Appendix A: Re-Turking Results Approved for Public Release; Distribution Unlimited. 14-0249

Burger, J., Doughty, E., Khare, R., *et al.* Hybrid curation of gene-mutation relations combining automated extraction and crowdsourcing. *Database* (2014) Vol. 2014: article ID bau094; doi:10.1093/database/bau094

Appendix A: Re-Turking Results

We performed two sets of experiments to attempt to provide a ground truth set for surface relation judgments.

Returking all Turker/Gold Standard Disagreements

In the first experiment, we selected all of the HITS where the aggregate Turker judgment differed from the Gold Standard. Three of the authors (RK, JA, LH) "re-turked" 125 HITs where the aggregate Turker judgment differed from the gold standard (both false positives and false negatives, but done using an earlier version of the gold standard). These three authors performed 119 HITs in common. Response counts appear in Table A1.

Table A1: Author responses to re-Turked HITs

	X	Y	Z	Total
yes	81	97	109	287
no	23	14	8	45
inconsistent	15	8	2	25
Total	119	119	119	

Pairwise raw agreement and Cohen's Kappa for author re-turked HITs appear in Table A2.

	X-Y	X-Z	Y-Z
% Agreement	0.765	0.739	0.849
Cohen's Kappa	0.432	0.279	0.381

Although the agreement levels among the three authors (Table A2) was slightly higher than for Turkers (Table 6 in the paper), the agreement levels were not particularly high in either case. However, there were 83 HITs in the set (66%) where all three annotators

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agreed; and of those, the "re-turking" agreed with the original Turkers (and disagreed with the gold standard) in 60 of those cases.

Returking a Random Subset of HITS

In the second experiment, six annotators from UMBC provided two-fold judgments of the HITs from a randomly selected subset of 100 abstracts. We performed several analyses on the 383 items that were presented to the UMBC annotators:

- VirtualTurkers: Analysis using every ItemID, attributing one response to "virtualturker1" and the other to "virtualturker2" (383 items – Table A3)
- ProlificTurkers: Analysis using the overlap items of the two most prolific Turkers (124 items – Table A4)

Count	Percent				
	4-way task				
383	100.00%	Items – 4-way task			
227	59.27%	Agreement			
158	41.25%	Both-yes			
61	15.93%	Both-no			
8	2.09%	Both-inconsistent			
0	0.00%	Both-blank			
	Binary task				
383	100.00%	Items – yes/not-yes task			
277	72.32%	Binary-task-agreement			
158	41.25%	Both-yes			
119	31.07%	Both-not-yes			

Table A3: Analysis of "virtual UMBC Turkers"

For each of these, we looked at the full task with four possible answers (yes/no/inconsistent/blank) and a binary task (yes/not-yes). For the VirtualTurkers, we

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calculated just raw agreement, and for the ProlificTurkers we calculated raw agreement and Kappa.

Count	Percent				
	4-way task				
124	100.00%	Items – 4-way task			
79	63.71%	Agreement			
54	43.55%	Both-yes			
23	18.55%	Both-no			
2	1.61%	Both-inconsistent			
0	0.00%	Both-blank			
	Binary task				
124	100.00%	Items – yes/not-yes task			
100	80.65%	Binary-task-agreement			
54	43.55%	Both-yes			
46	37.10%	Both-not-yes			

Table A4: Prolific Turker results

We see about 60% raw agreement between the virtual UMBC annotators, and 72% agreement for the binary task. This is slightly better than the actual Turkers (Table 7 in the paper). When looking at the actual Prolific Turker results (Table A4), we see that binary task agreement is (not surprisingly) quite a bit higher than full task agreement. For the ProlificTurkers we can also look at patterns of individual Turker tag usage and calculate kappa; Table A4 above shows that full task agreement is 63.7%, with a kappa of 0.40; binary task agreement is 80.6%, with a kappa of 0.61. These results are better than the agreement between actual Turkers and comparable to the best pair of authors. While the 80% agreement between the two Prolific UMBC Turkers is encouraging, even the best results fall short of the 90% inter-curator agreement achieved by expert curated databases. This may be a reflection of task difficulty, variations in background knowledge, or some other factor; see Snow et al (2008).

