disease.

## INTRODUCTION

The proteomes of eukaryotic cells and tissues are represented by a collection of structurally and functionally diverse proteins that form protein-protein interaction networks to communicate within and between cells and tissues to achieve cellular health-span and organismal lifespan (Gavin et al., 2006). Protein quality control mechanisms such as the proteostasis network (PN) protect proteome functionality and prevent accumulation of mutant, misfolded, and damaged proteins (Balch et al., 2008). Protein aggregation has profound consequences on cellular and organ-

ismal health and can cause both gain of function and loss of function (Park et al., 2013; Yu et al., 2014).

Protein conformational diseases are widespread and include cancer and metabolic and neurodegenerative disorders (Haass and Selkoe, 2007; Powers et al., 2009; Xu et al., 2011). Whereas pathogenic pathways for neurodegenerative diseases such as Alzheimer's (AD), Huntington's (HD), and Parkinson's (PD) intersect (Ehrnhoefer et al., 2011), the clinical profiles and environmental and genetic risk factors vary substantially (Langbehn et al., 2004; Belin and Westerlund, 2008; Hampel et al., 2010). For neurodegenerative diseases, the most significant and universal risk factor is aging; moreover, evidence suggests a mechanistic link between aging, aggregation-mediated proteotoxicity, and loss of proteostasis, which has been put forth as one of the nine hallmarks of aging (Cohen et al., 2006; López-Otín et al., 2013). The accumulation of proteotoxic species during aging is inversely correlated with age-associated proteostasis decline (Ben-Zvi et al., 2009). Chronic expression of misfolded proteins in age-onset neurodegenerative disease leads to accumulation of misfolded species and aggregates that overwhelm proteostasis as a basis of cellular dysfunction (Gidalevitz et al., 2006; Douglas and Dillin, 2010).

A central component of the PN is molecular chaperones and co-chaperones that determine the cellular folding environment, prevent misfolding, and redirect nonnative intermediates to the native state (Hartl et al., 2011) or for clearance by the ubiquitin-proteasome system and autophagy (Schmidt and Finley, 2014). The "chaperome" corresponds to the ensemble of chaperones and co-chaperones that interact in a complex network of molecular folding machines to regulate proteome function (Albanèse et al., 2006). An understanding of the chaperome will be instrumental to the biology of aging and how loss of proteostatic control increases the risk for protein conformational diseases. Whereas much is known about the function of individual chaperones (Hartl et al., 2011), there is only a limited analysis of chaperome dynamics and connectivity in metazoans. We therefore compiled the human and *C. elegans* chaperome by a systematic literature search as a basis for integration of human protein-protein interactions (PPIs) and aging brain expression data to achieve a chaperome interactome network. This was

complemented by functional chaperome-wide RNAi screens in *C. elegans* models of A $\beta$  and polyQ proteotoxicity and a human cellular model of Huntingtin aggregation.

Our study has identified chaperone clusters that exhibit striking repression and induction expression patterns in human brain aging. Repression predominates and involves all major families of cytosolic chaperones with a preponderance of ATP-dependent chaperones. We observed concordance of these dynamics with expression in brain tissues of AD, HD, and PD patients. The correlation of these dynamics underlines the central role of the chaperome in aging and disease. The complement of informatics with experimentation identified a chaperome subnetwork that safeguards cellular and organismal proteostasis in *C. elegans* models and human tissue culture cells expressing neurodegenerative disease-related misfolded proteins. This emergence of a conserved chaperome subnetwork provides a resource for future studies to establish how changes in the PN affect aging and disease.

## RESULTS

### Composition of the Human Chaperome

We examined the expression of genes encoding molecular chaperones in human brains during normal aging and in neurodegenerative disease. For this, we compiled a list of all human chaperones and co-chaperones by combining the extensive literature on the biochemical properties of molecular chaperones together with curation and structural genomics profiling to match genes by InterPro protein domain identifiers (IPR-IDs) (Hunter et al., 2012; Figure 1A; Table S1). This analysis identified 332 genes (Figure 1A; Tables S1 and S2A; Supplemental Experimental Procedures) that were unambiguously placed into nine chaperone gene families, corresponding to heat shock protein 90 (HSP90), HSP70, HSP60, HSP40, prefoldin, small HSPs (sHSPs), tetratricopeptide repeat (TPR)-domain-containing (Hartl and Hayer-Hartl, 2002), and organellar-specific chaperones of the ER (Kleizen and Braakman, 2004) and mitochondria (MITO) (Tatsuta et al., 2005). For genes with matching IPR-criteria domains, the groupings were prioritized by chaperone properties rather than localization. The organellar categorization of ER or MITO specific represents chaperones for which the biochemical, genetic, and cell biological evidence supports both chaperone function and organellar-specific localization and for which no IPR domain match could be obtained.

Of the 332 genes that comprise the human chaperome, 88 are functionally classified as chaperones and 244 are co-chaperones. Among the 88 chaperones are 50 ATP-dependent chaperone genes and 38 ATP-independent chaperones. The ATP-dependent chaperones are comprised of the 5 HSP90s, 17 HSP70s, 14 HSP60s, 6 ER-specific, and 8 MITO-specific Hsp100/AAA+ ATPases, respectively. In the HSP70 family are the 17 holding and folding ATP-dependent HSP70s and ten ATP-independent co-chaperones, corresponding to the nucleotide exchange factors (NEFs) BAG1–BAG6, the GrpE NEFs GRPE1 and GRPE2, SIL1 (Hsp110/BAP), and HSPBP1 (Mayer, 2013). Likewise, the HSP90 family is comprised of 46 members including the five ATP-dependent HSP90 chaperones (Pearl and Prodromou, 2006) and 41 ATP-independent co-chaperones

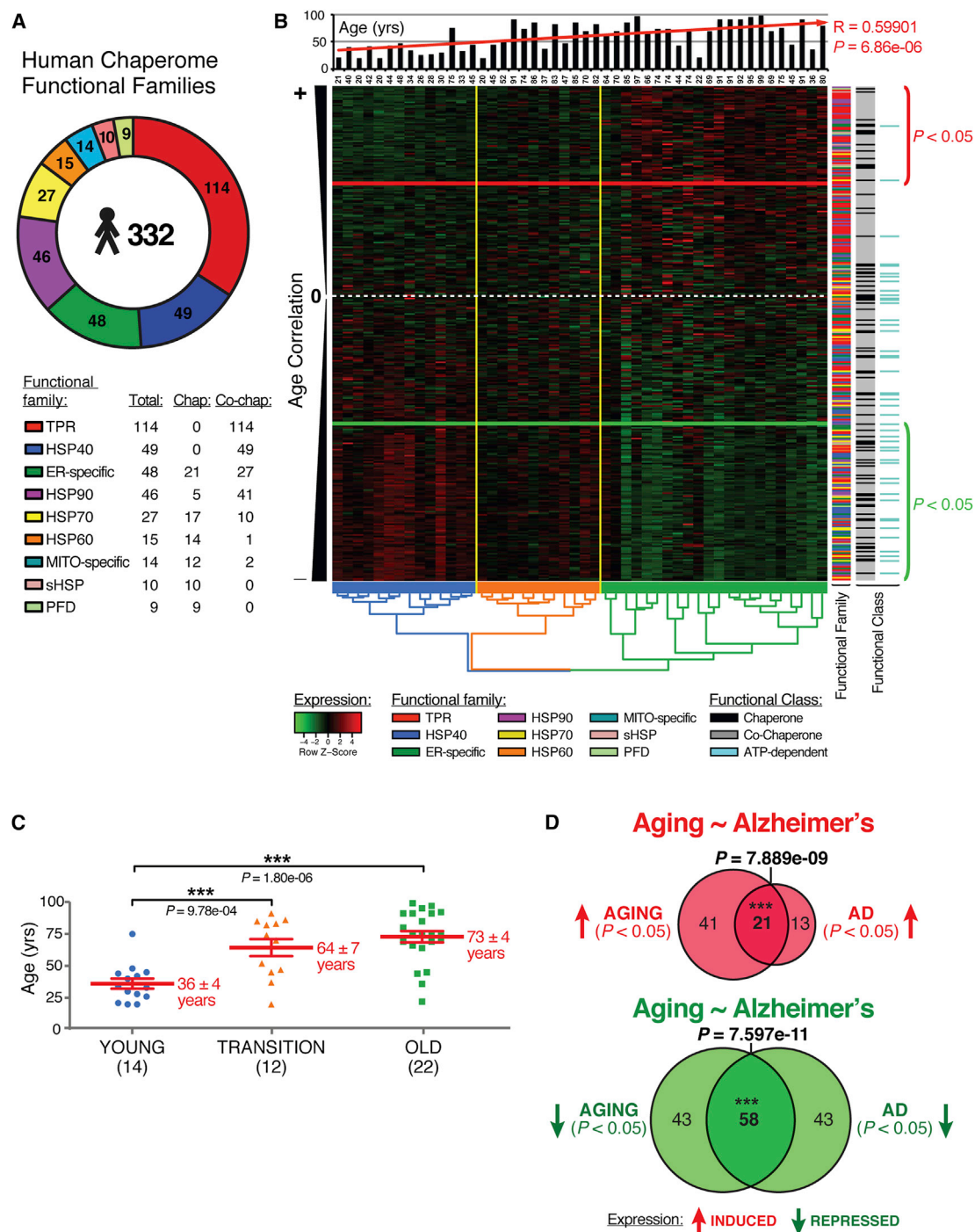
that regulate HSP90 including the two AHA1 co-chaperones (AHA1 and AHA2), CDC37, CDC37L1, p23, and 36 immunophilins subclassified into 18 cyclophilins and 18 FKBP. The 49 HSP40s correspond to a separate family of ATP-independent co-chaperones that function as holding chaperones and HSP70 co-chaperones. Taken together, the HSP90, HSP70, and HSP60 chaperone systems correspond to 26.5% of the chaperome, with the HSP40s contributing another 15% to the chaperome.

