z/OS 2.5

IBM Z Deep Neural Network Library Programming Guide and Reference





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Contents

Figures	VİÌ
Tables	ix
About this information	xi
How to send your comments to IBM	xiii
If you have a technical problem	
Summary of changes	xv
Summary of changes for z/OS 2.5	XV
Part 1. IBM Z Deep Neural Network library	1
Chapter 1. Using the IBM Z Deep Neural Network Library	
zDNN application environment	
Common data types and structures	
zDNN version information	
zDNN tensor	
zDNN tensor descriptorzDNN data layouts	
zDNN data tayoutszDNN data formats	
zDNN data typesz	
zDNN statuses	
zDNN runtime environment variables	
Chapter 2. zDNN API reference	11
Support functions	11
Initialization (zdnn_init)	11
Query functions	12
Get size (zdnn_getsize_ztensor)	
Initialize pre-transformed tensor descriptor (zdnn_init_pre_transformed_desc)	
Generate transformed tensor descriptor (zdnn_generate_transformed_desc)	
(zdnn_generate_transformed_desc_concatenated)	
Initialize zTensor (zdnn_init_ztensor)	
Initialize zTensor with memory allocate (zdnn_init_ztensor_with_malloc)	
Reset zTensor (zdnn_reset_ztensor)	
Allocate memory for zTensor (zdnn_allochelper_ztensor)	
Deallocate memory for zTensor (zdnn_free_ztensor_buffer)	
Reshape zTensor (zdnn_reshape_ztensor)	
Check whether version is runnable (zdnn_is_version_runnable)	∠⊃ 2∄
Get maximum runnable version (zdnn_get_max_runnable_version)	
Data transformation	
Transform to zTensor (zdnn_transform_ztensor)	
Transform to original (zdnn_transform_origtensor)	
Operations	
Element-wise operations	

Activation operations	34
Normalization operations	38
Matmul and matmul with broadcast	
LSTM (zdnn_lstm)	
GRU (zdnn_gru)	
Average pool 2D (zdnn_avgpool2d)	
Max pool 2D (zdnn_maxpool2d)	
Convolution 2D (zdnn_conv2d)	
Convenience functions	
Chapter 3. zDNN usage examples	59
Part 2. IBM Z Artificial Intelligence Optimization library	77
Chapter 4. Using the IBM Z Artificial Intelligence Optimization Library	79
IBM Z Artificial Intelligence Optimization Library environment	
IBM Z Artificial Intelligence Optimization code development	
IBM Z Artificial Intelligence Optimization execution	
zAIO API return status	
Chapter E. IDM 7 Artificial Intelligence Optimization Library ADI reference	ດລ
Chapter 5. IBM Z Artificial Intelligence Optimization Library API referencezAIO initialization (zaio Init)	دهم
Check availability of the IBM Z Integrated Accelerator for AI (zaio_zaiuReady)	
Check CBLAS availability (zaio_cblasReady)	
Get library version (zaio_getVersion)	
Copy vector to new location (zaio_vectorCopy)	
Average vector (zaio_averageVector)	
Semantic average (zaio_semanticAverage)	
Dot product (zaio_dotProduct)	
Cosine distance (zaio_cosineDistance)	
Vector normalization (zaio_normalize)	
Vector denormalization (zaio_denormalize)	
Vector absolute (zaio_absolute)	
Vector scale (zaio_vectorScale)	
Matrix-vector multiplication (zaio_matrixVector)	
Matrix-matrix multiplication (zaio_matrixMatrix)	
Matrix transpose (zaio_transpose)	
Semantic similarity (zaio_semanticSimilarity)	93
Semantic clustering (zaio_semanticClustering)	94
Semantic analogy (zaio_semanticAnalogy)	
Prefetching initialize (zaio_preFetching_Initialize)	
Prefetching execute (zaio_preFetching_Execute)	
Prefetching clear (zaio_preFetching_Clear)	
Chapter 6. Examples of using the IBM Z Artificial Intelligence Optimization Library APIs	99
Part 3. IBM Z Artificial Intelligence Data Embedding library	103
Chapter 7. Using the IBM Z Artificial Intelligence Data Embedding Library	
IBM Z Artificial Intelligence Data Embedding Library environment	
IBM Z Artificial Intelligence Data Embedding Library permissions	
IBM Z Artificial Intelligence Data Embedding Library log files	106
Chapter 8. IBM Z Artificial Intelligence Data Embedding Library API reference	109
base10Cluster	
ibm-data2vec	

Chapter 10. Troubleshooting the IBM Z Artificial Intelligence Data Embedding	•
Accessibility	117
Notices	119
Terms and conditions for product documentation	
IBM Online Privacy Statement	
Policy for unsupported hardware	122
Minimum supported hardware	
Trademarks	122

Figures

1. zDNN tensor structure	5
2. zDNN tensor descriptor	6
3. zDNN data layouts	6
4. zDNN data formats	7
	_
5. zDNN data types	
6 IBM 7 Artificial Intelligence Ontimization Library framework	70

Tables

1. zDNN success status	7
2. zDNN warning statuses	8
3. zDNN general failing statuses	8
4. zDNN hardware statuses	9
5. zDNN function-specific hardware statuses	9
6. zDNN runtime environment variables	9
7. Requirements for pre_transformed_desc and shape for matmul tensors	40
8. Requirements for pre_transformed_desc and shape for matmul broadcast tensors	42
9. Summary of zdnn_lstm parameters	46
10. Summary of zdnn_gru parameters	50
11. Summary of requirements for convolution 2D operations	57
12. zAIO supported hardware accelerations	81
13 zAIO return code mnemonic constants	81

About this information

IBM Z[®] Deep Neural Network Library (zDNN) provides high-level libraries that enable frameworks and model compilers to use the IBM Z on-chip AI accelerator, known as the IBM Z Integrated Accelerator for AI.

zDNN provides the following benefits to simplify access to the IBM Z Integrated Accelerator for AI:

- A high-level language application programming interface (API) for supported IBM Z Integrated Accelerator for AI primitives
- A unified approach for tensor data layout and type conversion
- Change management and version control mechanisms for IBM Z Integrated Accelerator for AI feature-level compatibility

This document contains information and reference material about the zDNN API, which is a standard C library.

This document also includes information and reference material about the IBM Z Artificial Intelligence Optimization Library and the IBM Z Artificial Intelligence Data Embedding Library.

- The IBM Z Artificial Intelligence Optimization Library provides a set of APIs that offer a seamless interface to various methods of hardware acceleration for programs that use semantic-based mathematical operations designed around vector and matrix operations.
- The IBM Z Artificial Intelligence Data Embedding Library provides a set of APIs to access a collection of packages designed to build and process vector embedding models on z/OS.

Who should read this information

This information is intended for use by application developers who wish to use the zDNN, IBM Z Artificial Intelligence Optimization Library, and IBM Z Artificial Intelligence Data Embedding Library APIs to create AI applications.

Related information

For additional information about z/OS, see z/OS Information Roadmap.

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If your comment or question is about z/OS itself, submit a request through the <u>IBM RFE Community</u> (www.ibm.com/developerworks/rfe/).

Feedback on IBM® Documentation function

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Feedback on the z/OS product documentation and content

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- The section title of the specific information to which your comment relates
- The text of your comment.

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Summary of changes

This information includes terminology, maintenance, and editorial changes. Technical changes or additions to the text and illustrations for the current edition are indicated by a vertical line to the left of the change.

Note: IBM z/OS policy for the integration of service information into the z/OS product documentation library is documented on the z/OS Internet Library under IBM z/OS Product Documentation Update Policy (www-01.ibm.com/servers/resourcelink/svc00100.nsf/pages/ibm-zos-doc-update-policy? OpenDocument).

Summary of changes for z/OS 2.5

The following content is new, changed, or no longer included in z/OS 2.5.

New

The following content is new.

August 2023 refresh

 Information about the IBM Z Artificial Intelligence Optimization (zAIO) library is added. (APAR OA64842)

Changed

The following content is changed.

January 2023 refresh

- The Format is updated in <u>"base10Cluster" on page 109</u>. (APARs OA63952 (z/OS 2.5) and OA63951 (z/OS 2.4))
- The Format and Parameters are updated in <u>"ibm-data2vec" on page 110</u>. (APARs OA63952 (z/OS 2.5) and OA63951 (z/OS 2.4))

September 2022 refresh

- The version information is changed from 1.0.0 to 1.0.1 in "zDNN version information" on page 4.
- Updates are made in "Convolution 2D requirements" on page 57.
- Updates are made in "base10Cluster" on page 109.

Deleted

The following content was deleted.

None.

Part 1. IBM Z Deep Neural Network library

Chapter 1. Using the IBM Z Deep Neural Network Library

IBM Z Deep Neural Network Library (zDNN) provides high-level libraries that enable frameworks and model compilers to use the IBM Z Integrated Accelerator for AI.

The zDNN deep learning library support is the software enablement technology that IBM provides to meet the following requirements:

- Specialized-function-assist instructions are intended to provide performance improvements for specific operations used in software libraries, utilities, and operating system (OS) services. The facilities and instructions described as specialized-function-assist instructions may be replaced or removed in the future. As such, IBM recommends that a software library or operating system function be used instead of directly accessing the instructions. This is the function provided by zDNN.
- IBM Z Integrated Accelerator for AI has complex requirements for the layout of data; these requirements arrange the tensor to enhance the performance characteristics of the operations. zDNN formats the tensor appropriately on behalf of the caller, and it does so using an optimized approach.
- For deep learning operations, the IBM Z Integrated Accelerator for AI requires the use of an internal data type (DLFLOAT16). This is a 2-byte data type, similar in concept to Brain float (BFLOAT16); that is, it is an AI optimized format that is used to speed up training and inference (from 4-byte formats) while minimizing the loss of accuracy at inference time.

The zDNN library provides a set of APIs that an exploiter can use to drive the desired request. zDNN is available on z/OS and Linux® on Z. The inclusion of Linux on Z provides particular benefit, as it enables acceleration in frameworks for z/OS using z/OS Container Extensions (zCX).

zDNN application environment

The overall z/OS environment for zDNN applications is:

- · Problem state
- AMODE 64
- XPLINK

Alignment requirements

The following information describes how zDNN and your application align with the requirements and limits of the IBM Z Integrated Accelerator for AI.

IBM Z Integrated Accelerator for AI operation limits

The IBM Z Integrated Accelerator for AI operation (op) limits (which also imply corresponding zDNN limitations) for all ops are:

- Number of elements in any dimension must not exceed the value returned by the **zdnn_get_nnpa_max_dim_idx_size** function.
- Total number of bytes required for storing a transformed tensor must not exceed the value returned by the **zdnn_get_nnpa_max_tensor_size** function.

Application interfaces for enterprise neural network inference

The following information describes the interfaces necessary for your application to access the IBM Z Integrated Accelerator for AI.

zDNN general

The zDNN deep learning library provides the standard IBM Z software interface to the IBM Z Integrated Accelerator for AI. This IBM-provided C library provides a set of functions that handle the data transformation requirements of the IBM Z Integrated Accelerator for AI and provides wrapper functions for the Neural Network Processing Assist (NNPA) instruction primitives.

The zDNN functions use the following criteria to determine if the IBM Z Integrated Accelerator for AI can be used to accelerate a deep learning primitive:

- Neural Network Processing Assist (NNPA) facility indicator in the system STFLE output
- Output of the NNPA-QAF (Query Available Functions) request

Using zDNN

Complete this task to use the zDNN C library for the NNPA instruction.

Link or re-link applications to use the zDNN library. The zDNN library is a library file in the z/OS UNIX System Services file system and can be linked statically or dynamically into your applications.

For z/OS (which requires z/OS Language Environment® (LE)):

- The paths for the zDNN 64-bit dynamic library files are:
 - /lib/libzdnn.so
 - /lib/libzdnn.x
- The path for the zDNN header files is /usr/include/.
- The XL C/C++ compiler and Language Environment provide various environment variables to control processing, in addition to the variables provided by the zDNN library itself.
 - Use the _CEE_RUNOPTS environment variable to specify invocation LE runtime options. For more
 information about using the _CEE_RUNOPTS environment variable and other C and LE variables, see
 z/OS XL C/C++ Programming Guide.
 - For environment variables that are accepted by the zDNN library, see <u>"zDNN runtime environment"</u> variables" on page 9.

Common data types and structures

The zDNN common data types and structures are defined in the zdnn.h include file.

zDNN version information

```
#define ZDNN_VERSION "1.0.1"
#define ZDNN_VERNUM 0x010001 // 0x[major][minor][patch]
#define ZDNN_VER_MAJOR 1
#define ZDNN_VER_MINOR 0
#define ZDNN_VER_PATCH 1
```

ZDNN_VER_MAJOR

The zDNN major version is incremented if any changes that are not compatible with earlier versions are introduced to the API. Such a change may also include minor and patch level changes. Minor and patch versions are reset to 0 when the major version is incremented.

ZDNN_VER_MINOR

The zDNN minor version is incremented if new functionalities that are compatible with earlier versions are introduced to the API or if any API functionalities are marked as deprecated. Such a change may also include patch level changes. The patch version is reset to 0 when the minor version is incremented.

ZDNN_VER_PATCH

The zDNN patch version is incremented if only bug fixes that are compatible with earlier versions are introduced. A *bug fix* is defined as an internal change that fixes incorrect behavior.

Functions for checking version compatibility with the zDNN load library are provided and described in "Support functions" on page 11.

zDNN tensor

The structure of a zDNN tensor (zTensor) is defined by the **zdnn_ztensor** structure, as shown in <u>Figure 1</u> on page 5.

```
typedef struct zdnn_ztensor {
  zdnn_tensor_desc
     *pre_transformed_desc; // tensor's shape information before transformation
  zdnn_tensor_desc *transformed_desc; // transformed tensor's shape information
  uint64_t buffer_size; // tensor size in bytes
  void *buffer; // pointer to the tensor in memory
  bool is_transformed; // indicator if data in buffer has been transformed
  char reserved[31]; // not currently used, should contain zeros.
} zdnn_ztensor;
```

Figure 1. zDNN tensor structure

General zTensor requirements

Observe the following general requirements for a zTensor:

- Requirements for the buffer field:
 - The zdnn_init_ztensor_with_malloc function automatically allocates and sets a valid buffer value for a tensor.
 - The buffer field must point to storage that is allocated of a sufficient size to contain the transformed tensor data described by its transformed_desc field. Call the zdnn_getsize_ztensor function with the tensor's transformed_desc value to obtain the required size.
 - The start of the buffer must be 4K-aligned. That is, the *buffer* value must point to a storage address that is on a 4K boundary.
- The *reserved* field should contain zeros; otherwise, the program might not operate compatibly in the future. Calling **zdnn_init_ztensor** or **zdnn_init_ztensor_with_malloc** sets *reserved* to zeros.

Concatenated zTensor requirements

Observe the following requirements for a concatenated zTensor.

- For use with weights, biases, hidden-weights, hidden-biases RNN-gates tensors.
- Follow the requirements in "General zTensor requirements" on page 5.
- Use the **zdnn_generate_transformed_desc_concatenated** function with the appropriate concatenation information.

Do not use **zdnn_generate_transformed_desc** with concatenated tensors.

• The pre-transformed shape dimensions must not include the concatenation.

Thus, the pre-transformed shape should be that of a single gate, not the shape of the combined gates.

- Afterward, transform with the **zdnn_transform_ztensor** function, as normal.
- Follow the requirements in "General zTensor requirements" on page 5.

zDNN tensor descriptor

The structure of a zDNN tensor descriptor is defined by the **zdnn_tensor_desc** structure, as shown in Figure 2 on page 6.

```
typedef struct zdnn_tensor_desc {
  zdnn_data_layouts layout; // data layout
  zdnn_data_formats format; // internal use only
  zdnn_data_types type; // data type
  uint32_t dim4; // number of elements in outermost dimension
  uint32_t dim3; // ... outer dimension
  uint32_t dim2; // ... inner dimension
  uint32_t dim1; // number of elements in innermost dimension
} zdnn_tensor_desc;
```

Figure 2. zDNN tensor descriptor

Programming notes

- Helper methods zdnn_init_pre_transformed_desc and zdnn_generate_transformed_desc or zdnn_generate_transformed_desc_concatenated will set the correct dimensions based on the layout and format.
- The layout of the tensor descriptor affects the expected order of the dimensions.
 - For tensors with less than four dimensions:
 - Unspecified dimensions in the *pre_transformed_desc* are ignored. For instance, a ZDNN_3D layout expects values in *dim4*, *dim3*, and *dim2*.
 - In the transformed desc, "unused" dimensions must be 1.
 - A ZDNN_NCHW layout expects dimensions such that dim4 = N, dim3 = H, dim2 = W, and dim1 = C.
 - A ZDNN_CNNK_HWCK layout expects dimensions such that dim4 = W, dim3 = W, dim2 = C, and dim1 = K.
- The format changes the expected dimension order for ZDNN_4D tensor layouts:
 - ZDNN_FORMAT_4DFEATURE expects dimensions such that dim4 = N, dim3 = H, dim2 = W, and dim1 = C.
 - ZDNN_FORMAT_4DKERNEL expects dimensions such that dim4 = H, dim3 = W, dim2 = C, and dim1 = K.

zDNN data layouts

The zDNN data layouts for zTensor descriptors are defined in the **zdnn_data_layouts** enumeration, as shown in <u>Figure 3 on page 6</u>. The layouts indicate the number and order of dimensions for the zTensor data.

```
typedef enum zdnn_data_layouts {
                        // 1d tensor
// 2d tensor
  ZDNN_1D,
 ZDNN_2D,
ZDNN_2DS,
ZDNN_3D,
ZDNN_3DS,
                         // represents special 2D tensors required by LSTM/GRU
                        // 3d tensor
// represents special 3D tensors required by
                         // LSTM, GRU, Softmax, and Matmul
                         // represents (update, reset, hidden) used by GRU
// 4d tensor
  ZDNN ZRH,
  ZDNN 4D,
  ZDNN_4DS,
ZDNN_NHWC,
                         // represents special 4D tensors required by LSTM/GRU output // 4d feature tensor in NHWC
  ZDNN_NCHW,
                         // 4d feature tensor in NCHW
                         // represents (forget, input, cell, output) used by LSTM // 4d kernel CNN tensor
  ZDNN_FICO,
ZDNN_CNNK_HWCK,
  ZDNN_BIDIR_ZRH,
                         // ZRH variant to work with bidirectional LSTM/GRU output
  ZDNN_BIDIR_FICO
                         // FICO variant to work with bidirectional LSTM/GRU output
} zdnn_data_layouts;
```

Figure 3. zDNN data layouts

Some layouts also indicate special rearrangement of the data during zTensor transformation.

ZDNN_2DS

The outermost dimension of the original shape is promoted to dim4 during transformation. For instance, a shape of (a, b) becomes [a, 1, 1, b] (dim4, dim3, dim2, dim1) in the transformed_desc.

ZDNN 3DS

The outermost dimension of the original shape is promoted to dim4 during transformation. For instance, a shape of (a, b, c) becomes [a, 1, b, c] (dim4, dim3, dim2, dim1) in the $transformed_desc$.

ZDNN_4DS

Arrangement for RNN output tensor.

The following layouts are set automatically in *transformed_desc* based on *info* when calling the **zdnn_generate_transformed_desc_concatenated** function:

ZDNN_ZRH / ZDNN_FICO

During transformation, the RNN input gates are concatenated on the innermost dimension. These layouts are supported with **pre_transformed_layout** of ZDNN_2DS or ZDNN_3DS.

ZDNN_BIDIR_ZRH / ZDNN_BIDIR_FICO

These layouts are similar to **ZDNN_ZRH** and **ZDNN_FICO** and are used when transforming RNN input weight gate data and the input tensor for the current RNN layer is a bidirectional RNN output from a previous RNN layer.

zDNN data formats

The zDNN data formats are defined in the **zdnn_data_formats** enumeration, as shown in Figure 4 on page 7.

```
typedef enum zdnn_data_formats {
   ZDNN_FORMAT_4DFEATURE, // tensor in AIU data layout format 0
   ZDNN_FORMAT_4DKERNEL, // tensor in AIU data layout format 1
} zdnn_data_formats;
```

Figure 4. zDNN data formats

zDNN data types

The zDNN data types are defined in the **zdnn_data_types** enumeration, as shown in Figure 5 on page 7.

Figure 5. zDNN data types

zDNN statuses

Success status

Table 1 on page 7 lists the success status returned from the zDNN library.

