Title

In silico screening by AlphaFold2 program revealed the potential binding partners of nuage-

localizing proteins and piRNA-related proteins

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Abstract

Protein-protein interactions are the fundamental features for understanding the molecular

functions and regulations of proteins. Despite extensive databases, many interactions remain

uncharacterized due to the intensive labor required for experimental validation. In this study, we

utilized the AlphaFold2 program to predict interactions among proteins localized in the nuage, a

germline-specific non-membrane organelle critical for piRNA biogenesis and RNA regulation.

We screened 20 types of nuage proteins for 1:1 interactions and predicted dimer structures.

Among those, five pairs represented novel interaction candidates. Three pairs, including Spn-

E_Squ, were validated through co-immunoprecipitation in cultured cells and confirmed the

interactions. Disruption of the salt bridges at the Spn-E_Squ interface verified their functional

importance, underscoring the predictive model's accuracy. Our analysis was extended to include

interactions between three representative nuage components, Vas, Squ, and Tej, and

approximately 430 oogenesis-related proteins. Following this extended analysis, co-

immunoprecipitation in S2 cells verified interactions for three pairs: Mei-W68_Squ, CSN3_Squ,

and Pka-C1_Tej. Furthermore, the majority of *Drosophila* proteins, ~12,000, were screened for

the interaction with Piwi protein, a central player in the piRNA pathway. Approximately 1.5%

of the pairs, totaling 164 pairs, with a score above 0.6, were identified as potential binding

partners. This in silico approach not only efficiently identifies potential interaction partners but

also significantly reduces the gap by facilitating the integration of bioinformatics and

experimental biology.

Introduction

Around 10,000 to 20,000 different types of proteins are encoded in the genome of most organisms, catalyzing the vast majority of physico-chemical reactions in cells[1]. Many proteins have specialized functions and they are often regulated through protein-protein interactions, where the formation of protein complexes can activate, inhibit, or stabilize their partners. Furthermore, protein-protein interactions can recruit target proteins to specific locations where they will function or regulate the mobility of the protein complex[2]. Within cells, proteins are thought to exist in a crowded environment and frequently interact with other molecules[3]. Thus, characterizing protein-protein interactions is fundamental for understanding protein function and regulation. Large-scale analyses of protein-protein interactions have been carried out, including Tandem Affinity Purification coupled with Mass Spectrometry (TAP-MS) for the yeast proteome[4] and the comprehensive 2-hybrid screening for the Human Reference Interactome (HuRI)[5]. Despite these extensive studies, the overall protein-protein interactions are still not fully understood in many organisms.

The binding between proteins is significantly influenced by their three-dimensional (3D) structures. The characteristics of their interfaces, including hydrogen bonds, salt bridges, and hydrophobicity, determine the interactions[6]. Therefore, to analyze protein-protein interactions physically and chemically, information on the individual 3D structures of proteins is

necessary. The 3D structures of proteins have been determined through experimental methods

such as X-ray crystallography, nuclear magnetic resonance (NMR), and cryo-electron

microscopy[7]. However, these techniques demand considerable labor and time. The recently

developed AlphaFold2 program can predict the 3D structure from its amino acid sequence with

high accuracy[8]. AlphaFold2 requires sequence homology information to predict protein-protein

interactions and the complex structure model. The reliability of these predictions is basically

dependent on the strength of co-evolutionary signals[9]. This tool has not only been utilized in

computational studies but has also become a valuable resource in experimental sciences for

predicting protein complexes, as demonstrated with yeast protein complexes[10].

In this study, we attempted a rapid screening of the protein interactions using

AlphaFold2 prediction, primarily focusing on components of nuage, a germline specific, non-

membrane organelle that involves wide variety of proteins containing unique motifs and

domains in *Drosophila melanogasater*[11]. Nuage is known to serve as the production and

amplification site for small non-coding piRNA, which is bound to PIWI-family proteins. The

piRNAs and the PIWI family proteins function to repress mobile genetic elements, or

transposons, that disrupt the genomes through their active transpositions[12]. Not only proteins

involved in piRNA production, but also translation repressor proteins including Me31B, Cup,

and Trailer hitch (Tral), also localize in nuage[13]. Previous studies have shown that the

localization of several components in nuage depends on their partners in a hierarchical manner[14].

However, the interaction and organization among nuage components remain unclear.

By using AlphaFold2 predictions, we investigated 20 of the nuage-localizing or

piRNA-related proteins for pairwise interactions. AlphaFold2 was initially trained to predict the

structure of individual proteins[8]. Its application to complex prediction is an extrapolative use

beyond its original intended scope, and its accuracy remains unverified. Even high-confidence

predictions may not correspond to actual interactions, necessitating experimental validation to

confirm whether predicted protein dimers truly bind. In this study, we confirmed the novel

interactions of candidate pairs including Spindle-E (Spn-E)_Squash (Squ), by co-

immunoprecipitation assay using cultured cells. In addition, a Squ mutant, which disrupts the

salt bridges predicted at the interface with Spn-E, failed to interact with Spn-E, validating the

accuracy of the predicted dimer structure. This screening was expanded for direct interacting

pairs between piRNA-related proteins and proteins involved in oogenesis, as well as Piwi and

other *Drosophila* proteins. This in silico approach not only streamlines the identification of

interaction partners but also bridges the gap between bioinformatics predictions and

experimental validation in biological research.

Result/Discussion

The nuage-localizing proteins and piRNA-related proteins used in the AlphaFold2

screening

Several dozen proteins engaged in piRNA production in germline cells exert their function by

recruiting piRNA precursors and interacting with their partner proteins, forming non-membrane

structure called a nuage[11,14]. Previous studies reported that many piRNA-related proteins

localized to nuage and some proteins localized in mitochondria (Table 1). In addition, protein

components of processing bodies and sponge bodies, which are involved in the translation,

storage, degradation, and transportation of mRNAs—such as Me31B, Cup, and Tral—also

localize to nuage[13] (Table 1). However, the details of how these proteins interact and organize

themselves within the nuage remain unclear.

In this study, we used the AlphaFold2 program to screen for interactions among 20

proteins that are localized in the nuage and/or involved in piRNA production in *Drosophila*

(Table 1). The monomeric structures of these 20 proteins, ranging in size from 20 kDa to 250

kDa, have already been predicted and are registered in databases[15]. This set includes both well-

structured proteins and those that are largely disordered with numerous loops (Supplemental Fig.

