# **EVALLER:** a web server for *in silico* assessment of potential protein allergenicity

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#### ABSTRACT

Bioinformatics testing approaches for protein allergenicity, involving amino acid sequence comparisons, have evolved appreciably over the last several years to increased sophistication and performance. EVALLER, the web server presented in this article is based on our recently published 'Detection based on Filtered Length-adjusted Allergen Peptides' (DFLAP) algorithm, which affords in silico determination of potential protein allergenicity of high sensitivity and excellent specificity. To strengthen bioinformatics risk assessment in allergology EVALLER provides a comprehensive outline of its judgment on a query protein's potential allergenicity. Each such textual output incorporates a scoring figure, a confidence numeral of the assignment and information on high- or low-scoring matches to identified allergen-related motifs, including their respective location in accordingly derived allergens. The interface, built on a modified Perl Open Source package, enables dynamic and color-coded graphic representation of key parts of the output. Moreover, pertinent details can be examined in great detail through zoomed views. The server can be accessed at http://bioinformatics. bmc.uu.se/evaller.html.

#### INTRODUCTION

Allergy, including food allergy, is a major and increasing ailment (1). The disease is strictly associated with atopy, i.e. a genetic predisposition to develop allergic immune reactions to otherwise innocuous components, generally

proteins. Several forms of this disorder are described and a major one is designated IgE-mediated allergy, also known as hypersensitivity type I (2). This disease involves reactions to a variety of aerial proteins typically occurring in tree, grass and weed pollen as well as proteins present in a wide range of foods. Animal dander and insect venoms can also cause disease reactions (3). The establishment of allergy consists of two separate phases: sensitation and triggering, i.e. education of the immune system and the actual reaction(s), respectively. The former part involves maturation of naïve T- and B-cells into immunocompetent effector cells, as dictated by a series of complex cellular interactions (4,5). The type-2 helper T-lymphocyte ( $T_H2$ ) has a key function in this process, since it preferentially promotes class switch to IgE-expression. Moreover, a variety of regulatory T-cell subsets play an essential function in the orchestration of an immunological educational procedure (6,7). IgE immunoglobulins can readily bind to high-affinity receptors on tissue mast cells or basophilic granulocytes. The triggering phase is commenced by renewed contact with the antigen, involving binding to cell-anchored IgE molecules and an accordingly elicited release of inflammatory substances, causing anyone or several among a range of symptoms (8–10). Asthma, rhinitis, rhinoconjunctivitis, eczema, contact dermatitis, angioedema and abdominal pain are common allergic reactions, but anaphylactic shock—entailed to impaired respiratory and circulatory function—can also follow.

A sensitized individual may also respond similarly to substances that share certain structural features with the molecule that elicited the initial immune reaction (11–13). This phenomenon, designated cross-reactivity, is tightly connected to the epitopes, i.e. parts of an allergenic protein that are recognized by immunoglobulins—particularly IgE—or receptors present on

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T-lymphocytes. Broadly defined, such cross-reactivity can engage either IgE- or T-cell epitopes, but that involving IgE-binding (generally referred to as B-cell crossreactivity) is much better understood (14-16). IgE epitopes can occur either as uninterrupted segments of amino acid residues (continuous epitopes) or distributed as patches on the protein (discontinuous epitopes), the latter sort being brought into juxtaposition in a native (folded) protein configuration. Some common examples of IgE-type cross-reactivity are the pollen-fruit and the latexfruit syndromes, both categories being associated with promiscuous IgE recognition due to protein structural similarity across species (12,17,18). This phenomenon typically, but not necessarily, occurs between protein allergens from phylogenetically related species (3,19,20). Moreover, a relatively high degree of identity at the amino acid sequence level is commonly seen between IgE crossreactive proteins (21). Nonetheless, high levels of homology without conservation of allergenicity and low degree of sequence similarity with conservation of the offending property are also reported (20,22).

