**Advanced Programming** 

- Today's Agenda
  - √ Goals
  - √ Structure
  - ✓ Implementation Details
    - → Functions (Monadic/Dyadic)
    - → Operators (Dyadic)
    - → Exercises
- Future Improvements

#### Goals

- APL is an interactive language, strongly orientated to mathematical concerns, offering a large range of operations over arrays (i.e., tensors).
- Functions can be of 3 types: Niladic, Monadic and Dyadic.
- Provide a CLisp implementation for APL, using CLisp syntax and semantic.

• <u>Structure</u> (1/6)

- As said before, APL arrays are tensors.
- Tensors can be divided in scalars, vectors, matrixes and >2D arrays.
- Implementation-wise, we specified tensors and scalars.

• <u>Structure</u> (2/6) (defclass tensor () ((<u>values</u> :initarg :values 1D array :reader tensor-values) (<u>rank</u> :initarg :rank :reader tensor-rank) (<u>shape</u> :initarg :shape (defclass scalar (tensor) ()) :reader tensor-shape) (<u>size</u> :initarg :size

:reader tensor-size)))

• <u>Structure</u> (3/6)

```
(defun s (arg)
  "Function that constructs a scalar with the given argument."
  (tensor-construct 'scalar (make-array 1 :initial-contents (list arg)) ∅ '() 1))
(defun v (&rest args)
  "Function that constructs a vector with the given arguments."
  (let* ((values (if (listp (first args)) (first args) args))
          (s (list-length values))
          (shape (list s)))
       (tensor-construct 'tensor (make-array shape :initial-contents values) 1
shape s)))
```

• <u>Structure</u> (4/6)

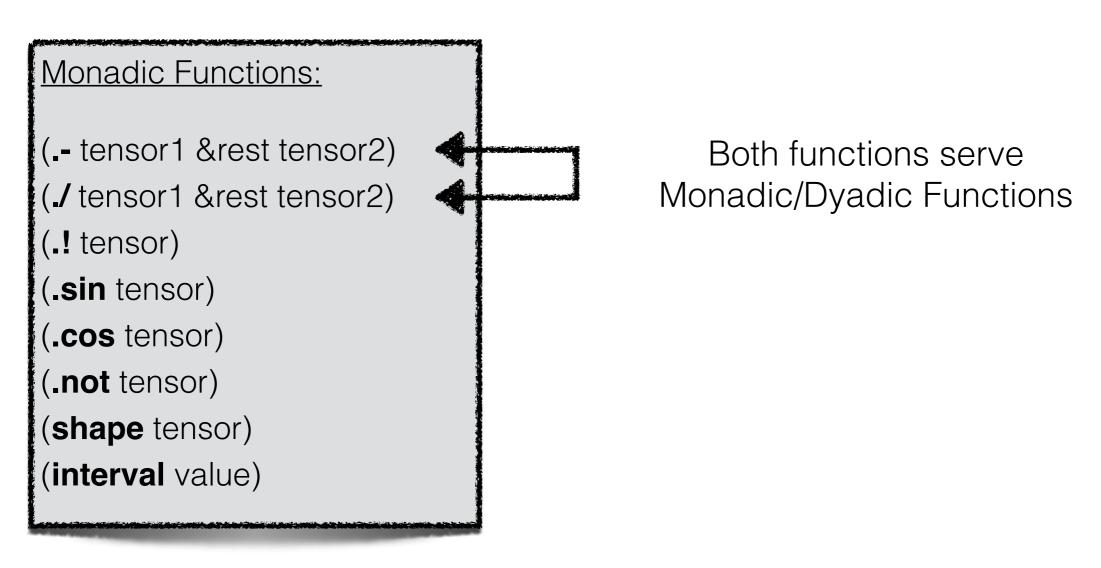
• <u>Structure</u> (5/6)

```
(defgeneric tensor-apply-dyadic (function tensor1 tensor2))
    (defmethod tensor-apply-dyadic (function (tensor1 tensor) (tensor2 tensor))
        (assert (and (eq (tensor-rank tensor1) (tensor-rank tensor2))
                          (equal (tensor-shape tensor1) (tensor-shape tensor2)))
                   (tensor1 tensor2)
                   "ERROR: The given tensors do not have the same rank nor shape")
        (tensor-apply function tensor1 tensor2))
    (defmethod tensor-apply-dyadic (function (tensor1 scalar) (tensor2 tensor))
        (tensor-apply function (reshape (shape tensor2) tensor1) tensor2))
    (defmethod tensor-apply-dyadic (function (tensor1 tensor) (tensor2 scalar))
        (tensor-apply function tensor1 (reshape (shape tensor1) tensor2)))
```