S1A). Of those, eight proteins feature one or more Tudor domains or extended Tudor (eTud)

domains. The Tudor domain contains approximately 60 residues and folds into an antiparallel β-

sheet with five strands forming a barrel-like fold, while the eTud domains include an additional

Oligonucleotide/oligosaccharide-Binding fold domain[16]. Both Tudor and eTud domains are

known to bind predominantly to methylated lysine or arginine residues. In addition, five RNA

helicases, such as Vasa (Vas) and the fly homolog of Tdrd9, Spn-E, which are essential for

piRNA processing, are also included (Table 1). The Vas's C-terminal region is known to bind to

the Lotus domain shared by two nuage components, Tejas (Tej) and Tapas. Spn-E is also

recently shown to interact with Tej[17]. Among those 20 proteins, the Molecular Interaction

Search Tool (MIST), a conventional database of protein-protein interactions, registers eight

interacting pairs as direct binding, and 28 interactions which are direct or indirect (Table 1,

Supplemental Fig. S1B, C)[18].

Screening for the protein-protein interactions by AlphaFold2

We used AlphaFold2 program to predict the direct protein-protein interaction and 3D structure

of the complex. Assuming a 1:1 binding of 20 types of proteins, a total of 400 pairs of dimer

predictions were calculated by a supercomputer. The prediction flow of AlphaFold2 consisted of

two main parts[8]. Initially, a multiple sequence alignment was performed for each query protein

and stored for the future use. Subsequently, the AlphaFold2 program predicted 3D dimer

structures based on the co-evolution inferred from the multiple sequence alignments. For each

dimer prediction, five different structure models with varying parameters were generated.

Among these, the model with the highest prediction confidence score (ranking confidence) was

selected as the final prediction result. The ranking confidence is constituted by two evaluations,

the overall structure (pTM) and an evaluation of the dimeric interface (ipTM), emphasizing the

interface evaluation as represented by the following formula[9]:

139   ranking confidence = 0.8 x ipTM + 0.2 x pTM

These 3 values, ranking confidence, ipTM and pTM, for each prediction pairs were visualized in

the separate heatmaps (Fig. 1A, Supplemental Table S1). In general, ranking confidence and

ipTM values showed similar trends although a well-structured protein (e.g. Spn-E) tended to

have a higher pTM value, which slightly elevated the ranking confidence. Based on this, in this

study, we used the ranking confidence as an indicator of the protein-protein interaction. Each

heterodimeric pair was calculated twice in the pairwise screening (e.g. proteins A_B and B_A),

and the ranking confidences were plotted (Fig. 1B). The results showed that there was

significant variance in the pairs with lower ranking confidences, while pairs with ranking

confidences above 0.6 had relatively higher reproducibility. Consequently, we set a threshold of

0.6 and considered protein pairs with ranking confidences above 0.6 as likely complex-forming

candidates. This approach identified 13 pairs; seven of these were already known to form

complexes, confirming the effectiveness of AlphaFold2 in predicting complex formations (Table

2). The highest ranking confidence pair was the Zuc homodimer, possibly because AlphaFold2

had learned from Zuc homodimer's crystal structure registered in the database[19]. The structures

of the 20 proteins used in this study have been analyzed to varying extents in previous studies

(Supplemental Table S2). A complex of Vas and the Lotus domain of Osk has been reported [20],

and based on this complex structure, the interaction between Vas and Tej Lotus domain was

predicted with a high score. Although the conformational analyses of the RNA helicase domain

and the eTud domain have been reported previously, many of those cover only a subset of the

regions and unlikely to affect our predictions in this study.

The predicted 3D structures and the Predicted Aligned Error (PAE) plots for the 12

pairs, are shown in Fig. 1C. Consistent with a previous report using silkworm *Bombyx mori*[21],

both Argonaute 3 (AGO3) and Aub, members of PIWI-family proteins sharing 50%-60% amino

acid sequence similarity, were predicted to form dimers with Maelstrom (Mael) (Fig. 1C-i, ii,

Table 2). AGO3 and Aub appeared well-folded protein except for their N-terminal flexible

regions. In contrast, Mael protein was divided into three parts: N-terminal HMG domain,

middle MAEL domain, and C-terminal disordered region[22] (Fig. 1C-i, ii). AlphaFold2 predicted

the MAEL domain interacted with AGO3 and Aub.

Me31B, Tral, and Cup are recognized as RNA regulators localized to the nuage and/or

sponge body, though they are not directly involved in the piRNA pathway. Previous studies

have indicated that these proteins form complexes[13,23,24]. Me31B is a well-conserved RNA

helicase and showed the tightly-folded structure composed of two concatenated RecA helicase

domains[25]. On the other hand, Tral and Cup were predicted largely disordered structure with

some secondary structures (Fig. 1C-iii, iv). The predicted dimer structures of Me31B_Tral and

Cup_Me31B showed scores of 0.74 and 0.68, respectively. (Table 2). Consistent with the

previous study[24], AlphaFold2 predicted that the FDF motif of Tral, which contains a Phe-Asp-

Phe sequence folded into two a-helixes from residue 405 to 537, was associated with Me31B.

(Fig. 1C-iii). In addition, an α-helix and loop regions of Cup were predicted to make a contact

with Me31B (Fig. 1C-iv). BoYb and Vret, both are eTud domain containing proteins[26] and their

direct interaction has been suggested by the high retrieval rate for BoYb in the

immunoprecipitant of Vret from the ovary[27]. The predicted structure revealed that both BoYb

and Vret proteins consist of two domains, one at the N-terminal and the other at the C-terminal,

connected by a flexible region. (Fig. 1C-v). Interactions were predicted between their N-

terminal domains and between C-terminal domains, respectively. It has been reported that Tej,

known as Tdrd5 in mammal, binds directly to Vas through its N-terminal Lotus domain[20] (Fig.

1C-vi) and to Spn-E through its loop region continuing the eTud domain[17] (Fig. 1C-vii). The

predicted structures of Tej_Vas and Spn-E_Tej were consistent to their binding properties

reported previously.

The remaining five pairs, previously unreported as directly interacting, were

considered novel binding pairs (Table 2, Fig. 1C-viii-xii). These interactions were

experimentally examined using *Drosophila* S2 culture cells derived from embryonic somatic

cells that lack germline-specific proteins. Previously, Squ was co-immunoprecipitated with Spn-

E along with other nuage components from ovarian lysate[28], but whether this interaction was

direct had not been examined. Co-immunoprecipitation assay in S2 cells, Myc-Spn-E was

strongly detected in the precipitant of Flag-Squ by Western blotting, possibly supporting the

direct interaction between Spn-E and Squ in the S2 cells devoid of germline proteins (Fig. 1D-i).