The complex mechanisms involved in allergy have prompted for several inherently different methods to safely conclude on potential protein allergenicity. Major schemes suggest a tiered set of tests involving amino acid sequence comparison (simple bioinformatics) as well as several in vitro and in vivo assays (23,24). Notably, bioinformatics-type inspection represents a key prescription for allergenicity testing in the subsequently adopted Codex Alimentarius guideline on safety assessment of genetically modified foods and that of the European Food Safety Authority (EFSA) (25,26). The Codex Alimentarius bioinformatics testing scheme, being an early computational design, is built to recognize both general homology-type similarity (to known allergens) and B-cell epitopes; T-cell counterparts may, though, be outside the remit of this allergenicity assessment (25). Intricate relationships between amino acid sequence similarity of query proteins to known allergens and their type-I hypersensitivity potential have, however, spurred further development within this field of risk assessment. Dedicated comparison approaches in conjunction with statistical learning algorithms have enabled increasing overall performance of computational assessment methodology (27-32).

Over the last decade, a variety of Internet-based bioinformatics testing tools for protein potential allergenicity have been developed (31–35). Recently, we reported an *in silico* method for evaluation of potential protein allergenicity, designated 'Detection based on Filtered Length-adjusted Allergen Peptides' (DFLAP) (30). This system is founded on a novel principle, which involves two main features: First, a flexible peptide-selection procedure from allergens, as accomplished by comparing allergens with presumed non-allergens, and secondly, specific education of an support vector machine (SVM) to which a query amino acid sequence can be presented.

In this article, we present EVALLER, a web serverbased on a DFLAP core algorithm and an intuitive interface that allows for expedient interrogation of query amino acid sequences, occurring in FASTA format. Subsequent to processing by the DFLAP machine EVALLER returns an assessment of its potential allergenicity, viewed as a rather comprehensive textual and graphical output. EVALLER should be feasible for scanning purposes and as a key part of an integrated allergenicity assessment procedure.

#### MATERIALS AND METHODS

#### EVALLER is based on the DFLAP algorithm

The EVALLER server is built as a Perl front end on top of a DFLAP original core, which is implemented in MATLAB. Briefly, the DFLAP algorithm was allowed to construct a set of 'Filtered Length-adjusted Allergen Peptides' (FLAPs), derived by extraction from an allergen database through a process involving comparison with a data set (largely compiled from the human proteome) holding proteins with low probability of being allergenic. Selection criteria for both data sets are described elsewhere (30). Amino acid sequences of both allergenic and presumably non-allergenic proteins were subsequently compared with the accordingly extracted FLAPs. Based on the resulting similarity score values for each protein, an SVM was ultimately educated to decide whether a query protein is sufficiently akin to any FLAP to be assigned as an allergen. The allergen data set (762 amino acid sequences), the non-allergen set for FLAP extraction, (52081 amino acid sequences) and that of presumable non-allergens for DFLAP training (1524 amino acid sequences) were identical to those reported in our earlier study (30). This also applies to DFLAP parameter settings in EVALLER (minimal peptide length  $l_{\min} = 22$ , FLAP threshold = 48, number of FLAP matches n = 4 and the cost parameter C = 100 in SVM). For details on these parameters and on the algorithm, see Soeria-Atmadja et al. (30). In its present configuration, EVALLER permits updates of both data and system. Nonetheless, efforts are underway to confer enhanced technical simplicity to this function.

#### **EVALLER** assignment uncertainty

A decision statistic, DFLAP score, being an output parameter by SVM algorithm of DFLAP, assigns a query protein as either presumably an allergen or presumably not an allergen depending on whether the aforementioned number is positive or negative. A confidence measure accompanies each risk assessment in order to inform the user on EVALLER's uncertainty regarding assignments. This measure is derived from decision statistics of a test set (not used in the design procedure) holding both allergens and presumed nonallergens. While we needed to hold some data outside the design procedure a DFLAP system was trained using two sets encompassing 500 allergens and 1000 presumed nonallergens, respectively, employed in our earlier published report (30), of which the latter data set was created by random sampling from Swiss-Prot. To achieve minimal incorporation of spurious entries into the non-allergen set, amino acid sequences shorter than 50 amino acid residues