Table 1. zDNN success status		
Mnemonic constant	Value	Meaning
ZDNN_OK	0x00000000	Success.

Warning statuses

Table 2 on page 8 lists the warning statuses returned from the zDNN library.

Table 2. zDNN warning statuses		
Mnemonic constant	Value	Meaning
ZDNN_ELEMENT_RANGE_VIOLATION	0x00020001	IBM Z Integrated Accelerator for AI operation resulted in data that was out of the normal range.

The **ZDNN_ELEMENT_RANGE_VIOLATION** status indicates that a *range violation* occurred for the IBM Z Integrated Accelerator for AI operation based on the data in the tensors. This usually indicates an overflow of the NNPA internal data type, but it can also be associated with operation-specific errors, such as "divide by zero." See the appropriate edition of *z/Architecture Principles of Operation* for your hardware model for information about the range violation on the operation that encountered the violation.

General failing statuses

Table 3 on page 8 lists the general failing statuses returned from the zDNN library.

Note: Statuses marked with an asterisk (*) indicate that, in certain scenarios, these statuses are returned only if the **ZDNN_ENABLE_PRECHECK** environment variable is enabled. When **ZDNN_ENABLE_PRECHECK** is not enabled, these scenarios will lead to abnormal program termination.

Table 3. zDNN general failing statuses		
Mnemonic constant	Value	Meaning
ZDNN_INVALID_SHAPE*	0x00040001	Invalid shape information in one or more of the input or output tensors.
ZDNN_INVALID_LAYOUT	0x00040002	Invalid layout information in one or more of the input or output tensors.
ZDNN_INVALID_TYPE*	0x00040003	Invalid type information in one or more of the input or output tensors.
ZDNN_INVALID_FORMAT*	0x00040004	Invalid format information in one or more of the input or output tensors.
ZDNN_INVALID_DIRECTION	0x00040005	Invalid RNN direction.
ZDNN_INVALID_CONCAT_INFO	0x00040006	Invalid concatenation information.
ZDNN_INVALID_STRIDE_PADDING*	0x00040007	Invalid padding type parameter for current strides.
ZDNN_INVALID_STRIDES*	0x00040008	Invalid stride height or width parameter.
ZDNN_MISALIGNED_PARMBLOCK*	0x00040009	NNPA parameter block is not on a doubleword boundary.
ZDNN_INVALID_CLIPPING_VALUE	0x0004000A	Invalid clipping for the specified operation.
ZDNN_ALLOCATION_FAILURE	0x00100001	Cannot allocate storage.
ZDNN_INVALID_BUFFER	0x00100002	Buffer address is NULL or not on a 4K-byte boundary, or insufficient buffer size.
ZDNN_CONVERT_FAILURE	0x00100003	Floating point data conversion failure.
ZDNN_INVALID_STATE	0x00100004	Invalid zTensor state.
ZDNN_UNSUPPORTED_AIU_EXCEPTION	0X00100005	IBM Z Integrated Accelerator for AI operation returned an unexpected exception.

Hardware statuses

Table 4 on page 9 lists statuses that are returned from the hardware.

Table 4. zDNN hardware statuses		
Status	Value	Meaning
ZDNN_UNSUPPORTED_PARMBLOCK	0x000C0001	NNPA parameter block format is not supported by the model.
ZDNN_UNAVAILABLE_FUNCTION	0x000C0002	Specified NNPA function is not defined or installed on the machine.
ZDNN_UNSUPPORTED_FORMAT	0x000C0010	Specified tensor data layout format is not supported.
ZDNN_UNSUPPORTED_TYPE	0x000C0011	Specified tensor data type is not supported.
ZDNN_EXCEEDS_MDIS	0x000C0012	Tensor dimension exceeds maximum dimension index size (MDIS).
ZDNN_EXCEEDS_MTS	0x000C0013	Total number of bytes in tensor exceeds maximum tensor size (MTS).
ZDNN_MISALIGNED_TENSOR	0x000C0014	Tensor address is not on a 4K-byte boundary.
ZDNN_MISALIGNED_SAVEAREA	0x000C0015	Function-specific save area address is not on a 4K-byte boundary.

<u>Table 5 on page 9</u> lists hardware statuses whose meanings vary based on operation. See the description of the operation that returned the status for the specific meaning.

0x000CF006

0x000CF007

0x000CF008

0x000CF009

Status	Value	Meaning
ZDNN_FUNC_RC_F000	0x000CF000	Function-specific response code (F000).
ZDNN_FUNC_RC_F001	0x000CF001	Function-specific response code (F001).
ZDNN_FUNC_RC_F002	0x000CF002	Function-specific response code (F002).
ZDNN_FUNC_RC_F003	0x000CF003	Function-specific response code (F003).
ZDNN_FUNC_RC_F004	0x000CF004	Function-specific response code (F004).
ZDNN_FUNC_RC_F005	0x000CF005	Function-specific response code (F005).

Function-specific response code (F006).

Function-specific response code (F007).

Function-specific response code (F008).

Function-specific response code (F009).

zDNN runtime environment variables

Table 5. zDNN function-specific hardware statuses

ZDNN_FUNC_RC_F006

ZDNN_FUNC_RC_F007

ZDNN_FUNC_RC_F008

ZDNN_FUNC_RC_F009

The following tables list the zDNN runtime environment variables.

Table 6. zDNN runtime environment variables

Variable name	Valid values	Description
ZDNN_ENABLE_PRECHECK	true false	When set to true, tensor integrity prechecks are run before issuing NNPA operations.
		 Enabling precheck can impact performance.
		 Enable precheck to debug issues that cause hardware exceptions that otherwise would result in abnormal program termination.

Table 6. zDNN runtime environment variables (continued)			
Variable name	Valid values	Description	
ZDNN_STATUS_DIAG	nnnnnnn (decimal) 0xnnnnnnnn (hexadecimal)	Prints or produces diagnostic information whenever the zDNN status code equals the specified value. Only one status value can be specified.	

Programming notes

- Environment variable settings are checked during initial library load by the **zdnn_init** function.
- To change environment variable settings after the library is loaded, you must manually call **zdnn_init** again.

Chapter 2. zDNN API reference

The zDNN APIs are grouped into the following categories:

- "Support functions" on page 11
- "Data transformation" on page 25
- "Operations" on page 28
- "Convenience functions" on page 58

Support functions

The zDNN support functions are:

- "Initialization (zdnn_init)" on page 11
- "Query functions" on page 12
- "Get size (zdnn_getsize_ztensor)" on page 17
- "Initialize pre-transformed tensor descriptor (zdnn_init_pre_transformed_desc)" on page 17
- "Generate transformed tensor descriptor (zdnn_generate_transformed_desc)" on page 18
- "Generate concatenated transformed tensor descriptor (zdnn_generate_transformed_desc_concatenated)" on page 18
- "Initialize zTensor (zdnn_init_ztensor)" on page 19
- "Initialize zTensor with memory allocate (zdnn_init_ztensor_with_malloc)" on page 20
- "Reset zTensor (zdnn_reset_ztensor)" on page 21
- "Allocate memory for zTensor (zdnn_allochelper_ztensor)" on page 21
- "Deallocate memory for zTensor (zdnn_free_ztensor_buffer)" on page 22
- "Retrieve status message for a status code (zdnn_get_status_message)" on page 22
- "Reshape zTensor (zdnn_reshape_ztensor)" on page 23
- "Check whether version is runnable (zdnn_is_version_runnable)" on page 24
- "Get maximum runnable version (zdnn_get_max_runnable_version)" on page 25

Initialization (zdnn_init)

Description

Initialize the zDNN library. This sends an NNPA-QAF to query the NNPA and loads the current environment variable settings.

This must be invoked at least once if the zDNN library is statically-linked. It is automatically invoked if the zDNN library is dynamically loaded.

Format

void zdnn_init();

Parameters

None.

Returns

None.

Query functions

The zDNN query functions are:

- "Maximum dimension index size (zdnn_get_nnpa_max_dim_idx_size)" on page 12
- "Maximum tensor size (zdnn_get_nnpa_max_tensor_size)" on page 12
- "NNPA function availability (zdnn_is_nnpa_function_installed)" on page 13
- "Availability of parameter block formats (zdnn_is_nnpa_parmblk_fmt_installed)" on page 14
- "Availability of NNPA data types (zdnn_is_nnpa_datatype_installed)" on page 14
- "Availability of NNPA data layout formats (zdnn_is_nnpa_layout_fmt_installed)" on page 15
- "Library version (zdnn_get_library_version)" on page 16
- "Library version string (zdnn_get_library_version_str)" on page 16
- "Availability of NNPA data type format conversions (zdnn_is_nnpa_conversion_installed)" on page 15
- "In-memory query result (zdnn_refresh_nnpa_query_result)" on page 16

Maximum dimension index size (zdnn_get_nnpa_max_dim_idx_size)

Description

Retrieve the maximum dimension index size value currently supported by the IBM Z Integrated Accelerator for AI from zDNN internal memory.

Format

```
uint32_t zdnn_get_nnpa_max_dim_idx_size();
```

Parameters

None.

Returns

Maximum dimension index size supported by the IBM Z Integrated Accelerator for AI.

Maximum tensor size (zdnn_get_nnpa_max_tensor_size)

Description

Retrieve the maximum tensor size value (number of bytes required for storing a transformed tensor) currently supported by the IBM Z Integrated Accelerator for AI from zDNN internal memory.

Format

```
uint64_t zdnn_get_nnpa_max_tensor_size();
```

Parameters

None.

Returns

Maximum tensor size supported by the IBM Z Integrated Accelerator for AI.

NNPA availability (zdnn_is_nnpa_installed)

Description

Queries the hardware to determine if the NNPA and NNP-internal data type (DLFLOAT16) conversion instructions are installed.

Use this function during application initialization to determine whether the IBM Z Integrated Accelerator for AI hardware is available.

Format

```
bool zdnn_is_nnpa_installed();
```

Parameters

None.

Returns

Returns true if NNPA and zDNN conversion instructions are installed; otherwise, returns false.

NNPA function availability (zdnn_is_nnpa_function_installed)

Description

Query, from zDNN internal memory, whether requested NNPA functions are available.

Format

```
bool zdnn_is_nnpa_function_installed(int count, ...);
```

Parameters

count

Number of NNPA functions to check.

... (additional arguments)

Function numbers, separated by commas. For instance: NNPA_MUL, NNPA_MIN_

The valid NNPA functions are:

NNPA_QAF NNPA_SIGMOID NNPA_ADD NNPA_SOFTMAX NNPA_SUB NNPA_BATCHNORMALIZATION NNPA_MUL NNPA_MAXPOOL2D NNPA_DIV NNPA_AVGPOOL2D NNPA_MIN NNPA_LSTMACT NNPA_MAX NNPA_GRUACT NNPA_LOG NNPA_CONVOLUTION NNPA_EXP NNPA_MATMUL_OP NNPA_RELU NNPA_MATMUL_OP_BCAST23 NNPA_TANH

Returns

Returns true if all queried functions are installed or if count is zero; otherwise, returns false.

Availability of parameter block formats (zdnn_is_nnpa_parmblk_fmt_installed)

Description

Query, from zDNN internal memory, whether requested parameter block formats are installed.

Format

```
bool zdnn_is_nnpa_parm_blk_fmt_installed(int count, ...);
```

Parameters

count

Number of NNPA parameter block formats to check.

... (additional arguments)

NNPA parameter block formats, separated by commas.

NNPA_PARMBLKFORMAT_0

Returns

Returns true if all queried formats are installed or if count is zero; otherwise, returns false.

Availability of NNPA data types (zdnn_is_nnpa_datatype_installed)

Description

Query, from zDNN internal memory, whether requested NNPA data types are installed.

Format

```
bool zdnn_is_nnpa_datatype_installed(uint16_t types_bitmask);
```

Parameters

uint16_t types_bitmask

The OR of the requested data type bit masks as defined in the **zdnn_query_datatypes** enumeration.

QUERY_DATATYPE_INTERNAL1

Returns

Returns true if all queried data types are installed; otherwise, returns false.

Availability of NNPA data layout formats (zdnn_is_nnpa_layout_fmt_installed)

Description

Query, from zDNN internal memory, whether requested NNPA data layout formats are installed.

Format

```
bool zdnn_query_is_nnpa_layout_fmt_installed(uint32_t layout_bitmask);
```

Parameters

uint32_t layout_bitmask

The OR of the requested layout bit masks as defined in the **zdnn_query_layoutfmts** enumeration.

```
QUERY_LAYOUTFMT_4DFEATURE
QUERY_LAYOUTFMT_4DKERNEL
```

Returns

Returns true if all queried data layouts are installed; otherwise, returns false.

Availability of NNPA data type format conversions (zdnn_is_nnpa_conversion_installed)

Description

Query, from zDNN internal memory, whether requested NNPA data type to/from BFP format conversions are installed.

Format

Parameters

nnpa data type type

The NNPA data type number as defined in the **nnpa_data_type** enumeration.

```
NNPA_DATATYPE_1
```

uint16_t format_bitmask

The OR of the BFP format bit masks as defined in the **zdnn_query_bfpfmts** enumeration.

```
QUERY_BFPFMT_TINY (FP16)
QUERY_BFPFMT_SHORT (FP32/BFLOAT)
```

Returns

Returns true if all queried conversions are installed; otherwise, returns false.

Library version (zdnn_get_library_version)

Description

Retrieve the library version as a 32-bit, hexadecimal value (0x00MMmmpp), where:

мм

The major level

mm

The minor level

pp

The patch level

Format

```
uint32_t zdnn_get_library_version();
```

Parameters

None.

Returns

Returns the library version number in 0x00MMmmpp format.

Library version string (zdnn_get_library_version_str)

Description

Retrieve the library version number and build information as a string.

Format

```
char *zdnn_get_library_version_str();
```

Parameters

None.

Returns

Returns the library version number and build information as a string.

In-memory query result (zdnn_refresh_nnpa_query_result)

Description

Retrieve the zDNN in-memory query result from the IBM Z Integrated Accelerator for AI.

Format

```
zdnn_status zdnn_refresh_nnpa_query_result();
```

Parameters

None.

Programming notes

This function is called automatically as part of **zdnn_init** processing and should not need to be called directly. Manually refreshing the query results before making other **zdnn_query_*** calls may noticeably impact performance.

Returns

One of the following zDNN status indicators:

```
ZDNN_OK
ZDNN_UNAVAILABLE_FUNCTION
```

Get size (zdnn_getsize_ztensor)

Description

Use this function to determine the buffer size required for the transformed tensor (including concatenated) in zDNN transformed format. Requires the tensor descriptor (**zdnn_tensor_desc**) with transformed shape information.

Format

```
uint64_t zdnn_getsize_ztensor(const zdnn_tensor_desc *tfrmd_desc);
```

Parameters

zdnn_tensor_desc *tfrmd_desc

Contains transformed information about the shape, layout, and data type.

Returns

The required buffer size, in bytes.

Initialize pre-transformed tensor descriptor (zdnn_init_pre_transformed_desc)

Description

Initialize a tensor descriptor (**zdnn_tensor_desc**) struct with pre-transformed (original) shape information.

Format

Parameters

zdnn_data_layouts layout

The data layout.

zdnn_data_types type

The data type.

zdnn_tensor_desc *pre_tfrmd_desc

The output **zdnn_tensor_desc** structure.

... (additional arguments)

(Variadic) The number of elements in each dimension in accordance with the layout, in outermost to innermost order.

Returns

None.

Generate transformed tensor descriptor (zdnn_generate_transformed_desc)

Description

Generate transformed tensor descriptor information based on a supplied pre-transformed tensor descriptor.

Format

```
zdnn_status zdnn_generate_transformed_desc(
    const zdnn_tensor_desc *pre_tfrmd_desc, zdnn_tensor_desc *tfrmd_desc);
```

Parameters

zdnn_tensor_desc *pre_tfrmd_desc

The input tensor descriptor with pre-transformed shape information.

zdnn_tensor_desc *tfrmd_desc

The output **zdnn_tensor_desc** structure.

Returns

One of the following zDNN status indicators:

zDNN_OK	Success.
ZDNN_INVALID_LAYOUT	The pre-transformed <i>layout</i> value is not recognized or is a layout only used for concatenated tensors.

Generate concatenated transformed tensor descriptor (zdnn_generate_transformed_desc_concatenated)

Description

Generate concatenated transformed tensor descriptor information for RNN input-gates tensors based on a supplied pre-transformed tensor descriptor.

Format

```
zdnn_status zdnn_generate_transformed_desc_concatenated(
  const zdnn_tensor_desc *pre_tfrmd_desc,
  zdnn_concat_info info, zdnn_tensor_desc *tfrmd_desc);
```

Parameters

zdnn_tensor_desc *pre_tfrmd_desc

The input tensor descriptor with pre-transformed shape information.

zdnn_concat_info info

Information about how the tensors will be concatenated. Consists of the RNN_TYPE, PREV_LAYER, and USAGE flags ORed together.

RNN_TYPE flags:

- RNN_TYPE_LSTM For LSTM.
- RNN_TYPE_GRU For GRU.

PREV_LAYER flags:

- PREV_LAYER_UNI Previous RNN layer is unidirectional.
- PREV_LAYER_NONE Previous layer is not an RNN layer.
- PREV_LAYER_BIDIR Previous RNN layer is bidirectional.

USAGE flags:

- USAGE_WEIGHTS Concatenate as input weights.
- USAGE_HIDDEN_WEIGHTS Concatenate as input hidden-weights.
- USAGE_BIASES Concatenate as input biases.
- USAGE_HIDDEN_BIASES Concatenate as input hidden-biases.

zdnn_tensor_desc *tfrmd_desc

The output **zdnn_tensor_desc** structure.

Returns

One of the following zDNN status indicators:

ZDNN_OK	Success.
ZDNN_INVALID_LAYOUT	The pre-transformed <i>layout</i> value is not recognized or is not supported for concatenated tensors.
ZDNN_INVALID_CONCAT_INFO	Invalid concatenation information.

Initialize zTensor (zdnn_init_ztensor)

Description

Initialize a **zdnn_ztensor** structure using the pre-transformed and transformed tensor shape information.

Format

Parameters

zdnn_tensor_desc *pre_tfrmd_desc

Input tensor descriptor with pre-transformed shape information.

zdnn_tensor_desc *tfrmd_desc

Input tensor descriptor with transformed shape information.

zdnn_ztensor *output

The **zdnn_ztensor** struct being initialized.

Returns

None.

Initialize zTensor with memory allocate (zdnn_init_ztensor_with_malloc)

Description

Provides the same functionality as **zdnn_init_ztensor**, and computes the size required for the tensor in the zDNN transformed format and allocates the storage for it. Sets the **buffer** and **buffer_size** fields within **output**.

Format

Parameters

zdnn_tensor_desc *pre_tfrmd_desc

Input tensor descriptor with pre-transformed shape information.

zdnn tensor desc *tfrmd desc

Input tensor descriptor with transformed shape information.

zdnn_ztensor *output

The **zdnn_ztensor** struct being initialized.

Returns

One of the following **zdnn_status** indicators:

Status	Meaning
ZDNN_OK	Success.
ZDNN_INVALID_FORMAT	tfrmd_desc->format is not recognized.
ZDNN_INVALID_TYPE	tfrmd_desc->type is not recognized or is a pre-transform type.
ZDNN_INVALID_SHAPE	If any of the following conditions are true:
	• One of the tfrmd_desc->dim dimensions is 0.
	 One of the tfrmd_desc->dim dimensions is greater than the size returned by zdnn_get_nnpa_max_dim_idx_size.
	Note: Concatenation dimensions have a smaller maximum size. See <u>"LSTM input / output requirements"</u> on page 43 or <u>"GRU input / output requirements"</u> on page 47.
	 The total number of tfrmd_desc elements is larger than the size returned by zdnn_get_nnpa_max_tensor_size.
ZDNN_ALLOCATION_FAILURE	Unable to allocate required memory on a 4K boundary.

Reset zTensor (zdnn reset ztensor)

Description

Reset a **zdnn_ztensor** struct for reuse.

Note: This operation does not set or reset the **buffer** and **buffer_size** fields nor free the transformed area storage.

Format

```
void zdnn_reset_ztensor(zdnn_ztensor *ztensor);
```

Parameters

zdnn tensor *ztensor

The **zdnn_ztensor** struct to be reset.

Returns

None.

Allocate memory for zTensor (zdnn_allochelper_ztensor)

Description

Calculate the size required for the tensor in the zDNN transformed format and allocate the needed storage, satisfying alignment requirements. Sets the **buffer** and **buffer_size** fields within **ztensor**.