• <u>Structure</u> (6/6)

```
(defmethod print-object ((object tensor) stream)
   "Specialization to tensors of the generic function Print-Object.
    Prints the given tensors according to the rules of dimensions, etc."
    (labels (
        (can-print? (shape indexes)
            (if (null indexes)
                (and (eql (- (car shape) 1) (car indexes))
                     (can-print? (cdr shape) (cdr indexes)))))
       (tensor-print (stream object position shape indexes)
           (let ((cur-dimension (list-length shape))
                  (cur-dimension-value (first shape)))
                (if (eq shape nil)
                    (progn
                        (format stream "~a" (aref (tensor-values object) position))
                        (unless (can-print? (last (tensor-shape object)) (last indexes))
                            (format stream " "))
                        (incf position))
                    (progn
                        (dotimes (dim cur-dimension-value)
                            (setf position (tensor-print stream object position (cdr shape) (append indexes (list dim)))))
                        (unless (can-print? (tensor-shape object) indexes)
                            (format stream "~%"))))
           position)))
    (tensor-print stream object 0 (tensor-shape object) '())))
```

Implementation Details - Monadic Functions (1/4)



Implementation Details - Monadic Functions (2/4)

```
(defgeneric .- (tensor1 &optional tensor2))
    (defmethod .- (tensor1 &optional tensor2)
          "Specialization of the generic function .- that decides what function to call, taking into account
          the number of given arguments."
         (if (eq tensor2 nil)
               (tensor-apply #'- tensor1)
               (tensor-apply-dyadic #'- tensor1 tensor2)))
    (defgeneric ./ (tensor1 &optional tensor2))
    (defmethod ./ (tensor1 &optional tensor2)
          "Specialization of the generic function ./ that decides what function to call, taking into account
          the number of given arguments."
         (if (eq tensor2 nil)
               (tensor-apply #'(lambda (n) (/ 1 n)) tensor1)
               (tensor-apply-dyadic #'/ tensor1 tensor2)))
```

Implementation Details - Monadic Functions (3/4)

```
(defun .! (tensor) (tensor-apply #'! tensor))
(defun .sin (tensor) (tensor-apply #'sin tensor))
(defun .cos (tensor) (tensor-apply #'cos tensor))
(defun .not (tensor) (tensor-apply #'(lambda (n) (if (eq n 0) 1 0)) tensor))
(defun shape (tensor) (v (tensor-shape tensor)))
```

Implementation Details - Monadic Functions (4/4)

```
(defun interval (value)
  "Monadic function that given an integer, returns a new vector
containing all the integer elements from zero up to the integer."
  (iota (s value)))
(defun iota (scalar)
  (let ((iota-lst '()))
     (dotimes (n (aref (tensor-values scalar) ∅))
         (setf iota-lst (append iota-lst (list (+ n 1)))))
  (v iota-lst)))
```

Implementation Details - Dyadic Functions (1/12)

#### **Dyadic Functions:** (.+ tensor1 tensor2) (.\* tensor1 tensor2) ( # tensor1 tensor2) (.% tensor1 tensor2) (.< tensor1 tensor2) (.> tensor1 tensor2) (.<= tensor1 tensor2) (.>= tensor1 tensor2) (.= tensor1 tensor2) (.or tensor1 tensor2) (.and tensor1 tensor2)

```
(more)
(reshape tensor1 tensor2)
(select tensor1 tensor2)
(drop tensor1 tensor2)
(catenate tensor1 tensor2)
(member? tensor1 tensor2)
```

Implementation Details - Dyadic Functions (2/12)

```
(defun .+ (tensor1 tensor2)
  "Dyadic function that given two tensors, returns a new tensor
resulting from applying the sum to each of their elements."
 (tensor-apply-dyadic #'+ tensor1 tensor2))
(defun .< (tensor1 tensor2)</pre>
 "Dyadic function that given two tensors, returns a new tensor
resulting from applying the less than relation to each of their
elements."
 (tensor-convert-to-int (tensor-apply-dyadic #'< tensor1 tensor2)))</pre>
```