or with high sequence similarity to any of the allergens were dismissed. Compliance with the last criterion was accomplished by alignment, allowing a maximum Smith-Waterman score of 100 to be considered as a presumed non-allergen. An identical procedure was applied to compiling a test set of 1000 presumed non-allergens. These test examples are, however, easily assigned as presumable non-allergens by DFLAP. Therefore, additional examples of this category, which are more difficult to assess, were also included (104 vertebrate tropomyosins, 39 animal profilins and 14 mammalian parvalbumins). Of the total 762 allergens the remaining 262 allergens, set apart from the design procedure, were used to estimate decision statistics typical for allergens (all sequence data sets are publicly available on the EVALLER server, under 'Supplementary Data'). Thus, decision statistics for 1157 (1000+157) presumed nonallergens and 262 allergens were estimated, using the accordingly designed DFLAP system. Uncertainty scores (US) are differently defined for allergen assignments (i.e. the decision statistic DFLAP score > 0), relative to those of presumed non-allergens (i.e. the decision statistic DFLAP score < 0). Both definitions are specified as the uncertainty, given that the DFLAP score served as a decision threshold instead of zero. In the former (allergen) case, the uncertainty score reflects the probability of false alarms (1-specificity), whereas the probability of overlooking an allergen (1-sensitivity) applies to the latter (non-allergen) situation:

### if DFLAPscore > 0; US(DFLAPscore) = $\frac{FP(DFLAPscore)}{TN(DFLAPscore)+FP(DFLAPscore)}$ 1

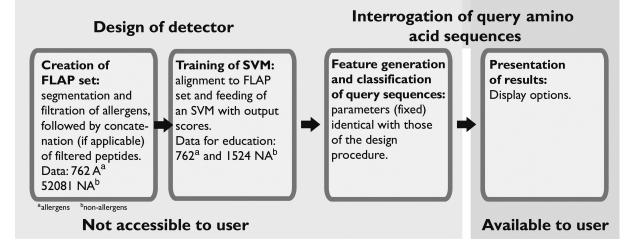
If DFLAPscore <0; US(DFLAPscore) =  $\frac{FN(DFLAPscore)}{TP(DFLAPscore) + FN(DFLAPscore)}$  FN(DFLAP score) and TP(DFLAP score) are numbers of misclassified and correctly assigned allergens, respectively, when test statistic DFLAP score is used as a decision threshold. Analogously, FP(DFLAP score) and TN(DFLAP score) are the numbers of incorrect/correct assignments of presumed non-allergens, when DFLAP score applies as a decision threshold.

#### **RESULTS AND DISCUSSION**

#### **EVALLER** web server

EVALLER was developed to enable bioinformatics assessment of protein potential allergenicity by virtue of the corresponding amino acid sequences. In its present design, protein sequences occurring in FASTA format are accepted. The interrogation procedure, involving submission of a query amino acid sequence (one at a time), allows for user-defined options regarding presentation of results; a range of top-scoring matches and resizable views of the test sequence and matching peptides (Figure 1). Detector design and classification of the test sequence are, however, not available to the user since parameters involved in these procedures have already been optimized (30).

As outlined in 'Material and Methods' section, the EVALLER decision statistic for allergenic potential has been split into two separate categories: 'presumably not an allergen' and 'presumably an allergen'. An uncertainty score, indicating the confidence level of EVALLER, is also presented. It is based on the decision statistics from interrogation of a reduced DFLAP, i.e. 262 allergens and 1157 presumed non-allergens (see 'Material and Methods' section). An uncertainty score for a negative (presumably a non-allergen) decision statistic, DFLAP score, represents the probability of neglecting an allergen, assuming that the decision threshold had been set at the DFLAP score instead of zero. Analogously, an uncertainty score based on a positive (presumably an allergen) DFLAP score indicates the probability of false alarm, on the assumption that the DFLAP score is identical to the decision threshold. Uncertainty score numbers decrease with increased distance of the DFLAP score to the



