

## ORIGINAL ARTICLE

# Genetic variation in the Yolk protein expression network of *Drosophila melanogaster*: sex-biased negative correlations with longevity

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One of the persistent problems in biology is understanding how genetic variation contributes to phenotypic variation. Associations at many levels have been reported, and yet causal inference has remained elusive. We propose to rely on the knowledge of causal relationships established by molecular biology approaches. The existing molecular knowledge forms a firm backbone upon which hypotheses connecting genetic variation, transcriptional variation and phenotypic variation can be built. The sex determination pathway is a well-established molecular network, with the *Yolk protein 1–3* (Yp) genes as the most downstream target. Our analyses reveal that genetic variation in expression for genes known to be upstream in the pathway explains variation in downstream targets. Relationships differ between the two sexes, and each Yp has a distinct transcriptional pattern. Yp expression is significantly negatively correlated with longevity, an important life history trait, for both males and females.

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## INTRODUCTION

Genomic tools have enabled the simultaneous evaluation of many gene expression levels within a genome, making the study of transcriptional networks possible (Featherstone and Broadie, 2002; Guthke *et al.*, 2005). There is evidence of genetic variation in expression networks (Tarone *et al.*, 2005; Sieberts and Schadt, 2007; Nuzhdin *et al.*, 2009), and genetic variation in transcription has been used as a systems biology tool for mapping large groups of genes underlying human diseases (Schadt *et al.*, 2009a,b) in a ‘top down’ approach. These large networks help to pinpoint specific genes, but a problem remains as covariation in gene expression should not be confused with causality (Coffman *et al.*, 2005; Lee *et al.*, 2009). For example, gene expression levels will be correlated with each other when there is a causal relationship, such as when one gene is upstream of the other. Expression levels will also be correlated when two genes are regulated by a common factor (Jansen *et al.*, 2009). When large numbers of genes are examined with small sample number of genotypes, the sheer complexity of organism-wide networks interfere with the identification of causal relationships (Coffman *et al.*, 2005; Jansen *et al.*, 2009). We propose a novel ‘bottom up’ approach, relying on causal relationships among genes having been already established in prior molecular biological experiments. We apply this paradigm for natural small-effect mutations where the networks have been established using mutations of major effect. It remains an open question as to whether natural genetic variation recapitulates a molecular network structure and can be related to phenotypic variation (see Box 3 in Harshman and Zera (2007) and Stern (2000)). In addition, the nature of the response to expression variation (that is, linear versus

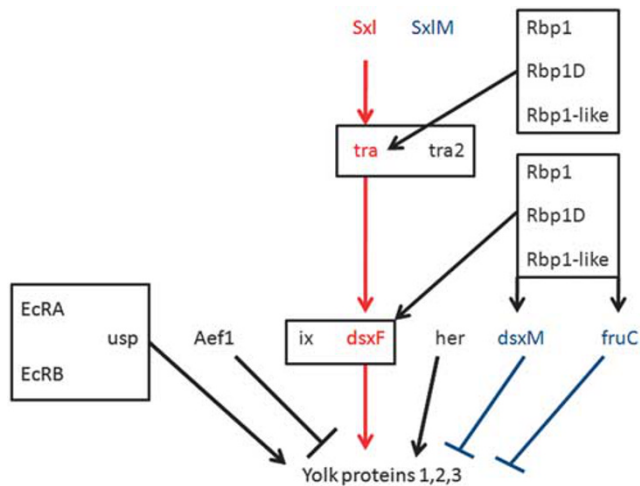
nonlinear) may be important to network outcomes (Gjuvsland *et al.*, 2007a–c). Here, we address these challenges using the Yolk protein (Yp) expression network as an exemplar.

The Yp expression network of *Drosophila melanogaster* (Figure 1) is well described (Ota *et al.*, 1981; Belote *et al.*, 1985; Kraus *et al.*, 1988; Baker *et al.*, 1989; Burtis *et al.*, 1991; Abrahamsen *et al.*, 1993; An and Wensink, 1995; Bownes *et al.*, 1996; Cline and Meyer, 1996; Erdman *et al.*, 1996; Li and Baker, 1998; Brodu *et al.*, 2001; Hutson and Bownes, 2003; Kumar and Lopez, 2005; Billeter *et al.*, 2006; Goldman and Arbeitman, 2007; Qi *et al.*, 2007; Sanchez, 2008; Lebo *et al.*, 2009). Consequently, causal relationships among genes in the network are known. *Yp1–3* provide the major components of egg yolk (Bownes, 1992) and are located on the X chromosome. The Yp network has a number of distinct advantages (1) many mutants are not lethal and demonstrate intermediate phenotypes (Cline and Meyer, 1996), (2) dosage effects have been established with mutant experiments (that is, Li and Baker, 1998) and (3) a genetic component has been demonstrated for expression variation in all parts of the sex determination hierarchy, including mis-spliced isoforms of *dsx* (Tarone *et al.*, 2005), that correlate with *Yp1* expression in males. Accordingly, this set of well-established causal relationships among genes in the network regulating Yps, and quantitative responses to upstream variation in known causal factors, makes the Yp expression network an ideal system for evaluating the effects of natural variation from a systems biology perspective.

A detailed understanding of natural variation in the Yp network could also provide insight into several interesting biological problems. Several loci in the network, including all of the Yps, are located on the

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**Figure 1** A diagram of known regulatory interactions in the Yp expression network. *Sxl*, *tra*, *tra2* and the Rbps are splicing factors, all other genes regulate expression. Arrows indicate activation of expression/splicing. Bars indicate inhibition of expression/splicing. Boxes indicate groups of physically interacting proteins. Red and blue represent alternative splices that are canonically considered to be expressed in a sex-specific manner (male, blue; female, red), though their expression is known to be leaky. Boxes represent genes that function together in complexes to influence downstream expression/splicing.

X chromosome, which is upregulated approximately twofold in *Drosophila* males compared with females (Hamada *et al.*, 2005; Kind *et al.*, 2008). Moreover, in the data analyzed here the X chromosome is enriched for genes that show additive genetic inheritance of gene expression in *Drosophila* males, but dominance variation in females (Wayne *et al.*, 2007). This pattern may suggest nonlinear responses in the network (Gjuvsland *et al.*, 2007a–c), variation in dosage compensation (Goldman and Arbeitman, 2007; Lebo *et al.*, 2009) or a combination of both factors. In the Yp network, *Sxl* is the most upstream. *Sxl* is also the most upstream factor in the sex determination splicing cascade and it regulates dosage compensation (Cline and Meyer, 1996; Sanchez, 2008).