Among the 38 ATP-independent chaperone genes are ten sHSPs, nine prefoldins, four MITO-specific, and 15 ER-specific chaperones. Another 19% of the chaperome are represented by the 48 ER-specific and 14 MITO-specific chaperones (Figure 1A; Table S2A) including 26 ER-specific oxidoreductases and two MITO-specific protein-disulfide-isomerase-type thioredoxins. Notably, the largest chaperome subclass is the 114 TPR domain-containing genes, representing 34% of the chaperome. These include STIP1 (HOP) that functions as an HSP70 and HSP90 co-chaperone (Prodromou et al., 1999; Song and Masiison, 2005) and contains three TPR-classifier IPR domains (IPR001440, IPR013026, and IPR019734). Although many of these newly identified members of the TPR-domain family have not been yet shown to function as HSP70 and HSP90 co-chaperones, we opted for a comprehensive and inclusive approach. Some of these members have been recently validated in *C. elegans* using biochemical assays (Haslbeck et al., 2013). This organization into nine functional families lends itself to a systems-level evaluation of chaperome functionality in aging and disease.

### Differential Chaperome Dynamics in Human Brain Aging

We examined the dynamics of the human chaperome using gene expression data from the superior frontal gyrus (SFG) of 48 brains from neuropathologically and neurologically normal control individuals of 20–99 years (Berchtold et al., 2008; Loerch et al., 2008). Analysis of the expression patterns of the human chaperome (Figure 1B) revealed a profile that correlated with aging ( $p = 6.86 \times 10^{-6}$ ) and clustered into two groups with a mean age of  $36 \pm 4$  years and  $73 \pm 4$  years (Figures 1B and 1C). These age groups are highly pronounced upon hierarchical clustering but are discernable even when ordered by chronological age (Figure S1A).

Aging correlation analysis of the human chaperome expressed in the SFG identified 101 chaperone genes (31.8%) that are repressed ( $\text{corr}_{\text{age}} < 0$  and  $p < 0.05$ ), and 62 (19.5%) genes that are induced during aging ( $\text{corr}_{\text{age}} > 0$  and  $p < 0.05$ ; Figure 1B; Table S3). Chaperome age expression revealed enrichment of certain functional families in induction and repression clusters (Figures 1B and S3A–S3D). TPR proteins tend to be induced, whereas HSP40s are repressed (Figure 1B). The significance of the repression and induction clusters is further supported by analysis of an independent data set from frontal lobes of individuals of 24–40 years and 70–94 years (Loerch et al., 2008; Figure S1D). Clustering identified isochronal aging repression and induction clusters with a significant boundary between the two age groups (Figures 1B, 1C, S1A, and S1B). Analysis of both data sets revealed that the chaperome genes repressed and induced in both data sets of normal brain aging overlapped significantly ( $p < 2.2 \times 10^{-16}$  and  $p = 1.7 \times 10^{-12}$ , respectively; Figures



**Figure 1. Differential Chaperome Responses in Human Brain Aging and Neurodegenerative Disease**

(A) The human chaperome. Functional families and number of members are indicated.

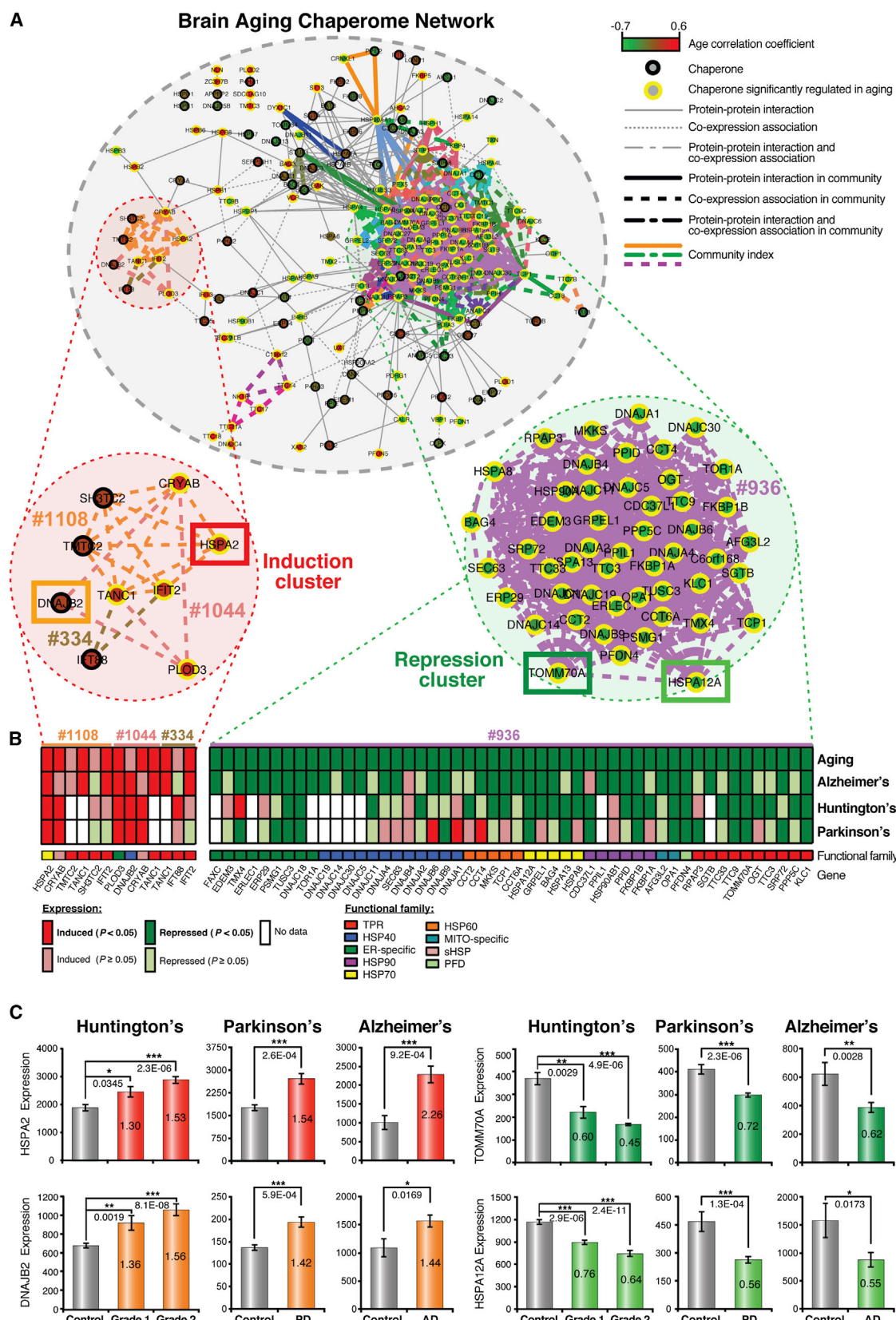
(B) Heatmap showing 318 chaperones expressed in human brain (super frontal gyrus) ordered by decreasing age correlation. The white dashed line indicates age-expression correlation coefficient closest to zero. Genes above the red line are induced ( $p < 0.05$ ); genes below the green line are repressed ( $p < 0.05$ ). The histogram visualizes specimen age upon hierarchical clustering. The dendrogram visualizes hierarchical clustering of brain specimens. The y axis color code highlights from left to right the nine chaperome families, chaperones (black), co-chaperone (gray), and ATP-dependent chaperones (turquoise).

(C) Three major age groups (blue, "young"; orange, "transition"; green, "old") are visualized by dendrogram coloring in (B). Values are mean age  $\pm$  SEM. \*\*\* $p < 0.001$ ; Student's  $t$  test.

(D) Overlaps of chaperones induced (red) or repressed (green) in aging versus AD.

See Figures S1–S3.





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S1E and S1F). We observed similar age clusters with significant boundaries in entorhinal cortex (Figure S1C), confirming chaperone expression dynamics in brain aging in different data sets.