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Figure 1. Flow-chart outlining procedural steps to arrive at the algorithmic core of EVALLER and functions available to the user.

decision threshold, which is zero (Figure 2). Notably, EVALLER is much more confident in its assignment to the 'presumably an allergen' category than that of nonallergens. The uncertainty scores are estimated for a reduced DFLAP (educated with 500 allergens and 1000 presumed non-allergens) rather than for the final DFLAP that EVALLER is based upon (762 allergens and 1524 presumed non-allergens), and may therefore be overly conservative. For clarity, the textual assignment output has been color-coded as determined by category (Figure 3). Green color indicates low allergenic potential whereas red corresponds to a presumable allergen, as judged by EVALLER.

A 2D graphic representation of the scanned sequence, alongside with a color-coded printout (according to the aforementioned assignment scheme) of best matching FLAPs, are presented to the user by virtue of a modified version of the Perl open source package EBioForms (unpublished). The display is dynamic and can be zoomed for detailed views of specific parts of the sequence (Figure 3). Apart from presumed allergen/presumed non-allergen assignment, being integrated in the aforementioned view, EVALLER also provides information on FLAP (see 'Materials and Methods' section) to which similarity is identified (Figure 3). Moreover, a link to the UniProt of the cognate allergen accompanies each FLAP. The server and related information is available at the following Internet address: http://bioinformatics. bmc.uu.se/evaller.html.

### Benchmarking EVALLER with calcium-binding proteins; comparison with other web servers

The EVALLER core algorithm has been extensively validated for sensitivity and false-alarm rates, using test sets of amino acid sequences (30). Nonetheless, several

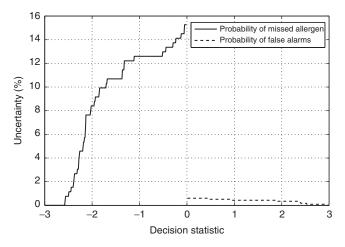


Figure 2. Graph depicting the level of uncertainty depending on the decision statistic obtained from EVALLER assignment. The uncertainty is defined as the probability of an erroneous assessment assuming the decision threshold is set at the decision statistic instead of zero. Under this condition, the solid line illustrates the probability of neglecting an allergen when EVALLER assigns an amino acid sequence as a presumable non-allergen. The dashed curve illustrates the probability of obtaining a false alarm when EVALLER assigns an amino acid sequence as a presumable allergen.