Manipulation of expression of genes in the Yp network has been demonstrated to affect indicators of fecundity such as fertility, hatch rates and egg numbers in females (Postlethwait and Shirk, 1981; Bownes *et al.*, 1991; Terashima and Bownes, 2004). The Yps are the major component of eggs and their expression is a good indicator of females with high fertility and fecundity (Bownes *et al.*, 1991; Terashima and Bownes, 2004). Reproduction is also known to result in a complex tradeoff with lifespan under some conditions (Rose, 1989; Djawdan *et al.*, 1996; Partridge *et al.*, 2005; Flatt *et al.*, 2008; Toivonen and Partridge, 2009; Kenyon, 2010). There is also some evidence that would suggest Yps may have a role in longevity. Yps have been shown to bind ecdysone (Bownes *et al.*, 1988), indicating that they may help relay hormonal signals that may in turn influence longevity (Simon *et al.*, 2003; Tatar, 2004). Further, Yps are evolutionarily convergent with vitellogenins (Brandt *et al.*, 2005; Tufail and Takeda, 2008, 2009) and recent evidence from studies of hymenoptera suggests that vitellogenins have a role in extending longevity (Brandt *et al.*, 2005; Seehuus *et al.*, 2006; Corona *et al.*, 2007). In the hymenoptera, long-lived castes have been shown to express more vitellogenin than shorter-lived castes, which has been linked to a reduction in oxidative stress (Landis *et al.*, 2004; Seehuus *et al.*, 2006) as well as immune function (Amdam *et al.*, 2004). For these reasons, studying natural expression variation in the Yp network

may provide valuable information regarding the disparity in the inheritance of *Drosophila* gene expression levels between the sexes and could provide molecular mechanisms for life history tradeoffs (Chippindale *et al.*, 2001).

The causal network, established by molecular biology techniques, combined with demonstrated links between large effect mutations and important life history traits provides the perfect backdrop upon which to test a ‘bottom up’ approach to understanding how genetic variation contributes to phenotypic variation. If genetic variation in these networks exists, and is important, then variation in upstream genes will be associated with variation in downstream targets. If the network itself is important for life history traits then the most downstream targets (the Yps) will be associated with longevity. Further this backdrop allows us to ask structural questions about the system such as: (1) Do nonlinear responses reflect patterns of genetic variation in gene expression? (2) Are the relationships among genes in the Yp network the same in both sexes? (3) Does each Yp respond to variation in the same regulators? (4) Given the X-chromosomal positions of genes in the network (the Yps, *usp*, *Rbp1-like* and *Sxl*), is dosage compensation important to the male Yp network? Using a set of expression data from 72 genotypes, progeny from a diallel cross, Wayne *et al.* (2007), and longevity data from the same crosses, genetic variation in the Yp network and that impact on longevity is explored. The regulatory structure of the existing network is modeled using structural equation models (SEMs) derived from Wright’s pathway analyses (Pearl, 2000). Structural equation modeling is distinct from regression modeling in that it is composed of a system of equations. In some equations a particular variable is independent, whereas others are dependent. In this ‘bottom up’ approach, we establish a network of equations derived from molecular experiments that establish causal relationships among genes and then test whether the genetic variation is reflected in the relationships dictated by the molecular models.

## MATERIALS AND METHODS

### Microarray gene expression data for the Yp network

Data from Wayne *et al.* (2007) were used for these analyses and results from this experiment for Yp network genes (Figure 1) can be observed in Table 1, Figure 2, Supplementary File 1 and Supplementary File 2. Reciprocal crosses of nine different inbred genotypes isolated from Winters, CA, USA were obtained and Agilent microarrays (Agilent, Santa Clara, CA, USA) were used to assay expression. At 3 days post-eclosion, RNA was isolated from whole carcasses of 10 males and 10 females derived from the full matrix of crosses among genotypes (minus the homozygotes). This scheme allows for the dissection of simple versus complex forms of inheritance. On a genome-wide scale, this experiment demonstrated a simple mode of gene expression inheritance for males (where offspring appear to express a gene at levels that are intermediate to parental expression levels), but a more complex pattern for females. Expression level data were derived from the natural log of microarray probe intensities after subtracting the mean background intensity and were only evaluated if the probe was determined to be expressed significantly beyond background levels (Wayne *et al.*, 2007). Data entered into the SEMs were centered by dye and scaled such that the mean was zero. Maternal genotype effects were then regressed out of the data by extracting and evaluating the residuals from models of expression based on maternal genotype. Centering does not change the relationship between genes, but is important for multivariate depiction of the data (Neter *et al.*, 1990).

### Dosage compensation

Dosage compensation effects for genes in the Yp network were evaluated from two previously published data sets. The first study evaluated the genome-wide effects of *msl-2* RNAi (Hamada *et al.*, 2005). Results from the Yp network were extracted and assessed here. Also, the effect of functional *Sxl* in *tra*

pseudomales on genes in the network was evaluated by comparing ratios of male/female expression to pseudomale/female expression with a *t*-test, as reported by the authors of that manuscript (Goldman and Arbeitman, 2007).

### Genetic variation and heritability

Heritability estimates and the significance of variance components for each probe analyzed were available (Wayne et al., 2007), and can be found in Supplementary File 2. General combining ability (GCA) describes additive inheritance, specific combining ability (SCA) describes non-additive

**Table 1** The proportion of crosses for which expression levels of a probe was not significantly above background levels

Gene	Probeuid	Males	Females
<i>Aef1</i>	1070	0.1	0
<i>dsxF</i>	6162	0.47	0.07
<i>dsxM</i>	12690	0	0.01
<i>EcRA</i>	5648	0.5	0.08
<i>EcRB</i>	14630	0.18	0.13
<i>fruC</i>	9294	0	0
<i>her</i>	4988	0	0
<i>ix</i>	5511	0.46	0.04
<i>Rbp1</i>	7014	0	0
<i>Rbp1D</i>	12045	0	0
<i>Rbp1-like</i>	4731	0	0
<i>Sxl</i>	782	0	0
<i>SxlM</i>	824	0.11	0.19
<i>tra</i>	9174	0	0
<i>tra2</i>	4734	0.03	0
<i>usp</i>	12140	0.03	0
<i>Yp1</i>	13974	0	0
<i>Yp2</i>	13101	0.88	0.01
<i>Yp3</i>	2812	0	0

Probeuid indicates the unique identifier for a probe on the arrays associated with specific isoforms of genes in the genome. Males denote the proportion of males that exhibited expression that was statistically above background on the microarray for that probe. Females indicate the same information for the probe, but for females.