### Concordant Dynamics of Chaperome Expression in Brain Aging and Neurodegenerative Diseases

Because aging represents a risk factor for neurodegenerative disease, we assessed the impact of AD, HD, and PD on chaperome dynamics by examining expression in patient brain samples (Hodges et al., 2006; Moran et al., 2006; Liang et al., 2008; Table S3C–S3E). When analyzing brain-expression data sets from AD patients, we identified 101 significantly repressed genes and 34 induced genes compared to age-matched controls. Both in aging and AD brains, chaperome repression is significantly enriched compared to overall gene repression in the genome (Figures S2A and S2B). We then asked whether the chaperome genes differentially regulated in AD overlapped with the aging-regulated chaperome genes and identified 21 genes that overlapped between the 62 genes induced in aging and 34 genes induced in AD ( $p = 7.89 \times 10^{-9}$ ) and 58 genes that overlapped between 101 aging-repressed and 101 AD-repressed chaperone genes ( $p = 7.6 \times 10^{-11}$ ; Figure 1D). Among the genes that are repressed in both aging and AD, the HSP70-HSP40 system corresponds to 36% of the 58 genes (Table S3D). Chaperome genes consistently repressed in aging and AD include members of all nine functional chaperome families, revealing that alterations in chaperone expression are not selective to specific gene families. The 21 genes induced in both aging and AD extend across all functional families except HSP60 genes. Similarly, we also examined whether the chaperome genes regulated in aging overlapped with those dynamically regulated in HD and PD. Among the 245 chaperome genes detected in all data sets, 36 genes overlapped between genes repressed in aging and HD ( $p = 3.96 \times 10^{-7}$ ) and 24 genes between aging and PD ( $p = 0.01062$ ; Figures S2C and S2E). Chaperome genes induced in aging also significantly overlapped with genes induced in HD ( $p = 2.94 \times 10^{-10}$ ) and PD ( $p = 0.00059$ ; Figures S2D and S2F; Table S3).

We partitioned the chaperome age-expression distribution into the nine families and observed reproducible expression patterns in four distinct brain tissues (Figures S3A–S3D). Ranked by decreasing median aging correlation, the induction of sHSPs and TPR genes consistently ranked high and the HSP60s, HSP40s, and HSP70s were consistently repressed. Among repressed genes, the HSP40s exhibited significant change ( $p = 0.04875$ ), with 62% of 48 HSP40 genes repressed in aging ( $p < 0.05$ ) and 51% repressed in AD. Of these, 41% are repressed

in both aging (SFG) and AD ( $p = 0.0009$ ). Among the genes that are induced in brain aging and disease are sHSPs and TPR-containing chaperone genes (Figures S3A–S3D).

The distribution of ATP-dependent chaperones in aging and AD was shown to be enriched 10-fold in the repression cluster of aging SFG ( $p = 4.8 \times 10^{-6}$ ) and 11-fold in the prefrontal cortex (PFC) ( $p = 1.7 \times 10^{-7}$ ; Figure S3E) whereas ATP-independent chaperones exhibited equivalent levels of repression and induction. This analysis of the chaperome in human brain aging also reveals concordant exacerbation of responses in neurodegenerative disease. These concordant chaperome changes provide evidence for significant changes in the proteostasis network in aging and neurodegenerative disease.

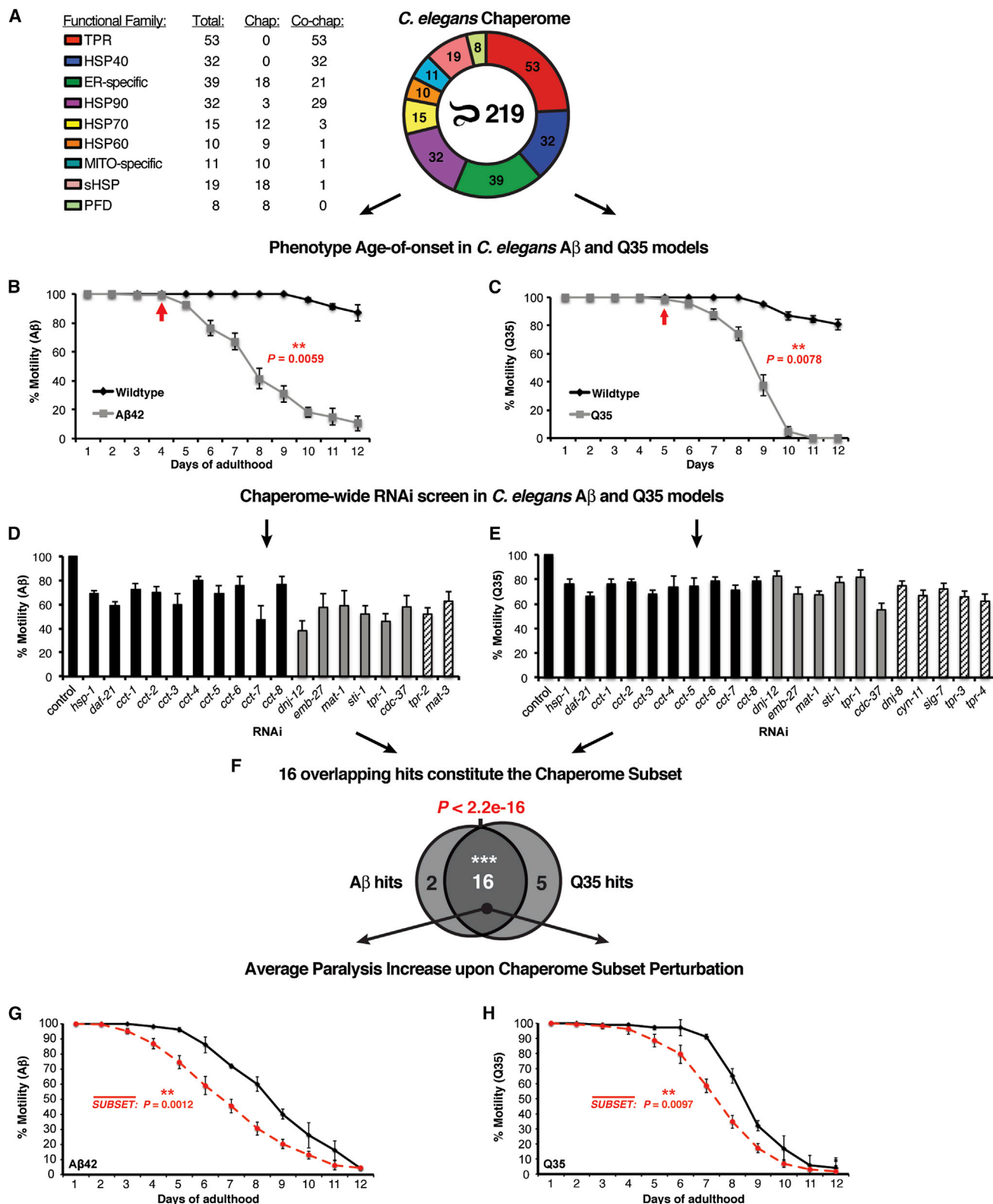
### Chaperome Network Community Dynamics in Brain Aging and Disease

The repression and induction of chaperones in brain aging likely affect the cellular balance of chaperone machines and functionality of the PN, leading us to consider how these components of the chaperome are physically and functionally associated. We visualized the systems-level connectivity of the chaperome by integrating physical protein-protein interactions (PPI edges) from public databases together with coexpression pairs in aging brains (COX edges; Tables S4 and S5) into a PPI-COX interactome (Figure 2A). The COX edges were identified using transcriptome data from SFG tissue given its highly significant and pronounced aging dynamics. Among all 50,403 chaperome pairs, we found 1,193 significant COX edges ( $\text{corr}_{\text{age}} > 0.8$  and  $p < 0.05$ ), of which 15 of 191 unique PPIs are also COX edges. Applying the link-community-clustering algorithm (Ahn et al., 2010) to the PPI-COX network, we identified 40 link communities, of which 34 are repression communities compared to only six induction communities (Figure 2A; Table S6).

This network community-clustering analysis also revealed that the majority of genes residing in induction or repression link communities showed concordant patterns in aging and neurodegenerative diseases, respectively (Figures 2A and 2B), leading to the hypothesis that these aging-expression changes can affect the cellular balance of chaperone machines and functionality of the PN. For example, concordantly aggravated expression patterns for the aging-induced genes HSPA2 (HSP70) and DNAJB2 (HSP40) and the aging-repressed HSPA12A (HSP70) and TOMM70A (TPR) were observed in brain biopsies from AD, HD, and PD patients (Figure 2C). In terms of gene-expression dynamics in aging and disease, these exemplary genes are representative for induction and repression cluster dynamics. Included in the repression cluster are members across eight of

### Figure 2. Chaperome Network Community Dynamics in Brain Aging and Age-Onset Neurodegenerative Diseases

(A) Integrated human chaperome network based on physical protein-protein interaction (PPI) and coexpression (COX) edges and link communities of chaperones concordantly induced or repressed during brain aging. PPIs (solid edges). COX  $> 0.8$  (dashed edges). Color scale indicates positive to negative correlation between age and gene expression. Link communities highlighted by edge color; yellow node borders indicate significant age-expression correlation ( $p < 0.05$ ). (B) Heatmaps visualize induction or repression in aging, AD, HD, and PD at node resolution for communities highlighted in (A). Community numbers and gene names are indicated. Color code micrographically visualizes functional family. Significantly induced and repressed genes ( $p < 0.05$ ) shown in dark red and green, respectively, and nonsignificantly induced and repressed genes with  $p \geq 0.05$  are shown in light red and light green. See Figures S2 and S3. (C) Chaperones and co-chaperones selected from induction and repression communities and their expression in brains from AD, HD, and PD patients. Values are average expression  $\pm$  SEM. Values indicated inside the bars indicate ratios of expression in disease over control. \* $p < 0.05$ ; \*\* $p < 0.01$ ; \*\*\* $p < 0.001$ ; Student's *t* test.