Note: The calling application assumes ownership of this storage and is responsible for freeing it.

Format

```
zdnn_status zdnn_allochelper_ztensor(zdnn_ztensor *ztensor);
```

Parameters

zdnn_tensor *ztensor

A **zdnn_ztensor** struct that contains the transformed shape information in the **transformed_desc** field.

Returns

One of the following **zdnn_status** indicators:

Status	Meaning	
ZDNN_OK	Success.	
ZDNN_INVALID_FORMAT	ztensor->transformed_desc->format is not recognized.	
ZDNN_INVALID_TYPE	ztensor->transformed_desc->type is not recognized or is a pre-transform type.	

Status	Meaning
ZDNN_INVALID_SHAPE	Any of the following reasons:
	• One of the ztensor->transformed_desc->dim dimensions is 0.
	 One of the ztensor->transformed_desc->dim dimensions is greater than the size returned by zdnn_get_nnpa_max_dim_idx_size.
	Note: Concatenation dimensions have a smaller maximum size. See <u>"LSTM input / output requirements"</u> on page 43 or <u>"GRU input / output requirements"</u> on page 47.
	 The total number of transformed_desc elements is larger than the value returned by zdnn_get_nnpa_max_tensor_size.
ZDNN_ALLOCATION_FAILURE	Unable to allocate the required memory on a 4K boundary.

Deallocate memory for zTensor (zdnn_free_ztensor_buffer)

Description

Free the transformed area storage associated with an input **zdnn_ztensor**.

Note: This function does not free the storage allocated for the **zdnn_ztensor** structure itself.

Format

```
zdnn_status zdnn_free_ztensor_buffer(const zdnn_ztensor *ztensor);
```

Parameters

zdnn tensor *ztensor

A **zdnn_ztensor** struct whose **buffer** field points to the allocated storage.

Returns

One of the following **zdnn_status** indicators:

Status	Meaning
ZDNN_OK	Success.
ZDNN_INVALID_BUFFER	The ztensor->buffer value is NULL.

Retrieve status message for a status code (zdnn_get_status_message)

Description

Retrieve the status message for a status code.

Format

```
const char *zdnn_get_status_message(zdnn_status status);
```

Parameters

zdnn_status *status*

The status code for which to retrieve the status message.

Returns

A pointer to the description string, or (Status string is not defined.) if status is not defined.

Reshape zTensor (zdnn reshape ztensor)

Description

Reshape and copy the contents from the buffer of a source tensor to the buffer of a destination tensor in accordance with the shape of the destination tensor.

The following conditions must be satisfied:

- The transformed_desc field of both the source and destination tensors must be fully initialized.
- The destination tensor's buffer (dest->buffer) must be preallocated.
- The source tensor (*src*) must be transformed.
- The destination tensor (dest) must not already be transformed.
- The transformed_desc->layout field of both the source and destination tensors must be the same, either NHWC or HWCK.
- Both tensors must contain an equal number of elements.

Format

zdnn_status zdnn_reshape_ztensor(const zdnn_ztensor *src, zdnn_ztensor *dest);

Parameters

src

The source tensor from which to copy.

dest

The destination tensor to which to copy.

Programming notes

- If src and dest have the same transformed_desc->dim1 dimension size, the transformed data is directly copied to the destination without untransformation.
- If src and dest have different transformed_desc->dim1 dimension sizes, reshaping will internally untransform the source and then retransform the values into the destination.

Returns

One of the following **zdnn_status** indicators:

Status	Meaning
ZDNN_OK	Success.
ZDNN_INVALID_SHAPE	Any of the following reasons:
	 The dimensions (transformed_desc->dim) of src and dest total to different numbers of elements.
	 One of the dest->transformed_desc->dim dimensions is 0.
	 One of the dest->transformed_desc->dim dimensions is greater than the size returned by zdnn_get_nnpa_max_dim_idx_size.
	Note: Concatenation dimensions have a smaller maximum size. See <u>"LSTM input / output requirements"</u> on page 43 or "GRU input / output requirements" on page 47.
	 The total number of dest->transformed_desc->dim elements is larger than the value returned by zdnn_get_nnpa_max_tensor_size.

Status	Meaning	
ZDNN_INVALID_LAYOUT	Any of the following reasons:	
	• The value of transformed_desc->layout for src and dest) are not the same.	
	• The value of transformed_desc->layout is neither ZDNN_NHWC nor ZDNN_HWCK.	
	 The value of src->pre_transformed_desc->layout is not recognized or is not a valid pre-transformation layout. 	
	 The value of dest->pre_transformed_desc->layout is not recognized or is not a valid pre-transformation layout. 	
ZDNN_INVALID_STATE	Any of the following reasons:	
	• The source tensor (src) is not already transformed.	
	• The destination tensor (dest) is already transformed.	
ZDNN_INVALID_FORMAT	The format of the source tensor $src\->transformed_desc\->format$ is not ZDNN_FORMAT_4DFEATURE.	
ZDNN_INVALID_TYPE	Any of the following reasons:	
	 The value of src->pre_transformed_desc->type is not recognized or is a transformed type. 	
	 The value of dest->pre_transformed_desc->type is not recognized or is a transformed type. 	
	 The value of dest->transformed_desc->type is not recognized or is a pre- transformation type. 	
ZDNN_INVALID_BUFFER	Any of the following reasons:	
	• The src->buffer field is NULL.	
	 The src->buffer) storage does not start on a 4K boundary. 	
	• The dest->buffer field is NULL.	
	 The dest->buffer) storage does not start on a 4K boundary. 	
	• The dest->buffer_size value is too small to hold the transformed values.	
ZDNN_CONVERT_FAILURE	Values failed to untransform or transform.	

Check whether version is runnable (zdnn_is_version_runnable)

Description

Check whether an application built for zDNN version *ver_num* can be run on the current IBM Z Integrated Accelerator for AI hardware with the installed zDNN library.

Format

bool zdnn_is_version_runnable(uint32_t ver_num);

Parameters

uint32_t ver_num

The zDNN version number from the application in 0x00[major][minor][patch] form. Typically, this is **ZDNN_VERNUM** that was used to compile the application.

Returns

The function returns true or false.

Get maximum runnable version (zdnn get max runnable version)

Description

Return the maximum zDNN version number that the current hardware and installed zDNN library can run together. The returned value means that the current runtime environment fully supports zDNN APIs of that [major].[minor] version and earlier.

Format

```
uint32_t zdnn_get_max_runnable_version();
```

Parameters

None.

Returns

A 32-bit zDNN version number in $0 \times 00 [major][minor]$ FF form.

Data transformation

The IBM Z Integrated Accelerator for AI requires that the tensor data be arranged in a format that enhances the performance characteristics of the operations. This documentation refers to that format as the *transformed format*. In addition, data conversions are necessary from the common formats (FP32, FP16, BFLOAT) to the internal format (DLFLOAT16) supported by the IBM Z Integrated Accelerator for AI. zDNN provides the following two conversion functions:

zdnn_transform_ztensor

Transforms the input tensor and converts the input data to the format required by the IBM Z Integrated Accelerator for AI. The resulting transformed zTensor can be reused as many times as necessary.

See <u>"Transform to zTensor (zdnn_transform_ztensor)" on page 25</u> for details about transforming an input tensor to the internal format.

zdnn_transform_origtensor

Transforms a zTensor (usually output from an operation or network) to the format and data types that are usable by the application.

See "Transform to original (zdnn_transform_origtensor)" on page 27 for details about transforming an input zTensor to the original format.

Transform to zTensor (zdnn_transform_ztensor)

Description

Converts the input tensor to the supported transformed format for execution by zDNN operations. If transformation is successful, the **is_transformed** field within **ztensor** is set to true; otherwise, it is set to false. Transformation fails if the **is_transformed** value is already set to true.

Note: Once it is in transformed format, the tensor layout in memory is dependent on the content of the input tensor's descriptors (**zdnn_tensor_desc** fields). Once converted, a **zdnn_ztensor** should only be manipulated by zDNN API functions.

Format

```
zdnn_status zdnn_transform_ztensor(zdnn_ztensor ztensor, ...);
```

Parameters

zdnn ztensor *tensor

The input **zdnn_ztensor** struct. The *pre_transformed_desc* and *transformed_desc* fields must be set, and the *is_transformed* field must be set to false. A 4K-aligned tensor storage must be preallocated by the caller (directly or by calling the zDNN allocation helper function) and the *buffer* field must point to the storage.

... (additional arguments)

(Variadic) A list of pointers for input data to be transformed, as follows:

- Non-concatenated: 1 data pointer
- LSTM concatenated: 4 data pointers, one for each input gate in Forget, Input, Cell, Output (FICO) order
- **GRU concatenated**: 3 data pointers, one for each input gate in (Z)update, Reset, Hidden, (ZRH) gate order

Programming notes

The **zdnn_transform_ztensor** function clears the pre-thread floating-point exception flags at entry, and may set FE_UNDERFLOW, FE_INVALID, FE_INEXACT, or FE_OVERFLOW when it encounters errors during data conversion.

Returns

One of the following **zdnn_status** indicators:

zdnn_ztensor->transformed_desc->format is not recognized.	
is not recognized or is not a	
t recognized or is not a valid	
not recognized or is a	
ecognized or is a pre-transform	
lues.	
m dimensions is 0.	
m dimensions is greater than size.	
m size. See <u>"LSTM input /</u> requirements" on page 47.	
than the value returned by	
i i s	

Transform to original (zdnn_transform_origtensor)

Description

Converts the input tensor from the zDNN transformed format back to a standard non-transformed layout. The **is_transformed** field within the input tensor must be set to true.

All stick-format tensors are supported, except:

- · Kernel tensors
- · Concatenated RNN input-gates tensors

Format

zdnn_status zdnn_transform_origtensor(const zdnn_ztensor *ztensor, void *out_buf);

Parameters

zdnn_ztensor *ztensor

The input **zdnn_ztensor** struct. The *pre_transformed_desc*, *transformed_desc*, and *buffer* fields must be set, and the *is_transformed* field must be set to true.

void *out_buf

The buffer for storing the standard non-transformed tensor data. Must be preallocated by the caller.

Programming notes

The **zdnn_transform_origtensor** function clears the pre-thread floating-point exception flags at entry, and may set FE_UNDERFLOW, FE_INVALID, FE_INEXACT, or FE_OVERFLOW when it encounters errors during data conversion.

Returns

One of the following **zdnn_status** indicators:

Status	Meaning	
ZDNN_OK	Success.	
ZDNN_UNSUPPORTED_TYPE	(SIM only)	
ZDNN_INVALID_FORMAT	The ztensor->transformed_desc->format value is not ZDNN_FORMAT_4DFEATURE.	
ZDNN_INVALID_LAYOUT	Any of the following reasons:	
	 The zdnn_ztensor->pre_transformed_desc->layout value is not recognized or is not a valid pre-transform layout. 	
	• The zdnn_ztensor->transformed_desc->layout value is not recognized or is not a valid transformed layout required by this function.	
ZDNN_INVALID_TYPE	Any of the following reasons:	
	 The ztensor->pre_transformed_desc->type value is not recognized or is a transformed type. 	
	 The ztensor->transformed_desc->type value is not recognized or is a pre- transform type. 	
ZDNN_INVALID_BUFFER	Any of the following reasons:	
	• The ztensor->buffer field is NULL.	
	 The start of the ztensor->buffer storage is not on a 4K boundary. 	
ZDNN_INVALID_STATE	The ztensor is not transformed.	
ZDNN_CONVERT_FAILURE	Values failed to untransform.	

Operations

The zDNN operations are organized into the following categories:

- "Element-wise operations" on page 28
- · "Activation operations" on page 34
- "Normalization operations" on page 38
- "Matmul and matmul with broadcast" on page 39
- "LSTM (zdnn_lstm)" on page 43
- "GRU (zdnn_gru)" on page 47
- "Average pool 2D (zdnn_avgpool2d)" on page 51
- "Max pool 2D (zdnn_maxpool2d)" on page 53
- "Convolution 2D (zdnn_conv2d)" on page 56

Element-wise operations

The zDNN element-wise operations are:

- "Addition (zdnn_add)" on page 28
- "Subtraction (zdnn_sub)" on page 29
- "Multiplication (zdnn_mul)" on page 30
- "Division (zdnn_div)" on page 30
- "Minimum (zdnn_min)" on page 31
- "Maximum (zdnn_max)" on page 32
- "Natural logarithm (zdnn_log)" on page 33
- "Exponential (zdnn_exp)" on page 33

Addition (zdnn_add)

Description

Given two input tensors in zDNN transformed format, perform element-wise addition and store the result into the provided output zDNN tensor.

Note: For zDNN use, broadcasting of the input tensors must be done by the caller. As such, the input tensors must be of the same shape.

Format

Parameters

zdnn ztensor *input a

An input tensor with addends to add to the *input_b* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_ztensor *input_b

An input tensor with addends to add to the $input_a$ tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *output

An output tensor to hold the result of the addition. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN OK
"Warning statuses" on page 8
ZDNN INVALID SHAPE
ZDNN_INVALID_TYPE
ZDNN_INVALID_FORMAT
"Hardware statuses" on page 8
```

Framework examples

- TensorFlow addition (https://www.tensorflow.org/api_docs/python/tf/math/add)
- ONNX addition (https://github.com/onnx/onnx/blob/master/docs/Operators.md#Add)

Subtraction (zdnn sub)

Description

Given two input tensors in zDNN transformed format, perform element-wise subtraction and store the result into the provided output zDNN tensor.

Note: For zDNN use, broadcasting of the input tensors must be done by the caller. As such, the input tensors must be of the same shape.

Format

```
zdnn_status zdnn_sub(const zdnn_ztensor *input_a, const zdnn_ztensor *input_b,
                     zdnn_ztensor *output);
```

Parameters

zdnn_ztensor *input_a

An input tensor with minuends to be subtracted by the input_b tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *input b

An input tensor with subtrahends to subtract from the *input* α tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *output

An output tensor to hold the result of the subtraction. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK
"Warning statuses" on page 8
ZDNN_INVALID_SHAPE
ZDNN_INVALID_TYPE
ZDNN_INVALID_FORMAT
"Hardware statuses" on page 8
```

Framework examples

TensorFlow subtraction (https://www.tensorflow.org/api_docs/python/tf/math/subtract)

ONNX subtraction (https://github.com/onnx/onnx/blob/master/docs/Operators.md#sub)

Multiplication (zdnn_mul)

Description

Given two input tensors in zDNN transformed format, perform element-wise multiplication and store the result into the provided output zDNN tensor.

Note: For zDNN use, broadcasting of the input tensors must be done by the caller. As such, the input tensors must be of the same shape.

Format

Parameters

zdnn_ztensor *input_a

An input tensor with multiplicands to be multiplied by the *input_b* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_ztensor *input_b

An input tensor with multipliers for the *input_a* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_ztensor *output

An output tensor to hold the result of the multiplication. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK
"Warning statuses" on page 8
ZDNN_INVALID_SHAPE
ZDNN_INVALID_TYPE
ZDNN_INVALID_FORMAT
"Hardware statuses" on page 8
```

Framework examples

- TensorFlow multiplication (https://www.tensorflow.org/api_docs/python/tf/math/multiply)
- ONNX multiplication (https://github.com/onnx/onnx/blob/master/docs/Operators.md#Mul)

Division (zdnn_div)

Description

Given two input tensors in zDNN transformed format, perform element-wise division and store the result into the provided output zDNN tensor.

Note: For zDNN use, broadcasting of the input tensors must be done by the caller. As such, the input tensors must be of the same shape.

Format

Parameters

zdnn_ztensor *input_a

An input tensor with dividends to be divided by the *input_b* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *input b

An input tensor with divisors for the $input_a$ tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_ztensor *output

An output tensor to hold the result of the division. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT

"Hardware statuses" on page 8
```

Framework examples

- TensorFlow division (https://www.tensorflow.org/api_docs/python/tf/math/divide)
- ONNX division (https://github.com/onnx/onnx/blob/master/docs/Operators.md#Div)

Minimum (zdnn_min)

Description

Given two input tensors in zDNN transformed format, compute the element-wise minimum and store the result into the provided output zDNN tensor.

Note: For zDNN use, broadcasting of the input tensors must be done by the caller. As such, the input tensors must be of the same shape.

Format

Parameters

zdnn_ztensor *input_a

An input tensor with values to be compared with the *input_b* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *input b

An input tensor with values to be compared with the $input_a$ tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_ztensor *output

An output tensor to hold the smaller values from each comparison of the inputs. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT

"Hardware statuses" on page 8
```

Framework examples

- TensorFlow minimum (https://www.tensorflow.org/api_docs/python/tf/math/minimum)
- ONNX minimum (https://github.com/onnx/onnx/blob/master/docs/Operators.md#min)

Maximum (zdnn max)

Description

Given two input tensors in zDNN transformed format, compute the element-wise maximum and store the result into the provided output zDNN tensor.

Note: For zDNN use, broadcasting of the input tensors must be done by the caller. As such, the input tensors must be of the same shape.

Format

Parameters

zdnn_ztensor *input_a

An input tensor with values to be compared with the *input_b* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *input b

An input tensor with values to be compared with the $input_a$ tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *output

An output tensor to hold the larger value from each comparison of the inputs. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT
```

Framework examples

- TensorFlow maximum (https://www.tensorflow.org/api_docs/python/tf/math/maximum)
- ONNX maximum (https://github.com/onnx/onnx/blob/master/docs/Operators.md#max)

Natural logarithm (zdnn_log)

Description

Given an input tensor in zDNN transformed format, compute the natural logarithm element-wise and store the result into the provided output zDNN tensor.

Format

```
zdnn_status zdnn_log(const zdnn_ztensor *input, zdnn_ztensor *output);
```

Parameters

zdnn ztensor *input

An input tensor with values to evaluate. The tensor must satisfy the requirements in <u>"General zTensor</u> requirements" on page 5.

zdnn_ztensor *output

An output tensor to hold the calculated natural logarithm of each value from the *input* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK
"Warning statuses" on page 8
ZDNN_INVALID_SHAPE
ZDNN_INVALID_TYPE
ZDNN_INVALID_FORMAT
"Hardware statuses" on page 8
```

Framework examples

- TensorFlow natural logarithm (https://www.tensorflow.org/api_docs/python/tf/math/log)
- ONNX natural logarithm (https://github.com/onnx/onnx/blob/master/docs/Operators.md#Log)

Exponential (zdnn_exp)

Description

Given an input tensor in zDNN transformed format, compute the exponential element-wise and store the result into the provided output zDNN tensor.

Format

```
zdnn_status zdnn_exp(const zdnn_ztensor *input, zdnn_ztensor *output);
```

Parameters

zdnn_ztensor *input

An input tensor with values to evaluate. The tensor must satisfy the requirements in <u>"General zTensor</u> requirements" on page 5.

zdnn_ztensor *output

An output tensor to hold the calculated exponential of each value from the *input* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT

"Hardware statuses" on page 8
```

Framework examples

- TensorFlow exponential (https://www.tensorflow.org/api_docs/python/tf/math/exp)
- ONNX exponential (https://github.com/onnx/onnx/blob/master/docs/Operators.md#Exp)

Activation operations

The zDNN activation operations are:

- "Rectified linear (zdnn_relu)" on page 34
- "Hyperbolic tangent (zdnn_tanh)" on page 35
- "Sigmoid (zdnn sigmoid)" on page 36
- "Softmax (zdnn_softmax)" on page 36

Rectified linear (zdnn_relu)

Description

Given an input tensor in zDNN transformed format, produce an output tensor where the rectified linear function, $y = \max(0, x)$, is applied to the input tensor element-wise. If an optional clipping_value is provided, clipping is performed against the intermediate output, where $z = \min(y, clipping_value)$.