Similarly, AlphaFold2 predicted a direct interaction between Aub and Vret, which was

corroborated by co-immunoprecipitation assays (Fig. 1D-ii). The binding capabilities of another

pair, BoYb-Shutdown (Shu), were also confirmed in S2 cells (Fig. 1D-iv). Three out of five

candidate pairs confirmed interactions, validating the effectiveness of AlphaFold2 in identifying

the binding partners. However, BoYb-Spn-E and Me31B-Vret did not show interaction in these

assays (Fig. 1D-iii, v), possibly suggesting weak interactions that co-immunoprecipitation may

have failed to detect. While co-immunoprecipitation is a widely used method, it may not always

detect weak or transient interactions. Other validation methods, such as FRET or co-localization

assay in culture cells, could offer further insights to support the results. It is also important to

note that AlphaFold2's predictions are not definitive and may lead to false positives, particularly

when analyzing a large number of interactions.

Evaluation of Spn-E and Squ interaction in culture cells and ovaries

Among the binding candidates, we focused on the predicted dimer structure of Spn-E and Squ

pair. Spn-E is an evolutionarily conserved RNA helicase which is expressed in germline cells. It

plays a crucial role in the piRNA production and transposon suppression in germline cells[28,29].

Similarly, Squ is also expressed in ovary and testis and involved in the piRNA production,

although its molecular role is less defined[29,30]. While *squ* is conserved across *Drosophila* species

(Supplemental Fig. 2A, B), vertebrate orthologs remain unidentified. Spn-E contains four

domains: DEAD/DEAH helicase, Hel-C, HA2, and eTud domains (Fig. 2A). Its predicted 3D

structure was well folded and contained few flexible regions (Fig. 1C-viii). In contrast, Squ was

predicted to be largely disordered, consisting of three α-helices and two β-strands (Fig. 2A).

The middle parts of Squ were in close contact with Spn-E, showing lower PAE values,

suggestive of their interaction (Fig. 1C-viii, 2A). AlphaFold2 predicts the five structure models

for each query using different initial model parameters (models 1-5) and ranking confidence is

given to each model. As for Spn-E_Squ pair, the ranking confidence scores were ranging from

0.74 to 0.77. The 3D structures of Spn-E were very similar across all five models,

superimposing almost perfectly (Fig. 2B). The middle region of Squ was consistently positioned

relative to Spn-E, although the N- and C-terminal regions of Squ remained flexible (Fig. 2B).

The closer examination of the Spn-E_Squ dimer interface revealed a short α-helix of Squ

(106th-116th residues) fitted into a groove on the Spn-E surface, while the anti-parallel β-sheet

(140th-153rd) was also predicted to interact with Spn-E (Fig. 2A, C). Physico-chemical structural

analysis using PDBePISA server (EMBL-EBI) identified salt bridges between Spn-E and Squ

(Supplemental Table S3, S4)[31]. To validate these predicted interactions, we generated Squ

mutants substituting each residue involved in the four salt bridges (E107, E109, R115, and

K163) with alanine (Fig. 2D, Supplemental Fig. S2B) and assessed their interactions by co-

immunoprecipitation in S2 cells expressing tagged proteins, Myc-Spn-E and Flag-Squ. The

assay revealed that while the E107A single mutation did not affect the interaction, other single

mutations mildly reduced the binding affinity of Squ to Spn-E (Supplemental Fig. S3A),

Furthermore, the localization of GFP-tagged Squ and mKate2 (mK2)-tagged Spn-E were

examined in S2 cells. When only Squ was expressed, it was dispersed in cytosol (Supplemental

Fig. S3B). On the other hand, when only Spn-E was expressed, it localized in the nucleus as

reported previously[17]. In the co-expression of Squ wildtype or single mutants, Spn-E was moved

to the cytoplasm and form granules together with Squ, suggesting the interaction between them.

Although the single mutants still could bind to Spn-E, Squ quadruple mutant (Squ^{4A}) completely

lost the binding (Fig. 2E) and did not show the co-localization with Spn-E in S2 cells

(Supplemental Fig. S3B). These results suggest that the salt bridges are important for the

interaction between Spn-E and Squ and support the accuracy of their dimer structure predicted

by AlphaFold2.

While the RNA binding site of Spn-E has not been extensively studied, it is presumed to be

near the helicase domain, similar to the Vas helicase-RNA complex[32]. In addition, Lin *et al*

demonstrated that Hel-C domain of Spn-E interacted with the Tej's eSRS region, which recruits

Spn-E to nuage[17], a site distinct from the predicted Squ binding sites (Fig. 2A). Interestingly, a

tetramer complex of Spn-E_Squ_Tej_RNA predicted by the recently available AlphaFold3[33]

placed the single strand RNA (ssRNA) near Spn-E's helicase domain (Fig. 2F), aligning with

the ssRNA binding position found in Vas (Supplemental Fig. S3C). The predicted tetramer

model suggests that Squ binding to Spn-E does not inhibit but may potentially regulate Spn-E's

interaction with Tej or RNA by stabilizing the domain orientation of Spn-E (Fig. 2F).

In addition to the Spn-E_Squ_Tej complex, 1:1 dimer prediction described above further

suggested potential trimers (Fig. 1; Supplemental Fig. S4). For example, Tej protein is predicted

to bind both Vas and Spn-E, and AlfaFold3 indeed further predicted a Vas_Tej_Spn-E trimer,

where Tej's Lotus and eTud domains interact with Vas and Spn-E, respectively. However, Lin *et*

al. reported that Tej binds exclusively either with Vas or Spn-E, but not simultaneously, in

Drosophila ovary[17], suggesting that the predicted trimers may be weak or transient. Similarly,

the BoYb_Vret_Shu and the Me31B_Cup_Tral trimers remain hypothetical and require

experimental verification (Supplemental Fig. S4).

We investigated whether Spn-E also interacts with Squ within the *Drosophila* ovary. The

antibody against Squ detected a specific band at the expected size by Western blotting in the

heterozygous control ovarian lysate, which was absent in the transheterozygote mutant,

squ$^{PP32/HE47}$ (Fig. 3A)[30]. Consistent with the previous report conducted with the transgenic line

expressing HA-Squ[30], immunostaining of ovaries revealed the Squ's localization in nuage,

which overlaps with endogenously-tagged Spn-E with mK2 (Fig. 3B). Spn-E was co-

immunoprecipitated together with Squ from ovarian lysate, indicating the interaction between

Squ and Spn-E (Fig. 3C). While the previous mass spectrometry analysis detected PIWI family

proteins, Piwi, Aub, and AGO3, in Spn-E immunoprecipitates[28], these three proteins were not

present in the immunoprecipitant of Squ (Fig. 3C), further supporting the direct interaction

between Squ and Spn-E.