(dominance or epistasis) inheritance, and reciprocal values for these terms (RGCA, RSCA) denote inheritance of expression levels that are dependent on parental effects (Wayne et al., 2007). A nominal *P*-value of  $\leq 0.05$  was considered significant. This approach may be liberal, in that some results that are significant may be false-positives. For this reason, we rely primarily on the consensus results across analytical approaches rather than individual tests.

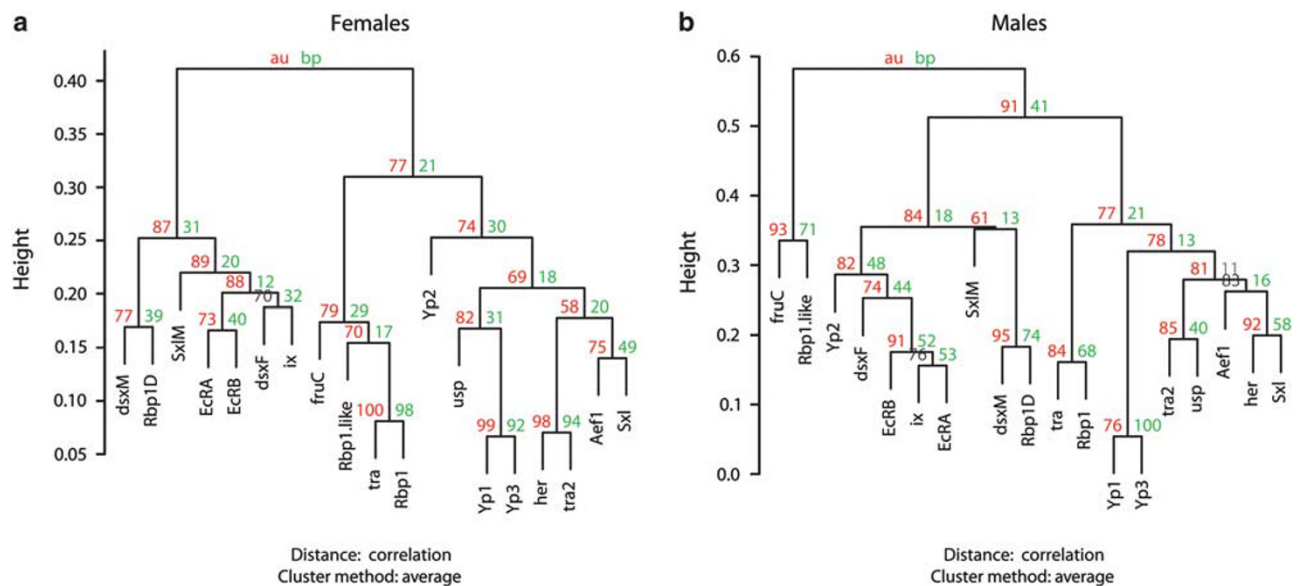
### The Yp network

The probes evaluated corresponded to loci known to affect Yp expression, sex determination genes and ecdysone receptor genes. The sex determination proteins encoded by *dsxM* and *dsxF*, *ix*, *her* and *fruC* have all been implicated in the regulation of Yps (Belote et al., 1985; Kraus et al., 1988; Abrahamsen et al., 1993; An and Wensink, 1995; Bownes et al., 1996; Hutson and Bownes, 2003; Goldman and Arbeitman, 2007; Lebo et al., 2009). The involvement of *fru* in Yp regulation has been implied recently, based on the observation that ectopic *fruB* expression, driven by a heat shock promoter, increases Yp expression and deletion of the male-specific *fru* P1 promoter increases expression of Yp (Goldman and Arbeitman, 2007; Lebo et al., 2009). These two pieces of evidence suggest different regulatory roles (positive and negative regulation). Accordingly, the effect of the *fruC* isoform on Yp expression was evaluated, as it is the least likely exon to be expressed by females through common promoters and it is expressed in the majority of cells that express the male-biased isoforms of *fru* (Goodwin et al., 2000).

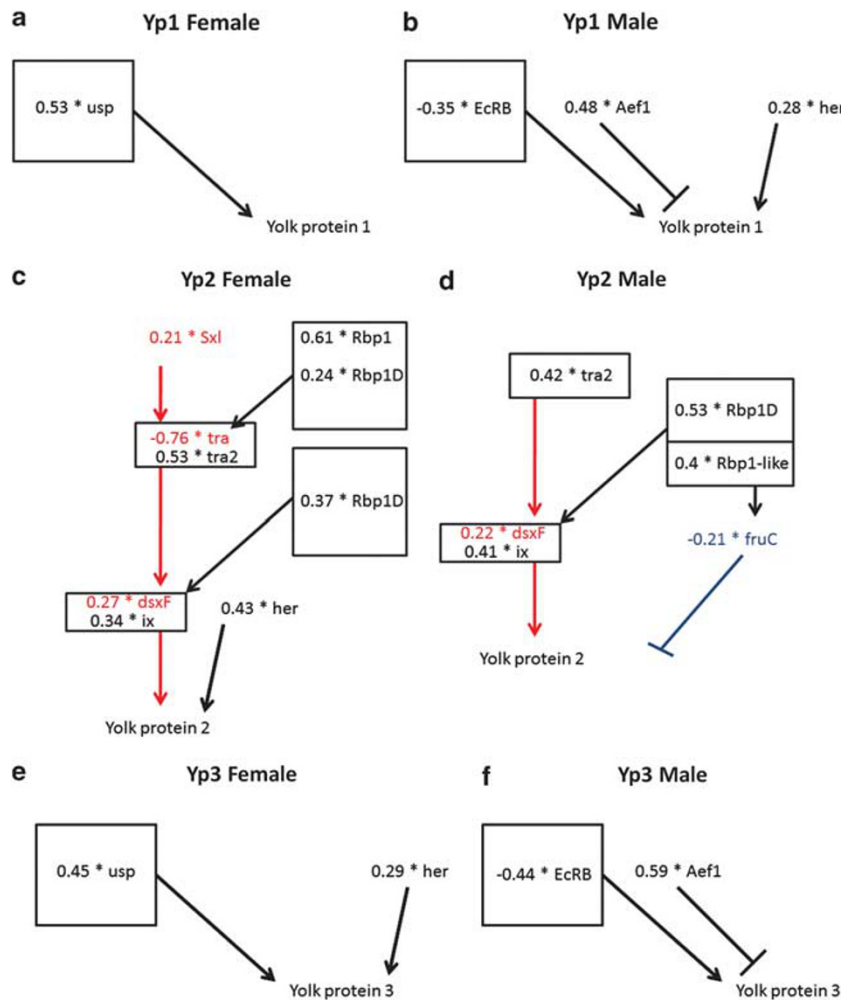
In addition, probes from genes involved in ecdysone mediated regulation of Yps were evaluated and included *EcR* (the A and B1 isoforms), *usp* and *Aef1* (An and Wensink, 1995; Bownes et al., 1996; Brodu et al., 2001; Hutson and Bownes, 2003). Likewise, the influence of concentration of the common exon of *tra*, the common exon of *tra2*, a common exon of *Rbp1*, a male-biased *Rbp1* exon (referred to as *Rbp1D*) and *Rbp1-like* were evaluated as to their influences on *dsx* and *fru* splicing and mis-splicing in both sexes. The effects of the *Rbp1* transcripts and a common (labeled here as *Sxl*) and male-biased (*SxlM*) exon of *Sxl* were considered as potential factors that could influence *tra* expression.