Format

Parameters

zdnn ztensor *input

An input tensor with values to evaluate. The tensor must satisfy the requirements in <u>"General zTensor</u> requirements" on page 5.

void *clipping_value

A pointer to an FP32 value used to clip the elements of the input tensor. If set to NULL or 0, no clipping occurs. The clipping value must not be negative.

zdnn_ztensor *output

An output tensor to hold the rectified linear function result of each value from the *input* tensor.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT

ZDNN_INVALID_CLIPPING_VALUE

"Hardware statuses" on page 8
```

Framework examples

- TensorFlow rectified linear (https://www.tensorflow.org/api_docs/python/tf/math/relu)
- ONNX rectified linear (https://github.com/onnx/onnx/blob/master/docs/Operators.md#relu)

Hyperbolic tangent (zdnn_tanh)

Description

Given an input tensor in zDNN transformed format, produce an output tensor where the hyperbolic tangent function is applied to the input tensor element-wise.

Format

```
zdnn_status zdnn_tanh(const zdnn_ztensor *input, zdnn_ztensor *output);
```

Parameters

zdnn_ztensor *input

An input tensor with values to evaluate. The tensor must satisfy the requirements in <u>"General zTensor</u> requirements" on page 5.

zdnn_ztensor *output

An output tensor to hold the hyperbolic tangent result of each value from the *input* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT

"Hardware statuses" on page 8
```

Framework examples

- TensorFlow hyperbolic tangent (https://www.tensorflow.org/api_docs/python/tf/math/tanh)
- ONNX hyperbolic tangent (https://github.com/onnx/onnx/blob/master/docs/Operators.md#Tanh)

Sigmoid (zdnn_sigmoid)

Description

Given an input tensor in zDNN transformed format, produce an output tensor where the sigmoid function is applied to the input element-wise.

Format

```
zdnn_status zdnn_tanh(const zdnn_ztensor *input, zdnn_ztensor *output);
```

Parameters

zdnn_ztensor *input

An input tensor with values to evaluate. The tensor must satisfy the requirements in <u>"General zTensor</u> requirements" on page 5.

zdnn_ztensor *output

An output tensor to hold the sigmoid result of each value from the *input* tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT
"Hardware statuses" on page 8
```

Framework examples

- TensorFlow sigmoid (https://www.tensorflow.org/api docs/python/tf/math/sigmoid)
- ONNX sigmoid (https://github.com/onnx/onnx/blob/master/docs/Operators.md#Sigmoid)

Softmax (zdnn_softmax)

Description

Given an input tensor in zDNN transformed format, compute the softmax (normalized exponential) for each vector formed in dimension 1, then if *act_func* is not SOFTMAX_ACT_NONE, apply the activation function to the results, and store the results into the provided output zDNN tensor.

Note: Other parameters, such as **axis**, are not supported.

Format

Parameters

zdnn ztensor *input

An input tensor with a ZDNN_3DS layout and pre-transformed shape of [batch size, batch size, vector dimension size] or output from another operation that is of the correct shape. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

void *save area

The address of preallocated memory to use for temporary storage during internal processing. The preallocated memory must be at least 8K bytes in size and aligned on a 4K boundary. If set to NULL, the operation determines, allocates, and frees storage automatically.

zdnn_softmax_act act_func

The activation function to apply to the results. Valid values are SOFTMAX_ACT_NONE or SOFTMAX_ACT_LOG.

zdnn_ztensor *output

An output tensor with a ZDNN_3DS layout and the same shape as the *input* tensor to hold the softmax result of each value from the *input* tensor. The tensor must satisfy the requirements in <u>"General</u> zTensor requirements" on page 5.

Programming notes

- If all elements of a dimension 1 vector are the largest-magnitude negative number possible for the transformed data type, accuracy may be reduced.
- A ZDNN_3DS tensor is expected, where the transformed_desc dimension 1 (dim1) describes the vector, and dim2 and dim4 are used to batch multiple vector requests together. The dim3 dimension must always be 1. The zdnn_softmax operation is performed against the vector in dim1, repeating for each dim1 vector in the dim4 and dim2 dimensions.
- Tensors that cannot be processed as vectors in dimension 1 or as batches of dimension 1 vectors must be coerced or reshaped by the caller.

When the entire tensor is to be processed by softmax, it can be coerced by creating an alternate descriptor prior to zDNN transformation. For example:

- A 4D tensor with pre_transformed_desc dimensions 2x2x2x2 and a data array of 16 FP32 entries could have an alternate ZDNN_3DS layout pre_transformed_desc using dimensions 1x1x16 and use the same original data array prior to the zdnn_transform_ztensor call. After transformation, such a tensor would be valid for the zdnn_softmax operation.
- As a further example, the 4D 2x2x2x2 tensor could be processed as 2 batches of 8 vectors using a ZDNN_3DS layout pre_transformed_desc with dimensions 1x2x8.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT

ZDNN_ALLOCATION_FAILURE — A preallocated save area was not specified and internal allocation for the required memory failed.

"Hardware statuses" on page 8

ZDNN_FUNC_RC_F000 — Dimension 3 of the input tensor ($input->transformed_desc->dim3$) is not 1.

ZDNN_FUNC_RC_F001 — Invalid act_func value.

Framework examples

- TensorFlow softmax (https://www.tensorflow.org/api_docs/python/tf/math/softmax)
- ONNX softmax (https://github.com/onnx/onnx/blob/master/docs/Operators.md#Softmax)

Normalization operations

The zDNN normalization operations are:

- "Mean reduce (zdnn_meanreduce2d)" on page 38
- "Batch norm (zdnn_batchnorm)" on page 39

Mean reduce (zdnn_meanreduce2d)

Description

Given an input tensor in zDNN transformed format, produce a downsampled tensor reducing the middle dimensions to a size of 1 based on the mean of the original values and store the result into the provided output zDNN tensor.

Format

```
zdnn_status zdnn_meanreduce2d(const zdnn_ztensor *input, zdnn_ztensor *output);
```

Parameters

zdnn_ztensor *input

A ZDNN_NHWC tensor with a pre-transformed of [batch_Num, Height, Width, Channel]. The Height and Width dimensions must be less than or equal to 1024. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *output

The output tensor to hold the result of the pooling operation in its buffer with shape as follows:

- The *output* dimensions *batch_Num* and *Channel* must be the same as the respective *input* dimensions.
- The output dimensions Height and Width must be 1.

The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

ZDNN_OK

ZDNN_INVALID_SHAPE — The shape of the input or output tensor is invalid based on the given kernel and stride parameters.

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT

"Hardware statuses" on page 8

ZDNN_FUNC_RC_F001 — The input tensor has a *Height* or *Width* dimension greater than allowed for **zdnn_meanreduce2d**.

Framework examples

- TensorFlow reduce mean with axis set for the Height and Width axes, and **keepdims** set to true (https://www.tensorflow.org/api_docs/python/tf/math/reduce_mean)
- ONNX reduce mean (https://github.com/onnx/onnx/blob/master/docs/Operators.md#ReduceMean)

Batch norm (zdnn_batchnorm)

Description

Given 3 input zDNN tensors, *input_a*, *input_b*, and *input_c*, compute the batch-normalized result for each vector formed in dimension 1 according to the following formula:

```
ouptut = input_b × input_a + input_c
```

where $input_b$ is a precomputed elementwise divide of scale and variance tensors, and $input_c$ is a precomputed elementwise multiply of (-1) * mean and $input_b + input$ bias tensors.

Format

Parameters

zdnn_ztensor *input_a

Must be a 4D, ZDNN_NHWC input tensor. The tensor must satisfy the requirements in <u>"General</u> zTensor requirements" on page 5.

zdnn_ztensor *input_b

Must be a 1D tensor. The tensor must satisfy the requirements in <u>"General zTensor requirements" on</u> page 5.

zdnn_ztensor *input_c

Must be a 1D tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_ztensor *output

An output tensor of the same size as <code>input_a</code> to hold the computed value of the formula stated in "Description" on page 39. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK

"Warning statuses" on page 8

ZDNN_INVALID_SHAPE

ZDNN_INVALID_TYPE

ZDNN_INVALID_FORMAT

"Hardware statuses" on page 8
```

Framework examples

- TensorFlow Batchnorm (https://www.tensorflow.org/api_docs/python/tf/keras/layers/BatchNormalization)
- <u>ONNX Batchnorm</u> (https://github.com/onnx/onnx/blob/master/docs/ Operators.md#BatchNormalization)

Matmul and matmul with broadcast

The zDNN matmul and matmul with broadcast functions are:

• "zdnn_matmul_op" on page 40

• "zdnn_matmul_bcast_op" on page 41

zdnn_matmul_op

Description

Given three input zDNN tensors, ($input_a$, $input_b$, and $input_c$, determine the matrix multiplication of $input_a \times input_b$, then perform one of the following operations using $input_c$ against the dot product, and store the result into the specified output zDNN tensor.

Operations:

- Addition
- Compare if dot product is greater than element
- Compare if dot product is greater than or equal to element
- Compare if dot product is equal to element
- Compare if dot product is not equal to element
- Compare if dot product is less than or equal to element
- Compare if dot product is less than element

For an operation type of addition, *input_c* is added to the intermediate dot product.

For operation types of comparison, the intermediate dot product is compared to *input_c* and if the comparison is true, the result is set to 1; otherwise, it is set to 0.

The outermost dimension can optionally indicate that the inputs are stacks of matrices. The results for each matrix stack are independent of other stacks, but all stacks are calculated in a single call.

Format

Input and output requirements for matmul tensors

- All tensors must either be stacked or unstacked.
- The tensor must satisfy the requirements in "General zTensor requirements" on page 5.
- Table 7 on page 40 lists the requirements for *pre_transformed_desc* and shape requirements for each tensor.

Туре	input_a	input_b	input_c	output
Unstacked	ZDNN_2D (m, n)	ZDNN_2D (n, p)	ZDNN_1D (p)	ZDNN_2D (m, p)
Stacked	ZDNN_3DS (s, m, n)	ZDNN_3DS (s, n, p)	ZDNN_2DS (s, p)	ZDNN_3DS (s, m, p)

Parameters

zdnn_ztensor *input_a

An input tensor with the first matrix for multiplication. The pre-transformed shape and layout must be as described in "Input and output requirements for matmul tensors" on page 40.

zdnn ztensor *input b

An input tensor with the second matrix for multiplication. The pre-transformed shape and layout must be as described in "Input and output requirements for matmul tensors" on page 40.

zdnn_ztensor *input_c

An input tensor that will have the requested operation performed against the intermediate dot product of *input_a* and *input_b*. The pre-transformed shape and layout must be as described in <u>"Input</u> and output requirements for matmul tensors" on page 40.

zdnn_matmul_ops op_type

The operation to perform on the dot product. Valid values are:

```
MATMUL_OP_ADDITION
MATMUL_OP_GREATER
MATMUL_OP_GREATER_EQUAL
MATMUL_OP_EQUAL
MATMUL_OP_NOT_EQUAL
MATMUL_OP_LESSER_EQUAL
MATMUL_OP_LESSER
```

zdnn ztensor *output

The output tensor that will hold the result of the operation in its buffer. The pre-transformed shape and layout must be as described in "Input and output requirements for matmul tensors" on page 40.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

```
ZDNN_OK
ZDNN_INVALID_SHAPE
ZDNN_INVALID_TYPE
ZDNN_INVALID_FORMAT
"Hardware statuses" on page 8
ZDNN_FUNC_RC_F000 — Invalid op_type value
```

Framework examples

- TensorFlow matmul (https://www.tensorflow.org/api_docs/cc/class/tensorflow/ops/mat-mul)
- ONNX matmul (https://github.com/onnx/onnx/blob/master/docs/Operators.md#MatMul)

zdnn_matmul_bcast_op

Description

Given three input zDNN tensors, $input_a$, $input_b$, and $input_c$, determine the matrix multiplication of $input_a \times input_b + bias$, then perform one of the following operations using $input_c$ against the dot product, and store the result into the specified output zDNN tensor.

Operations:

Addition

The outermost dimension for *input_a* can optionally indicate that the input is a stack of matrices. Each stack of *input_a* is multiplied by the same *input_b* matrix and *input_c* which are broadcast over each stack of *input_a*. The results for each stack are returned in the corresponding stack index of *output*.

Format

Input and output requirements for matmul broadcast tensors

- The tensor must satisfy the requirements in "General zTensor requirements" on page 5.
- Table 8 on page 42 lists the requirements for *pre_transformed_desc* and shape for stacked and unstacked tensors.

Table 8. Requirements for pre_transformed_desc and shape for matmul broadcast tensors

input_a	input_b	input_c	output
ZDNN_3DS (s, m, n)	ZDNN_2D (n, p)	ZDNN_1D (p)	ZDNN_3DS (s, m, p)

Parameters

zdnn ztensor *input a

An input tensor with the first matrix for multiplication. The pre-transformed shape and layout must be as described in Table 8 on page 42.

zdnn_ztensor *input_b

An input tensor with the second matrix for multiplication. The same single $input_b$ matrix is broadcast and used as the multiplier for each stack dimension of $input_a$. The pre-transformed shape and layout must be as described in Table 8 on page 42.

zdnn_ztensor *input_c

An input tensor that will have the requested operation performed against the intermediate dot product for each *m* dimension in *output*. The pre-transformed shape and layout must be as described in Table 8 on page 42.

zdnn_matmul_bcast_ops op_type

The operation to perform on the dot product. Valid values are:

MATMUL_BCAST_OP_ADDITION

zdnn ztensor *output

The output tensor that will hold the result of the operation in its buffer. The pre-transformed shape and layout must be as described in Table 8 on page 42.

Programming notes

The **zdnn_matmul_bcast_op** function only supports a value of MATMUL_BCAST_OP_ADDITION for *op type*. Any other values are ignored and may not operate compatibly in the future.

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

ZDNN_OK
ZDNN_INVALID_SHAPE
ZDNN_INVALID_TYPE
ZDNN_INVALID_FORMAT
"Hardware statuses" on page 8

Framework examples

- TensorFlow matmul (https://www.tensorflow.org/api_docs/cc/class/tensorflow/ops/mat-mul)
- ONNX matmul (https://github.com/onnx/onnx/blob/master/docs/Operators.md#MatMul)

LSTM (zdnn lstm)

Description

Implements the Long-Short Term Memory¹ (LSTM) layer. The following formula is computed for the input tensor, t, for all time steps. The defaults are: f = Sigmoid, g = Tanh, h = Tanh.

```
it = f(Xt*(Wi^T) + Ht-1*(Ri^T) + Wbi + Rbi)
ft = f(Xt*(Wf^T) + Ht-1*(Rf^T) + Wbf + Rbf)
ct = g(Xt*(Wc^T) + Ht-1*(Rc^T) + Wbc + Rbc)
Ct = ft (.) Ct-1 + it (.) ct
ot = f(Xt*(Wo^T) + Ht-1*(Ro^T) + Wbo + Rbo)
Ht = ot (.) h(Ct)
```

Format

```
zdnn_status zdnn_lstm(const zdnn_ztensor *input, const zdnn_ztensor *h0,
                        const zdnn_ztensor *c0, const zdnn_ztensor *weights,
                        const zdnn_ztensor *biases,
const zdnn_ztensor *hidden_weights,
                        const zdnn_ztensor *hidden_biases,
                        lstm_gru_direction direction, void *work_area,
                        zdnn_ztensor *hn_output, zdnn_ztensor *cf_output);
```

For an example of the calling syntax, see "Example: Calling the zdnn_lstm API (forward)" on page 60.

LSTM input / output requirements

Any *num_hidden* dimension must be less than or equal to 8192 elements.

Parameters

zdnn ztensor *input

An input tensor with shape (num timesteps, num batches, num features) prior to transformation by the **zdnn_transform_ztensor** function. The value of *pre_transformed_desc->layout* must be ZDNN_3DS. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn ztensor *h0

An input tensor that contains the initial hidden state with shape (num_dirs, num_batches, num_hidden) prior to transformation by the zdnn_transform_ztensor function. The value of pre transformed desc->layout must be ZDNN 3DS. The tensor must satisfy the requirements in "General zTensor requirements" on page 5. The tensor must also satisfy the requirements in "LSTM input / output requirements" on page 43.

zdnn ztensor *c0

An input tensor that contains the initial cell state with shape (num_dirs, num_batches, num_hidden) prior to transformation by the zdnn_transform_ztensor function. The value of pre_transformed_desc->layout must be ZDNN_3DS. The tensor must satisfy the requirements in "General zTensor requirements" on page 5. The tensor must also satisfy the requirements in "LSTM input / output requirements" on page 43.

zdnn_ztensor *weights

An input tensor that contains the concatenated input connection weights in Forget, Input, Cell, Output (FICO) order. Prior to transformation, each gate must be transposed to shape (num dirs, num_features, num_hidden) by the caller. The value of pre_transformed_desc->layout must be ZDNN 3DS. The **zdnn_concat_info** field must have the following flags turned on:

¹ Hochreiter, 1997.

- RNN_TYPE_LSTM
- USAGE WEIGHTS
- Appropriate PREV_LAYER flag:
 - PREV_LAYER_NONE, if input tensor is not from a previous RNN layer.
 - PREV_LAYER_UNI, if *input* tensor is unidirectional output from a previous RNN layer.
 - PREV_LAYER_BIDIR, if *input* tensor is bidirectional output from a previous RNN layer.

The tensor must satisfy the requirements in <u>"Concatenated zTensor requirements" on page 5</u>) and "LSTM input / output requirements" on page 43.

zdnn_ztensor *biases

An input tensor that contains the concatenated input connection bias in FICO order. Prior to transformation, each gate must be of shape (num_dirs, num_hidden). The value of pre_transformed_desc->layout must be ZDNN_2DS. The zdnn_concat_info field must have the following flags turned on:

- RNN_TYPE_LSTM
- USAGE_BIASES
- Appropriate PREV_LAYER flag:
 - PREV_LAYER_NONE, if *input* tensor is not from a previous RNN layer.
 - PREV_LAYER_UNI, if *input* tensor is unidirectional output from a previous RNN layer.
 - PREV_LAYER_BIDIR, if input tensor is bidirectional output from a previous RNN layer.

The tensor must satisfy the requirements in "Concatenated zTensor requirements" on page 5) and "LSTM input / output requirements" on page 43.

zdnn ztensor *hidden weights

An input tensor that contains the concatenated hidden connection weights in FICO order. Prior to transformation, each gate must be transposed to shape (num_dirs, num_hidden, num_hidden) by the caller. The value of pre_transformed_desc->layout must be ZDNN_3DS. The zdnn_concat_info field must have the following flags turned on:

- RNN TYPE LSTM
- USAGE_HIDDEN_WEIGHTS
- Appropriate PREV_LAYER flag:
 - PREV_LAYER_NONE, if *input* tensor is not from a previous RNN layer.
 - PREV LAYER UNI, if *input* tensor is unidirectional output from a previous RNN layer.
 - PREV_LAYER_BIDIR, if *input* tensor is bidirectional output from a previous RNN layer.

The tensor must satisfy the requirements in <u>"Concatenated zTensor requirements"</u> on page 5) and "LSTM input / output requirements" on page 43.

zdnn ztensor *hidden biases

An input tensor that contains the concatenated hidden connection bias in FICO order. Prior to transformation, each gate must be of shape (num_dirs, num_hidden). The value of pre_transformed_desc->layout must be ZDNN_2DS. The zdnn_concat_info field must have the following flags turned on:

- RNN_TYPE_LSTM
- USAGE HIDDEN BIASES
- Appropriate PREV_LAYER flag:
 - PREV_LAYER_NONE, if *input* tensor is not from a previous RNN layer.
 - PREV_LAYER_UNI, if *input* tensor is unidirectional output from a previous RNN layer.
 - PREV_LAYER_BIDIR, if *input* tensor is bidirectional output from a previous RNN layer.

The tensor must satisfy the requirements in <u>"Concatenated zTensor requirements" on page 5</u>) and "LSTM input / output requirements" on page 43.

lstm gru direction direction

A direction indicator of **lstm_gru_direction** direction type. Valid values are:

```
FWD (forward)
BWD (backward)
BIDIR (bidirectional)
```

For input and output shapes, the num_dirs dimension should be:

- 1 for unidirectional calls, such as FWD or BWD
- 2 for bidirectional calls, such that:
 - Dimension 0 contains FWD values.
 - Dimension 1 contains BWD values.

void *work_area

The address of preallocated memory to use for temporary storage during internal operation processing. If set to NULL, the operation determines, allocates, and frees storage automatically. The amount of required storage can be determined given the LSTM num_timesteps, num_batches, and num_hidden values. For bidirectional operations, twice the amount of contiguous storage is required. The start of the buffer storage must be 4K-aligned.

The following sample code creates a zTensor descriptor that is an equivalent size of the required work_area. To use this sample code, replace the num_timesteps, num_batches, and num_hidden variables with your own values.

```
zdnn_tensor_desc desc;
desc.dim4 = (4 * num_timesteps) + 6;
desc.dim3 = 1;
desc.dim2 = num_batches;
desc.dim1 = num_hidden;
uint64_t work_area_size = zdnn_getsize_ztensor(&desc);
```

zdnn ztensor*hn output

An output tensor to hold the results of the hidden states. The value of $pre_transformed_desc-> layout$ must be ZDNN_4DS.