In this study, three novel protein-protein interactions were predicted and experimentally

confirmed. AlphaFold2 also predicted the 3D structure of these complexes, providing insight

into the important regions involved in complex formation. These predictions will provide

fundamental information to elucidate nuage assembly. Nuage is thought to form by liquid-phase

separation; however, direct protein-protein interactions likely occur within protein-dense nuage,

facilitating RNA processing. Although the precise roles of individual interactions require further

study, characterization of protein-protein interactions within nuage will help clarify the

mechanism of piRNA production.

Screening oogenesis-related proteins for interaction with nuage proteins.

283   Given the role of nuage for piRNA biogenesis and germline development, interactions

between nuage-localized proteins and those involved in oogenesis were expected. We employed

AlphaFold2 to predict these interactions using Vas, Squ, and Tej, the representative nuage

components yet remain elusive, as baits. Of 430 proteins in oogenesis pathway[34], dimeric

binding of 1,290 pairs was predicted (Supplemental Table S5), with 18 pairs showing dimer

structures scoring above 0.6 (Table 3). Among those, co-immunoprecipitation in S2 cells

confirmed interactions of three pairs, Mei-W68_Squ, CSN3_Squ, and Pka-C1_Tej (Fig. 4A, B,

Table 3). The Mei-W68_Squ dimer, scoring 0.63, the binding site of Squ to MeiW68 was

predicted at α-helixes in its middle region, which overlaps with the interacting site to Spn-E

(Table 3, Fig.4A-i, compare with Fig.1C-viii). Mei-W68 is a topoisomerase, known as Spo11 in

many organisms, which is required for the formation of double strand breaks during meiosis[35].

Interestingly, Squ also plays a role in DNA damage response pathway and showed the genetic

interaction with *chk2,* a meiotic checkpoint gene[30]. These results suggest that the binding of Squ

to Mei-W68 may regulate the enzymatic activity of Mei-W68 in order to suppress the excessive

formation of double-strand breaks. Another confirmed pair was CSN3_Squ pair scoring 0.62

(Fig. 4A-ii, B-ii). CSN3, a component of COP9 signalosome which removes Nedd8

modifications from target proteins, is required for the self-renewal of the germline stem cells[36].

Pka-C1, a cAMP-dependent protein kinase involved in axis specification, rhythmic behavior

and synaptic transmission[37] and predicted to bind with the N-terminal Lotus domain of Tej

(Score 0.64, Fig. 4A-iii, B-iii), which is also known as binding site to Vas[20]. This suggests a

potential competitive interaction between Pka-C1 and Vas for Tej. Although the success rate of

confirmed interactions was low (3 out of 18) (Table 3, Supplemental Fig. S5), the results

indicate that these protein pairs could interact within cells if co-expressed *in vivo*. The ranking

confidence score reflects the reliability of AlphaFold2's predicted structure but does not always

ensure accuracy. Therefore, we assessed complex affinity based on the predicted three-

dimensional structures (Supplemental Table S6). Most dimers with high ranking confidence

scores exhibited low Kd values indicative of high affinity, while some showed high Kd values

indicating weak interactions (Supplemental Table S6). For example, the Baf_Vas complex had a

high AlphaFold2 ranking confidence score (0.85) but a relatively high Kd value (1.1E-4 M),

indicating low affinity. Consistently, Baf_Vas binding was not detected in Co-IP experiments

(Supplemental Fig. S5C). Although accurate Kd prediction may be limited due to insufficient

structural optimization, it could serve as a valuable secondary screening tool following

AlphaFold2 predictions.

Screening all *Drosophila* proteins for Piwi-interacting proteins

Given the crucial role of Piwi in piRNA biogenesis, heterochromatin formation, and germline

stem cell (GSC) maintenance, we employed AlfaFold2 to screen all proteins in *Drosophila*

melanogaster for potential Piwi interactions. Piwi, the founder member of the PIWI family

proteins, is not only essential for binding piRNAs and regulating complementary mRNAs but

also plays a critical role in GSC self-renewal[39]. Studies have shown that Piwi, lacking the N-

terminal moiety containing the nuclear localization signal (NLS), still retains GSC self-renewal

capabilities. Its function in GSC self-renewal is realized independently in the cytoplasm of GSC

niche cells, separate from its role in transposon repression. The crystal structures of *Drosophila*

Piwi and silkworm Siwi have been solved and revealed the organization of four domains (N,

PAZ, MID, and PIWI)[40,41]. Recently, the ternary structure of piRNA, target RNA, and MILI, a

mouse ortholog of Piwi, has been reported and the bound piRNA threaded through the channel

between N-PAZ and MID–PIWI lobes (Supplemental Fig. S6A)[42].

To identify novel Piwi-binding proteins, we conducted a 1:1 interaction screening

involving approximately 12,000 *Drosophila* proteins, excluding any proteins over 2,000 amino

acid residues due to the computational limits. The ranking confidences by AlphaFold2 were

primarily low, with over 98% being below 0.6, suggesting a low likelihood of interaction

between Piwi and the vast majority of the proteins (Fig. 5A). Approximately 1.5% of the pairs,

totaling 164 pairs, scored above 0.6, was expected to contain the novel binding partners

(Supplemental Table S7). Top 24 candidates with greater than 0.75 ranking confidence were

listed in Table 4. This list contained many metabolic enzymes and three piRNA-related proteins,

Asterix (Arx), Mael, and Hen1. The interactions between Mael and Piwi-family proteins have

been already reported[21]. Arx, known as Gtsf1 in mammals and integral to Piwi–piRISC-

mediated transcriptional silencing in nucleus[43], had high ranking confidences (0.83, Table 4).

Despite its known three-dimensional structure determined by NMR spectroscopy[44], the

Arx_Piwi complex structure remained elusive. AlphaFoldF2 predicted that while Arx lacked a

compact domain, the majority of Arx protein associated around the PIWI domain, except for the

flexible C-terminal region (130th-167th residues) (Fig. 5B-i). Three Arx paralogs in *Drosophila*

(CG34283, CG32625, and CG14036) were also predicted to bind to Piwi with high ranking

confidences, suggesting their interactions within the cells (Supplemental Fig. S6B). Although

CG34283 is not expressed, CG32625 and CG14036 are moderately and highly expressed in

ovary, respectively[37]. However, unlike *arx*, knockdown of each paralogous gene did not result in

de-repression of a transposon, *mdg1*[43], suggesting that they may be pseudogenes or possess

redundant roles.