### Structural equation models

The expression network was evaluated with SEMs (Pearl, 2000). Linear SEMs were developed using the known prior network structure (Figure 1). A confirmatory modeling procedure was used, where the regulatory relationships given by molecular approaches were used to derive a system of equations (Supplementary Files 3–9). These relationships were then tested to see



**Figure 2** Bootstrapped hierarchical clustering of Yp network transcripts in males and females. Red values reflect approximate unbiased probabilities determined through hierarchical bootstrapping. Green values reflect bootstrap values. (a = Females). Clustering of *Rbp1/tra*, *Yp1/Yp3* and *her/tra2* is significant. (b = Males). Clustering of *Yp1/Yp3*, *fruC/Rbp1-like*, *Rbp1D/dsxM* and *EcRA/EcRB/ix* is significant.



**Figure 3** SEM results for each Yp in both sexes. Arrows, bars and colors are the same as Figure 1 and represent predicted regulatory relationships. Only statistically significant correlations among transcript levels are noted for each Yp and sex. (a, c and e) Present results of Yp analyses in females, denoting *Yp1*, *Yp2* and *Yp3*, respectively. (b, d and f) Present results of Yp analyses in males, denoting *Yp1*, *Yp2* and *Yp3*, respectively. Numbers in front of genes names represent standardized parameter estimates for each response. Note that *Yp2* was the only locus sensitive to expression variation of sex determination loci, whereas *Yp1* and *Yp3* were more responsive to variation in ecdysone signaling.

whether genetic variation in the network was reflected in the given system of equations. Transcripts that were external variables were considered as covariates if they were isoforms of the same gene (that is, *EcRA* and *EcRB*), or if they were structurally and functionally similar (that is, *Rbp1D* and *Rbp1-like*, which are both male-biased splices of similar genes). One model was made for each Yp in each sex. Summaries of results can be found in Supplementary File 3 and Figure 3. Full reports from the analyses can be found in Supplementary Files 4–9. Connections between variables in the network were considered significant if they yielded a *Q*-value of  $<0.05$  with a false discovery rate of 0.05 (Supplementary File 3). Relative expression values among genotypes were compared between sexes with histograms (Supplementary File 1) and by clustering of expression levels (Suzuki and Shimodaira, 2006). Bootstrap values (green) as well as approximate unbiased probabilities (red) are reported (Figure 2).

### Regression models

Genes in the network were evaluated for nonlinearity of response using the mixed model:  $Y_{ijkl} = \mu + d_i + s_j + g_k + g_k^2 + sg_{jk} + \epsilon_{ijkl}$ . For each of the relationships postulated in the network, the gene expression of the downstream gene was fit as the dependent variable (*Y*) and the upstream gene as the independent variable (*g*) with both a linear and quadratic term. The

significance of quadratic term indicates a nonlinear response. The fixed effects of dye (*d*) and sex (*s*) and the interaction between the linear effect of the downstream gene and sex were also included in the model. Possible correlation among the observations due to the mating design was accounted for using a block diagonal structure for the error matrix with each dam having its own estimate of error. Full results are reported in Supplementary File 10. For these models a *P*-value of 0.05 was considered significant.

### Longevity experiment

For each cross and sex the median age at which 15 individuals (per replicate) survived post-eclosion was used as a measure of longevity. Two independent replicates were performed for each cross and sex for a total of 288 measurements of cross averages. Samples where replicates were highly discordant and one of the replicates had values that were consistent with date entry error were removed. This left 248 samples for analysis, though it should be noted that the general pattern of our observations were unchanged by evaluating all 288. The model  $Y_{ijk} = \mu + s_i + g_j + sg_{ij} + \epsilon_{ijk}$  was fit where longevity, the dependent variable (*Y*), was the median time of death for sex *i* and genotype *j*. The mean of the array replicates for sex *i* and genotype *j* was used to estimate the effect of the Yp and possible correlation among the observations due to the mating design was accounted for using a block

diagonal structure for the error matrix with each dam having its own estimate of error. Error was assumed to be normally distributed.

For the longevity experiments flies were reared on a *Drosophila* diet that consisted of the following components: water (92.45% v/v), unsulfured molasses (5.39% v/v), ethanol (1.54% v/v), propionic acid (0.62% v/v), cornmeal (9.24% v/w), torula yeast (7.70% w/v), agar (0.68% w/v) and Tegosept (0.31% w/v). Stocks were maintained at room temperature (22–24 °C). Adults were collected from each line as virgins and crossed in all pairwise combinations including reciprocal crosses. These crosses were made in cut bottles and eggs were harvested from the bottles and transferred to vials at ~75 eggs per vial. Offsprings were collected from these vials and collected as virgins using light ether. These flies were transferred to cages at ~30 newly eclosed virgin flies per cage for the lifespan assay. The cages consisted of quart deli containers with mesh on the lid for ventilation and two portals on opposite sides of the cylinder. One portal was a small circle cut into the side adapted as a fitting for fresh food vials. The other portal was a slit cut into an inner tube sewn onto the wall of the cylinder. An aspirator was inserted into the slit to collect dead flies from the cage. The lifespan assay was conducted at 25 °C, 12L: 12D. A fresh food vial replaced the previous vial in the cage every 4 days, and the dead flies collected and recorded until all flies in each cage were dead. Three cages were set up for each cross and all crosses were assayed at the same time. The entire lifespan assay was repeated once.