The tensor must satisfy the requirements in "General zTensor requirements" on page 5. The tensor must also satisfy the requirements in "LSTM input / output requirements" on page 43.

Output pre-transformed shapes:

- All timesteps: (num timesteps, num dirs, num batches, num hidden)
- Final timestep only: (1, num_dirs, num_batches, num_hidden)

For bidirectional (BIDIR) output:

- Forward and backward results are concatenated on the innermost dimension.
- Can be used directly as input for subsequent RNN layers without needing untransformation. Cannot be used directly as input for other non-RNN zDNN operations.
- Untransformation is supported.

Note that for BWD and the backward component of BIDIR directions, the output order matches the order of the input, not the processing order. For instance, the first input time step is the last to be processed, and its result is the first time step of the output.

zdnn_ztensor *cf_output

An output tensor to hold the results of the cell state for the last processed time step. The value of **pre_transformed_desc->layout** must be ZDNN_4DS. The tensor must satisfy the requirements in <u>"General zTensor requirements"</u> on page 5. The tensor must also satisfy the requirements in <u>"LSTM"</u> input / output requirements" on page 43.

Output pre-transformed shapes: (1, num_dirs, num_batches, num_hidden) For bidirectional (BIDIR) output:

- Forward and backward results are concatenated on the innermost dimension.
- Cannot be used directly as input for other non-RNN zDNN operations.
- Untransformation of output is supported.

Summary

Table 9. Summary of 2	Table 9. Summary of zdnn_lstm parameters		
Parameter	Pre-transformed layout	Pre-transformed shape	To create transformed descriptor
input	ZDNN_3DS	(num_timesteps, num_batches, num_features)	zdnn_generate_transformed_desc
h0	ZDNN_3DS	(num_dirs, num_batches, num_hidden)	zdnn_generate_transformed_desc
c0	ZDNN_3DS	(num_dirs, num_batches, num_hidden)	zdnn_generate_transformed_desc
weights	ZDNN_3DS	(num_dirs, num_features, num_hidden)	zdnn_generate_transformed_desc_concatenated RNN_TYPE_LSTM + USAGE_WEIGHTS + one of: PREV_LAYER_NONE / PREV_LAYER_UNI / PREV_LAYER_BIDIR
biases	ZDNN_2DS	(num_dirs, num_hidden)	zdnn_generate_transformed_desc_concatenated RNN_TYPE_LSTM + USAGE_BIASES + one of: PREV_LAYER_NONE / PREV_LAYER_UNI / PREV_LAYER_BIDIR
hidden_weights	ZDNN_3DS	(num_dirs, num_hidden, num_hidden)	zdnn_generate_transformed_desc_concatenated RNN_TYPE_LSTM+USAGE_HIDDEN_WEIGHTS+one of: PREV_LAYER_NONE / PREV_LAYER_UNI / PREV_LAYER_BIDIR
hidden_biases	ZDNN_2DS	(num_dirs, num_hidden)	zdnn_generate_transformed_desc_concatenated RNN_TYPE_LSTM+USAGE_HIDDEN_BIASES + one of: PREV_LAYER_NONE / PREV_LAYER_UNI / PREV_LAYER_BIDIR
hn_output	ZDNN_4DS	(num_timesteps, num_dirs, num_batches, num_hidden) (Last time step only when num_timesteps = 1)	zdnn_generate_transformed_desc
cf_output	ZDNN_4DS	(1, num_dirs, num_batches, num_hidden)	zdnn_generate_transformed_desc

Returns

One of the following **zdnn_status** indicators (as described in "zDNN statuses" on page 7):

Status	Meaning	
ZDNN_OK	Success.	
ZDNN_INVALID_TYPE	ConffControl for Wordship and Property Control	
ZDNN_INVALID_FORMAT	– See <u>"General failing statuses" on page 8.</u>	
ZDNN_INVALID_SHAPE	Any of the following reasons:	
	• The <i>hn_output</i> timesteps dimension must be 1 or the same size as the <i>input</i> timestep dimension.	
	• All tensors with a direction dimension have the same direction dimension size.	
	• The <i>input</i> timestep dimension must be greater than or equal to 1.	
	Other general shape violations (such as, exceeds MDIS, and others)	
ZDNN_INVALID_DIRECTION	The specified <i>direction</i> parameter is not a recognized lstm_gru_direction direction.	
ZDNN_ALLOCATION _FAILURE	A preallocated <i>work_area</i> was not specified and internal allocation for the required memory failed.	

Status	Meaning
Hardware statuses	See <u>"Hardware statuses" on page 8.</u>

Framework examples

- TensorFlow LSTM (https://www.tensorflow.org/api_docs/python/tf/keras/layers/LSTMCell)
- ONNX LSTM (https://github.com/onnx/onnx/blob/master/docs/Operators.md#LSTM)

GRU (zdnn_gru)

Description

Implements Gated Recurrent Unit² (GRU), and only supports reset after linear.

The following formula is computed for the input tensor, input(t), for all time steps. The defaults are: f = Sigmoid, g = Tanh.

```
 zt = f(Xt*(Wz^T) + Ht-1*(Rz^T) + Wbz + Rbz)   rt = f(Xt*(Wr^T) + Ht-1*(Rr^T) + Wbr + Rbr)   ht = g(Xt*(Wh^T) + (rt (.) (Ht-1*(Rh^T) + Rbh)) + Wbh)   Ht = (1 - zt) (.) ht + zt (.) Ht-1
```

Format

For an example of the calling syntax, see "Example: Calling the zdnn_gru API (forward)" on page 73.

GRU input / output requirements

Any *num_hidden* dimension must be less than or equal to 10,880 elements.

Parameters

zdnn_ztensor *input

An input tensor with shape (num_timesteps, num_batches, num_features) prior to transformation by the **zdnn_transform_ztensor** function. The value of *pre_transformed_desc->layout* must be ZDNN_3DS. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_ztensor *h0

An input tensor that contains the initial hidden state with shape (num_dirs, num_batches, num_hidden) prior to transformation by the **zdnn_transform_ztensor** function. The value of <code>pre_transformed_desc->layout</code> must be ZDNN_3DS. The tensor must satisfy the requirements in "General zTensor requirements" on page 5. The tensor must also satisfy the requirements in "GRU input / output requirements" on page 47.

zdnn ztensor *weights

An input tensor that contains the concatenated input connection weights in (Z)update, Reset, Hidden (ZRH) order. Prior to transformation, each gate must be transposed to shape (num_dirs, num_features, num_hidden) by the caller. The value of pre_transformed_desc->layout must be ZDNN_3DS. The zdnn_concat_info field must have the following flags turned on:

² Kyunghyun Cho, 2014.

- RNN_TYPE_GRU
- USAGE WEIGHTS
- Appropriate PREV_LAYER flag:
 - PREV_LAYER_NONE, if input tensor is not from a previous RNN layer.
 - PREV_LAYER_UNI, if *input* tensor is unidirectional output from a previous RNN layer.
 - PREV_LAYER_BIDIR, if input tensor is bidirectional output from a previous RNN layer.

The tensor must satisfy the requirements in "Concatenated zTensor requirements" on page 5 and "GRU input / output requirements" on page 47.

zdnn_ztensor *biases

An input tensor that contains the concatenated input connection bias in ZRH order. Prior to transformation, each gate must be of shape (num_dirs, num_hidden). The value of pre_transformed_desc->layout must be ZDNN_2DS. The zdnn_concat_info field must have the following flags turned on:

- RNN_TYPE_GRU
- USAGE_BIASES
- Appropriate PREV_LAYER flag:
 - PREV_LAYER_NONE, if *input* tensor is not from a previous RNN layer.
 - PREV_LAYER_UNI, if *input* tensor is unidirectional output from a previous RNN layer.
 - PREV_LAYER_BIDIR, if input tensor is bidirectional output from a previous RNN layer.

The tensor must satisfy the requirements in "Concatenated zTensor requirements" on page 5 and "GRU input / output requirements" on page 47.

zdnn ztensor *hidden weights

An input tensor that contains the concatenated hidden connection weights in ZRH order. Prior to transformation, each gate must be transposed to shape (num_dirs, num_hidden, num_hidden) by the caller. The value of pre_transformed_desc->layout must be ZDNN_3DS. The zdnn_concat_info field must have the following flags turned on:

- RNN TYPE GRU
- USAGE_HIDDEN_WEIGHTS
- Appropriate PREV_LAYER flag:
 - PREV_LAYER_NONE, if input tensor is not from a previous RNN layer.
 - PREV LAYER UNI, if *input* tensor is unidirectional output from a previous RNN layer.
 - PREV_LAYER_BIDIR, if *input* tensor is bidirectional output from a previous RNN layer.

The tensor must satisfy the requirements in <u>"Concatenated zTensor requirements" on page 5</u> and "GRU input / output requirements" on page 47.

zdnn ztensor *hidden biases

An input tensor that contains the concatenated hidden connection bias in ZRH order. Prior to transformation, each gate must be of shape (num_dirs, num_hidden). The value of pre_transformed_desc->layout must be ZDNN_2DS. The zdnn_concat_info field must have the following flags turned on:

- RNN_TYPE_GRU
- USAGE HIDDEN BIASES
- Appropriate PREV_LAYER flag:
 - PREV_LAYER_NONE, if *input* tensor is not from a previous RNN layer.
 - PREV_LAYER_UNI, if *input* tensor is unidirectional output from a previous RNN layer.
 - PREV_LAYER_BIDIR, if *input* tensor is bidirectional output from a previous RNN layer.

The tensor must satisfy the requirements in "Concatenated zTensor requirements" on page 5 and "GRU input / output requirements" on page 47.

lstm gru direction direction

A direction indicator of **lstm_gru_direction** direction type. Valid values are:

```
FWD (forward)
BWD (backward)
BIDIR (bidirectional)
```

For input shapes, the num_dirs dimension should be:

- 1 for unidirectional calls, such as FWD or BWD
- 2 for bidirectional calls, such that:
 - Dimension 0 contains FWD values.
 - Dimension 1 contains BWD values.

void work_area

The address of preallocated memory to use for temporary storage during internal operation processing. If set to NULL, the operation determines, allocates, and frees storage automatically. The amount of required storage can be determined from the GRU timestep, batch, and num_hidden values. For bidirectional operations, twice the amount of contiguous storage is required. The start of the buffer storage must be 4K-aligned.

The following sample code creates a zTensor descriptor that is an equivalent size of the required work_area. To use this sample code, replace the num_timesteps, num_batches, and num_hidden variables with your own values.

```
zdnn_tensor_desc desc;
desc.dim4 = (3 * timestep) + 5;
desc.dim3 = 1;
desc.dim2 = batch;
desc.dim1 = hidden_state_size;
uint64_t work_area_size = zdnn_getsize_ztensor(&desc);
```

zdnn ztensor *hn output

An output tensor to hold the results of the hidden states. The value of $pre_transformed_desc-> layout$ must be ZDNN_4DS.

The tensor must satisfy the requirements in "General zTensor requirements" on page 5. The tensor must also satisfy the requirements in "GRU input / output requirements" on page 47.

Output pre-transformed shapes:

- All timesteps: (num_timesteps, num_dirs, num_batches, num_hidden)
- Final timestep only: (1, num_dirs, num_batches, num_hidden)

For bidirectional (BIDIR) output:

- Forward and backward results are concatenated on the innermost dimension.
- Can be used directly as input for subsequent RNN layers without needing untransformation.
- Untransformation of output is supported.

Note that for BWD and the backward component of BIDIR directions, the output order matches the order of the input, not the processing order. For instance, the first input time step is the last to be processed, and its result is the first time step of the output.

Summary

Table 10. Summary of zdnn_gru parameters				
Parameter	Pre-transformed layout	Pre-transformed shape	To create transformed descriptor	
input	ZDNN_3DS	(num_timesteps, num_batches, num_features)	zdnn_generate_transformed_desc	
h0	ZDNN_3DS	(num_dirs, num_batches, num_hidden)	zdnn_generate_transformed_desc	
c0	ZDNN_3DS	(num_dirs, num_batches, num_hidden)	zdnn_generate_transformed_desc	
weights	ZDNN_3DS	(num_dirs, num_features, num_hidden)	zdnn_generate_transformed_desc_concatenated RNN_TYPE_GRU + USAGE_WEIGHTS + one of: PREV_LAYER_NONE / PREV_LAYER_UNI / PREV_LAYER_BIDIR	
biases	ZDNN_2DS	(num_dirs, num_hidden)	zdnn_generate_transformed_desc_concatenated RNN_TYPE_GRU + USAGE_BIASES + one of: PREV_LAYER_NONE / PREV_LAYER_UNI / PREV_LAYER_BIDIR	
hidden_weights	ZDNN_3DS	(num_dirs, num_hidden, num_hidden)	zdnn_generate_transformed_desc_concatenated RNN_TYPE_GRU + USAGE_HIDDEN_WEIGHTS + one of: PREV_LAYER_NONE / PREV_LAYER_UNI / PREV_LAYER_BIDIR	
hidden_biases	ZDNN_2DS	(num_dirs, num_hidden)	zdnn_generate_transformed_desc_concatenated RNN_TYPE_GRU + USAGE_HIDDEN_BIASES + one of: PREV_LAYER_NONE / PREV_LAYER_UNI / PREV_LAYER_BIDIR	
hn_output	ZDNN_4DS	(num_timesteps, num_dirs, num_batches, num_hidden) (Last timestep only when num_timesteps = 1)	zdnn_generate_transformed_desc	

Returns

One of the following **zdnn_status** indicators (as described in <u>"zDNN statuses" on page 7</u>):

Status	Meaning	
ZDNN_OK	Success.	
ZDNN_INVALID_TYPE	Con "Conoval failing statuses" on page 0	
ZDNN_INVALID_FORMAT	"General failing statuses" on page 8.	
ZDNN_INVALID_SHAPE	Any of the following reasons:	
	 The hn_output timesteps dimension must be 1 or the same size as the input timestep dimension. 	
	 All tensors with a direction dimension have the same direction dimension size. 	
	 The input timestep dimension must be greater than or equal to 1. 	
	Other general shape violations (such as, exceeds MDIS, and others).	
ZDNN_INVALID_DIRECTION	The specified <i>direction</i> parameter is not a recognized lstm_gru_direction direction.	
ZDNN_ALLOCATION _FAILURE	A preallocated <i>work_area</i> was not specified and internal allocation for the required memory failed.	
Hardware statuses	See <u>"Hardware statuses" on page 8</u> .	

Framework examples

- TensorFlow GRU (https://www.tensorflow.org/api_docs/python/tf/keras/layers/GRUCell)
- ONNX GRU (https://github.com/onnx/onnx/blob/master/docs/Operators.md#GRU)

Average pool 2D (zdnn_avgpool2d)

Description

Given an input tensor in zDNN transformed format, padding type, kernel size, and kernel stride, produce a downsampled tensor, reducing the middle dimensions based on the mean values within the kernel window at each step, and store the results into the provided output zDNN tensor.

Format

Parameters

zdnn_ztensor *input

A tensor with original values to be downsampled in the output tensor. This must be a ZDNN_NHWC tensor with a pre-transformed shape of [batch_Num, Height, Width, Channel]. See "AvgPool2D parameter restrictions" on page 52 for information about the expected shape of the input tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

padding_type

The type of padding to use for the pooling operations. Valid values are SAME_PADDING or VALID_PADDING. See "AvgPool2D parameter restrictions" on page 52 for information about the expected padding_type value. For information about same and valid padding, see What is the difference between 'SAME' and 'VALID' padding in tf.nn.max_pool of tensorflow? (https://www.pico.net/kb/what-is-the-difference-between-same-and-valid-padding-in-tf-nn-max-pool-of-tensorflow).

kernel height

The size of the kernel window that passes over the height dimension of the input tensor. See <u>"AvgPool2D parameter restrictions" on page 52</u> for information about the expected *kernel_height* value.

kernel width

The size of the kernel window that passes over the width dimension of the input tensor. See "AvgPool2D parameter restrictions" on page 52 for information about the expected *kernel_width* value.

stride_height

The number of positions the kernel moves over the height dimension of the input tensor at each step.

- If stride_height is 0, stride_width must also be 0.
- If strides are greater than 0, stride_height must be less than or equal to 30.

stride width

The number of positions the kernel moves over the width dimension of the input tensor at each step.

- If stride_height is 0, stride_width must also be 0.
- If strides are greater than 0, stride_width must be less than or equal to 30.

zdnn ztensor *output

The output tensor that will hold the result of the pooling operation in its buffer. This must be a ZDNN_NHWC tensor with a pre-transformed shape of [batch_Num, Height, Width, Channel]. See "AvgPool2D parameter restrictions" on page 52 for information about the expected shape of the output tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

AvgPool2D parameter restrictions

Parameter restrictions may vary based on the provided strides and padding type.

- The batch_Num and channel dimensions of the input tensor must always match the respective dimensions of the output tensor.
- If strides are 0:
 - The height dimension of the input tensor and the *kernel_height* value must match and be less than or equal to 1024.
 - The width dimension of the input tensor and the *kernel_width* value must match and be less than or equal to 1024.
 - The height and width dimensions of the output tensor must be 1.
 - The padding_type value must be VALID_PADDING.
- If strides are greater than 0:
 - The kernel_width and kernel_height values must be less than or equal to 64.
 - The height and weight dimensions of the input tensor must not be greater than 1024.
 - If the padding_type value is SAME_PADDING:
 - The height dimension of the output tensor must equal the following value:

```
ceil((float)input-height ÷ stride_height)
```

- The width dimension of the output tensor must equal the following value:

```
ceil((float)input-width ÷ stride_width)
```

- If the padding_type value is VALID_PADDING:
 - The height dimension of the output tensor must equal the following value:

```
ceil((float)(input-height - kernel_height + 1) ÷ stride_height)
```

- The width dimension of the output tensor must equal the following value:

```
ceil((float)(input-width - kernel_width + 1) ÷ stride_width)
```

Programming notes

If the magnitude of difference between elements of *input_tensor* is large (greater than 10), accuracy may be reduced.

Returns

One of the following **zdnn_status** indicators:

Status	Meaning
ZDNN_OK	Success.
ZDNN_INVALID_SHAPE	Shape of the input or output tensor is invalid based on the given kernel and stride parameters.
	Other general shape violations (such as, exceeds MDIS, and others).
ZDNN_INVALID_TYPE	
ZDNN_INVALID_FORMAT	See <u>"General failing statuses" on page 8</u> .
ZDNN_INVALID_STRIDE_PADDING	
ZDNN_INVALID_STRIDES	One stride was non-zero, but not the other.

Status	Meaning
Hardware statuses	See "Hardware statuses" on page 8.
	In addition, the ZDNN_EXCEEDS_MDIS hardware status also occurs if any of the following conditions occur:
	 The stride_height value is larger than the value returned by zdnn_get_nnpa_max_dim_idx_size.
	 The stride_width value is larger than the value returned by zdnn_get_nnpa_max_dim_idx_size.
	 The kernel_height value is 0 or is larger than the value returned by zdnn_get_nnpa_max_dim_idx_size.
	 The kernel_width value is 0 or is larger than the value returned by zdnn_get_nnpa_max_dim_idx_size.
ZDNN_FUNC_RC_F000	Invalid padding_type value.
ZDNN_FUNC_RC_F001	<pre>stride_height = 0 and stride_width = 0, but a kernel parameter is greater than allowed. See the earlier descriptions of the kernel_height and kernel_width parameters.</pre>
ZDNN_FUNC_RC_F002	stride_height > 0 and stride_width > 0, but a kernel parameter is greater than allowed. See the earlier descriptions of the kernel_height and kernel_width parameters.
ZDNN_FUNC_RC_F003	stride_height > 0 and stride_width > 0, but a stride parameter is greater than allowed. See the earlier descriptions of the stride_height and stride_width parameters.
ZDNN_FUNC_RC_F004	stride_height > 0 and stride_width > 0, but either the height or weight dimension of the input tensor is greater than 1024.

Framework examples

- TensorFlow AvgPool (https://www.tensorflow.org/api_docs/cc/class/tensorflow/ops/avg-pool)
- ONNX AvgPool (https://github.com/onnx/onnx/blob/master/docs/Operators.md#AveragePool)

Max pool 2D (zdnn_maxpool2d)

Description

Given an input tensor in zDNN transformed format, padding type, kernel size, and kernel stride, produce a downsampled tensor, reducing the middle dimensions based on the maximum values within the kernel window at each step, and store the results into the provided output zDNN tensor.