Implementation Details - Dyadic Functions (3/12)

```
(defun .or (tensor1 tensor2)
 "Dyadic function that given two tensors, returns a new tensor resulting
from applying the logical disjunction to each of their elements."
 (tensor-convert-to-int (tensor-apply-dyadic #'(lambda (v1 v2) (or v1 v2))
(tensor-convert-to-bool tensor1) (tensor-convert-to-bool tensor2))))
(defun .and (tensor1 tensor2)
 "Dyadic function that given two tensors, returns a new tensor resulting
from applying the logical conjunction to each of their elements."
 (tensor-convert-to-int (tensor-apply-dyadic #'(lambda (v1 v2) (and v1
v2)) (tensor-convert-to-bool tensor1) (tensor-convert-to-bool tensor2))))
```

Implementation Details - Dyadic Functions (4/12)

```
(defun reshape (tensor1 tensor2)
   "Dyadic function that given two tensors, returns a new tensor whose shape is the one given
in the 1st argument and contents are the ones from the 2nd argument."
  (let* ((shape (array-to-list (tensor-values tensor1)))
          (size-tensor1 (reduce #'* shape))
          (result-tensor (tensor-construct-simple 'tensor (length shape) shape size-tensor1))
          (tensor2-size (tensor-size tensor2)))
        (dotimes (position size-tensor1)
             (setf (aref (tensor-values result-tensor) position)
                   (aref (tensor-values tensor2) (rem position tensor2-size))))
  result-tensor))
```

Implementation Details - Dyadic Functions (5/12)

```
(defun member? (tensor1 tensor2)
  "Dyadic function that given two tensors, returns a new tensor resulting from
testing if each element of 1st tensor is present somewhere on the 2nd tensor."
  (let ((result-tensor (tensor-copy-simple tensor1)))
      (dotimes (position (tensor-size tensor1))
           (if (> (reduce #'+ (tensor-values (.= (s (aref (tensor-values
tensor1) position)) tensor2))) ∅)
               (setf (aref (tensor-values result-tensor) position) 1)
               (setf (aref (tensor-values result-tensor) position) ∅)))
  result-tensor))
```

• Implementation Details - Dyadic Functions (6/12)

```
(SELECT)

1st step: Calculate new Shape
    - Keep rank-1 dimensions and concatenate the sum of '1's in 1st Tensor.

2nd step: Transform tensor (array) into list.

3rd step: Apply recursion (constructs a new list)
    - When in last dimension (columns), only add values to list whose position in 1st tensor is 1.
```

Implementation Details - Dyadic Functions (7/12)

Implementation Details - Dyadic Functions (8/12)

```
(defgeneric catenate (tensor1 tensor2))
  (defmethod catenate ((tensor1 scalar) (tensor2 scalar))
        (v (aref (tensor-values tensor1) 0) (aref (tensor-values tensor2) 0)))

  (defmethod catenate ((tensor1 tensor) (tensor2 scalar))
        (catenate tensor1 (reshape (v (append (array-to-list (tensor-values (drop (s -1) (shape tensor1)))) (list 1))) tensor2)))

        (defmethod catenate ((tensor1 scalar) (tensor2 tensor))
            (catenate (reshape (v (append (array-to-list (tensor-values (drop (s -1) (shape tensor2)))) (list 1))) tensor1) tensor2))

        (defgeneric catenate (tensor1 tensor2))
```

Implementation Details - Dyadic Functions (9/12)

# (CATENATE) 1st step: Test rank (difference between the two must be 0 or 1) 2nd step: Know which tensor is smaller, if they do not have the same rank. 3rd step: If there's a smaller tensor, reshape the smaller tensor with the concatenation of its shape and a 1. 4th step: Calculate shape of resulting tensor (concatenation of rank-1 dimensions with the sum of last dimensions of both tensors). 5th step: Convert arrays to lists.

-If on last dimension, add to sub-list the corresponding sublist of the tensor which is being concatenated.

6th step: Apply recursion (constructs a new list)

7th step: Transform resulting list into array and create new Tensor with new Shape and new Values.