## RESULTS

### Gene expression correlations

Expression was detected for all genes in this study (Table 1, (Wayne *et al.*, 2007)). In males, the expression of *dsxF*, *ix*, *EcRA* and *Yp2* was statistically indistinguishable from background in numerous crosses (Table 1). Expression levels of these genes were female biased (Supplementary File 1, Supplementary File 2).

Several groups of transcripts in the network were highly correlated. Unsupervised, hierarchical clustering of expression showed similar groupings in male and female profiles (Figure 2). Within sex-biased groups of genes (Wayne *et al.*, 2007), there were several distinct modules of co-regulated genes (Supplementary File 2, Figure 2). *Yp1* and *Yp3* were co-expressed in a strongly supported cluster in both sexes (correlations were 0.95 and 0.93 in males and females, respectively; covariance estimates were 0.23 and 0.13, respectively). In males, the male-biased *fruC* transcript clustered with the male-biased splicing factor *Rbp1-like* (correlation: 0.67; covariance: 0.04) and *dsxM* clustered with the male-biased transcript of a splicing factor *Rbp1* (correlation: 0.82; covariance: 0.05). Further, both isoforms of *EcR* significantly clustered with *ix* expression in males (average correlation: 0.83; average covariance: 0.06). In females, *Rbp1* clustered with *tra* expression (correlation: 0.92; covariance: 0.11), whereas *her* clustered significantly with *tra2* expression (correlation: 0.93; covariance: 0.1). Mixed-sex models were evaluated to identify statistical interactions between sex and expression. Table 2 indicates the many significant sex by gene interactions that were found in the network.

### Genetic variation and heritability

Heritability and genetic variance components were evaluated for genes in the network (Supplementary File 2) (Wayne *et al.*, 2007). Heritability of expression was generally <0.1, reflecting the low amount of additive genetic variance in females. Less genetic variation was detected in males than females, with 8 of 19 genes in the analysis demonstrating significant genetic variation in males, whereas all 19 genes demonstrated significant genetic variation in females (Fisher's exact test,  $P = 0.00012$ ).

The entire network was assessed separately in males and females with SEMs based upon the known linkages among genes in this pathway (Supplementary File 3, Figure 3a–f; Pearl, 2000). SEMs

**Table 2 Significant interactions of sex with gene expression levels in the Yp network**

Regulator	NumDF	DenDF	F value	P-value	Model	Q-value
<i>fruC*sex</i>	1	308	69.37496	2.71E−15	<i>Yp2</i>	1.19E−13
<i>EcRB*sex</i>	1	304	44.70859	1.10E−10	<i>Yp2</i>	2.41E−09
<i>Rbp1-like*sex</i>	1	306	43.36909	1.97E−10	<i>dsxF</i>	2.89E−09
<i>Rbp1D*sex</i>	1	308	31.11336	5.33E−08	<i>dsxF</i>	5.86E−07
<i>EcRA*sex</i>	1	308	26.40915	4.91E−07	<i>Yp2</i>	4.33E−06
<i>her*sex</i>	1	306	17.38404	3.98E−05	<i>Yp2</i>	0.000292
<i>Rbp1-like*sex</i>	1	306	14.9784	0.000133	<i>tra</i>	0.000836
<i>EcRA*sex</i>	1	308	13.71128	0.000253	<i>Yp3</i>	0.001389
<i>ix*sex</i>	1	306	13.36864	0.000301	<i>Yp3</i>	0.001422
<i>ix*sex</i>	1	306	13.22946	0.000323	<i>Yp2</i>	0.001422
<i>Rbp1-like*sex</i>	1	306	12.80402	0.000402	<i>tra</i>	0.001608
<i>EcRA*sex</i>	1	308	12.26733	0.000529	<i>Yp1</i>	0.00194
<i>ix*sex</i>	1	306	11.88957	0.000644	<i>Yp1</i>	0.002178
<i>Rbp1-like*sex</i>	1	306	11.73646	0.000697	<i>fruC</i>	0.002189
<i>dsxF*sex</i>	1	308	10.70216	0.001192	<i>Yp2</i>	0.003495
<i>Rbp1*sex</i>	1	308	10.57733	0.001272	<i>tra</i>	0.003498
<i>Rbp1D*sex</i>	1	308	10.24278	0.001515	<i>fruC</i>	0.003922

Abbreviations: FDR, false discovery rate; Yp, Yolk protein.

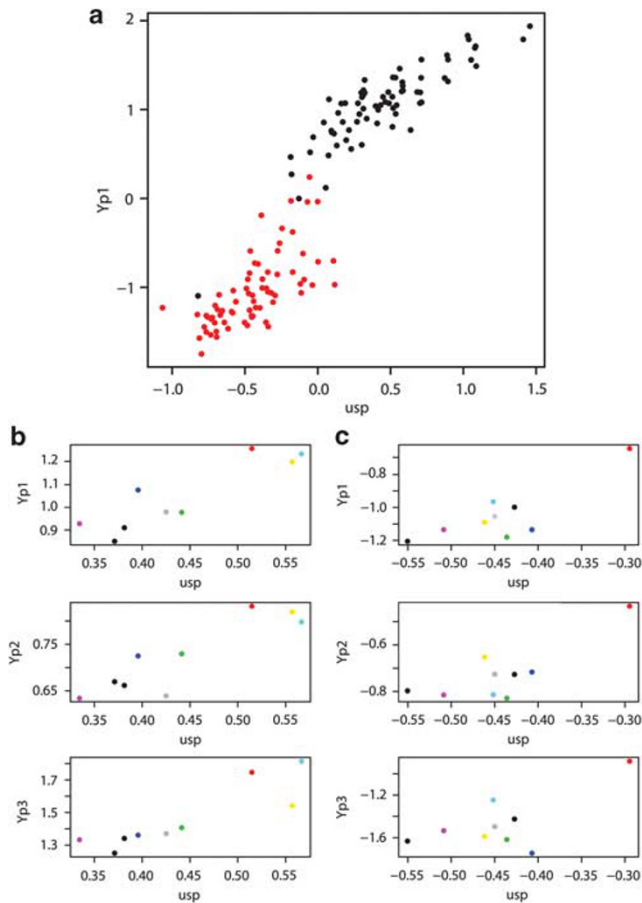
Regulator indicates the genes known to regulate the gene or splice in the model column. Q-values represent an FDR of 0.05.