potential allergens of the polcalcin family of proteins, being members of a widely known protein family involved in pollen-pollen cross-sensitization (36), were not included in those evaluations and may therefore qualify as feasible for a simple test of EVALLER performance. Polcalcins hold two EF-hand calcium-binding domains and typically show high intra-family sequence similarity (37). Presumable non-allergenic homologues to the polcalcin family include the calmodulins and calmodulin-like proteins, as well as other related calcium-binding proteins. An assembly of these proteins, derived from both plant and animal kingdoms, were mined from UniProt and interrogated for potential allergenicity by EVALLER as well as by two additional web servers-Allermatch and APPEL-dedicated to assessment of potential allergenicity (32,34). The former of these already reported methods is designed to apply bioinformatics testing principles outlined by the Codex Alimentarius Commission, i.e. either >35% identity in a segment of 80 amino acid residues (criterion 1) alone or in conjunction with an exact match in stepwise searches for continuous identical sequence segments (criterion 2), whereas the latter implementation derives an assessment from sequence-derived structural and physicochemical properties in combination with an SVM (25,32,34). The EVALLER and APPEL servers assigned all calmodulins or calmodulin-like proteins as presumably non-allergenic, whereas a traditional alignment approach (35% similarity over 80 amino acid segments) gives preference to resemblance of input proteins to known allergens (Table 1). Although EVALLER and Allermatch differ in assignment on (presumably non-allergen) query proteins, both methods identified peptides (or entire amino acid sequences) in allergen polcalcins as best matches. In two cases, however, EVALLER reported differently. The topscoring FLAP hits for calcium-binding protein-5 (bovine and human) are derived from a troponin-like protein occurring in the fish parasite Anisakis simplex. This protein, however, also contains EF-hand Ca<sup>2+</sup> binding motifs, typical of polcalcins, which confers reason to its identification by the EVALLER algorithm (38). Furthermore, to probe for sensitivity of the aforementioned web servers, three polcalcins-neither of them incorporated in the EVALLER system-were submitted for interrogation. Two of them occur in tobacco and one (Syr v 3) in lilac (Table I). The Allermatch database already holds these potential allergens, thereby easily finding perfect matches. Both EVALLER and APPEL, though, assigned Syr v 3 as presumably allergenic, a conclusion supported by a recent report (39). The two tobacco polcalcins were also recognized as potential allergens. For the time being, though, these proteins are devoid of documentation on allergenicity in the scientific literature. Although scored as allergens by EVALLER and the two additional bioinformatics testing tools referred to above, further interrogation is needed to arrive at a scientifically justified conclusion on the allergenicity of the three polcalcin proteins. For this purpose, immunoassay analysis, involving reactivity measurement of IgE antibodies in the sera of patients with clinically validated allergic responses to other polcalcins

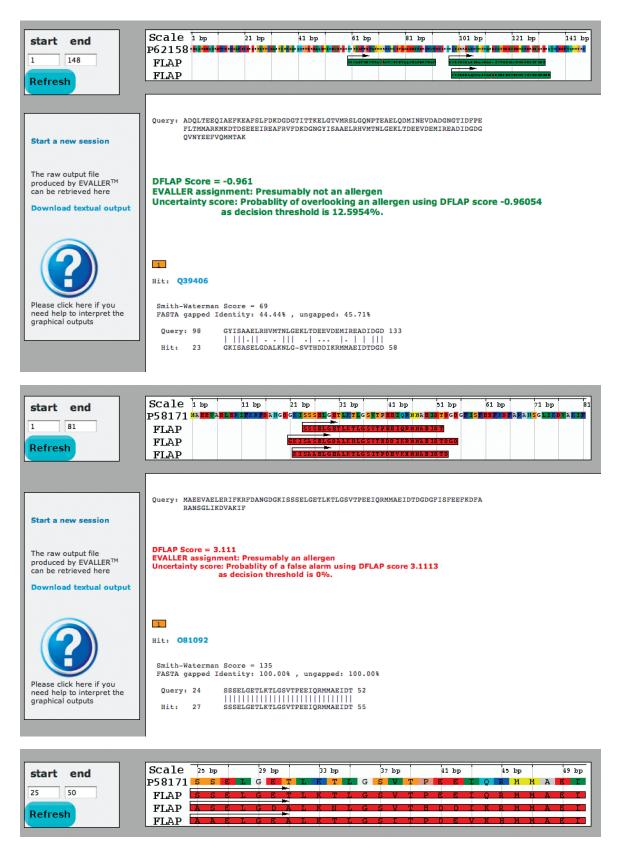


Figure 3. Snapshots of the EVALLER output page subsequent to assessment of potential allergenicity for amino acid sequences. Colored (green or red) bars indicate FLAPs, being part of a data set generated by a filtration process as particular for allergenic proteins. The presumably non-allergenic human calmodulin (A) as well as the likely allergenic polcalcin (Syr v 3) from lilac (B). A zoomed-in view focusing between amino residues at position 25 and 50 of the presumed allergen Syr v 3 is also shown (C).