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nine chaperone gene families with predominance of ATP-dependent chaperones and HSP40 co-chaperones, whereas induction communities are enriched for TPR-domain co-chaperones and sHSPs. These observations provide support that prominent changes in chaperone expression levels could accelerate AD, HD, or PD disease pathology characterized by elevated toxic gain-of-function aggregation. Chaperome repression communities dominate the network landscape in human brain aging and disease, linking known chaperones and co-chaperones with less well-characterized chaperones, possibly revealing novel interactions important for the aging and disease PN.

### Chaperome Function in *C. elegans* Models of Protein Aggregation

To complement the bioinformatics analysis of the human chaperome with in vivo functional data, we experimentally validated the functional consequences of repressed chaperome gene expression and function during aging and disease using two established *C. elegans* models expressing the cytotoxic aggregation-prone proteins, A $\beta$  (A $\beta$ <sub>42</sub>) and polyQ (Q35), implicated in AD and polyglutamine (HD) diseases, respectively (Link, 1995; Satyal et al., 2000; Morley et al., 2002). In both models, aggregation and toxicity, measured by decreased motility, increases in an age-dependent manner and can be suppressed by lifespan-enhancing pathways such as the insulin-like signaling pathway (*daf-2* and *age-1*) and the heat shock response (*hsf-1*; Morley et al., 2002; Cohen et al., 2006). We assembled and curated the *C. elegans* chaperome by orthology mapping and manual curation (Harris et al., 2010; Sayers et al., 2012; see Supplemental Experimental Procedures) and identified 219 *C. elegans* chaperone and co-chaperone genes, corresponding to the same nine functional gene families (Table S2B). Comparison of *C. elegans* and human chaperomes revealed similar proportions of most functional families, with notably a reduction in TPR domain co-chaperones to 24% of the *C. elegans* chaperome from 34% in the human chaperome and increased number of sHSPs to 19 genes in *C. elegans* from ten sHSP genes in humans (Figure 3A).

We first examined the functional requirements of all 219 *C. elegans* chaperome genes using RNAi knockdown in animals expressing A $\beta$ <sub>42</sub> by monitoring early-onset paralysis on day 4 of adulthood (Figure 3B). Based on our methodology of screening, assessing age-dependent aggregation and toxicity phenotypes (measured by decreased motility), genes when knocked down

that caused motility defects in both wild-type and disease models were eliminated; in other words, genes that gave the same magnitude of phenotypic change in wild-type animals were not further considered. This functional screen identified 18 genes (Figure 3D), corresponding to ten ATP-dependent chaperones, HSC70 (*hsp-1*), HSP90 (*daf-21*), and eight subunits of the CCT/TRiC chaperonin complex; the co-chaperones, HSP40 (*dna-12*) and CDC37 (*cdc-37*); and the TPR-domain protein STI1 that upon knockdown significantly enhanced A $\beta$ <sub>42</sub> proteotoxicity (Figure 3D). Included among these modifiers were four TPR-domain proteins; the anaphase-promoting complex (APC/C) subunits *mat-1*, *mat-3*, and *emb-27*; and the uncharacterized open reading frames, Y39A3CR.3 (*tpr-1*) and Y57G7A.10 (*tpr-2*), conserved in human as TTC7A/TTC7B and EMC2, with a phenotype on the A $\beta$ <sub>42</sub> animals that were not previously implicated in proteostasis.

To test whether the chaperome genes that regulate A $\beta$ <sub>42</sub> proteotoxicity have more general effects, we performed a subsequent RNAi screen using a *C. elegans* model for expression of aggregation-prone polyQ (Q35), associated with HD pathogenesis. This model of chronic Q35 protein expression and aggregation exhibits an early-onset, age-dependent decline in muscle function (Figure 3C; Morley et al., 2002). Knockdown of 21 of the 219 *C. elegans* chaperome genes significantly enhanced polyQ-dependent proteotoxicity (Figure 3E). These correspond to the same ATP-dependent chaperones (*daf-21*, *hsp-1*, and the eight CCT/TRiC complex subunits) that overlapped with the A $\beta$ <sub>42</sub> screen and 11 co-chaperones, of which six genes were identified in both screens, including the TPR-domain APC/C subunits *mat-1* and *emb-27* and the TPR protein, Y39A3CR.3 (*tpr-1*; Figures 3D and 3E). These results reveal an overlapping common subset of 16 chaperome genes including the newly identified members of the APC/C ( $p < 2.2 \times 10^{-16}$ ; Fisher's exact test; Figures 3D–3F). Additionally, these screens also identified seven chaperones with more selective phenotypes on either A $\beta$ <sub>42</sub>- or Q35-expressing animals.

To investigate whether the common chaperome subset also affects age-related proteotoxicity, we assessed the functionality of *C. elegans* muscle throughout adulthood (days 1–12) following RNAi knockdown of all 16 subset genes in both models. All 16 genes were highly protective in the A $\beta$ <sub>42</sub> ( $p = 0.0012$ ) and Q35 models ( $p = 0.0097$ ) and showed significant reduction in motility upon RNAi, suggesting that repression of the chaperome subset

### Figure 3. Functional Chaperome Perturbation Analyses in *C. elegans* Models of Protein Misfolding

(A) The *C. elegans* chaperome with its functional families and numbers of members per family are shown.

(B) Paralysis (% motility) for wild-type and A $\beta$ <sub>42</sub>-expressing *C. elegans* from day 1 to day 12 of adulthood. Arrow indicates paralysis age of onset. Data points are average percent motility  $\pm$  SEM ( $n = 3$  and  $n \geq 25$  animals/trial). \*\* $p < 0.01$ ; Student's *t* test.

(C) Motility defects for wild-type and Q35-expressing *C. elegans* from day 1 to day 12. Arrow indicates age of onset. Data points as in (B).

(D) RNAi paralysis phenotypes on day 4 of adulthood (% motility) for *C. elegans* expressing A $\beta$ <sub>42</sub> (mean  $\pm$  SEM;  $n = 3$  and  $n \geq 25$  animals/trial). Values are average percent motility  $\pm$  SEM ( $n = 3$  and  $n \geq 25$  animals/trial).

(E) RNAi motility defects on day 2 of adulthood (% motility) for *C. elegans* expressing Q35 (mean  $\pm$  SEM;  $n = 3$  and  $n \geq 25$  animals/trial). Values as in (D).

(F) Venn diagram indicating significant overlap of 16 hits from both screens ( $p < 2.2 \times 10^{-16}$ ; Fisher's exact test).

(G) Average paralysis (% motility) for RNAi of all 16 chaperome subset genes in A $\beta$ <sub>42</sub>-expressing *C. elegans* throughout adulthood (days 1–12). Data points are averages of corresponding data points in each RNAi experiment  $\pm$  SEM, each based on  $n \geq 3$  independent experiments and  $n \geq 25$  animals/trial. \*\* $p < 0.01$ ; Student's *t* test.

(H) Average paralysis (% motility) for chaperome subset RNAi in Q35-expressing *C. elegans* throughout adulthood (days 1–12). Data points as in (G).

See Figure S4.



renders aged organisms more susceptible to proteotoxicity (Figures 3G, 3H, and S4).

### A Chaperome Subset Safeguards Proteostasis in Aging *C. elegans*

Our network analysis of chaperome repression demonstrated concordant changes in brain aging and neurodegenerative disease (Figures 1D and S2). This led us to speculate whether expression of these chaperones also changes during aging, thus affecting the susceptibility of A $\beta$ <sub>42</sub>- and Q35-expressing animals to proteotoxic insult (Figures 3G and 3H). To address this, we monitored the age-dependent changes in motility of *C. elegans* that express a metastable temperature-sensitive mutation in paramyosin (UNC-15<sup>TS</sup>) that misfolds in early adulthood at the permissive temperature (Gidalevitz et al., 2006). At the permissive temperature, knockdown of the chaperome subset (Figures 4A and S4C) substantially exacerbated the loss of muscle cell function during aging of UNC-15<sup>TS</sup> animals, providing direct functional evidence for a protective role in aging.