demonstrated several interesting features. In males, variation in *her*, *Aef1* and *EcRB* was correlated with variation in *Yp1* expression. Similarly, *Yp3* responded to variation in expression of *Aef1* and *her*. However, variation in expression of *Yp2* was significantly influenced by variation in *ix*, *dsxF* and *fruC*. Variation in *dsxF* expression was influenced by *tra2* and *Rbp1D* levels, while *fruC* was significantly correlated with variation in *Rbp1-like*. In females, *Yp1* and *Yp3* were both correlated with expression levels of *usp*, but *Yp3* also responded to variation in *her*. *Yp2* variation in females was significantly influenced by *dsxF*, *ix* and *her* expression. Expression of *dsxF* was significantly correlated with *tra*, *tra2* and *Rbp1D* expression and *tra* expression was, in turn, correlated with *Sxl*, *Rbp1* and *Rbp1D* expression (Figure 3c and d).

### Statistical analyses of the Yp network

The SEM analyses also revealed several interesting factors associated with the mis-splicing of transcripts. Previously, *tra2* (a gene known to regulate *dsx* splicing) expression was observed to significantly correlate with *dsxF* levels in males (Tarone *et al.*, 2005). The observation of a *tra2* correlation with *dsx* mis-splicing was repeated in these analyses. Furthermore, *Rbp1D* was significantly correlated with *dsxM* levels in females and *dsxF* levels in males, whereas *Rbp1-like* levels in females significantly correlated with expression of the *fruC* transcript in females. All of these results indicate that fluctuations in the levels of specific splicing factors have downstream repercussions for the splicing of specific target transcripts.

The results of the SEM analyses were then evaluated graphically and statistically to identify potential nonlinear responses in the network (Figure 4, Table 3). Several genes significantly correlated with expression levels of downstream targets and also exhibited linear responses within a sex with a small number of genotypes that clearly fell off of the line. However, when both sexes were observed together, these loci exhibited curved responses, with some overlap between the sexes observed among the outlier genotypes of both sexes (Figure 4a). The sexes clearly form two separate groups (Figure 4b and c) and the sexes were significantly different from



**Figure 4** Plots of Yp expression in terms of *usp* expression. These profiles were typical of *usp*, *Aef1*, *her*, *ix*, *dsxF* and *Rbp1-like*. (a) *Yp1* expression as a function of *usp* expression from the diallel crosses displays linear responses within a sex, but a sigmoidal response between the sexes. Males are displayed in red and females in black. (b) Mean expression in females for each parental line, with each line assigned a different color that is the same in all. There were three lines that expressed high levels of *usp*, which also produced the highest Yp expression levels. These lines were much less likely to produce crosses that expressed Yps at intermediate levels. (c) Mean expression in males for each parental line, with each line assigned a different color. There was one line that expressed high levels of *usp*, which also produced the highest Yp expression levels. This line was much more likely to produce crosses that expressed Yps at intermediate levels.

each other (Table 2). Such patterns were typical of *usp*, *Aef1*, *her*, *ix*, *dsxF* and *Rbp1-like*. There was also a nonlinear response of *dsxM* in females, where the line means demonstrated a parabolic response to *tra2*, with the exception of two genotypes that expressed exceptionally high levels of *Rbp1D*, which was also significantly associated with mis-splicing (Figure 5). These responses potentially indicate a nonlinear switch-like behavior. To explicitly test the observation of nonlinear switches, a general model across sexes was used to test for nonlinear responses through the observation of significance in quadratic terms. These analyses identified 19 significant nonlinear responses between sexes (Table 3). However, within a sex all but one gene show linear responses.

#### Dosage compensation

The effect of dosage compensation on the Yp network genes was evaluated with two data sets. The ‘Kuroda’ data set (Hamada *et al.*,

**Table 3** Significant nonlinear responses in the Yp network detected across sexes as determined by significant correlations of quadratic terms in a linear model with the transcript in the Model column

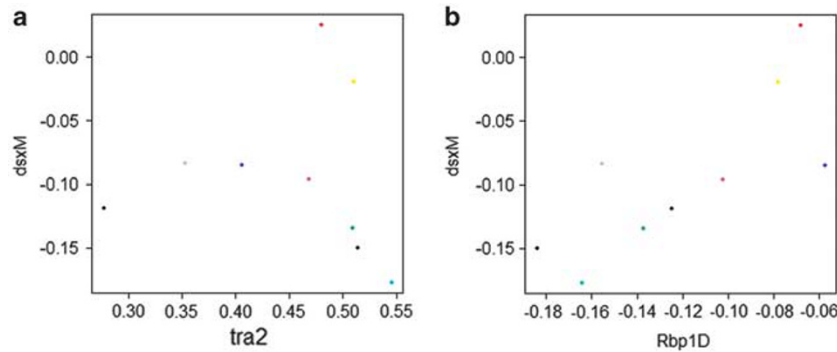
Regulator	NumDF	DenDF	F value	P-value	Model	Q-value
<i>Rbp1</i> * <i>Rbp1</i>	1	308	47.27511	3.44E-11	<i>dsxF</i>	1.51E-09
<i>tra</i> * <i>tra</i>	1	308	33.89814	1.46E-08	<i>dsxF</i>	3.21E-07
<i>Rbp1-like</i> * <i>Rbp1-like</i>	1	306	32.68229	2.58E-08	<i>dsxF</i>	3.78E-07
<i>Rbp1-like</i> * <i>Rbp1-like</i>	1	306	25.80027	6.60E-07	<i>tra</i>	6.68E-06
<i>usp</i> * <i>usp</i>	1	304	25.51169	7.60E-07	<i>Yp1</i>	6.68E-06
<i>Aef1</i> * <i>Aef1</i>	1	302	23.18078	2.34E-06	<i>Yp1</i>	1.71E-05
<i>Aef1</i> * <i>Aef1</i>	1	302	21.6355	4.94E-06	<i>Yp3</i>	2.92E-05
<i>her</i> * <i>her</i>	1	306	21.31166	5.75E-06	<i>Yp2</i>	2.92E-05
<i>her</i> * <i>her</i>	1	306	21.23315	5.98E-06	<i>Yp3</i>	2.92E-05
<i>usp</i> * <i>usp</i>	1	304	18.15835	2.71E-05	<i>Yp3</i>	0.000119
<i>her</i> * <i>her</i>	1	306	16.60402	5.87E-05	<i>Yp1</i>	0.000235
<i>ix</i> * <i>ix</i>	1	306	15.91645	8.29E-05	<i>Yp2</i>	0.000304
<i>Rbp1D</i> * <i>Rbp1D</i>	1	308	9.974343	0.001745	<i>tra</i>	0.005905
<i>tra2</i> * <i>tra2</i>	1	308	8.971234	0.002965	<i>dsxF</i>	0.009319
<i>Rbp1</i> * <i>Rbp1</i>	1	308	8.499873	0.003812	<i>tra</i>	0.011183
<i>Rbp1D</i> * <i>Rbp1D</i>	1	308	7.75046	0.005702	<i>tra</i>	0.01568
<i>Rbp1-like</i> * <i>Rbp1-like</i>	1	306	7.443663	0.006734	<i>tra</i>	0.017429
<i>dsxF</i> * <i>dsxF</i>	1	308	6.477048	0.011415	<i>Yp1</i>	0.027904
<i>Rbp1-like</i> * <i>Rbp1-like</i>	1	306	5.863766	0.016037	<i>fruC</i>	0.037138