Hen1 is a methyltransferase known to mediate methylation of the terminal 2' hydroxyl

group of small interfering RNAs and piRNAs, thereby enhancing the stability of the small

RNAs. Consistent with the previous report showing Hen1 binding to Piwi[43], the dimer structure

of Hen1_Piwi was predicted with high ranking confidence, 0.77. This prediction further

suggests that Hen1 is recruited to Piwi, thereby positioning it closer to the piRNA substrate (Fig.

5B-ii). Another potential interacting protein for Piwi was CG33703, a protein whose functions

remains uncharacterized despite having 75 paralogs listed in *Drosophila* genome[37]. Together

with three of these paralogs (CG33783, CG33647, and CG33644), CG33703 was predicted to

form dimer with Piwi (ranking confidences 0.82) (Table 4, Supplemental Fig. S6C). The domain

of unknown function, DUF1091[45], shared by these paralogs was predicted to associate with the

PIWI-domain (Fig. 5B-iii). Although these proteins are generally not expressed under the

normal conditions[37], their potential to bind Piwi suggests a regulatory role in the abnormal or

stress conditions where CG33703 or its paralogs are expressed. In addition, we investigated two

oogenesis-related proteins, Twinfilin (Twf, ranking confidence 0.64, Fig. 5B-iv) and Brainiac

(Brn, ranking confidence 0.63, Fig. 5B-v), for their binding with Piwi through co-

immunoprecipitation (Fig. 5C, Supplemental Table S7). While no binding was observed with

Twf, significant binding was detected with Brn, which is involved in dorsal-ventral polarity

determination in follicle cells[46].

This study identifies several potential protein interactions, but AlphaFold2 predictions

require caution. Protein-protein interactions involve conformational changes and dependencies

on ligands, ions, and cofactors, which AlphaFold2 does not consider, potentially reducing

prediction accuracy. Notably, the presence of a high-scoring model in terms of structural

complementarity does not guarantee that the interaction is biologically significant. The

expression patterns of these candidate proteins within the organism are crucial for further

validation of our findings. It is likely that these proteins interact when co-expressed in the same

cellular context. Under typical growth conditions, these interactions might not occur; however,

in stress or disease states where these proteins are upregulated, the likelihood of interaction

increases, potentially implicating these interactions in the disruption of normal cellular

functions and contributing to disease or tumorigenesis. Furthermore, in silico screening proves

extremely valuable, especially when dealing with toxic bait proteins, as it allows us to narrow

down the list of potential candidates and reduce the need for hazardous experimental procedures.

Ultimately, establishing these potential interactions in vivo could significantly advance our

understanding of protein functions under both normal and pathological conditions.

Materials and Methods

Antibodies

The anti-Squ antibody was generated as follows. His-tagged full-length Squ was expressed in

Escherichia coli BL21(DE3) strain, with the plasmid that subcloned the *squ* coding region into

pDEST17 vector (Thermo Fisher Scientific). His-Squ was solubilized with 6 M Urea in PBS,

purified using Nickel Sepharose beads (GE healthcare) following the manufacturer's protocol,

and subsequently used for immunization in rats. The antibodies used for Western blotting

analysis were rat anti-Spn-E[17] (1:500), rat anti-Ago3[17] (1:200), guinea pig anti-Aub[47] (1:1000),

mouse monoclonal anti-Piwi (G-1, sc-390946, Santa Cruz Biotechnology (United States)), and

mouse monoclonal anti-α-Tubulin (DM1A, sc-32293, Santa Cruz Biotechnology). The

secondary antibodies used in this study were HRP-conjugated goat anti-guinea pig (Dako, Cat.#

P0141), HRP-conjugated goat anti-rat (Dako, Cat.# P0450), HRP-conjugated goat anti-mouse

(BioRad, Cat.# 1706516) and HRP-conjugated goat anti-rabbit (BioRad, Cat.# 1706515). HRP-

conjugated anti-DDDDK-tag antibody (MBL, Cat.#M185-7) and HRP-conjugated anti-Myc-tag

antibody (MBL, Cat.#M192-7) were used to detect FLAG-tagged and Myc-tagged proteins,

respectively.

AlphaFold2 prediction for the direct interacting protein pairs

Amino acid sequences for *Drosophila* proteins were obtained from Flybase[37]. For proteins

annotated with multiple isoforms, only the longest isoform was selected. Proteins exceeding

2,000 residues were excluded due to computational limitations. AlphaFold v2.2 program was

installed in the Supercomputer for Quest to Unsolved Interdisciplinary Datascience (SQUID) at

Cyber Media Center in Osaka University. All necessary protein sequence databases for

AlphaFold2 were stored on an SSD device connected to the SQUID system.

The AlphaFold2 prediction process was divided into two steps: generation of the

multiple sequence alignment (MSA) and the prediction of the 3D structure. The MSAs were

computed on SQUID's CPU node and stored for reuse. The calculation of the MSA took on

average 2-4 hours per protein, with the more homologs of the protein in query, the longer it took.

For dimer structure prediction, two MSAs corresponding to the dimer pair were placed in the

directory of msas/A and msas/B. The calculations were performed on the GPU node with the

options of -t 2022-05-14 -m multimer -l 1 -p true. AlphaFold2 generates five structural models

for each prediction. To speed up the prediction, five computations were assigned to five GPU

units, even though the original AlphaFold2 program computes 5 models one at a time.

Prediction of dimer structure took approximately 1-2 hours per pair on average, depending on

protein size. Each user can compute 100~200 pairs of calculations per day, but since the

supercomputer is shared, job availability varies with overall demand.

The prediction confidence score (ranking confidence) was provided for each model

and among 5 models, the highest ranking confidence was used as the prediction score for the

corresponding dimer structure. PAE plots for dimer structures were drawn by extracting the data

form pkl files generated by AlphaFold2. The list of protein pairs scoring above 0.6 and the

corresponding PAE plots and PDB structures are available on Github (https://dme-

research.github.io/AF2_2/).