To further characterize the chaperome subset during aging, we monitored various physiological phenotypes in wild-type and RNAi-treated animals and showed that this subset of the chaperome is important to prevent or delay age-dependent paralysis (Figures 4B, 4C, and S4D). Knockdown of *daf-21* (HSP90) or *hsp-1* (HSC70) led to increased paralysis in 45% and 44% of day 6 animals, respectively, and knockdown of TPR co-chaperones *tpi-1* and *dnj-12* resulted in 70% impairment (Figure S4D). The loss of motility in wild-type animals was due to deterioration of myofilament structure (sarcopenia). We monitored the integrity of MYO-3, a heavy chain component of myofilaments by MYO-3::GFP fluorescence and, upon knockdown of *dnj-12* and *emb-27*, observed more-severe sarcopenia at day 8 compared to day 1, whereas structural integrity of muscle was maintained up to day 8 in controls (Figure 4D). Consistent with these observations, RNAi of *cct-1*, *hsp-1*, and *daf-21* leads to premature Q35 aggregation (Figure 4E), recapitulating the misfolding of disease-associated polyQ proteins, a hallmark of HD. Our evidence at cellular and organismal levels suggests that the chaperome subset safeguards proteostasis during aging.

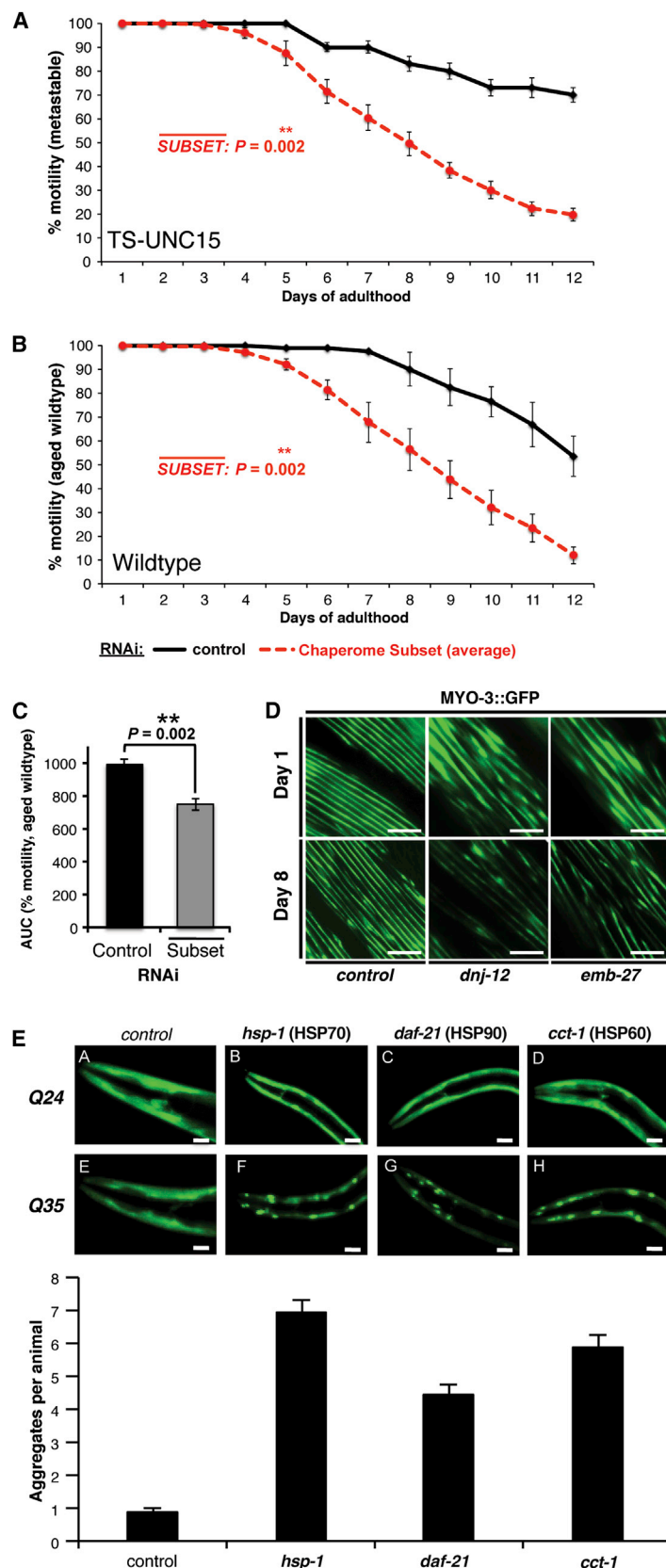
### The Chaperome Subset Safeguards Proteostasis in Human Cells

To test whether the chaperome subset identified in *C. elegans* models of A $\beta$  and Q35 proteotoxicity functionally extends to the human chaperome, and to test its potential contribution to HD, we used a high-content imaging assay to quantify aggregation of doxycycline-inducible Huntingtin-exon1(Q78)-GFP (Htt-GFP) expressed in HeLa cells. The 16 subset *C. elegans* chaperones and co-chaperones correspond to 28 genes in the human genome, of which 24 genes are expressed in HeLa cells (Nagaraj et al., 2011; Figure 5A). We confirmed small interfering RNA (siRNA) knockdown efficiency of Htt-GFP, CCT2, DNAJA1, and HSPA8 by immunoblot analysis to show reduced levels of these chaperones (Figure S5A). An increase in the fraction of Htt-GFP-expressing cells with protein aggregates was observed upon knockdown of 15 human chaperones compared to control, corresponding to 63% of the human chaperome subset and

75% of the worm chaperome subset, respectively (Figure 5B; Table S7). These included all subunits of the CCT/TRiC complex (except CCT5); HSP40 and HSP70 family members DNAJA1 (HDJ-2), DNAJA4, HSPA8 (HSC70), and HSPA14 (Figures 5B and 5C); and the TPR-domain APC/C subunits CDC23 and CDC27 that, upon knockdown, led to significantly elevated aggregation (Figure S5B). The overall protective effect of the chaperome subset in human cells against Htt-GFP aggregation provides additional functional evidence to support the results from the *C. elegans* RNAi analysis of the chaperome subset in proteotoxicity.

### The Chaperome Subnetwork Is Repressed in Brain Aging and Disease

Whereas broad chaperome repression in aging human brains pointed toward proteostasis functional decline and increased susceptibility to proteotoxic insults in neurodegenerative diseases, our functional screens in *C. elegans* led to the identification of a common chaperome subset. To investigate the dynamics of the corresponding chaperome subset in human brain aging and disease, we examined the connectivity of the chaperome interactome and partitioning across communities of induction and repression. We matched orthologous human chaperome subset nodes in the PPI-COX chaperome interactome to visualize their expression dynamics and interactome topology (Figure 6A). Of the 28 human nodes, 27 genes are expressed in the human brain (Berchtold et al., 2008), of which the majority (20 genes) are interconnected in a major component involving 60 edges. This human chaperome subnetwork is significantly interconnected ( $p < 0.01$ ; Figures 6A and S6A–S6C). The subnetwork nodes include five chaperone families and have a higher degree of connectivity than nonsubnetwork nodes ( $p = 0.04$ ; Figure S6D). Overall, 52% of subnetwork nodes are repressed in aging brain compared to 30% repression of nonsubnetwork nodes ( $p = 0.0292$ ; Fisher's exact test; Figure 6C). Likewise, 52% of subnetwork nodes are significantly repressed in AD compared to 30% repression of nonsubnetwork nodes ( $p = 0.0292$ ; Fisher's exact test), 24% in HD, and 16% in both diseases (Figure 6C). The chaperome subnetwork is nearly 2-fold more repressed in brain aging and AD as opposed to nonsubnetwork chaperome genes. We further tested the significance of the overlaps of subnetwork genes repressed in all conditions, aging, AD, and HD as compared to nonsubnetwork genes, asking whether the subset of chaperome subnetwork genes repressed in both AD and HD is significantly enriched. Four genes that are significantly repressed both in AD and HD (HSP90AB1, HSPA8, HSPA14, and TCP1) are also repressed in aging (Figure 6B). We applied a Fisher exact test considering all chaperome genes significantly repressed in at least one condition, AD, HD, or aging, which includes 19 chaperome subnetwork and 142 nonsubnetwork chaperome genes. The significance of the observation that a set of four genes repressed in AD and HD is also repressed in aging ( $p < 10 \times 10^{-5}$ ; Fisher's exact test; Figure 6D) demonstrates the power of integrating data from more than one disease and aging. Some of the subnetwork chaperome nodes that were not significantly repressed in aging are repressed in AD, including the APC/C complex TPR-domain subunits



**Figure 4. A Chaperome Subset Safeguards *C. elegans* Proteostasis against Aging-Related Proteotoxicity**

(A) Average paralysis (% motility) for chaperome subset RNAi in the *unc-15(e1402)* TS strain at 15°C throughout adulthood (days 1–12). Data points are averages of corresponding data points in each RNAi experiment  $\pm$  SEM, based on  $n \geq 3$  experiments and  $n \geq 20$  animals/trial.  $**p < 0.01$ ; Student's *t* test.