Abbreviations: FDR, false discovery rate; Yp, Yolk protein. Q-values represent an FDR of 0.05.

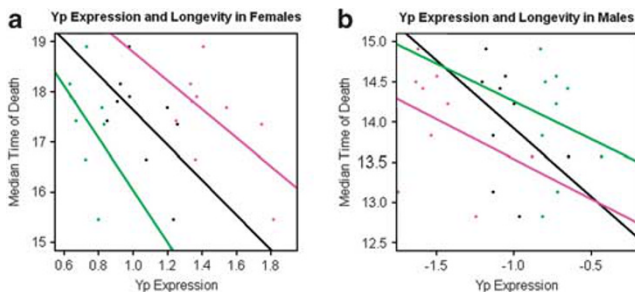
2005) is derived from a genome-wide evaluation of the effects of knocking out dosage compensation in a male cell line via RNAi of *msl-2*, which is necessary for dosage compensation. Any genes that were differentially expressed in this experiment are likely to be affected by dosage compensation, either directly or indirectly. These data indicated that *tra*, *tra2*, *Rbp1*, *Aef1* and *ix* displayed stable and consistent differences in expression among RNAi and control treatments, which were statistically significant (*t*-test,  $P < 0.05$ ). In addition, the ‘Arbeitman’ data set (Goldman and Arbeitman, 2007) measured expression differences between females and males and compared them to expression differences between females and tra pseudomales, which have two X chromosomes but are somatically male. These data showed significant differences among males and tra pseudomales for expression of *Yp3* (*t*-test,  $P = 0.01$ ), suggesting that at least one Yp is influenced by the dosage compensation mechanism. Taken together, these data suggest that in both cell culture and in whole males, one or more components of the Yp network are significantly influenced by dosage compensation, which may be one reason for the discrepancy in gene expression inheritance observed between the sexes in this experiment.

#### Longevity

Recent data suggest that vitellogenin proteins, which are functionally similar to Yps, have effects on insect lifespans (Seehuus *et al.*, 2006; Corona *et al.*, 2007). All Yps were significantly correlated with median time of death in at least one sex, with females demonstrating stronger correlations than males (Figure 6a and b). When individual Yps were evaluated along with sex in a mixed linear model, sex significantly correlated with lifespan in all cases, with females living longer than males ( $P < 0.0001$ ). The median time of death was significantly



**Figure 5** Mis-splicing of *dsx* in females is driven by *tra2* and *Rbp1D* expression. (a) An evaluation of line means indicates that for seven of the nine genotypes, *dsxM* levels exhibit a parabolic response to *tra2* expression. However, two genotypes express much higher levels of *dsxM* than the other genotypes. (b) These two strains express high levels of *Rbp1D*. These results indicate that an optimal level of *tra2* (high or low levels) should produce the least mis-splicing in females, though some genotypes that express *Rbp1D* at high levels overcome this pattern, meaning interactions between these two regulators may be complex.



**Figure 6** Correlations of longevity with Yp expression. Regressions of line means for median time of death with Yp expression in females (a) and males (b). *Yp1* expression levels are designated by the color black, *Yp2* by green and *Yp3* by magenta.

correlated with Yp expression (*Yp1* and *Yp2*;  $P=0.016$  and  $0.026$ , respectively). Median time of death was significantly associated with *Yp3* expression ( $P=0.023$ ), with a significant interaction between sex and *Yp3* ( $P=0.026$ ). Given the observation of an interaction between sex and *Yp3* expression, correlations of that gene with lifespan were evaluated in each sex individually. This analysis demonstrated correlations with female ( $P=0.0004$ ), but not male lifespan ( $P=0.71$ ). In all analyses, high Yp expression levels were more likely to be found in individuals with shorter median times of death.

## DISCUSSION

### Do nonlinear responses reflect patterns of genetic variation in gene expression?

Research by Gjuvslund *et al.* (2007a–c) would suggest that the large degree of non-additive genetic variation observed in females in this experiment (as compared with the predominantly additive inheritance of male gene expression) could be explained by nonlinear responses on additive inheritance. In such a case, females should exhibit more nonlinear responses in the network than males. The data presented here do not support the idea of within-sex nonlinear responses, with the exception of *tra2* effects on *dsxM* expression in females. Accordingly, it is unlikely that nonlinearity explains differences in gene expression inheritance between the sexes.

However, there were numerous responses within the network that indicated a nonlinear, sigmoid, response if expression was observed between the sexes (Figure 4). This pattern indicates a switch-like

response between sexes, with some genotypes more likely than others to produce intermediate expression levels that would fall on the nonlinear portion of the response. Note that these ‘switches’ appear noisy, raising a question as to how unambiguous sex-specific regulation is maintained. These results clarify previous observations that variation in the sex determination pathway functions more like a dial than a switch (Tarone *et al.*, 2005).

### Does each Yp respond to genetic variation in the same regulators? Is dosage compensation important to the male Yp network?