AlphaFold3 prediction for the structure of the trimer complex

The structure of Spn-E_Squ_Tej complexed with RNA, 5'-CUGACUACCGAAGUACUACG-

3', was predicted by the AlphaFold3 prediction server (https://alphafoldserver.com/)[33]. The

trimer structures of Spn-E_Squ_Tej, Vas_Tej_Spn-E, BoYb_Vret_Shu, and Me31B_Cup_Tral

were also predicted by AlphaFold3.

Analysis of protein 3D structure

The protein 3D structure was visualized using ChimeraX software[48]. The SpnE_Squ dimer

interface was analyzed with the 'Protein interfaces, surfaces and assemblies' service (PISA) at

the European Bioinformatics Institute (http://www.ebi.ac.uk/pdbe/prot_int/pistart.html)[31].

Fly stocks

All stocks were maintained at 25□ with standard methods. Mutant alleles of *squ* (*squ^pp32* and

squ^HE47) were used in this study[30]. The mK2-tagged Spn-E-mK2 knock-in fly was previously

generated[17]. *y w* strain served as the control.

Western blotting

Ovaries were homogenized in the ice-cold PBS and denatured in the presence of SDS sample

buffer at 95°C for 5 min. The samples were then subjected to SDS-PAGE and transferred to

ClearTrans SP PVDF membrane (Wako). The primary and secondary antibodies described

above were diluted in the Signal Enhancer reagent HIKARI (Nacalai Tesque).

Chemiluminescence was induced by the Chemi-Lumi One reagent kit (Nacalai Tesque) and

detected with ChemiDoc Touch (Bio-Rad). The bands were quantified using ImageJ[49] or Image

Lab software (Bio-Rad).

Co-immunoprecipitation in S2 cells

Drosophila Schneider S2 cells were cultured at 28°C in Schneider's medium supplemented with

10% (v/v) fetal bovine serum and antibiotics (penicillin and streptomycin). Protein coding

regions were cloned into pENTR vector (Thermo Fisher Scientific) and then transferred into

pAFW or pAMW destination vectors. S2 cells (0.2-$2\text{x}10^6$ cells/ml) were seeded in 12-well

plates overnight and transfected using Hilymax (Dojindo Molecular Technologies, Japan). After

36-48 hours, S2 cells were resuspended in 360 μl of ice-cold PBS containing 0.02% Triton-

X100 and 1x protease inhibitor cocktail (Roche), and sonicated (0.5 sec, 5 times). The resulted

lysate was clarified by spinning at 15,000 xg for 15 min at 4°C. 300 μl of supernatant was

incubated with 6 μl of prewashed anti-FLAG magnetic beads (MBL) or anti-Myc magnetic

beads (Thermo Fisher Scientific) for 1.5 h at 4°C with gentle rotation. After incubation, the

beads were washed three times with 800 μl of ice-cold PBS with 0.02% Triton-X100, denatured

in SDS sample buffer and subjected to SDS-PAGE and Western blot. 1% of the total lysates

were loaded as input samples.

Co-localization assay in S2 cells

Construction of GFP-tagged or mKate2-tagged proteins and transfection were conducted as

described in the previous section. After 48 h of transfection, the cells were placed onto the

concanavalin A-coated coverslips for 20 min, fixed with PBS containing 4% (w/v)

paraformaldehyde for 15 min at room temperature, permeabilized with PBX [PBS containing

0.2% (v/v) TritonX-100] for 10 min twice, stained with DAPI (1:1000) and mounted with

Fluoro-Keeper Antifade Reagent (Nacalai Tesque). Images were taken by ZEISS LSM 900 with

Airy Scan 2 using 63x oil NA 6.0 objectives and processed using ZEISS ZEN 3.0 and ImageJ[49].

Crosslinking immunoprecipitation (CL-IP)

As previously described[17], 100 ovaries from *y w* flies were dissected in ice-cold PBS and fixed

in PBS containing 0.1% (w/v) paraformaldehyde for 20 min on ice, quenched in 125 mM

glycine for 20 min, and then homogenized in CL-IP lysis buffer. The lysate was incubated at

4°C for 20 min and then sonicated. After centrifugation at maximum speed for 10 min at 4°C,

the supernatant was collected and diluted with an equal volume of CL-IP wash buffer. 10 μl of

pre-washed Dynabeads Protein G/A mixture (1:1) (Invitrogen) was added for pre-clearance at

4°C for 1 h. Anti-Squ antibody was added to the cleared supernatant with 1:500 dilution and

incubated at 4°C overnight. The 20 μl of pre-washed Dynabeads Protein G/A 1:1 mixture beads

(Invitrogen) were added for binding and incubated at 4°C for 3 h. After washed with CL-IP

wash buffer for 3 times, beads were collected and 50 μl of CL-IP wash buffer containing SDS

sample buffer was added. The beads were boiled at 95°C for 5 min and subjected for SDS-

PAGE and Western blotting analysis.

Immunostaining of ovaries

As previously described[17,47], ovaries were dissected, fixed, permeabilized with PBX and

immunostained. The primary and the secondary antibodies were anti-Squ antibody (in this study,

1:500) and Alexa Fluor 488-conjugated anti-rat IgG (Thermo Fisher Scientific, 1:200). Images

were taken by ZEISS LSM 900 with Airy Scan 2 using 63X oil NA 1.4 objectives and processed

by ZEISS ZEN 3.0 and ImageJ[49].

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Data availability statement

PDB files and PAE plots for the protein dimers whose ranking confidences were more than 0.6,

were deposited and available at GitHub Pages (https://dme-research.github.io/AF2_2/)

Competing Interests Statement

The authors declare that the research was conducted in the absence of any commercial or

financial relationships that could be construed as a potential conflict of interest.

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Figure legends

Figure 1: The 1:1 dimer structure prediction by AlphaFold2 for piRNA-related proteins

(A) Heatmaps of the prediction confidence scores (ranking confidence, Green), pTM values

(Blue), and ipTM values (Red) provided by AlphaFold2. The 20 types of proteins are aligned

from top to bottom and left to right in the same order. Boxes on diagonal line represent

homodimers.

(B) Scatter plot of the ranking confidences. The scores from first and second predictions for

each heterodimer pair are plotted on X and Y axis, respectively.

(Ci ~ xii) The predicted 3D structures (top panels) and the Predicted Aligned Error (PAE) plots

(bottom panels) for each candidate heterodimers scoring above 0.6. The PAE plot displays the

positional errors between all amino acid residue pairs, formatted in a matrix layout.