Format

```
zdnn_status zdnn_maxpool2d(const zdnn_ztensor *input,
                                            zdnn_pool_padding padding_type,
uint32_t kernel_height, uint32_t kernel_width,
uint32_t stride_height, uint32_t stride_width,
                                            zdnn_ztensor *output);
```

Parameters

zdnn_ztensor *input

An input tensor with original values to be downsampled in the output tensor. This must be a ZDNN_NHWC tensor with a pre-transformed shape of [batch_Num, Height, Width, Channel]. See "MaxPool2D parameter restrictions" on page 54 for information about the expected shape of the input tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

padding_type

The type of padding to use for the pooling operations. Valid values are SAME_PADDING or VALID_PADDING. See "MaxPool2D parameter restrictions" on page 54 for information about the expected value of padding_type. For information about "same" and "valid" padding, see What is the difference between 'SAME' and 'VALID' padding in tf.nn.max_pool of tensorflow? (https://www.pico.net/kb/what-is-the-difference-between-same-and-valid-padding-in-tf-nn-max-pool-of-tensorflow).

kernel_height

Size of the kernel window that passes over the height dimension of the input tensor. See <u>"MaxPool2D parameter restrictions"</u> on page 54 for information about the expected value of the *kernel_height*.

kernel_width

The size of the kernel window that passes over the width dimension of the input tensor. See "MaxPool2D parameter restrictions" on page 54 for information about the expected value of kernel width.

stride_height

The number of positions the kernel moves over the height dimension of the input tensor at each step.

- If stride_height is 0, stride_width must also be 0.
- If strides are greater than 0, stride_height must be less than or equal to 30.

stride_width

Number of positions the kernel moves over the width dimension of the input tensor at each step.

- If stride_height is 0, stride_width must also be 0.
- If strides are greater than 0, stride_width must be less than or equal to 30.

zdnn_ztensor *output

The output tensor that will hold the result of the pooling operation in its buffer. This must be a ZDNN_NHWC tensor with a pre-transformed shape of [batch_Num, Height, Width, Channel]. See "MaxPool2D parameter restrictions" on page 54 for information about the expected shape of the output tensor. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

MaxPool2D parameter restrictions

Parameter restrictions may vary based on the provided strides and padding type.

- The batch_Num and Channel dimensions of the input tensor must always match the respective dimensions of the output tensor.
- If strides are 0:
 - The Height dimension of the input tensor and the *kernel_height* value must match and must be less than or equal to 1024.
 - The Width dimension of the input tensor and the *kernel_width* value must match and must be less than or equal to 1024.
 - The height and width dimensions of the output tensor must be 1.
 - The padding_type value must be VALID_PADDING.
- If strides are greater than 0:
 - The kernel_width and kernel_height values must be less than or equal to 64.
 - The height and weight dimensions of the input tensor must not be greater than 1024.
 - If the padding_type value is SAME_PADDING:
 - The height dimension of the output tensor must equal the following value:

```
ceil((float)input-height ÷ stride_height)
```

- The width dimension of the output tensor must equal the following value:

```
ceil((float)input-width ÷ stride_width)
```

- If the padding type value is VALID PADDING:
 - The height dimension of the output tensor must equal the following value:

```
\texttt{ceil}((\texttt{float})(\texttt{input-height} - \texttt{kernel\_height} + \texttt{1}) \; \div \; \texttt{stride\_height})
```

- The width dimension of the output tensor must equal the following value:

```
ceil((float)(input-width - kernel\_width + 1) \div stride\_width)
```

Programming notes

• If the magnitude of difference between elements of *input* is large (greater than 10), accuracy may be reduced.

Returns

One of the following **zdnn_status** indicators:

Status	Meaning
ZDNN_OK	Success.
ZDNN_INVALID_SHAPE	Shape of the input or output tensor is invalid based on the given kernel and stride parameters.
	Other general shape violations (such as, exceeds MDIS, and others).
ZDNN_INVALID_TYPE	
ZDNN_INVALID_FORMAT	See <u>"General failing statuses" on page 8</u> .
ZDNN_INVALID_STRIDE_PADDING	_
ZDNN_INVALID_STRIDES	One stride is non-zero, but not the other.
Hardware statuses	See <u>"Hardware statuses" on page 8.</u>
	In addition, the ZDNN_EXCEEDS_MDIS hardware status also occurs if any of the following conditions occur:
	 The stride_height value is larger than the value returned by zdnn_get_nnpa_max_dim_idx_size.
	 The stride_width value is larger than the value returned by zdnn_get_nnpa_max_dim_idx_size.
	 The kernel_height value is 0 or is larger than the value returned by zdnn_get_nnpa_max_dim_idx_size.
	 The kernel_width value is 0 or is larger than the value returned by zdnn_get_nnpa_max_dim_idx_size.
ZDNN_FUNC_RC_F000	Invalid padding_type value.
ZDNN_FUNC_RC_F001	<pre>stride_height = 0 and stride_width = 0, but a kernel parameter is greater than allowed. See the earlier descriptions of the kernel_height and kernel_width parameters.</pre>
ZDNN_FUNC_RC_F002	stride_height > 0 and stride_width > 0, but a kernel parameter is greater than allowed. See the earlier descriptions of the kernel_height and kernel_width parameters.
ZDNN_FUNC_RC_F003	stride_height > 0 and stride_width > 0, but a stride parameter is greater than allowed. See the earlier descriptions of the stride_height and stride_width parameters.
ZDNN_FUNC_RC_F004	stride_height > 0 and stride_width > 0, but either the height or weight dimension of the input tensor is greater than 1024.

Framework examples

- TensorFlow MaxPool (https://www.tensorflow.org/api_docs/cc/class/tensorflow/ops/max-pool)
- ONNX MaxPool (https://github.com/onnx/onnx/blob/master/docs/Operators.md#MaxPool)

Convolution 2D (zdnn_conv2d)

Description

Perform 2D convolution over an input tensor in zDNN transformed format, as follows:

- 1. The *input* tensor in convolved with the *kernel* tensor.
- 2. The bias tensor is added to the results.
- 3. If the activation function, act_func, is not CONV2D_ACT_NONE, the activation function is applied to the results.
- 4. If act_func is set to CONV2D_ACT_RELU and clipping_value is not NULL or 0, clipping is performed against the intermediate result (z), where z = min(intermediate_result, clipping_value).
- 5. The result is stored into the provided output zDNN tensor.

Format

Parameters

zdnn_ztensor *input

An input tensor with original values to be downsampled in the output tensor. See <u>"Convolution 2D requirements" on page 57</u> for requirements. The tensor must satisfy the requirements in <u>"General zTensor requirements" on page 5</u>.

zdnn_ztensor *kernel

The kernel tensor to convolve with the *input* tensor. This must be a ZDNN_CNNK_HWCK tensor with a pre-transformed shape of [kernel_height, kernel_width, channels_in, channels_out]. See "Convolution 2D requirements" on page 57 for additional requirements. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_ztensor *bias

The bias tensor to add to the convolved results. This must be a ZDNN_1D tensor with a pre-transformed shape of [channels_out]. See "Convolution 2D requirements" on page 57 for additional requirements. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

zdnn_pool_padding_type

The type of padding to use for the pooling operations. Valid values are SAME_PADDING or VALID_PADDING. For information about "same" and "valid" padding, see What is the difference between 'SAME' and 'VALID' padding in tf.nn.max_pool of tensorflow? (https://www.pico.net/kb/what-is-the-difference-between-same-and-valid-padding-in-tf-nn-max-pool-of-tensorflow).

uint32 t stride height

Number of positions the kernel moves over the input's dim3 dimension at each step. See <u>"Convolution"</u> 2D requirements" on page 57 for requirements.

uint32_t stride_width

Number of positions the kernel moves over the input's dim2 dimension at each step. See <u>"Convolution"</u> 2D requirements" on page 57 for requirements.

zdnn_conv2d_act act_func

The activation function to apply to the results. Valid values are CONV2D_ACT_NONE or CONV2D_ACT_RELU.

void *clipping_value

A pointer to an FP32 value used to clip the elements of the input tensor. This value must not be negative. If this value is set to NULL or 0, no clipping occurs. This value is ignored if act_func is not set to CONV2D_ACT_RELU.

zdnn ztensor *output

The output tensor that will hold the result of the operation. This must be a ZDNN_NHWC tensor with a pre-transformed shape of [num_batches, height_out, width_out, channels_out]. See "Convolution 2D requirements" on page 57 for additional requirements. The tensor must satisfy the requirements in "General zTensor requirements" on page 5.

Convolution 2D requirements

<u>Table 11 on page 57</u> summarizes the requirements for the *input*, *input_kernel*, *input_bias*, and *output* tensors for convolution 2D operations based on the specified strides and padding.

Strides and padding	input (num_batches, height_in, width_in, channels_in)	kernel (kernel_height, kernel_width, channels_in, channels_out)	bias (channels_out)	<pre>output (num_batches, height_out, width_out, channels_out)</pre>
Strides > 0 and ≤ 13 and SAME padding	_	Both <i>kernel_height</i> and <i>kernel_width</i> must be ≤ 64.	-	height_out = ceil(height_in ÷ stride_height) width_out = ceil(width_in ÷ stride_width)
Strides > 0 and ≤ 13 and VALID padding	height_in must be ≥ kernel_height.	Both <i>kernel_height</i> and <i>kernel_width</i> must be ≤ 64.	-	height_out = ceil((height_in – kernel_height + 1) ÷ stride_height)
	width_in must be ≥ kernel_width.			$\label{eq:width_out} \begin{split} \textit{width_out} &= \text{ceil}((\textit{width_in} - \textit{kernel_width} + 1) \div \\ \textit{stride_width}) \end{split}$
Strides = 0 and VALID padding	height_in must be = kernel_height. width_in must be = kernel_width	Both <i>kernel_height</i> and <i>kernel_width</i> must be ≤ 448.	-	Both height_out and width_out must be 1.

Returns

One of the following **zdnn_status** indicators:

Status	Meaning
ZDNN_OK	Success.
ZDNN_INVALID_SHAPE	Shape of the input or output tensor is invalid based on the given kernel and stride parameters.
	Other general shape violations (such as, exceeds MDIS, and others).
ZDNN_INVALID_TYPE	
ZDNN_INVALID_FORMAT	_
ZDNN_INVALID_STRIDE_PADDING	See <u>"General failing statuses" on page 8</u> .
ZDNN_INVALID_STRIDES	_
ZDNN_INVALID_CLIPPING_VALUE	_
Hardware statuses	See <u>"Hardware statuses" on page 8.</u>
ZDNN_FUNC_RC_F000	Invalid padding_type value.
ZDNN_FUNC_RC_F001	Invalid act_func value.
ZDNN_FUNC_RC_F002	stride_height = 0 and stride_width = 0, but either the kernel_height or kernel_width value is greater than 448.
ZDNN_FUNC_RC_F003	stride_height > 0 and stride_width > 0, but either the kernel_height or kernel_width value is greater than 64.
ZDNN_FUNC_RC_F004	Either the stride_height or stride_width value is greater than 13.

Framework examples

- TensorFlow Conv2D (https://www.tensorflow.org/api_docs/python/tf/keras/layers/Conv2D)
- ONNX Conv2D (https://github.com/onnx/onnx/blob/master/docs/Operators.md)

Convenience functions

None.

Chapter 3. zDNN usage examples

The following examples illustrate how to code and use some of the zDNN APIs to develop applications.

- "Example: Flow of an application calling the zDNN APIs" on page 59
- "Example: Calling the zdnn_lstm API (forward)" on page 60
- "Example: Calling the zdnn_lstm API (bi-directional)" on page 64
- "Example: Calling the zdnn_lstm API (multi-layer, bi-directional)" on page 68
- "Example: Calling the zdnn_gru API (forward)" on page 73

Example: Flow of an application calling the zDNN APIs

```
#include <assert.h>
#include <stdint.h>
#include <stdio.h>
#include <stdlib.h>
#include <string.h>
#include "zdnn.h"
// ****************************
// Sample:
// Create 2 zTensors a and b, and add them together via zdnn_add()
int main(int argc, char *argv[]) {
   zdnn_tensor_desc pre_tfrmd_desc, tfrmd_desc;
  zdnn_ztensor ztensor_a;
  zdnn_ztensor ztensor_b;
  zdnn ztensor ztensor out;
  zdnn_status status;
  uint32_t dim_n = 1, dim_h = 32, dim_w = 32, dim_c = 3;
  zdnn_data_types type = FP32;
short element_size = 4; // size of each element in bytes
uint64_t num_elements = dim_n * dim_h * dim_w * dim_c;
  // allocate tensor data storage
  void *data1 = malloc(num_elements * element_size);
  void *data2 = malloc(num elements * element size);
  void *data_out = malloc(num_elements * element_size);
  // read input_data
  // check status for AIU availability, supported ops, etc. here
  // status = zdnn_query(...);
  // set input tensor data to 0 to 127 sequentially and repeat
  for (uint64_t i = 0; i < num_elements; i++) {
    ((float *)data1)[i] = (float)(i & 0x7f);
    ((float *)data2)[i] = (float)(i & 0x7f);</pre>
  zdnn_init_pre_transformed_desc(ZDNN_NHWC, type, &pre_tfrmd_desc, dim_n, dim_h,
                                   dim_w, dim_c);
  // generate transformed shape information
  status = zdnn_generate_transformed_desc(&pre_tfrmd_desc, &tfrmd_desc);
  assert(status == ZDNN_OK);
  // initialize zTensors and allocate 4k-aligned storage via helper function
      zdnn_init_ztensor_with_malloc(&pre_tfrmd_desc, &tfrmd_desc, &ztensor_a);
  assert(status == ZDNN OK);
  status =
      zdnn_init_ztensor_with_malloc(&pre_tfrmd_desc, &tfrmd_desc, &ztensor_b);
  assert(status == ZDNN_OK);
      zdnn_init_ztensor_with_malloc(&pre_tfrmd_desc, &tfrmd_desc, &ztensor_out);
  assert(status == ZDNN_OK);
  // transform the feature tensor
```

```
status = zdnn_transform_ztensor(&ztensor_a, data1);
assert(status == ZDNN_OK);
status = zdnn_transform_ztensor(&ztensor_b, data2);
assert(status == ZDNN_OK);
// perform element-wise add between the two input tensors
status = zdnn_add(&ztensor_a, &ztensor_b, &ztensor_out);
assert(status == ZDNN_OK);
// transform resultant zTensor back to original data format
status = zdnn_transform_origtensor(&ztensor_out, data_out);
assert(status == ZDNN OK);
for (uint64_t i = 0; i < num_elements; i++) {
  printf("out element %" PRIu64 " %f\n", i, ((float *)data_out)[i]);</pre>
// Free zTensors
status = zdnn_free_ztensor_buffer(&ztensor_a);
assert(status == ZDNN_OK);
status = zdnn free ztensor buffer(&ztensor b);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&ztensor_out);
assert(status == ZDNN_OK);
free(data1);
free(data2);
free(data_out);
```

Example: Calling the zdnn_lstm API (forward)

```
// SPDX-License-Identifier: Apache-2.0
 * Copyright IBM Corp. 2021
 * Licensed under the Apache License, Version 2.0 (the "License");
 * you may not use this file except in compliance with the License.
 * You may obtain a copy of the License at
         http://www.apache.org/licenses/LICENSE-2.0
 * Unless required by applicable law or agreed to in writing, software * distributed under the License is distributed on an "AS IS" BASIS, * WITHOUT WARRANTIES OR CONDITIONS OF ANY KIND, either express or implied.
 * See the License for the specific language governing permissions and
 \star limitations under the License.
#include <assert.h>
#include <stdio.h>
#include <stdlib.h>
#include <string.h>
#include "zdnn.h"
// Sample: LSTM
int main(int argc, char *argv[]) {
  zdnn_status status;
#ifdef STATIC_LIB
 zdnn_init();
#endif
  /*****************************
   * LSTM (FWD/BWD):
   * INPUTS -----
                  | ZDNN_3DS | (num_timesteps, num_batches, num_features)
   * input
   * Input | ZDNN_3DS | (num_tamesteps, num_batches, num_hidden)

* k0 | ZDNN_3DS | (1, num_batches, num_hidden)

* weights | ZDNN_3DS | (1, num_features, num_hidden)

* biases | ZDNN_2DS | (1, num_hidden)

* hidden_weights | ZDNN_3DS | (1, num_hidden, num_hidden)

* hidden_biases | ZDNN_2DS | (1, num_hidden, num_hidden)
    * OUTPUTS -----
   * hn_output | ZDNN_4DS | (num_timesteps, 1, num_batches, num_hidden)
```

```
or (1, 1, num_batches, num_hidden)
                                    ZDNN_4DS | (1, 1, num_batches, num_hidden)
  * cf output
  /*************************
  * Create input zTensor
  zdnn_tensor_desc input_pre_tfrmd_desc, input_tfrmd_desc;
zdnn_ztensor input;
uint32 t num timesteps = 5;
uint32_t num_batches = 3;
uint32_t num_features = 32;
uint32_t num_hidden = 5;
zdnn_data_types type = FP32;
short element_size = 4; // size of each element in bytes
lstm_gru_direction dir = FWD;
uint8 t num dirs = 1;
{\tt zdnn\_init\_pre\_transformed\_desc(ZDNN\_3DS,\ type,\ \&input\_pre\_tfrmd\_desc,\ desc,\ d
                                                    num_timesteps, num_batches, num_features);
status =
zdnn_generate_transformed_desc(&input_pre_tfrmd_desc, &input_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&input_pre_tfrmd_desc)
                                                                 &input_tfrmd_desc, &input);
assert(status == ZDNN_OK);
uint64_t input_data_size =
       num_timesteps * num_batches * num_features * element_size;
void *input_data = malloc(input_data_size);
status = zdnn_transform_ztensor(&input, input_data);
assert(status == ZDNN_OK);
  * Create initial hidden and cell state zTensors
  zdnn_tensor_desc h0c0_pre_tfrmd_desc, h0c0_tfrmd_desc;
zdnn ztensor h0, c0;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &h0c0_pre_tfrmd_desc, num_dirs,
                                                    num_batches, num_hidden);
status =
zdnn_generate_transformed_desc(&h0c0_pre_tfrmd_desc, &h0c0_tfrmd_desc);
assert(status == ZDNN_0K);
status = zdnn_init_ztensor_with_malloc(&h0c0_pre_tfrmd_desc, &h0c0_tfrmd_desc,
                                                                 &h0);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&h0c0_pre_tfrmd_desc, &h0c0_tfrmd_desc,
                                                                 &c0);
assert(status == ZDNN_OK);
uint64_t h0c0_data_size = num_batches * num_hidden * element_size;
void *hidden_state_data = malloc(h0c0_data_size);
void *cell_state_data = malloc(h0c0_data_size);
status = zdnn_transform_ztensor(&h0, hidden_state_data);
assert(status == ZDNN OK);
status = zdnn_transform_ztensor(&c0, cell_state_data);
assert(status == ZDNN_OK);
/**********************************
 * Create input weights zTensor
  * Resultant zTensor is concatenated
 ******************************
zdnn_tensor_desc weights_pre_tfrmd_desc, weights_tfrmd_desc;
zdnn_ztensor weights;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &weights_pre_tfrmd_desc,
                                                   num_dirs, num_features, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
       assert(status == ZDNN_OK);
```

```
status = zdnn_init_ztensor_with_malloc(&weights_pre_tfrmd_desc,
                                  &weights_tfrmd_desc, &weights);
assert(status == ZDNN OK);
uint64_t weights_data_size = num_features * num_hidden * element_size;
void *weights_data_f = malloc(weights_data_size);
void *weights_data_i = malloc(weights_data_size);
void *weights_data_c = malloc(weights_data_size);
void *weights_data_o = malloc(weights_data_size);
status = zdnn_transform_ztensor(&weights, weights_data_f, weights_data_i,
                           weights_data_c, weights_data_o);
assert(status == ZDNN_OK);
/***********************************
 * Create biases zTensors
 * Resultant zTensors are concatenated
 zdnn_tensor_desc biases_pre_tfrmd_desc, biases_tfrmd_desc;
zdnn ztensor biases;
status = zdnn_generate_transformed_desc_concatenated(
   &biases_pre_tfrmd_desc, RNN_TYPE_LSTM | USAGE_BIASES | PREV_LAYER_NONE,
   &biases tfrmd desc)
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&biases_pre_tfrmd_desc,
                                  &biases tfrmd desc, &biases);
assert(status == ZDNN OK);
uint64_t biases_data_size = num_hidden * element_size;
void *biases_data_f = malloc(biases_data_size);
void *biases_data_i = malloc(biases_data_size);
void *biases_data_c = malloc(biases_data_size);
void *biases_data_o = malloc(biases_data_size);
status = zdnn_transform_ztensor(&biases, biases_data_f, biases_data_i,
                            biases_data_c, biases_data_o);
assert(status == ZDNN OK);
/**********************************
* Create hidden weights zTensor
* Resultant zTensor is concatenated
zdnn_tensor_desc hidden_weights_pre_tfrmd_desc, hidden_weights_tfrmd_desc;
zdnn_ztensor hidden_weights;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &hidden_weights_pre_tfrmd_desc,
                           num_dirs, num_hidden, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
   &hidden_weights_pre_tfrmd_desc
   RNN_TYPE_LSTM | USAGE_HIDDEN_WEIGHTS | PREV_LAYER_NONE,
   &hidden_weights_tfrmd_desc);
assert(status == ZDNN OK);
&hidden_weights);
assert(status == ZDNN_OK);
uint64_t hidden_weights_data_size = num_hidden * num_hidden * element_size;
void *hidden_weights_data_f = malloc(hidden_weights_data_size);
void *hidden_weights_data_i = malloc(hidden_weights_data_size);
void *hidden_weights_data_c = malloc(hidden_weights_data_size)
void *hidden_weights_data_o = malloc(hidden_weights_data_size);
status = zdnn_transform_ztensor(&hidden_weights, hidden_weights_data_f,
                            hidden_weights_data_i, hidden_weights_data_c,
                            hidden_weights_data_o);
assert(status == ZDNN_OK);
/***************************
 * Create hidden biases zTensors
 * Resultant zTensors are concatenated
 zdnn_tensor_desc hidden_biases_pre_tfrmd_desc, hidden_biases_tfrmd_desc;
zdnn_ztensor hidden_biases;
```

```
zdnn_init_pre_transformed_desc(ZDNN_2DS, type, &hidden_biases_pre_tfrmd_desc,
                              num_dirs, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
    &hidden_biases_pre_tfrmd_desc,
    RNN_TYPE_LSTM | USAGE_HIDDEN_BIASES | PREV_LAYER_NONE,
    &hidden_biases_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(
    &hidden_biases_pre_tfrmd_desc, &hidden_biases_tfrmd_desc, &hidden_biases);
assert(status == ZDNN_OK);
uint64_t hidden_biases_data_size = num_hidden * element_size;
void *hidden_biases_data_f = malloc(hidden_biases_data_size);
void *hidden_biases_data_i = malloc(hidden_biases_data_size);
void *hidden_biases_data_c = malloc(hidden_biases_data_size);
void *hidden_biases_data_o = malloc(hidden_biases_data_size);
status = zdnn_transform_ztensor(&hidden_biases, hidden_biases_data_f,
                               hidden_biases_data_i, hidden_biases_data_c,
                               hidden_biases_data_o);
assert(status == ZDNN_OK);
/*****************************
 * Create output zTensor
 // get only the last timestep, thus hn and cf can share descriptor
zdnn_tensor_desc hncf_pre_tfrmd_desc, hncf_tfrmd_desc;
zdnn_ztensor hn_output_ztensor, cf_output_ztensor;
zdnn_init_pre_transformed_desc(ZDNN_4DS, type, &hncf_pre_tfrmd_desc, 1, 1,
                              num_batches, num_hidden);
status =
    zdnn_generate_transformed_desc(&hncf_pre_tfrmd_desc, &hncf_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&hncf_pre_tfrmd_desc, &hncf_tfrmd_desc,
                                     &hn_output_ztensor);
assert(status == ZDNN OK);
status = zdnn_init_ztensor_with_malloc(&hncf_pre_tfrmd_desc, &hncf_tfrmd_desc,
                                     &cf_output_ztensor);
assert(status == ZDNN_OK);
/*****************************
 * Call the AIU
 *****************************
void *work area = NULL:
status = zdnn_lstm(&input, &h0, &c0, &weights, &biases, &hidden_weights,
                  &hidden_biases, dir, work_area, &hn_output_ztensor,
                  &cf_output_ztensor);
assert(status == ZDNN_OK);
/****************************
 * Output and Cleanup
 uint64_t hncf_data_size = num_batches * num_hidden * element_size;
void *hn_output_data = malloc(hncf_data_size);
void *cf output data = malloc(hncf data size);
status = zdnn_transform_origtensor(&hn_output_ztensor, hn_output_data);
assert(status == ZDNN_OK);
status = zdnn_transform_origtensor(&cf_output_ztensor, cf_output_data);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&input);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&h0);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&c0);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&weights);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&biases);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hidden_weights);
assert(status == ZDNN_OK);
```

```
status = zdnn_free_ztensor_buffer(&hidden_biases);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hn_output_ztensor);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&cf_output_ztensor);
assert(status == ZDNN_OK);
free(input_data);
free(hidden_state_data);
free(cell_state_data);
free(weights_data_f);
free(weights_data_i);
free(weights_data_c);
free(weights_data_o);
free(hidden_weights_data_f);
free(hidden_weights_data_i);
free(hidden_weights_data_c);
free(hidden_weights_data_o);
free(biases_data_f);
free(biases_data_i)
free(biases_data_c);
free(biases_data_o);
free(hidden_biases_data_f);
free(hidden_biases_data_i);
free(hidden_biases_data_c);
free(hidden_biases_data_o);
free(hn_output_data);
free(cf_output_data);
```