The Yps are usually considered to respond to the same regulatory elements. However, each locus has its own position on the X chromosome and its own orientation with respect to the sequences that regulate their expression. Although each gene may be affected by the same set of transcription factors, the order of importance of any single regulator to a specific Yp may be unique to that Yp. There were clear differences among Yps responding to the same network variation. In both sexes, *Yp1* and *Yp3* were significantly correlated with each other more strongly than with *Yp2* (Figure 2). It is particularly notable that this pattern was observed (in both sexes) given that *Yp1* and *Yp2* are considered to share the same regulatory sequence (though they read in opposite orientations from that region). In the SEMs, *Yp1* and *Yp3* also correlated with variation in ecdysone signaling transcripts (*usp* in females; *EcrB* and *Aef1* in males), while *Yp2* responded to variation in sex determination loci. These and other observed correlations within the network suggest that genetic variation in the Yp network affected specific targets differently.

Dosage compensation has been shown to decrease transcriptional noise in mammals (Yin *et al.*, 2009), imposing a general pattern of simplicity of expression inheritance in males. In *Drosophila*, RNAi experiments with male tissues have been used to eliminate expression of two dosage compensation genes *mSl-2* and *MOF*, demonstrating a patchwork system where each locus on the X is upregulated to a slightly different degree, with some autosomal consequences (Hamada *et al.*, 2005; Kind *et al.*, 2008). We hypothesize that the variation in these dosage compensation responses among genotypes could have important consequences for the male Yp network. Indeed, experiments comparing genome-wide patterns of expression find many more genes differentially expressed between males and females than between females and tra pseudomales, which are not apparently engaged in dosage compensation (Goldman and Arbeitman, 2007).

Our assessment of published results from a genome-wide study of RNAi in male cell lines and a comparison of males to *tra* pseudomales is that dosage compensation may have a role in expression inheritance in the Yp network. Results from these studies indicate that *Yp3*, *tra*, *tra2*, *ix*, *AeFl* and multiple isoforms of *Rbp1* are susceptible to dosage compensation effects in males. These transcripts fall within all of the major clusters of expression found in the network, and their response to knocking out the dosage compensation machinery indicates the potential for widespread effects of dosage compensation throughout the network, which may overwhelm the other inputs in the pathway, and account for the simple inheritance of male expression levels.

### Does variation in Yp expression, an indicator of fecundity in females, correlate with variation in longevity?

Variation in the Yp network may shed light on the very complex tradeoff between fecundity and longevity (Chippindale *et al.*, 2001; Partridge *et al.*, 2005; Flatt *et al.*, 2008; Toivonen and Partridge, 2009; Kenyon, 2010). We compared the state of the pathway with longevity phenotypes in the 72 genotypes and found extensive negative correlations of Yps on the median time of death for males and females. We focused on virgin flies that enabled the evaluation of longevity responses in the absence of interference from mating effects. In females, Yp mutants affect fertility, ovariole number and egg hatch rates (Postlethwait and Shirk, 1981; Bownes *et al.*, 1991; Terashima and Bownes, 2004), therefore Yp expression is an indicator of fecundity. Tradeoffs between fecundity and lifespan are well described; therefore this correlation makes sense in females (Marden *et al.*, 2003; Mukhopadhyay and Tissenbaum, 2007).

However, males have no ovaries and only express Yps at background rates, indicating that there may be non-germline mediated influences at have in this correlation. High Yp expression in males with short lifespans may mean that Yp expression is a marker of mis-expression of sex determination network genes, which could have negative repercussions for either sex. This potential effect is supported by the observation that overexpressing sex determination genes has negative effects on *Drosophila* lifespan (Shen *et al.*, 2009). There is also a potential endocrine signaling function for Yps, related to the demonstrated ability of these proteins to bind ecdysone (Bownes *et al.*, 1988) and the fact that they are known to be regulated by ecdysone signaling, which may also affect lifespan (Simon *et al.*, 2003; Tatar, 2004). Another potential avenue by which male longevity may be directly affected by Yp expression is through immune function, which has also been linked to Yp levels (Amdam *et al.*, 2004).

The potential causes of the observed negative correlation of Yps with longevity in male and female *Drosophila* are numerous and correspond to several distinct mechanisms that are considered critical to understanding mechanisms underlying tradeoffs between longevity and reproduction (Harshman and Zera, 2007). Functional information from hymenopteran vitellogenins would indicate that Yps may have a functional role in *Drosophila* longevity, possibly through influences on oxidative stress, juvenile hormone or immune function (Amdam *et al.*, 2004; Landis *et al.*, 2004; Seehuus *et al.*, 2006). Note though that the effects here are opposite to what is known about effects of vitellogenins on lifespan of hymenoptera (Seehuus *et al.*, 2006; Corona *et al.*, 2007). Direct experimentation with Yp mutants and natural Yp variants, especially in males, will help to dissect the mechanism by which Yps negatively correlate with longevity in *Drosophila*. Further studies examining the relationship between genetic variation in Yp and longevity developed from independent populations of *D. melanogaster* and related species, as well as quantitative manipulations of Yp (for example, through RNAi), will

be necessary before concluding that the relationship between Yp and longevity is causal.

### CONCLUSIONS

The goal of this study was to test whether natural variation within a known gene expression network reflects known regulatory relationships and phenotypic associations. The Yp expression network was used as a model for this 'bottom up' systems biology approach, as it is well-characterized molecularly. Variation in the network reflects many known interactions, though sex and individual Yps responded to genetic variation in different known factors. Yp expression also negatively correlated with longevity in both males and females, but to different degrees, indicating that systems-level analyses of this expression network may be a useful model system for unraveling molecular mechanisms of life history tradeoffs related to reproduction and lifespan.

### DATA ARCHIVING

Data have been deposited at Dryad: doi:10.5061/dryad.49v70

### CONFLICT OF INTEREST

The authors declare no conflict of interest.

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*Authors contributions:* The research was conceived by AMT and SVN. AMT and SVN conducted SEM analyses. LMM conducted the analyses of linear models. AMT analyzed results from RNAi and *tra* pseudomale experiments. LGH performed longevity experiments. AMT wrote the paper with major contributions from LMM, LGH and SVN. We acknowledge support from the NIH grants (R01GM077618 and S1R01GM077618-S1). AMT is supported by startup funds from the College of Agriculture and Life Sciences and from the Texas AgriLife Research at Texas A&M University.

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