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References

Snow R et al. (2008), Cheap and fast---but is it good?: evaluating non-expert annotations for natural language tasks, Proceeding EMNLP '08 Proceedings of the Conference on Empirical Methods in Natural Language Processing, pps. 254-263

Appendix B: Comparison Between Control and Test

As mentioned above, we inserted control items into the workflow to gauge which Turkers to trust more. In our first experiment, an arbitrary subset of the items was chosen to act as controls. In the current study, we selected items from Experiment 1 that were highly predictive of overall performance, as described in the Methods section above. The graphs in Figure B1 show concept level relation accuracy for individual Turkers on the control items (x-axis) plotted against performance on test items (y-axis). To our surprise, Experiment 1 (Figure B1, left) showed a higher correlation than Experiment 2 (Figure B1, right): an R² of 0.44 for Experiment 1 vs. R² of 0.24 for Experiment 2. The lower correlation for Experiment 2 was unexpected and has led us to re-examine the criteria for selection of control items.

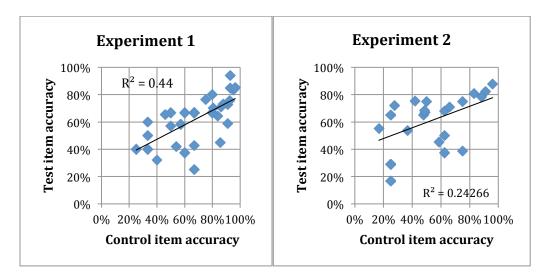


Figure B1: Control item performance vs test items

Appendix C: Analysis of Turker False Positives

After removing all HITs that had non-local positional information, we analyzed the remaining 68 false positive aggregate Turker judgments. The analysis was performed in terms of the following categories:.

- Non-human mutation: The abstract mentions mutations from a non-human organism, EMU finds these and generates HITs. However, the gold standard flags all non-human mutations and they are excluded from the scoring procedure.
- 2. **Non-coding mutation:** Only later entries in the gold standard consistently captured non-coding mutations, so non-coding mutations are ignored during scoring. If, however, EMU extracts an apparent coding representation for a non-coding mutation, it may result in a false positive.¹
- 3. **Missing Gold Standard information:** In a few cases, a mutation may be mentioned at both the amino acid level and the nucleotide level, but the position may only be given in terms of the codon (amino acid). In these cases, the gold standard includes an entry lacking position information for the nucleotide level; thus any nucleotide level mutation that EMU produces will not match the gold standard.
- 4. **Gene name or gene ID problem**: The gene ID for a correctly highlighted gene doesn't match the gold standard, with two underlying causes:
 - Incomplete capture of the gene name leading to incorrect gene identifier,
 e.g., using "insulin-growth factor II" instead of "IGFR2" (where R stands for receptor, making this a different gene);
 - \circ Incorrect selection of the gene identifier in cases of ambiguity.

¹ If EMU extracts information positional information that characterizes the mutation as non-coding (e.g., a negative position), then this is filtered out and no HIT is generated for this mutation.

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5. Erroneous Turker judgment: The relation was approved despite the Turker being presented with sufficient information to indicate that the proposed relation was incorrect.

Table C1: Categorization of false positives (excluding HITs from non-local
mutations)

		3. Missing	4. Gene	5. Wrong	Total
1. Non-human	2. Non-coding	gold standard	name or	Turker	
mutation	mutation	information	ID error	judgement	
23	11	3	21	10	68

From Table C1, we see that there were categories of errors where there may have been insufficient instructions given to the Turkers (categories 1: non-human or not curated; and 2: non-coding mutations) and/or a mismatch between gold standard and the Turker task (category 3: gene or position not present in the Gold Standard). For example, if Turkers had been instructed to *only* judge mutations occurring in human genes and to ignore any non-coding mutations, this might have eliminated many errors in categories 1 and 2, assuming that Turkers had made correct judgments about whether or not a given abstract contained the appropriate information.