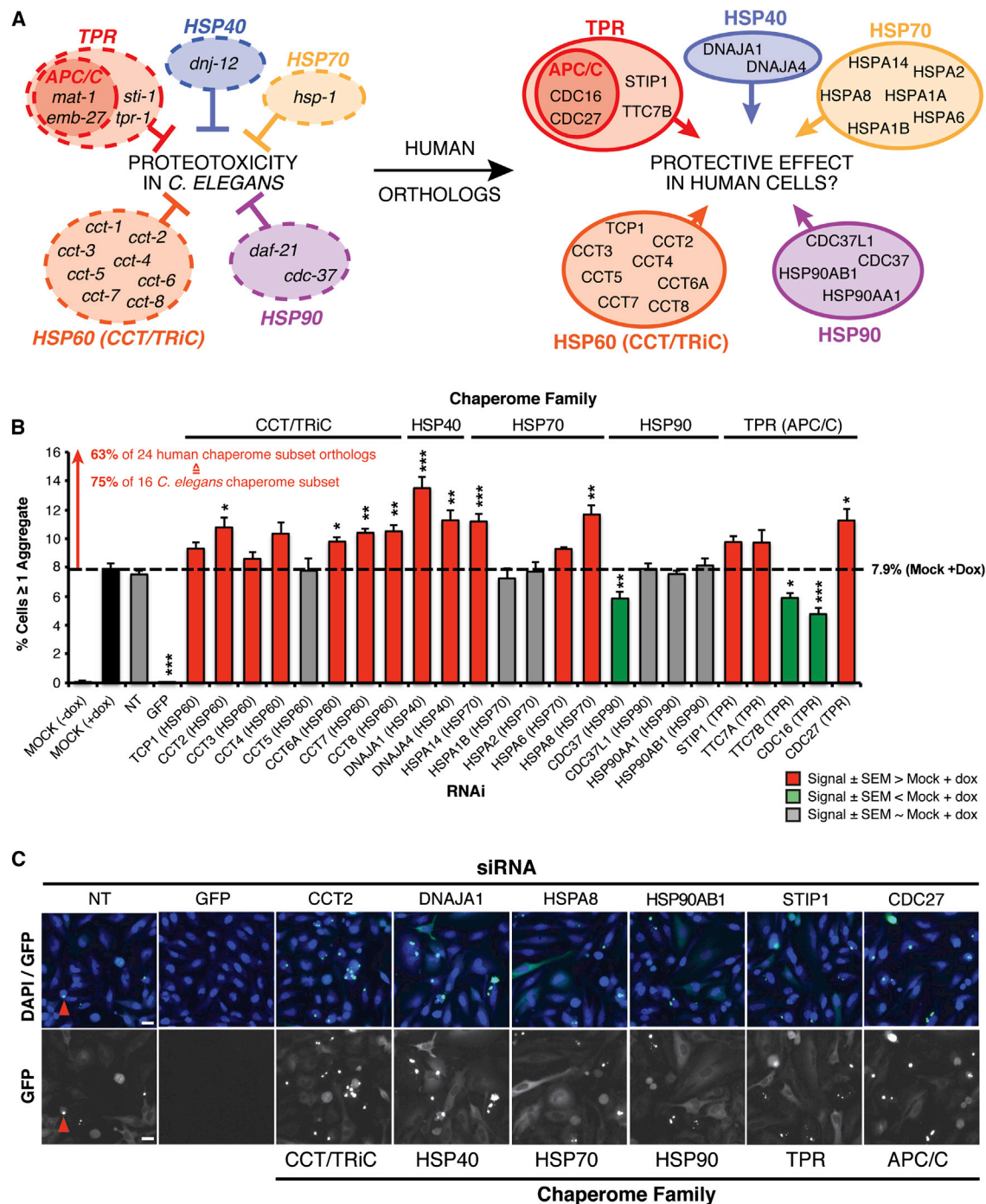
(B) Average paralysis (% motility) in aged wild-type animals throughout adulthood (days 1–12). Data points as in (A).

(C) Early-onset paralysis (% motility) upon chaperome subset RNAi in aged wild-type animals (compare B) as area under the curve (AUC) for control aging wild-type worms (average  $\pm$  SEM;  $n = 5$ ) and average of RNAi-treated aging wild-type worms (average of 16 subset phenotypes  $\pm$  SEM, each  $n = 3$ ).  $**p < 0.01$ ; Student's *t* test.

(D) Sarcopenia phenotype upon control, *dnj-12*, and *emb-27* RNAi visualized by MYO3::GFP fluorescence at day 1 versus day 8 of adulthood. The scale bar represents 10  $\mu$ m.

(E) Early-onset aggregation of polyQ (Q35) expressed in body wall muscle cells upon chaperome subset RNAi. Q25, subthreshold polyQ. Graph shows increased average aggregate count upon RNAi compared to control  $\pm$  SEM ( $n \geq 100$  animals;  $n = 3$ ). The scale bar represents 0.02 mm.

See Figure S4.



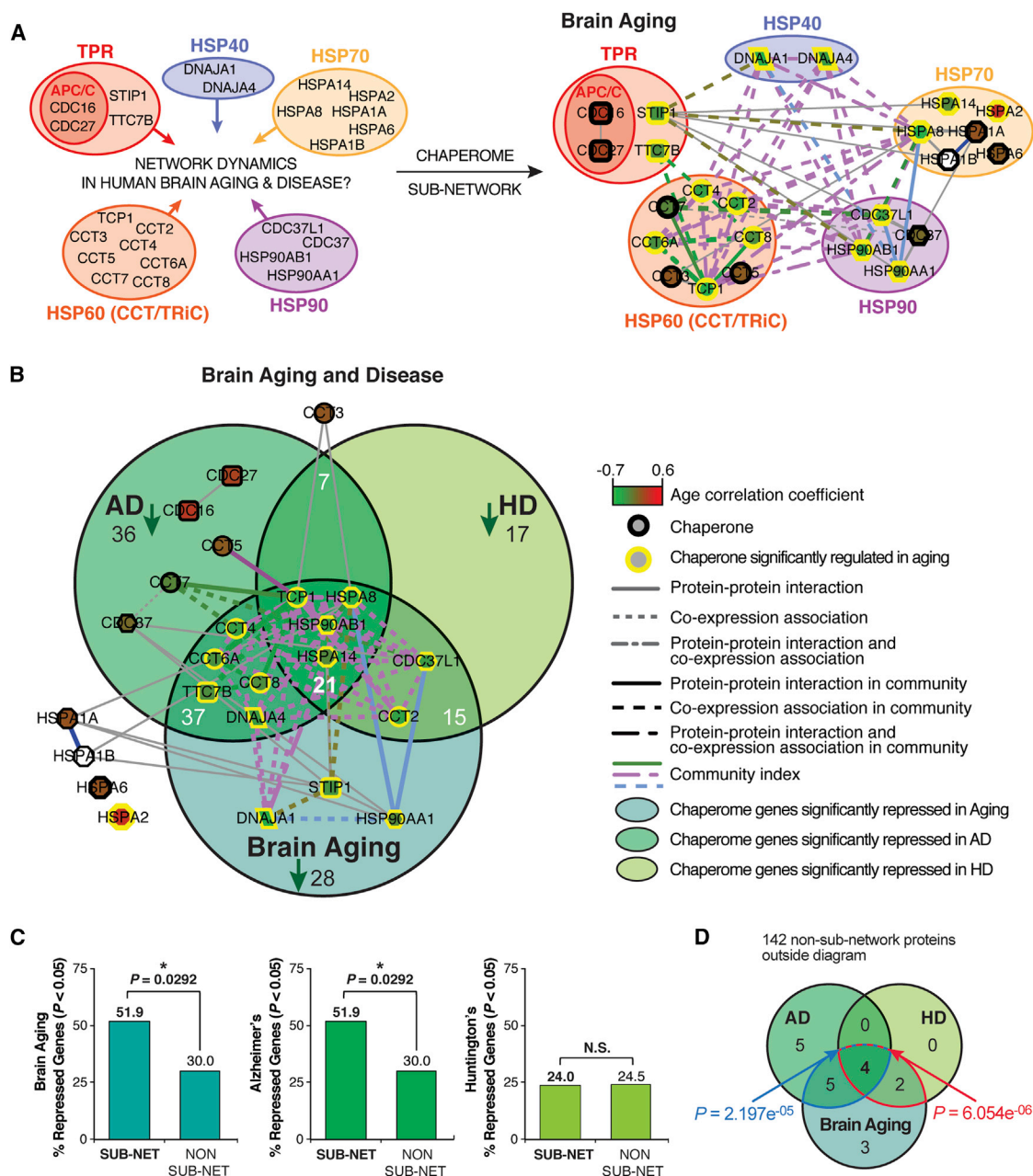
**Figure 5. Human Chaperome Subnetwork Safeguards Proteostasis against Huntingtin Aggregation**

(A) Sixteen chaperome subset members identified by RNAi screens in  $A\beta_{42}$  and Q35 *C. elegans* models grouped by functional family. APC/C, anaphase-promoting complex/cyclosome and the corresponding 24 human chaperome subset members identified by orthology mapping.

(B) Percentage of HeLa cells with greater than or equal to one Huntingtin-exon1(Q78)-GFP (HTT-GFP) aggregate and upon siRNA. Results shown for all 24 human orthologs expressed in HeLa, corresponding to the 16 *C. elegans* chaperome subset members. Values are averages  $\pm$  SEM (n = 6). Red, gray, and green bars represent increased, unchanged, and decreased aggregation, respectively, measured as “%Cells  $\geq$  1 aggregate”. \*p < 0.05; \*\*p < 0.01; \*\*\*p < 0.001; Student's t test.