Implementation Details - Dyadic Functions (10/12)

```
(CATENATE - Example)
              t1
> (catenate (v 1 1) (reshape (v 2 2) (s 2)))
1st step: (rank t1: 1; rank t2: 2)
2nd step: (diff ranks: 1) -> (smaller tensor: t1)
3rd step: (shape_t1: (2)) -> (modifiedShape_t1: (2 1)) -> (smaller_tensor: (reshape (v 2 1) (v 1 1))
4th step: (shape_smaller: (2 1)); (shape_t2: (2 2)) -> (resulting_shape: (2 3))
5th step: (smaller_tensor: ((1) (1))); (tensor2: ((2 2) (2 2)))
6th step: (resulting_list: ((1 2 2) (1 2 2)))
7th step: [1 2 2 1 2 2]
```

Implementation Details - Dyadic Functions (11/12)

(DROP)

1st step: Calculate new Shape

- If shape given in 1st tensor is smaller than 2nd tensor shape, fill the remaining dimensions with 0's. Then, subtract this filled shape to original shape.

2nd step: Transform tensor (array) into list.

3rd step: Apply recursion (constructs a new list)

- Iterate as many times as the number of elements of tensor 1, applying recursion with increasing depth (increases at each iteration).
  - •If n-elements > 0, add the rest of the sub-list.
  - •If n-elements < 0, add n-times the first elements of the sub-list.
  - •If n-elements = 0, maintains the original sub-list.

4th step: Transform resulting list into array and create new Tensor with new Shape and new Values.

Implementation Details - Dyadic Functions (12/12)

Implementation Details - Monadic Operators (1/3)

Monadic Operators:

(**fold** function)

(scan function)

(outer-product function)

Implementation Details - Monadic Operators (2/3)

```
(defun fold (function)
    "Monadic operator that given a function, returns another function that applies the given one to successive
elements of a given vector."
    #'(lambda (tensor)
          (reduce function (map 'array #'s (tensor-values tensor)))))
(defun scan (function)
    "Monadic operator that given a function, returns another function that applies the given one to
increasingly larger subsets of the elements of the given vector."
    #'(lambda (tensor)
          (let ((result-list '())
                (scalar-tensor (map 'array #'s (tensor-values tensor))))
                (dotimes (position (tensor-size tensor))
                      (setf result-list (append result-list (list (aref (tensor-values (reduce function scalar-
tensor :start ∅ :end (+ position 1))) ∅)))))
          (v result-list))))
```

Implementation Details - Monadic Operators (3/3)

```
(defun outer-product (function)
  "Monadic operator that given a function, returns another function that applies the given one to all
combinations of elements of the given tensors."
  #'(lambda (tensor1 tensor2)
        (let ((shape (append (tensor-shape tensor1) (tensor-shape tensor2)))
                (scalar-tensor (tensor-construct 'tensor (map 'array #'s (tensor-values tensor1))
(tensor-rank tensor1) (tensor-shape tensor1) (tensor-size tensor1)))
                (result-list '()))
                (dotimes (position (tensor-size tensor1))
                   (setf result-list (append result-list (array-to-list (tensor-values (apply function
(list (aref (tensor-values scalar-tensor) position) tensor2)))))))
        (tensor-construct 'tensor (list-to-array result-list) (list-length shape) shape (reduce #'*
shape)))))
```

• Implementation Details - Exercises (1/2)

```
(defun tally (tensor)
   "Function that given a tensor, returns a scalar with the number of elements of the given tensor."
   (funcall (fold #'*) (shape tensor)))
(defun rank (tensor)
   "Function that given a tensor, returns a scalar with the number of dimensions of the given tensor."
   (funcall (fold \#'+) (.>= (shape tensor) (s \emptyset))))
(defun within (tensor scalar1 scalar2)
   "Function that given a tensor and two scalars, returns a vector containing only the elements of the
given tensor that are in the range between scalar1 and scalar2."
   (select (.and (.>= tensor scalar1) (.<= tensor scalar2)) tensor))
(defun ravel (tensor)
   "Function that given a tensor, returns a vector containing all the elements of the given tensor."
   (reshape (tally tensor) tensor))
```

Implementation Details - Exercises (2/2)

Future Improvements

- Implement inner-product.
- Increase performance, by reducing the number of inner-structure conversions.

# Thank you!