Similarly, a number of the category 4 errors (those relating to gene ID problems) were hidden from the Turkers, who saw a plausible gene name highlighted in the text and may have judged the relation between gene and mutation as correct. Almost 1/3 of the errors involved a hidden error in gene ID.

Appendix D: Instructions and Qualifier Items

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Appendix D: Instructions and Qualifier Items

Below we include the instructions given to the Turkers. These were available in a pop up on each item, and also as the introduction to the qualifier exam.

Instructions

The task is to read a series of medical abstracts that discuss genes and proteins, as well as mutations. *Genes* encode information about *proteins*, and so these are often discussed interchangeably. *Mutations* occur on genes, but are often described with respect to proteins, because a gene mutation can cause a change in the resulting protein.

You will be asked to judge whether each abstract associates a particular mutation with a specific gene or protein. The abstract may discuss multiple genes/proteins and multiple mutations; it may also mention a particular gene/protein or mutation more than once. You are only being asked about whether the highlighted mutation is associated with the highlighted gene or protein.

You may see multiple sections of text highlighted with the same color; these should be mentions of the same gene/protein or the same mutation, possibly with different wording. If you believe that these are *not* all the same, please select the option **Inconsistent Annotation**.

A mutation may be highlighted that is not associated with the highlighted gene or protein. If this is the case, then answer **No**.

If you are reasonably certain that the mutation is in fact associated with the gene or protein, then answer **Yes**.

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We also include the five items used for the qualifier. Turkers were required to answer at least four of these items correctly in order to participate in the task. We show the expected answer for each item in bold. We also show the PubMed identifier of each abstract here for reference purposes only—the Turkers were not presented with the PMIDs.

Commonly studied single-nucleotide polymorphisms and breast cancer: results from the Breast Cancer Association Consortium. (PMID 17018785)

BACKGROUND: The Breast Cancer Association Consortium (BCAC) is an international collaboration that was established to provide large sample sizes for examining genetic associations. We conducted combined analyses on all singlenucleotide polymorphisms (SNPs) whose associations with breast cancer have been investigated by at least three participating groups. METHODS: Data from up to 12 studies were pooled for each SNP (ADH1C I350V, AURKA F31I, BRCA2 N372H, CASP8 D302H, ERCC2 D312N, IGFBP3 -202 c>a, LIG4 D501D, PGR V660L, SOD2 V16A, TGFB1 L10P, TP53 R72P, XRCC1 R399Q, XRCC2 R188H, XRCC3 T241M, XRCC3 5' UTR, and XRCC3 IVS7-14). Genotype frequencies in case and control subjects were compared, and genotype-specific odds ratios for the risk of breast cancer in heterozygotes and homozygotes for the rare allele compared with homozygotes for the common allele were estimated with logistic regression. Statistical tests were two-sided. RESULTS: The total number of subjects for analysis of each SNP ranged from 12,013 to 31,595. For five SNPs--CASP8 D302H, IGFBP3 -202 c>a, PGR V660L, SOD2 V16A, and TGFB1 L10P--the associations with breast cancer were of borderline statistical significance (P = .016, .060, .047, .056, and .0088 respectively). The remaining 11 SNPs were not associated with breast cancer risk; genotype-specific odds ratios were close to unity. There was some evidence for between-study heterogeneity (P < .05) for four of the 11 SNPs (ADH1C I350V, ERCC2 D312N, XRCC1 R399O, and XRCC3 IVS5-14). CONCLUSION: Pooling data within a large consortium has helped to clarify associations of SNPs with breast cancer. In the future, consortia such as the BCAC will be important in the analysis of rare polymorphisms and gene x gene or gene x environment interactions, for which individual studies have low power to identify associations, and in the validation of associations identified from genome-wide association studies.