	EVALLER		Allermatch	h <sup>a</sup>	APPEL <sup>b</sup>	
Query protein	Assignment <sup>c</sup> (%)	Best hit	Assignment <sup>d</sup> (%)	Best hit	Assignment	Best hit
Wheat calmodulin	Not an allergen (13)	Bra n 2	Allergen (45)	Jun o 4	Non-allergen	NA
Rice calmodulin	Not an allergen (13)	Bra n 2	Allergen (43)	Jun o 4	Non-allergen	NA
Rape calmodulin	Not an allergen (13)	Bra n 2	Allergen (46)	Jun o 4	Non-allergen	NA
Mouse calmodulin	Not an allergen (13)	Bra n 2	Allergen (43)	Jun o 4	Non-allergen	NA
Human CaBP5	Not an allergen (9)	Ani s Troponin	Allergen (36)	Cyn d 7	Non-allergen	NA
Human calmodulin-like	Not an allergen (13)	Bran 2	Allergen (45)	Che a 3	Non-allergen	NA
Human calmodulin	Not an allergen (13)	Bra n 2	Allergen (43)	Jun o 4	Non-allergen	NA
Bovin CaBP5	Not an allergen (9)	Ani s Troponin	Allergen (35)	Cyn d 7	Non-allergen	NA
Banana calmodulin-like	Not an allergen (13)	Bran 2	Allergen (46)	Jun o 4	Non-allergen	NA
Arabidopsis calmodulin-like	Not an allergen (13)	Bet v 4	Allergen (44)	Che a 3	Non-allergen	NA
Apple calmodulin	Not an allergen (13)	Bra n 2	Allergen (45)	Jun o 4	Non-allergen	NA
Tobacco polcalcin 1	Allergen (0.3)	Ole e 3	Allergen (100)	Self	Allergen	NA
Tobacco polcalcin 2	Aallergen (0.3)	Ole e 3	Allergen (100)	Self	Allergen	NA
Lilac polcalcin (Syr v 3)	Allergen (0)	Bet v 4	Allergen (100)	Self	Allergen	NA

<b>Table I.</b> Web server benchmarking with calcium binding proteins	Table I.	Web	server	benchmarking	with	calcium	binding	proteins
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<sup>a</sup>http://www.allermatch.org/

<sup>b</sup>http://jing.cz3.nus.edu.sg/cgi-bin/APPEL

<sup>c</sup>The percentage indicates an uncertainty score for the assignment. (See 'Material and Methods' section for details.)

<sup>d</sup>The percentage indicates the sequence identity of the best 80-mer match, as revealed by alignment (decision threshold is 35%). This is one of the two criteria for bioinformatics assessment of potential allergenicity, as appearing in the *Codex Alimentarius* guidelines, the other one being scanning for presence of short identical peptide matches.

should apply (25). Other tests, such as resistance to pepsin digestion under appropriate conditions, may further improve assessment accuracy (25,40).

## EVALLER in the context of various approaches to bioinformatics-type risk assessment of protein potential allergenicity

Most of the hitherto accumulated literature on bioinformatics protein allergenicity assessment can be assorted into any of the following several categories: straightforward alignment (e.g. the *Codex* two-part procedure), alignment-based feature-extraction combined with statistical learning, methods based on comparison to either allergen-derived motifs or reported IgE epitopes and, lastly, similarity search of entire proteins as represented by a variety of coding protocols (27,28,32,41–46). Moreover, by bringing a special kind of segment-reduction procedure into action on allergens, the alignment/statistical learning model has been considerably enhanced (29,30). Hence, EVALLER-built on a DFLAP core-exploits on a tripartite procedure, including a highly specialized filtration of peptides from allergens involving usage of the human proteome, to create material, which permits efficient education of an SVM algorithm. Each output, in response to query submission, is accompanied by an uncertainty numeral, which allows the user to appraise assignment accuracy. Additionally, parts of the query proteins deemed most akin to cognate segments in any or several among the local repository of allergens, are depicted and made available to users of EVALLER in several ways, which altogether support risk assessment.

#### SUPPLEMENTARY DATA

Supplementary data are available at NAR Online.

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