Example: Calling the zdnn_lstm API (bi-directional)

```
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 * Unless required by applicable law or agreed to in writing, software * distributed under the License is distributed on an "AS IS" BASIS, * WITHOUT WARRANTIES OR CONDITIONS OF ANY KIND, either express or implied.
 * See the License for the specific language governing permissions and
 \star limitations under the License.
#include <assert.h>
#include <stdio.h>
#include <stdlib.h>
#include <string.h>
#include "zdnn.h"
// Sample: LSTM BI-DIR
int main(int argc, char *argv[]) {
  zdnn_status status;
#ifdef STATIC_LIB
  zdnn_init();
#endif
  /*****************************
    * LSTM (BI-DIR):
    * INPUTS -----
                  | ZDNN_3DS | (num_timesteps, num_batches, num_features)
   * input
   * Input | ZDNN_3DS | (num_tallesteps, num_batches, num_hidden)

* k0 | ZDNN_3DS | (2, num_batches, num_hidden)

* weights | ZDNN_3DS | (2, num_features, num_hidden)

* biases | ZDNN_3DS | (2, num_features, num_hidden)

* hidden_weights | ZDNN_3DS | (2, num_hidden, num_hidden)

* hidden_biases | ZDNN_2DS | (2, num_hidden, num_hidden)
    * OUTPUTS -----
   * hn_output | ZDNN_4DS | (num_timesteps, 2, num_batches, num_hidden)
```

```
or (1, 2, num_batches, num_hidden)
                                    ZDNN_4DS | (1, 2, num_batches, num_hidden)
  * cf output
  /*************************
  * Create input zTensor
  zdnn_tensor_desc input_pre_tfrmd_desc, input_tfrmd_desc;
zdnn_ztensor input;
uint32 t num timesteps = 5;
uint32_t num_batches = 3;
uint32_t num_features = 32;
uint32_t num_hidden = 5;
zdnn_data_types type = FP32;
short element_size = 4; // size of each element in bytes
lstm_gru_direction dir = BIDIR;
uint8 t num dirs = 2;
{\tt zdnn\_init\_pre\_transformed\_desc(ZDNN\_3DS,\ type,\ \&input\_pre\_tfrmd\_desc,\ desc,\ d
                                                    num_timesteps, num_batches, num_features);
status =
zdnn_generate_transformed_desc(&input_pre_tfrmd_desc, &input_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&input_pre_tfrmd_desc)
                                                                 &input_tfrmd_desc, &input);
assert(status == ZDNN_OK);
uint64_t input_data_size =
       num_timesteps * num_batches * num_features * element_size;
void *input_data = malloc(input_data_size);
status = zdnn_transform_ztensor(&input, input_data);
assert(status == ZDNN_OK);
  * Create initial hidden and cell state zTensors
  zdnn_tensor_desc h0c0_pre_tfrmd_desc, h0c0_tfrmd_desc;
zdnn ztensor h0, c0;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &h0c0_pre_tfrmd_desc, num_dirs,
                                                    num_batches, num_hidden);
status =
zdnn_generate_transformed_desc(&h0c0_pre_tfrmd_desc, &h0c0_tfrmd_desc);
assert(status == ZDNN_0K);
status = zdnn_init_ztensor_with_malloc(&h0c0_pre_tfrmd_desc, &h0c0_tfrmd_desc,
                                                                 &h0);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&h0c0_pre_tfrmd_desc, &h0c0_tfrmd_desc,
                                                                 &c0);
assert(status == ZDNN_OK);
uint64_t h0c0_data_size = num_batches * num_hidden * element_size;
void *hidden_state_data = malloc(h0c0_data_size);
void *cell_state_data = malloc(h0c0_data_size);
status = zdnn_transform_ztensor(&h0, hidden_state_data);
assert(status == ZDNN OK);
status = zdnn_transform_ztensor(&c0, cell_state_data);
assert(status == ZDNN_OK);
/**********************************
 * Create input weights zTensor
  * Resultant zTensor is concatenated
 ******************************
zdnn_tensor_desc weights_pre_tfrmd_desc, weights_tfrmd_desc;
zdnn_ztensor weights;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &weights_pre_tfrmd_desc,
                                                   num_dirs, num_features, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
       assert(status == ZDNN_OK);
```

```
status = zdnn_init_ztensor_with_malloc(&weights_pre_tfrmd_desc,
                                  &weights_tfrmd_desc, &weights);
assert(status == ZDNN OK);
uint64_t weights_data_size = num_features * num_hidden * element_size;
void *weights_data_f = malloc(weights_data_size);
void *weights_data_i = malloc(weights_data_size);
void *weights_data_c = malloc(weights_data_size);
void *weights_data_o = malloc(weights_data_size);
status = zdnn_transform_ztensor(&weights, weights_data_f, weights_data_i,
                           weights_data_c, weights_data_o);
assert(status == ZDNN_OK);
/***********************************
 * Create biases zTensors
 * Resultant zTensors are concatenated
 zdnn_tensor_desc biases_pre_tfrmd_desc, biases_tfrmd_desc;
zdnn ztensor biases;
status = zdnn_generate_transformed_desc_concatenated(
   &biases_pre_tfrmd_desc, RNN_TYPE_LSTM | USAGE_BIASES | PREV_LAYER_NONE,
   &biases tfrmd desc)
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&biases_pre_tfrmd_desc,
                                  &biases tfrmd desc, &biases);
assert(status == ZDNN OK);
uint64_t biases_data_size = num_hidden * element_size;
void *biases_data_f = malloc(biases_data_size);
void *biases_data_i = malloc(biases_data_size);
void *biases_data_c = malloc(biases_data_size);
void *biases_data_o = malloc(biases_data_size);
status = zdnn_transform_ztensor(&biases, biases_data_f, biases_data_i,
                            biases_data_c, biases_data_o);
assert(status == ZDNN OK);
/**********************************
* Create hidden weights zTensor
* Resultant zTensor is concatenated
zdnn_tensor_desc hidden_weights_pre_tfrmd_desc, hidden_weights_tfrmd_desc;
zdnn_ztensor hidden_weights;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &hidden_weights_pre_tfrmd_desc,
                           num_dirs, num_hidden, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
   &hidden_weights_pre_tfrmd_desc
   RNN_TYPE_LSTM | USAGE_HIDDEN_WEIGHTS | PREV_LAYER_NONE,
   &hidden_weights_tfrmd_desc);
assert(status == ZDNN OK);
&hidden_weights);
assert(status == ZDNN_OK);
uint64_t hidden_weights_data_size = num_hidden * num_hidden * element_size;
void *hidden_weights_data_f = malloc(hidden_weights_data_size);
void *hidden_weights_data_i = malloc(hidden_weights_data_size);
void *hidden_weights_data_c = malloc(hidden_weights_data_size)
void *hidden_weights_data_o = malloc(hidden_weights_data_size);
status = zdnn_transform_ztensor(&hidden_weights, hidden_weights_data_f,
                            hidden_weights_data_i, hidden_weights_data_c,
                            hidden_weights_data_o);
assert(status == ZDNN_OK);
/***************************
 * Create hidden biases zTensors
 * Resultant zTensors are concatenated
 zdnn_tensor_desc hidden_biases_pre_tfrmd_desc, hidden_biases_tfrmd_desc;
zdnn_ztensor hidden_biases;
```

```
zdnn_init_pre_transformed_desc(ZDNN_2DS, type, &hidden_biases_pre_tfrmd_desc,
                           num_dirs, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
    &hidden_biases_pre_tfrmd_desc,
    RNN_TYPE_LSTM | USAGE_HIDDEN_BIASES | PREV_LAYER_NONE,
    &hidden_biases_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(
   &hidden_biases_pre_tfrmd_desc, &hidden_biases_tfrmd_desc, &hidden_biases);
assert(status == ZDNN_OK);
uint64_t hidden_biases_data_size = num_hidden * element_size;
void *hidden_biases_data_f = malloc(hidden_biases_data_size);
void *hidden_biases_data_i = malloc(hidden_biases_data_size);
void *hidden_biases_data_c = malloc(hidden_biases_data_size);
void *hidden_biases_data_o = malloc(hidden_biases_data_size);
status = zdnn_transform_ztensor(&hidden_biases, hidden_biases_data_f,
                            hidden_biases_data_i, hidden_biases_data_c,
                            hidden_biases_data_o);
assert(status == ZDNN_OK);
/*****************************
 * Create output zTensor
 zdnn_tensor_desc hn_pre_tfrmd_desc, hn_tfrmd_desc, cf_pre_tfrmd_desc,
   cf_tfrmd_desc;
zdnn_ztensor hn_output_ztensor, cf_output_ztensor;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &cf_pre_tfrmd_desc, 1, 2,
                           num_batches, num_hidden);
status = zdnn_generate_transformed_desc(&cf_pre_tfrmd_desc, &cf_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&hn_pre_tfrmd_desc, &hn_tfrmd_desc,
                                  &hn_output_ztensor);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&cf_pre_tfrmd_desc, &cf_tfrmd_desc,
                                  &cf_output_ztensor);
assert(status == ZDNN_OK);
/********************************
 * Call the AIU
 void *work area = NULL;
&cf_output_ztensor);
assert(status == ZDNN_OK);
/****************************
 * Output and Cleanup
 uint64_t hn_data_size =
   num_timesteps * 2 * num_batches * num_hidden * element_size;
uint64_t cf_data_size = 2 * num_batches * num_hidden * element_size;
void *hn_output_data = malloc(hn_data_size);
void *cf_output_data = malloc(cf_data_size);
status = zdnn_transform_origtensor(&hn_output_ztensor, hn_output_data);
assert(status == ZDNN_OK);
status = zdnn_transform_origtensor(&cf_output_ztensor, cf_output_data);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&input);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&h0);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&c0);
assert(status == ZDNN_OK);
```

```
status = zdnn_free_ztensor_buffer(&weights);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&biases);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hidden_weights);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hidden_biases);
assert(status == ZDNN_OK)
status = zdnn_free_ztensor_buffer(&hn_output_ztensor);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&cf_output_ztensor);
assert(status == ZDNN OK);
free(input_data);
free(hidden_state_data);
free(cell_state_data);
free(weights_data_f);
free(weights_data_i);
free(weights_data_c);
free(weights_data_o);
free(hidden_weights_data_f);
free(hidden_weights_data_i);
free(hidden_weights_data_c);
free(hidden_weights_data_o);
free(biases_data_f);
free(biases_data_i);
free(biases_data_c);
free(biases_data_o);
free(hidden_biases_data_f);
free(hidden_biases_data_i);
free(hidden_biases_data_c);
free(hidden_biases_data_o);
free(hn_output_data);
free(cf_output_data);
```