(C) Representative images for nontargeting (NT) siRNA, siRNA-GFP (positive control), and siRNA against each one member of the chaperome subset functional families are shown. Red arrows exemplify HTT-GFP aggregates. The scale bar represents 20  $\mu$ m.

See Figure S5.



**Figure 6. The Human Chaperome Subnetwork Is Repressed in Aging and Disease**

(A) Extraction of the human orthologous chaperome subnetwork from the chaperome interactome shown in Figure 2A to highlight chaperome subnetwork dynamics in human aging brain and neurodegenerative disease. Nodes, edges, shapes, and edge strengths as in Figure 2A.

(B) Human chaperome subnetwork superimposed on Venn overlaps of chaperome genes significantly repressed in aging, AD, and HD.

(C) Graphs show percent subnetwork (sub-net) versus percent nonsubnetwork (non sub-net) chaperome nodes repressed in human aging brain (SFG) and brains from Alzheimer's (SFG) and Huntington's disease (PFC) patients (see Figure S6). SFG, superior frontal gyrus; PFC, prefrontal cortex.

(D) Venn diagram of overlaps of chaperome subnetwork genes significantly repressed in both AD and HD as well as in aging. p values are based on Fisher's exact test, considering only chaperones that are significantly repressed in at least one of the three conditions: aging, AD, or HD. The blue overlap area and p value indicate the significance of the overlap of subnetwork genes repressed in all three conditions against the union of subnetwork genes repressed in "aging only" and in "aging and AD"; the red overlap area and p value indicate the significance of the overlap of subnetwork genes repressed in all three conditions against the union of subnetwork genes repressed in aging only and in "aging and HD".

CDC16 and CDC27. These results reveal that the chaperome subnetwork is significantly more interconnected in the human interactome and concordantly more repressed in brain aging.

The significantly enriched fraction of aging-repressed subnetwork chaperome nodes versus nonsubnetwork nodes and their aggravated repression in aging and disease is in agreement with



the chaperome subnetwork phenotypes observed in our RNAi functional perturbation experiments.

Thus, our orthogonally integrated chaperome-scale approach successfully identified a small subset of chaperones and specific co-chaperones from hundreds of chaperone and co-chaperone factors, including well-established and novel regulators of proteostasis maintenance in aging and disease that are highly interconnected in a chaperome subnetwork.

## DISCUSSION

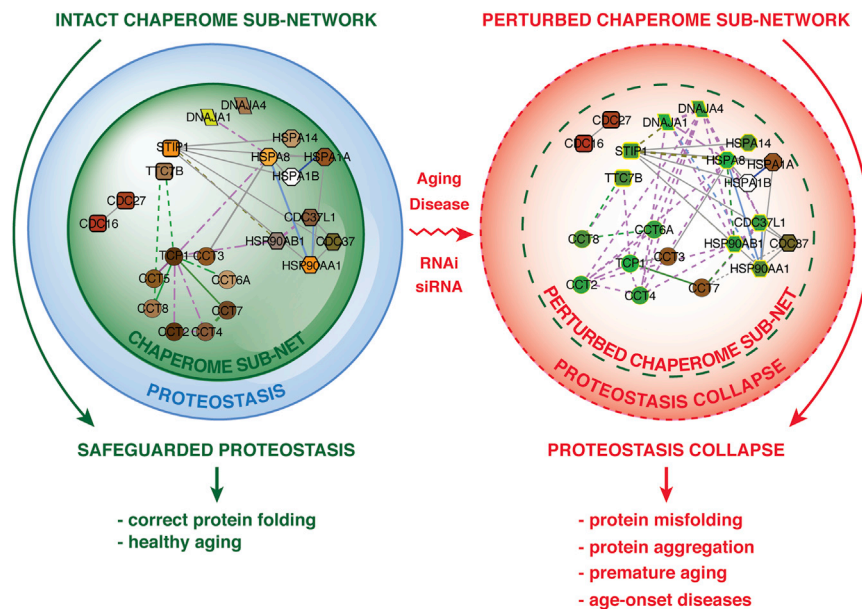
Molecular chaperones, being among the most highly conserved genes with essential functions for protein biogenesis, might have been thought to be equally important for proteome maintenance. Our analysis of chaperome dynamics combines the analysis of expression in human brain and neurodegenerative disease, experimental validation using *C. elegans* and human cells expressing disease-associated aggregates, and protein-protein interaction network analysis, from which we have identified a chaperome subnetwork affected in aging and disease. This study has identified a subset of the chaperome that is critical to maintain proteostasis in aging and upon challenge with neurodegenerative disease-associated proteins. This combined approach led to identification of a conserved subset of 16 genes in *C. elegans*, comprised of the ATP-dependent chaperones HSC70 and HSP90; the CCT/TRiC complex; and select HSP40 and TPR-domain co-chaperones that exhibit altered expression during human brain aging and are functionally required in *C. elegans* models to prevent proteotoxicity of neurodegenerative-disease-associated proteins. Of the human chaperome of 332 genes, 32% are repressed in brain aging, corresponding mostly to ATP-dependent chaperone machines involved in holding intermediates and folding to the native states, and are represented by highly connected repression clusters that concordantly decline in brains of AD, PD, and HD patients. We propose that changes in expression of the subnetwork may signify early events, leading to age-associated proteostasis collapse with implications for the pathogenesis of neurodegenerative disease.

The composition of the chaperome subnetwork highlights the central importance of specific ATP-dependent cytoplasmic chaperone machines during aging from *C. elegans* to human essential to achieve a healthy-tissue proteostatic state that can withstand challenge by expression of cytoplasmic polyQ expansion proteins or A $\beta$ . Some of these chaperones such as the HSP70-HSP40 machine have been previously implicated in the modulation of polyQ-expanded protein aggregation (Cummings et al., 1998; Jana et al., 2000). Likewise, the level of cytosolic chaperonin affects polyQ toxicity by actively modulating the aggregation state, a major cause of polyQ cytotoxicity in Huntington's disease (Nollen et al., 2004; Behrends et al., 2006; Kitamura et al., 2006; Tam et al., 2006). Differences are revealed that may point toward aging or disease-specific subnetwork modules or contribution of only parts of the subnetwork to pathways involved in molecular pathology of these diseases. Notably, HSP90 resides at the intersection of aging, AD, and HD. The lower overall number of subnetwork versus nonsubnetwork genes repressed in HD compared to those repressed in AD could

correspond to differences in the molecular underpinnings of these diseases, whereas the six subnetwork genes significantly repressed in HD are also significantly repressed in aging, including HSP90, HSP70, and chaperonin (TCP1), representative of the core cytoplasmic molecular folding machineries. In addition to identification of the major ATP-dependent chaperones in our functional screens, we show that components of the APC, an E3 ubiquitin ligase that targets proteins for degradation, are highly effective modifiers of A $\beta$  and polyQ proteotoxicity phenotypes. Despite its established role in the exit from mitosis, it has been shown that the APC is functional in postmitotic neurons (Gieffers et al., 1999; Kim et al., 2009; Marrocco et al., 2009) with a role in cognitive processes (Kuczera et al., 2011). Further evidence suggests that deregulated APC function is associated with neurodegeneration and cognitive decline (Almeida et al., 2005; Li et al., 2008; Maestre et al., 2008), and a screen in yeast identified the APC as modifier of polyQ toxicity (Bocharova et al., 2008). Considering existing evidence, we propose that these APC components represent novel proteostasis modifiers with a role in degradation through their E3 ubiquitin ligase function, whereas mechanistically, it is possible that they may function as co-chaperones. Previous studies using RNAi in *C. elegans* have identified components acting in protein degradation as modifiers of polyQ proteotoxicity (Nollen et al., 2004).

The largest chaperome gene class is the 114 TPR-domain-containing proteins corresponding to 53 orthologs in *C. elegans*, accommodating, in an unbiased way, the large degree of functional heterogeneity of TPR-domain proteins in chaperone-related function. Four *C. elegans* proteins contribute to the chaperome subnetwork (*sti-1*, *mat-1*, *emb-27*, and *tp-1*), and another four were identified to affect proteostasis in the A $\beta$  (*tp-2* and *mat-3*) and polyQ (*tp-3* and *tp-4*) models, of which none except *sti-1* had been previously described to have a role in proteostasis. The TPR family contains the largest number of members that have not yet been shown to function as HSP90 and HSP70 co-chaperones, although a recent biochemical analysis in *C. elegans* identified 13 TPR proteins that interact with HSP70 or HSP90 (Haslbeck et al., 2013). Based on our inclusive and unbiased chaperome-scale in vivo results from two independent screens, we identified additional TPR-domain proteins to be functionally equivalent to HSP90 or HSC70, leading us to propose that these factors harbor properties that are highly linked to proteostasis network maintenance and concordantly regulated with global chaperome dynamics in aging and disease.