(D) Co-immunoprecipitation assays using tagged proteins to verify interactions between

specific pairs: Spn-E_Squ (i), Aub_Vret (ii), Spn-E_BoYb (iii), BoYb_Shu (iv), and

Me31B_Vret (v). Single transfected cells expressing only Myc-tagged but not Flag-tagged

proteins are used as negative controls for each set. Box and whisker plots show the intensity

ratio between immunoprecipitated and input bands (n=3).

Figure 2: Interaction between Spn-E and Squ

(A) Schematic of Spn-E domain structures defined in SMART[45]. Boxes (α-helix: orange) and

arrow (β-sheet: green) for Squ structure. The predicted interacting regions between Spn-E and

Squ are indicated in gray boxes. Tej interaction site of Spn-E is also shown[17].

(B) The predicted five models of heterodimer of Spn-E (in gray) and Squ (in magenta). Spn-E

molecules in all five models are superimposed.

(C) 3D structure of the Spn-E_Squ dimer colored by Spn-E domains as indicated in (A), with

Squ in magenta. The enlarged image of the interface indicated by box is also shown.

(D) The predicted salt bridges at the interface, with Spn-E in gray and Squ in magenta. The

residues forming salt bridges are depicted in stick model.

(E) Co-immunoprecipitation assay using S2 cell lysate to examine the interaction between Myc-

Spn-E and Flag-Squ mutant (4A) whose salt bridge-forming residues are mutated to Ala. S2

cells expressing Myc-Spn-E alone is used as a control. The ratios of the band intensity

(IP/input) are shown in a box and whisker plot (n=3).

(F) The heterotetramer model of Spn-E_RNA_Squ_Tej predicted by AlphaFold3. Spn-E is

shown as a space filled model in gray, Squ in magenta, Tej in cyan, and RNA in yellow. The

model on the left is rotated 180º in the Y axis to produce the image on the right.

Figure 3: Spn-E and Squ interact in *Drosophila* ovary

(A) Western blotting analysis using anti-Squ antibody reveals a specific band at the expected

size (approximately 28 kDa) for endogenous Squ in *Drosophila* ovarian lysates of the

heterozygous control. This band is absent in the transheterozygoute, *squ*$^{PP32/HE47}$.

(B) Immunostaining of *Drosophila* egg chambers with anti-Squ antibody and anti-mKate2

(mK2) antibody demonstrates colocalization of Squ and Spn-E-mK2 in nuage, a perinuclear

granule in germline cells. The enlarged images of nuclei are shown in the panels below. Scale

bars: 10 µm (top row), 2.5 µm (enlarged images)

(C) Immunoprecipitation of the endogenous Squ from ovarian lysate revealed the interaction

with Spn-E protein. Proteins were detected by western blotting analysis using the specific

antibody for each protein. The negative control was performed without anti-Squ antibody (beads

only).

Figure 4: Squ- and Tej-interacting proteins predicted by AlphaFold2

(A i-iii) The predicted dimer structures (top) and Predicted Aligned Error (PAE) plots (bottom)

of Mei-W68 in blue and Squ in magenta (i), CSN3 in green and Squ in magenta (ii), Pka-C1 in

orange and Tej in cyan (iii). The PAE plot displays the positional errors between all amino acid

residue pairs, formatted in a matrix layout.

(B i-iii) Co-immunoprecipitation assays using tagged proteins to verify interactions between

specific pairs: Mei-W68_Squ (i), CSN3_Squ (ii), and Pka-C1_Tej (iii). Single transfected cells

expressing only Myc-tagged but not Flag-tagged proteins are used as negative controls for each

set. Box and whisker plots show the intensity ratio between immunoprecipitated and input

bands (n=3).

Figure 5: Screening for Piwi-interacting proteins in *Drosophila* proteome

(A) Pie chart displaying the distribution of ranking confidences from the AlphaFold2 screening

for Piwi-interacting proteins among those encoded by *Drosophila* genome.

(Bi~ v) The predicted dimer structure (top) and PAE plots (bottom) for the Piwi and the binding

candidates in red: Arx (i), Hen1 (ii), CG33703 (iii), Twf (iv), and Brn (v). Piwi is shown in the

same colors as Supplemental Fig. S5A.

(C) Co-immunoprecipitation assays using tagged proteins to verify interactions between Piwi

and the binding candidates, Twf and Brn. Single transfected cells expressing only Flag-Piwi is

used as negative control. Box and whisker plots show the intensity ratio between

immunoprecipitated and input bands (n=3).

Table 1   The piRNA production-related proteins used in this study

Protein	Ortholog	Number of residues	Domain	Direct binding (MIST databse)	Localization	Reference,
Vas	DDX4	661	DEAD-Box, Hel-C	Aub	Nuage	14
Spn-E	Tdrd9	1434	DEAD-Box, Hel-C, HA2, eTud		Nuage	28
Tej	Tdrd5	559	Lotus, eTud		Nuage	17
Tapas	Tdrd7	1222	Lotus, eTud		Nuage	50
Qin	Rnf17	1857	RING, eTud		Nuage	28
Kots	Tdrd1	892	eTud		Nuage	47
Krimp	-	746	eTud		Nuage	14
Squ	-	241			Nuage	30
Mael	Mael	462	HMG, MAEL		Nuage	14
Aub	PIWIL2	866	N, PAZ, PIWI, MID	Vas, Papi, Me31B	Nuage	14
AGO3	PIWIL4	867	N, PAZ, PIWI, MID	Papi	Nuage	51
Papi	Tdrkh	576	eTud, KH	Aub, AGO3	Mitochondria	52
Vret	Tdrd1	691	eTud	BoYb	Nuage	27
Bel	DDX3	801	DEAD-Box		Nuage	53
Zuc	Pld6	253	PLD-like	Zuc	Mitochondria	54
Cup	Eif4enif1	1117		Me31B	Nuage	13
Tral	Lsm14	657	Lsm, FDF	Me31B	Nuage	13
Me31B	DDX6	459	DEAD-Box	Aub, Cup, Tral	Nuage	13
Shu	Fkbp6	455	PPIase		Nuage	55
BoYb	Tdrd12	1059	DEAD-Box, eTud	Vret	Nuage	27

757 Table 2　The screening for the interacting proteins (prediction confidence score, ranking

758 confidence > 0.6)