Does this abstract indicate that the **mutation** is associated with the **gene/protein**?

O Yes

• No

The 5alpha-reductase type II A49T and V89L high-activity allelic variants are more common in men with prostate cancer compared with the general population. (PMID 16039774)

OBJECTIVES: To compare men with prostate disease with those from the general population regarding polymorphisms in the **androgen receptor** gene and in the 5alphareductase II (SRD5A2) gene. MATERIALS AND METHODS: The SRD5A2 polymorphisms **A49T**, V89L and R227Q, the **androgen receptor** CAG and GGN repeats and sex hormone status was investigated in men with prostate cancer (CaP) (n=89), benign prostate hyperplasia (n=45) and healthy military conscripts (n=223). RESULTS: The SRD5A2 high-activity allele variants **A49T** AT and V89L LL were more frequent in CaP-patients compared to general population, p=0.026 and p=0.05, respectively. CaP progression was, however, independent of SRD5A2 variants. In contrary, men with GGN<23 had a higher risk of dying from the disease than their counterparts with longer repeats. CONCLUSIONS: Men with CaP were more often genetically predisposed to a higher enzymatic activity in the turn over from T to DHT compared to the general population. In our population, **androgen receptor** genotype affected CaP outcome.

Does this abstract indicate that the **mutation** is associated with the **gene/protein**?

O Yes

• No

Suppression of PTEN function increases breast cancer chemotherapeutic drug resistance while conferring sensitivity to mTOR inhibitors. (PMID 18332865)

Ectopic expression of mutant forms of phosphatase and tensin homologue deleted on chromosome 10 (PTEN) lacking lipid (G129E) or lipid and protein (C124S) phosphatase activity decreased sensitivity of MCF-7 breast cancer cells, which have wild-type PTEN, to doxorubicin and increased sensitivity to the mammalian target of rapamycin (mTOR) inhibitor rapamycin. Cells transfected with a mutant PTEN gene lacking both lipid and protein phosphatase activities were more resistant to doxorubicin than cells transfected with the **PTEN** mutant lacking lipid phosphatase activity indicating that the protein phosphatase activity of **PTEN** was also important in controlling the sensitivity to doxorubicin, while no difference was observed between the lipid (G129E) and lipid and protein (C124S) phosphatase PTEN mutants in terms of sensitivity to rapamycin. A synergistic inhibitory interaction was observed when doxorubicin was combined with rapamycin in the phosphatase-deficient **PTEN**-transfected cells. Interference with the lipid phosphatase activity of **PTEN** was sufficient to activate Akt/mTOR/p70S6K signaling. These studies indicate that disruption of the normal activity of the PTEN phosphatase can have dramatic effects on the therapeutic sensitivity of breast cancer cells. Mutations in the key residues which control PTEN lipid and protein phosphatase may act as dominant-negative mutants to suppress endogenous PTEN and alter the sensitivity of breast cancer patients to chemo- and targeted therapies.

Does this abstract indicate that the mutation is associated with the gene/protein?

- Yes
- O No
- **O** Inconsistent annotation

Contribution of germline BRCA1 and BRCA2 sequence alterations to breast cancer in Northern India. (PMID 17018160)