Previous efforts to characterize chaperone networks have proposed subnetworks that participate in the folding of newly synthesized proteins and those that interact with preexisting proteins that become denatured upon acute stress (Albanèse et al., 2006). Our network analysis combines chaperome-expression analysis in aging brains with community network clustering to organize the connectivity dynamics of the human chaperome network and provides a 3D representation of the chaperome subnetwork within the context of the complete chaperome interactome. The subnetwork nodes are more interconnected and repressed than nonsubnetwork chaperome nodes and suggests that perturbation of a subnetwork node and its edges would result in a more severe perturbation of network integrity compared to the more peripheral low-degree



**Figure 7. The Chaperome Subnetwork as Proteostasis Safeguard and Its Collapse in Disease**

(A) Chaperome subnetwork action as buffer that safeguards proteostasis from proteotoxic stress, facilitating healthy development and aging. (B) Chaperome subnetwork perturbation entails proteostasis collapse, exposure to proteotoxicity, accelerated aging, and age-onset disease. Perturbation exemplified by loss of edges and repression of gene expression (green nodes).

annotation and to identify members not previously associated with these families. We organized the genes into nine functional families based on literature evidence on activities and the IPR-criteria domains. Chaperones with exclusive function in the ER and MITO compartments for which no IPR domain could be matched were grouped as “ER-specific” and “MITO-specific”. Small co-chaperone families with unambiguous functional association with a chaperone were grouped within the respective chaperone system (family). HSP40 and TPR-domain co-chaperones were organized

in separate families. Human and *C. elegans* chaperome gene lists were matched and reconciled using orthology pairs with the National Center for Biotechnology Information (NCBI) HomoloGene database. The annotations were curated based on the WormBase (release WS234) comparative genomics tool that associates *C. elegans* genes with human orthologs based on curated and automated predictions by NCBI KOGs, InParanoid, TreeFam, pre-computed BLAST results, Ensembl COMPARA, and the orthologs matrix project (OMA). We applied bipartite mapping to identify orthology pairs and the respective species-specific chaperome subsets.

nonsubnetwork nodes. Accordingly, loss of protective chaperome subnetwork buffering capacity compromises proteostasis capacity, leading to an increased sensitivity to endogenous and exogenous stress and disease predisposition (Figure 7). The HSP90 chaperone has been proposed to have buffering capacity in its role as a capacitor of morphological variation and facilitator of evolution. Reduction of HSP90 levels below a critical threshold exposes cryptic endogenous variants such as genetic mutations that would otherwise be corrected or suppressed by HSP90 (Rutherford and Lindquist, 1998; Queitsch et al., 2002). Local fluctuations in the expression of HSP90 in one tissue are recognized by transcellular chaperone signaling by the compensatory expression of chaperones in distant tissues to achieve organismal proteostasis (van Oosten-Hawle et al., 2013). The chaperome subset described here unites HSP90 and its co-chaperones with several novel and previously undescribed PN components in a highly interconnected subnetwork. We propose that the chaperome subnetwork, rather than individual chaperones, is important for the properties of the PN in aging and disease and suggest that this subnetwork is a functional “core chaperome” within the global chaperome (Powers and Balch, 2013). Based on the importance of proteostasis in health and disease, we suggest that chaperome subnetwork-targeted therapeutic interventions may be beneficial for a large number of age-related protein-misfolding disorders (Powers et al., 2009).

## EXPERIMENTAL PROCEDURES

### Chaperome Gene List Curation, Annotation, and Orthology Mapping

We curated the literature for chaperone and co-chaperone families, covering all structural and functional categories and subcellular localizations relevant to chaperone-assisted protein folding, and comprehensively annotated the human and *C. elegans* family members. We matched genes with domain structures referenced in UniProt, prioritizing 44 bona fide IPR-criteria domains (IPR-IDs) (Table S1) characteristic of each family to consolidate our literature-based

expression profiles for 318 human chaperome genes were extracted from two independent transcriptome data sets of human brain biopsy tissue samples, covering subjects from a variety of ages (Berchtold et al., 2008; Loerch et al., 2008). We calculated Pearson correlation between age and each chaperone’s expression and evaluated significance of correlation ( $p < 0.05$ ). Hierarchical clustering was performed to cluster samples by expression profile similarity. For further details, see Supplemental Experimental Procedures.

### Chaperome Expression Correlation Analyses

Expression profiles for 318 human chaperome genes were extracted from two independent transcriptome data sets of human brain biopsy tissue samples, covering subjects from a variety of ages (Berchtold et al., 2008; Loerch et al., 2008). We calculated Pearson correlation between age and each chaperone’s expression and evaluated significance of correlation ( $p < 0.05$ ). Hierarchical clustering was performed to cluster samples by expression profile similarity. For further details, see Supplemental Experimental Procedures.

### Construction of the Integrated Brain-Aging Chaperome Interactome

We retrieved 64,738 unique human PPIs from MINT, BioGRID, HPRD, and IntAct and extracted the human chaperome interactome. Among these, we identified PPIs involving chaperome genes expressed in superior frontal gyrus of aging human brains (Berchtold et al., 2008). Coexpression correlation coefficients ( $\text{corr}_{\text{age}}$ ) were calculated for all-by-all gene pairs to identify pairs with significant Pearson correlation of coexpression. Pairs with  $\text{corr}_{\text{age}} \geq 0.8$  ( $p < 9.0 \times 10^{-12}$ ) were considered significantly coexpressed (COX) and combined with PPIs into an integrated PPI-COX network. Visualizations were generated in Cytoscape v2.8.1 (Smoot et al., 2011).

### Chaperome Network Community Clustering

We applied the link-community-network-clustering algorithm gauged at a community size cutoff of greater than or equal to three nodes and greater than or equal to two edges (Ahn et al., 2010) to identify communities of interconnected aging-coreregulated chaperome genes. See Supplemental Experimental Procedures.

### *C. elegans* Strains and Maintenance

*C. elegans* wild-type Bristol strain N2,  $A_{\beta 42}$  CL2006 (*dvl52*), Q35 AM140 (*rmls132[Punc-54::q35::yfp]*), the temperature-sensitive (TS) mutant strain

CB1402 (*unc-15(e1402)*), and the RW1596 (*myo-3(st386);stEx30[myo-3::GFP;rol-6(su1006)]*) strains were maintained according to standard methods at 20°C on nematode growth media with OP50 *E. coli* (Brenner, 1974).

### C. elegans RNAi Screens for Chaperome Modifiers of Protein-Misfolding-Related Proteotoxicity

Chaperome-wide RNAi screens for enhancement of motility defects in *C. elegans* body wall muscle cells were performed using the commercial RNAi library. Missing or incorrect clones were cloned into L4440 (Kamath and Ahringer, 2003). Synchronized L1 animals expressing A $\beta$ <sub>42</sub> or polyQ were fed bacteria expressing RNAi for each target. In case of lethality or larval arrest, worms were fed at the L4 stage. Adult worms from age-synchronized populations were scored for paralysis (Link, 1995; A $\beta$ <sub>42</sub> screen) on day 4 or for motility defects (Silva et al., 2011; Q35 screen) on day 2 of adulthood. RNAi candidates with 20% decrease in movement compared to control in greater than or equal to three experiments constitute the final set. For aging-related proteotoxicity, synchronized adult animals fed chaperome subset RNAi were assayed daily, and nonresponders to prodding were scored as paralyzed. *unc-15(e1402)* animals were grown at 15°C and assayed daily for paralysis. To assess myofilament structure, we monitored MYO-3::GFP fluorescence in animals fed bacteria expressing double-stranded RNA against each target. Images were taken on days 1 and 8 of adulthood using a Zeiss Axiovert 200 microscope. See Supplemental Experimental Procedures.

### Human Chaperome Subnetwork Interactome

We extracted 28 human orthologs of the 16 chaperome subset genes as described. The human chaperome subnetwork was obtained as a subnetwork of the PPI-COX chaperome interactome. To test significance, we built 100 randomized control PPI-COX networks, keeping number of nodes, edges, and node degree constant but rewiring edges between nodes and treating PPI and COX edges separately to conform to the different nature of these interactions. Network figures were generated with Cytoscape.

### siRNA-HCI for Modifiers of Huntingtin Aggregation

Chaperome modifiers of Htt-GFP aggregation (percent of cells greater than or equal to one aggregate) were identified by siRNA perturbation coupled to high-content imaging (HCI) in HeLa cells. Monoclonal doxycycline-inducible cells expressing Htt-GFP were transfected with nontargeting or quadruplex siRNA smart pools. Cells were fixed, stained with Hoechst dye, and analyzed. See Supplemental Experimental Procedures.

### SUPPLEMENTAL INFORMATION

Supplemental Information includes Supplemental Experimental Procedures, six figures, and seven tables and can be found with this article online at <http://dx.doi.org/10.1016/j.celrep.2014.09.042>.

### AUTHOR CONTRIBUTIONS

M.B., C.V., J.H.S., and A.V. performed experiments or contributed new reagents. M.B., T.R., S.W., Y.Z., and K.O. performed computational analyses. M.B., C.V., H.G., and R.I.M. wrote the manuscript. D.G., M.V., H.G., and R.I.M. designed and/or advised research. M.V., H.G., and R.I.M. should be considered joint senior authors.

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