Protein A_B 1st prediction	ranking confidence	Protein B_A 2nd prediction	ranking confidence	Reference	Validation by Co-IP
Zuc_Zuc	0.85	N/A	N/A	[19]	N/A
AGO3_Mael	0.78	Mael_AGO3	0.78	[21]	N/A
Aub_Mael	0.78	Mael_Aub	0.78	[21]	N/A
Spn-E_Squ	0.77	Squ_Spn-E	0.78	This study	++
Me31B_Tral	0.74	Tral_Me31B	0.72	[13]	N/A
Aub_Vret	0.72	Vret_Aub	0.72	This study	+
BoYb_Spn-E	0.69	Spn-E_BoYb	0.69	This study	-
Cup_Me31B	0.68	Me31B_Cup	0.70	[13]	N/A
Spn-E_Tej	0.65	Tej_Spn-E	0.65	[17]	N/A
BoYb_Vret	0.64	Vret_BoYb	0.65	[27]	N/A
BoYb_Shu	0.64	Shu_BoYb	0.56	This study	+
Me31B_Vret	0.64	Vret_Me31B	0.45	This study	-
Tej_Vas	0.61	Vas_Tej	0.62	[56]	N/A

762 Table 3. The binding candidates predicted by AlphaFold2

Protein_A	Protein_B	AlphaFold2 ranking confidence	Validation by Co-IP	Function of Protein_A
Vps25	Squ	0.71	No	a member of the ESCRT-II complex
Nup44A	Squ	0.65	No	a nuclear pore protein
Nclb	Squ	0.64	No	Chromatin-associated factor
Mei-W68	Squ	0.63	Bound	formation of double strand breaks
DNaseII	Squ	0.63	N/E	Deoxyribonuclease II
Spn-D	Squ	0.62	No	homologous recombinational DNA repair
CSN3	Squ	0.62	Bound	subunit of the COP9 signalosome
Jagn	Tej	0.72	No	located in the endoplasmic reticulum
Pka-C1	Tej	0.64	Bound	serine/threonine kinase
Rab7	Tej	0.62	No	vesicle trafficking regulation
Baf	Vas	0.85	No	chromatin organization
Mats	Vas	0.79	No	Coactivator of Warts (Wts) kinase
Abo	Vas	0.68	No	negative regulator of histone transcription genes
CathD	Vas	0.67	N/E	apoptosis and the defense response
Rab11	Vas	0.67	No	endomembrane traffiking
Vls	Vas	0.63	No	substrate recognition platform for cusl
Hsc70-4	Vas	0.62	No	protein folding
RhoL	Vas	0.61	N/E	maturation of hemocytes

764 N/E: Not examined. The expression plasmids were not constructed due to the
765 technical reasons.

768   Table 4. Piwi-interacting proteins predicted by AlphaFold2 (Socre >= 0.75).

protein	length (residue)	ranking confidence	human ortholog	Gene Summary (Flybase)
CG34283	153	0.85	GTSF1	-
CG32625	144	0.84	GTSF1	-
Arx	167	0.83	GTSF1	It plays an essential role in piRNA-guided transcriptional silencing, interacting probably directly with the product of piwi.
CG33703	181	0.82	-	No phenotypic data is available.
GstE12	223	0.82	GSTT2B	Glutathione S transferase E12 (GstE12) encodes an enzyme involved in glutathione metabolism.
CAH4	279	0.81	CA6	Predicted to enable carbonate dehydratase activity. Predicted to be active in cytoplasm.
CG13192	323	0.81	GNB1L	Predicted to be involved in social behavior.
Mael	462	0.79	MAEL	Involved both in the piRNA and miRNA metabolic processes.
Adk3	366	0.78	ADK	Predicted to enable adenosine kinase activity.
Alg11	475	0.78	ALG11	Predicted to enable GDP-Man:Man3GlcNAc2-PP-Dol alpha-1,2-mannosyltransferase activity.
CG41378	228	0.78	IFI30	Predicted to enable oxidoreductase activity.
CG14036	93	0.77	GTSF1	Involved in copper ion homeostasis.
CG7966	486	0.77	SELENBP1	Predicted to enable methanethiol oxidase activity.
Hen1	391	0.77	HENMT1	Hen1 encodes a methyltransferase that methylates the terminal 2' hydroxyl group of small interfering RNAs and Piwi-interacting RNAs.
Rpp14b	112	0.77	RPP14	Predicted to enable ribonuclease P RNA binding activity.
CG33783	164	0.76	-	No phenotypic data is available.
AANATL4	224	0.75	-	Predicted to enable aralkylamine N-acetyltransferase activity.
CG14787	260	0.75	CDYL2	Is expressed in adult heart; embryonic Malpighian tubule; and embryonic main segment of Malpighian tubule.
CG33160	258	0.75	PRSS1	Predicted to enable serine-type endopeptidase activity.
CG3397	342	0.75	AKR7A2	Predicted to enable D-arabinose 1-dehydrogenase [NAD(P)+] activity.
CG4390	330	0.75	ESD	Enables serine hydrolase activity.
CG7142	334	0.75	KLK1	Predicted to enable serine-type endopeptidase activity.
JanA	135	0.75	PHPT1	JanA and janB regulate somatic sex differentiation.
Yip7	270	0.75	CTRB1	Enables serine hydrolase activity.

Supplemental information

Supplemental Figure S1: The Nuage Proteins Analyzed in This Study

Supplemental Figure S2: Comparative Analysis of Squ and Spn-E Orthologs in *Drosophila*

Supplemental Figure S3: Interaction and Localization Analysis of Spn-E and Squ in S2 Cells

Supplemental Figure S4: Trimer structures predicted by AlphaFold3

Supplemental Figure S5: Validation of Predicted Protein Interactions via Co-
Immunoprecipitation from S2 cell lysate

Supplemental Figure S6: Structural Analyses of Piwi Complexes and Interactions

Supplemental Table S1: The prediction confidence scores (ranking confidences) for the pairwise
dimer predictions by AlphaFold2 as shown in Fig. 1A

Supplemental Table S2: The experimentally determined 3D structure models for the nuage-
localizing/piRNA-related proteins.

Supplemental Table S3: The salt-bridges and H-bonds found in the predicted interface between
Spn-E and Squ dimer

Supplemental Table S4: The hydrophobic residues found in the predicted interface between
Spn-E and Squ proteins

Supplemental Table S5: The AlphaFold2 screening for the interacting pairs of Squ, Tej, Vas
against 430 oogenesis-related proteins

Supplemental Table S6: The computed binding affinity of the protein-protein complex on the
basis of the three-dimensional structure predicted by AlphaFold2.

Supplemental Table S7: The AlphaFold2 screen for Piwi interacting pairs against 12,427
Drosophila proteins.