BACKGROUND: A large number of distinct mutations in the BRCA1 and BRCA2 genes have been reported worldwide, but little is known regarding the role of these inherited susceptibility genes in breast cancer risk among Indian women. We investigated the distribution and the nature of BRCA1 and BRCA2 germline mutations and polymorphisms in a cohort of 204 Indian breast cancer patients and 140 age-matched controls. METHOD: Cases were selected with regard to early onset disease (< or =40 years) and family history of breast and ovarian cancer. Two hundred four breast cancer cases along with 140 age-matched controls were analyzed for mutations. All coding regions and exon-intron boundaries of the BRCA1 and BRCA2 genes were screened by heteroduplex analysis followed by direct sequencing of detected variants. RESULTS: In total, 18 genetic alterations were identified. Three deleterious frame-shift mutations (185delAG in exon 2; 4184del4 and 3596del4 in exon 11) were identified in BRCA1, along with one missense mutation (K1667R), one 5'UTR alteration (22C>G), three intronic variants (IVS10-12delG, IVS13+2T>C, IVS7+38T>C) and one silent substitution (5154C>T). Similarly three pathogenic protein-truncating mutations (6376insAA in exon 11, 8576insC in exon19, and 9999delA in exon 27) along with one missense mutation (A2951T), four intronic alterations (IVS2+90T>A, IVS7+75A>T, IVS8+56C>T, IVS25+58insG) and one silent substitution (1593A>G) were identified in BRCA2. Four previously reported polymorphisms (K1183R, S1613G, and M1652I in BRCA1, and 7470A>G in BRCA2) were detected in both controls and breast cancer patients. Rare BRCA1/2 sequence alterations were observed in 15 out of 105 (14.2%) early-onset cases without family history and 11.7% (4/34) breast cancer cases with family history. Of these, six were pathogenic protein truncating mutations. In addition, several variants of uncertain clinical significance were identified. Among these are two missense variants, one alteration of a consensus splice donor sequence, and a variant that potentially disrupts translational initiation. CONCLUSION: BRCA1 and BRCA2 mutations appear to account for a lower proportion of breast cancer patients at increased risk of harboring such mutations in Northern India (6/204, 2.9%) than has been reported in other populations. However, given the limited extent of reported family history among these patients, the observed mutation frequency is not dissimilar from that reported in other cohorts of early onset breast cancer patients. Several of the identified mutations are unique and novel to Indian patients.

Does this abstract indicate that the **mutation** is associated with the **gene/protein**?

• Yes

O No

Down-regulation of BRCA1-BARD1 ubiquitin ligase by CDK2. (PMID 15665273)

BRCA1, a breast and ovarian tumor suppressor, is a phosphoprotein whose cellular expression level is regulated in a cell cycle-dependent manner. BRCA1 interacts with BARD1 to generate significant ubiquitin ligase activity which catalyzes nontraditional Lys-6-linked polyubiquitin chains. However, it is not clear how the activity is regulated and how this affects BRCA1's multiple cellular functions. Here we show that the ubiquitin ligase activity of BRCA1-BARD1 is down-regulated by CDK2. During the cell cycle, BARD1 expression can largely be categorized into three patterns: moderately expressed in a predominantly unphosphorylated form in early G(1) phase, expressed at low levels in both phosphorylated and unphosphorylated forms during late G(1) and S phases, and highly expressed in its phosphorylated form during mitosis coinciding with BRCA1 expression. CDK2-cyclin A1/E1 and CDK1-cyclin B1 phosphorylate BARD1 on its NH(2) terminus in vivo and in vitro. Intriguingly, the BRCA1-BARD1-mediated in vivo ubiquitination of nucleophosmin/B23 (NPM) and autoubiquitination of BRCA1 are dramatically disrupted by coexpression of CDK2-cyclin A1/E1, but not by CDK1-cyclin B1. The inhibition of ubiquitin ligase activity is not due to the direct effect of the kinases on BARD1 because an unphosphorylatable mutant of BARD1, S148A/S251A/S288A/T299A, is still inhibited by CDK2-cyclin E1. Alternatively, BRCA1 and BARD1 are likely exported to the cytoplasm and their expressions are

remarkably reduced by CDK2-cyclin E1 coexpression. Recognizing the importance of cyclin E1 overexpression in breast cancer development, these results suggest a CDK2-BRCA1-NPM pathway that coordinately functions in cell growth and tumor progression pathways.

Does this abstract indicate that the **mutation** is associated with the **gene/protein**?

O Yes

• No