Example: Calling the zdnn_lstm API (multi-layer, bi-directional)

```
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 * See the License for the specific language governing permissions and
 * limitations under the License.
#include <assert.h>
#include <stdio.h>
#include <stdlib.h>
#include <string.h>
#include "zdnn.h"
void do_bidir_layer(zdnn_ztensor *input, uint32_t num_hidden,
                      zdnn_ztensor *hn_output, bool is_prev_layer_bidir) {
  zdnn status status;
  uint32_t num_batches = input->pre_transformed_desc->dim2;
  // if input is bidir output from previous layer then number of features for
  // this layer is 2x of hidden-state size (dim1) of the previous layer
  uint32_t num_features =
      input->pre_transformed_desc->dim1 * (is_prev_layer_bidir ? 2 : 1);
  zdnn_data_types type = FP32;
  short element_size = 4; // size of each element in bytes
  lstm_gru_direction dir = BIDIR;
  uint8_t num_dirs = 2;
```

```
* Create initial hidden and cell state zTensors
 zdnn_tensor_desc h0c0_pre_tfrmd_desc, h0c0_tfrmd_desc;
zdnn_ztensor h0, c0;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &h0c0_pre_tfrmd_desc, num_dirs,
                             num_batches, num_hidden);
status =
   zdnn generate transformed desc(&h0c0 pre tfrmd desc, &h0c0 tfrmd desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&h0c0_pre_tfrmd_desc, &h0c0_tfrmd_desc,
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&h0c0_pre_tfrmd_desc, &h0c0_tfrmd_desc,
                                    &c0);
assert(status == ZDNN_OK);
uint64_t h0c0_data_size = num_batches * num_hidden * element_size;
void *hidden_state_data = malloc(h0c0_data_size);
void *cell_state_data = malloc(h0c0_data_size);
status = zdnn_transform_ztensor(&h0, hidden_state_data);
assert(status == ZDNN_OK);
status = zdnn_transform_ztensor(&c0, cell_state_data);
assert(status == ZDNN_OK);
/**********************************
 * Create input weights zTensor
 * Resultant zTensor is concatenated
 zdnn_tensor_desc weights_pre_tfrmd_desc, weights_tfrmd_desc;
zdnn_ztensor weights;
\ensuremath{//} if using previous layer bidir output as input then number of features of \ensuremath{//} this layer is
status = zdnn_generate_transformed_desc_concatenated(
   &weights_pre_tfrmd_desc,
RNN_TYPE_LSTM | USAGE_WEIGHTS
       (is_prev_layer_bidir ? PREV_LAYER_BIDIR : PREV_LAYER_UNI),
   &weights_tfrmd_desc)
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&weights_pre_tfrmd_desc,
                                    &weights_tfrmd_desc, &weights);
assert(status == ZDNN_OK);
uint64_t weights_data_size = num_features * num_hidden * element_size;
void *weights_data_f = malloc(weights_data_size);
void *weights_data_i = malloc(weights_data_size);
void *weights_data_c = malloc(weights_data_size)
void *weights_data_o = malloc(weights_data_size);
status = zdnn_transform_ztensor(&weights, weights_data_f, weights_data_i,
                             weights_data_c, weights_data_o);
assert(status == ZDNN_OK);
/*********************************
 * Create biases zTensors
 * Resultant zTensors are concatenated
 zdnn_tensor_desc biases_pre_tfrmd_desc, biases_tfrmd_desc;
zdnn ztensor biases;
zdnn_init_pre_transformed_desc(ZDNN_2DS, type, &biases_pre_tfrmd_desc,
                            num_dirs, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
   &biases_pre_tfrmd_desc,
RNN_TYPE_LSTM | USAGE_BIASES
       (is_prev_layer_bidir ? PREV_LAYER_BIDIR : PREV_LAYER_UNI),
   &biases_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&biases_pre_tfrmd_desc,
                                    &biases_tfrmd_desc, &biases);
```

```
assert(status == ZDNN_OK);
uint64_t biases_data_size = num_hidden * element_size;
void *biases_data_f = malloc(biases_data_size);
void *biases_data_i = malloc(biases_data_size);
void *biases_data_c = malloc(biases_data_size);
void *biases_data_o = malloc(biases_data_size);
status = zdnn_transform_ztensor(&biases, biases_data_f, biases_data_i,
                               biases_data_c, biases_data_o);
assert(status == ZDNN_OK);
/***************************
 * Create hidden weights zTensor
 * Resultant zTensor is concatenated
 zdnn_tensor_desc hidden_weights_pre_tfrmd_desc, hidden_weights_tfrmd_desc;
zdnn_ztensor hidden_weights;
status = zdnn_generate_transformed_desc_concatenated(
    &hidden_weights_pre_tfrmd_desc,
RNN_TYPE_LSTM | USAGE_HIDDEN_WEIGHTS |
        (is_prev_layer_bidir ? PREV_LAYER_BIDIR : PREV_LAYER_UNI),
&hidden_weights_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&hidden_weights_pre_tfrmd_desc,
                                     &hidden_weights_tfrmd_desc,
                                     &hidden_weights);
assert(status == ZDNN_OK);
uint64_t hidden_weights_data_size = num_hidden * num_hidden * element_size;
void *hidden_weights_data_f = malloc(hidden_weights_data_size);
void *hidden_weights_data_i = malloc(hidden_weights_data_size);
void *hidden_weights_data_c = malloc(hidden_weights_data_size);
void *hidden_weights_data_o = malloc(hidden_weights_data_size);
status = zdnn_transform_ztensor(&hidden_weights, hidden_weights_data_f,
                              hidden_weights_data_i, hidden_weights_data_c, hidden_weights_data_o);
assert(status == ZDNN_OK);
/***********************************
 * Create hidden biases zTensors
 * Resultant zTensors are concatenated
 zdnn_tensor_desc hidden_biases_pre_tfrmd_desc, hidden_biases_tfrmd_desc;
zdnn_ztensor hidden_biases;
status = zdnn_generate_transformed_desc_concatenated(
&hidden_biases_pre_tfrmd_desc,
    RNN_TYPE_LSTM | USAGE_HIDDEN_BIASES |
        (is_prev_layer_bidir ? PREV_LAYER_BIDIR : PREV_LAYER_UNI),
&hidden_biases_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(
    &hidden_biases_pre_tfrmd_desc, &hidden_biases_tfrmd_desc, &hidden_biases);
assert(status == ZDNN OK);
uint64_t hidden_biases_data_size = num_hidden * element_size;
void *hidden_biases_data_f = malloc(hidden_biases_data_size);
void *hidden_biases_data_i = malloc(hidden_biases_data_size);
void *hidden_biases_data_c = malloc(hidden_biases_data_size);
void *hidden_biases_data_o = malloc(hidden_biases_data_size);
status = zdnn_transform_ztensor(&hidden_biases, hidden_biases_data_f,
                               hidden_biases_data_i, hidden_biases_data_c,
                               hidden_biases_data_o);
assert(status == ZDNN_OK);
/******************************
 * Create cf output zTensor
 zdnn_tensor_desc cf_pre_tfrmd_desc, cf_tfrmd_desc;
```

```
zdnn_ztensor cf_output_ztensor;
 zdnn_init_pre_transformed_desc(ZDNN_4DS, type, &cf_pre_tfrmd_desc, 1, 2,
                             num_batches, num_hidden);
 status = zdnn_generate_transformed_desc(&cf_pre_tfrmd_desc, &cf_tfrmd_desc);
 assert(status == ZDNN_OK);
 status = zdnn_init_ztensor_with_malloc(&cf_pre_tfrmd_desc, &cf_tfrmd_desc,
                                     &cf_output_ztensor);
 assert(status == ZDNN_OK);
 /****************************
  * Call the AIU
  void *work_area = NULL;
 status =
     zdnn_lstm(input, &h0, &c0, &weights, &biases, &hidden_weights,
              &hidden_biases, dir, work_area, hn_output, &cf_output_ztensor);
 assert(status == ZDNN_OK);
 /******************************
  * Cleanup and Return
  status = zdnn_free_ztensor_buffer(&h0);
assert(status == ZDNN_OK);
 status = zdnn_free_ztensor_buffer(&c0);
 assert(status == ZDNN OK);
 status = zdnn_free_ztensor_buffer(&weights);
 assert(status == ZDNN_OK);
 status = zdnn_free_ztensor_buffer(&biases);
 assert(status == ZDNN_OK);
 status = zdnn_free_ztensor_buffer(&hidden_weights);
assert(status == ZDNN_OK);
 status = zdnn_free_ztensor_buffer(&hidden_biases);
 assert(status == ZDNN_OK);
 status = zdnn_free_ztensor_buffer(&cf_output_ztensor);
 assert(status == ZDNN_OK);
 free(hidden_state_data);
 free(cell_state_data);
 free(weights_data_f);
 free(weights_data_i);
free(weights_data_c);
 free(weights_data_o);
 free(hidden_weights_data_f);
 free(hidden_weights_data_i);
 free(hidden_weights_data_c);
 free(hidden_weights_data_o);
 free(biases_data_f)
 free(biases_data_i)
 free(biases_data_c);
 free(biases_data_o);
 free(hidden_biases_data_f);
 free(hidden_biases_data_i);
 free(hidden_biases_data_c);
free(hidden_biases_data_o);
// Sample: LSTM multi-layer BIDIR
int main(int argc, char *argv[]) {
 zdnn status status;
#ifdef STATIC_LIB
 zdnn_init();
 uint32_t num_hidden[2] = \{5, 4\};
 /****************************
  * Create input zTensor
  zdnn_tensor_desc input_pre_tfrmd_desc, input_tfrmd_desc;
 zdnn_ztensor input;
 uint32_t num_timesteps = 5;
 uint32_t num_batches = 3;
 uint32_t num_features = 32;
```

```
zdnn_data_types type = FP32;
short element_size = 4; // size of each element in bytes
zdnn_generate_transformed_desc(&input_pre_tfrmd_desc, &input_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&input_pre_tfrmd_desc,
                                   &input_tfrmd_desc, &input);
assert(status == ZDNN OK);
uint64_t input_data_size =
   num_timesteps * num_batches * num_features * element_size;
void *input_data = malloc(input_data_size);
status = zdnn_transform_ztensor(&input, input_data);
assert(status == ZDNN_OK);
/**********************************
 * Create 2 hn output zTensors
 zdnn_tensor_desc hn_pre_tfrmd_desc[2], hn_tfrmd_desc[2];
zdnn_ztensor hn_output[2];
for (int i = 0; i < 2; i++) {
 zdnn_init_pre_transformed_desc(ZDNN_4DS, type, &hn_pre_tfrmd_desc[i], num_timesteps, 2, num_batches,
                             num hidden[i]);
 status = zdnn_generate_transformed_desc(&hn_pre_tfrmd_desc[i],
                                     &hn_tfrmd_desc[i]);
 assert(status == ZDNN OK);
 status = zdnn_init_ztensor_with_malloc(&hn_pre_tfrmd_desc[i],
                                     &hn_tfrmd_desc[i], &hn_output[i]);
 assert(status == ZDNN_OK);
/*****************************
 * Do the layers
// call the first layer with input, previous layer bidir = false, output goes
// to hn_output[0]
do_bidir_layer(&input, num_hidden[0], &hn_output[0], false);
// call the second layer with hn_output[0] from layer 1, previous layer bidir
// = true, output goes to hn_output[1]
do_bidir_layer(&hn_output[0], num_hidden[1], &hn_output[1], true);
/*****************************
 * Output and Cleanup
 void *hn_output_data[2];
for (int i = 0; i < 2; i++) {
 uint64_t hn_output_data_size = (uint64_t)num_timesteps * num_batches *
                             num_hidden[i] * 2 * element_size;
  hn_output_data[i] = malloc(hn_output_data_size);
 status = zdnn_transform_origtensor(&hn_output[i], hn_output_data[i]);
 assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&input);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hn_output[0]);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hn_output[1]);
assert(status == ZDNN_OK);
free(input_data);
free(hn_output_data[0]);
free(hn_output_data[1]);
```

Example: Calling the zdnn_gru API (forward)

```
// SPDX-License-Identifier: Apache-2.0
* Copyright IBM Corp. 2021
* Licensed under the Apache License, Version 2.0 (the "License"); * you may not use this file except in compliance with the License.
 * You may obtain a copy of the License at
       http://www.apache.org/licenses/LICENSE-2.0
* Unless required by applicable law or agreed to in writing, software * distributed under the License is distributed on an "AS IS" BASIS, * WITHOUT WARRANTIES OR CONDITIONS OF ANY KIND, either express or implied.
 \star See the License for the specific language governing permissions and
 * limitations under the License.
#include <assert.h>
#include <stdio.h>
#include <stdlib.h>
#include <string.h>
#include "zdnn.h"
// Sample: GRU
int main(int argc, char *argv[]) {
 zdnn_status status;
#ifdef STATIC LIB
 zdnn_init();
#endif
  /**********************************
   * GRU (FWD/BWD):
   * INPUTS -----
  * INPUTS

* input | ZDNN_3DS | (num_timesteps, num_batches, num_features)

* h0 | ZDNN_3DS | (1, num_batches, num_hidden)

* weights | ZDNN_3DS | (1, num_features, num_hidden)

* input_biases | ZDNN_2DS | (1, num_hidden)

* hidden_weights | ZDNN_3DS | (1, num_hidden, num_hidden)

* hidden_biases | ZDNN_2DS | (1, num_hidden)
   * OUTPUTS -----
                       | ZDNN_4DS | (num_timesteps, 1, num_batches, num_hidden)
   * hn_output
                                      or (1, 1, num_batches, num_hidden)
   /*************************
   * Create input zTensor
   zdnn_tensor_desc input_pre_tfrmd_desc, input_tfrmd_desc;
  zdnn ztensor input;
  uint32_t num_timesteps = 5;
 uint32_t num_batches = 3;
uint32_t num_features = 32;
  uint32_t num_hidden = 5;
  zdnn_data_types type = FP32;
  short element_size = 4; // size of each element in bytes
  lstm_gru_direction dir = FWD;
  uint8_t num_dirs = 1;
  zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &input_pre_tfrmd_desc,
                                     num_timesteps, num_batches, num_features);
  zdnn_generate_transformed_desc(&input_pre_tfrmd_desc, &input_tfrmd_desc);
assert(status == ZDNN_OK);
  status = zdnn_init_ztensor_with_malloc(&input_pre_tfrmd_desc,
                                              &input_tfrmd_desc, &input);
  assert(status == ZDNN_OK);
  uint64_t input_data_size =
      num_timesteps * num_batches * num_features * element_size;
  void *input_data = malloc(input_data_size);
```

```
status = zdnn_transform_ztensor(&input, input_data);
assert(status == ZDNN_OK);
/***********************************
 * Create initial hidden zTensor
 zdnn_tensor_desc h0_pre_tfrmd_desc, h0_tfrmd_desc;
zdnn_ztensor h0;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &h0_pre_tfrmd_desc, num_dirs,
num_batches, num_hidden);
status = zdnn_generate_transformed_desc(&h0_pre_tfrmd_desc, &h0_tfrmd_desc);
assert(status == ZDNN_OK);
   \label{localization} zdnn\_init\_ztensor\_with\_malloc(\&h0\_pre\_tfrmd\_desc, \&h0\_tfrmd\_desc, \&h0);
assert(status == ZDNN_OK);
uint64 t h0 data size = num batches * num hidden * element size;
void *hidden_state_data = malloc(h0_data_size);
status = zdnn_transform_ztensor(&h0, hidden_state_data);
assert(status == ZDNN OK);
/****************************
* Create input weights zTensor
* Resultant zTensor is concatenated
zdnn_tensor_desc weights_pre_tfrmd_desc, weights_tfrmd_desc;
zdnn_ztensor weights;
zdnn_init_pre_transformed_desc(ZDNN_3DS, type, &weights_pre_tfrmd_desc,
num_dirs, num_features, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
   &weights_pre_tfrmd_desc, RNN_TYPE_GRU | USAGE_WEIGHTS | PREV_LAYER_NONE,
   &weights_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&weights_pre_tfrmd_desc,
                                   &weights_tfrmd_desc, &weights);
assert(status == ZDNN OK);
uint64_t weights_data_size = num_features * num_hidden * element_size;
void *weights_data_z = malloc(weights_data_size);
void *weights_data_r = malloc(weights_data_size);
void *weights_data_h = malloc(weights_data_size);
status = zdnn_transform_ztensor(&weights, weights_data_z, weights_data_r,
                            weights_data_h);
assert(status == ZDNN_OK);
/***********************************
 * Create biases zTensors
 * Resultant zTensors are concatenated
 zdnn_tensor_desc biases_pre_tfrmd_desc, biases_tfrmd_desc;
zdnn_ztensor biases;
zdnn_init_pre_transformed_desc(ZDNN_2DS, type, &biases_pre_tfrmd_desc,
&biases_tfrmd_desc)
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&biases_pre_tfrmd_desc,
                                   &biases_tfrmd_desc, &biases);
assert(status == ZDNN_OK);
uint64_t biases_data_size = num_hidden * element_size;
void *biases_data_z = malloc(biases_data_size);
void *biases_data_r = malloc(biases_data_size);
void *biases_data_h = malloc(biases_data_size);
status = zdnn_transform_ztensor(&biases, biases_data_z, biases_data_r,
                            biases_data_h);
assert(status == ZDNN_OK);
```

```
/***************************
  * Create hidden weights zTensor
 * Resultant zTensor is concatenated
 zdnn_tensor_desc hidden_weights_pre_tfrmd_desc, hidden_weights_tfrmd_desc;
zdnn_ztensor hidden_weights;
{\tt zdnn\_init\_pre\_transformed\_desc(ZDNN\_3DS,\ type,\ \&hidden\_weights\_pre\_tfrmd\_desc,\ and\ type,\ \&hidden\_weights\_pre\_tfrmd\_desc,\ and\ type,\ \&hidden\_weights\_pre\_tfrmd\_desc,\ and\ type,\ type,\ and\ type,\ and\ type,\ and\ type,\ and\ type,\ and\ type,\ and\ type,\ an
                                                  num_dirs, num_hidden, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
      &hidden weights pre tfrmd desc
      RNN_TYPE_GRU | USAGE_HIDDEN_WEIGHTS | PREV_LAYER_NONE, &hidden_weights_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&hidden_weights_pre_tfrmd_desc,
                                                               &hidden_weights_tfrmd_desc,
                                                               &hidden_weights);
assert(status == ZDNN_OK);
uint64 t hidden weights data size = num hidden * num hidden * element size;
void *hidden_weights_data_z = malloc(hidden_weights_data_size);
void *hidden_weights_data_r = malloc(hidden_weights_data_size);
void *hidden_weights_data_h = malloc(hidden_weights_data_size);
assert(status == ZDNN OK);
/***********************************
  * Create hidden biases zTensors
  * Resultant zTensors are concatenated
 zdnn_tensor_desc hidden_biases_pre_tfrmd_desc, hidden_biases_tfrmd_desc;
zdnn_ztensor hidden_biases;
{\tt zdnn\_init\_pre\_transformed\_desc(ZDNN\_2DS,\ type,\ \&hidden\_biases\_pre\_tfrmd\_desc,}
                                                  num_dirs, num_hidden);
status = zdnn_generate_transformed_desc_concatenated(
&hidden_biases_pre_tfrmd_desc,
    RNN_TYPE_GRU | USAGE_HIDDEN_BIASES | PREV_LAYER_NONE,
      &hidden_biases_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(
    &hidden_biases_pre_tfrmd_desc, &hidden_biases_tfrmd_desc, &hidden_biases);
assert(status == ZDNN_OK);
uint64_t hidden_biases_data_size = num_hidden * element_size;
void *hidden_biases_data_z = malloc(hidden_biases_data_size);
void *hidden_biases_data_r = malloc(hidden_biases_data_size);
void *hidden_biases_data_h = malloc(hidden_biases_data_size);
status = zdnn transform ztensor(&hidden biases, hidden biases data z,
                                                    hidden_biases_data_r, hidden_biases_data_h);
assert(status == ZDNN_OK);
/***********************************
 * Create output zTensor
 // get only the last timestep
zdnn_tensor_desc hn_pre_tfrmd_desc, hn_tfrmd_desc;
zdnn_ztensor hn_output_ztensor;
zdnn_init_pre_transformed_desc(ZDNN_4DS, type, &hn_pre_tfrmd_desc, 1, 1,
                                                  num_batches, num_hidden);
status = zdnn_generate_transformed_desc(&hn_pre_tfrmd_desc, &hn_tfrmd_desc);
assert(status == ZDNN_OK);
status = zdnn_init_ztensor_with_malloc(&hn_pre_tfrmd_desc, &hn_tfrmd_desc,
                                                               &hn_output_ztensor);
assert(status == ZDNN_OK);
/**********************************
  * Call the AIU
  void *work_area = NULL;
```

```
status = zdnn_gru(&input, &h0, &weights, &biases, &hidden_weights,
                   &hidden_biases, dir, work_area, &hn_output_ztensor);
assert(status == ZDNN_OK);
/***********************************
 * Output and Cleanup
 uint64_t hn_data_size = num_batches * num_hidden * element_size;
void *hn_output_data = malloc(hn_data_size);
status = zdnn transform origtensor(&hn output ztensor, hn output data);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&input);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&h0);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&weights);
assert(status == ZDNN_OK);
status = zdnn free ztensor buffer(&biases);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hidden_weights);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hidden_biases);
assert(status == ZDNN_OK);
status = zdnn_free_ztensor_buffer(&hn_output_ztensor);
assert(status == ZDNN_OK);
free(input_data);
free(hidden_state_data);
free(weights_data_z);
free(weights_data_r);
free(weights_data_h)
free(hidden_weights_data_z);
free(hidden_weights_data_r);
free(hidden_weights_data_h);
free(biases_data_z)
free(biases_data_r)
free(biases_data_h);
free(hidden_biases_data_z);
free(hidden_biases_data_r);
free(hidden_biases_data_h);
free(hn_output_data);
```

Part 2. IBM Z Artificial Intelligence Optimization library

Chapter 4. Using the IBM Z Artificial Intelligence Optimization Library

The IBM Z Artificial Intelligence Optimization Library (zAIO) provides an interface to core functions used to implement database queries embedded with AI information, extracted from a given database, and expressed as semantic queries. With this library, developers can integrate semantic embedding operations to a database-capable tool, such as IBM Db2®, and SQL-enabled frameworks, such as Spark SQL and Python SQL.

The library is composed of several modules, as shown in Figure 6 on page 79.

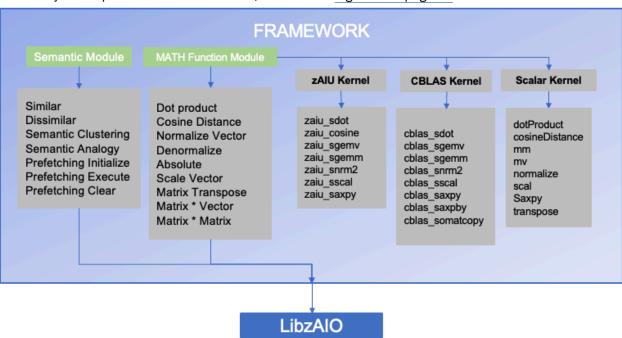


Figure 6. IBM Z Artificial Intelligence Optimization Library framework

The first module, known as the *semantic module*, implements atomic semantic operations on elements or words of a dictionary. The dictionary represents a model composed of unique words and multidimensional floating-point vectors. The dictionary or model is the output of a training operation performed on a translated view of a database. See ibm-data2vec documentation for specific details regarding data input, data processing, training, and output model generation. The semantic operations implement specific mathematical operations as described in the paper, Demonstrating Semantic SQL Queries over Relational Data using the AI-Powered Database (aidb-workshop.github.io/aidb2019-proceeding/6-neves.pdf). The semantic operations can be executed in a word-by-word mode or in batch where multiple words are selected for a given semantic operation. For instance, dot product can be a one-to-one operation (similar) or a one-to-many operation (prefetching).

The second module, known as the *mathematical module*, exposes a set of functions designed to operate on vectors and matrices as required by the semantic operations, such as the dot product or cosine distance calculations between two vectors as it is used by semantic similarity. This module is organized around three *kernels* that implement several linear algebra operations in three different ways to explore hardware acceleration features, as available by specific hardware and selected by the user-specified acceleration mode. The first kernel, *scalar*, implements the operations in a hardware agnostic way and thus is the slowest mode for most operations. The second kernel, *CBLAS*, implements the same operations using a linear algebra software package, such as OpenBLAS, which is designed to exploit hardware vector instructions on targeted hardware architectures, such as IBM Z and IBM Power*. The third kernel, *zAIU_Math*, implements the same functions targeting the use of the IBM Z Integrated Accelerator for AI features available on IBM Z systems designed with the new Telum processor.

The topics that follow describe in detail how to integrate the library to a C/C++ application as well as the syntax descriptions of all APIs. It also describes several acceleration capabilities to speed up most of the functions, including how to exploit hardware acceleration with the latest AI acceleration unit on the IBM z16 CPU. A C program example that shows how to use all the APIs is also included.

IBM Z Artificial Intelligence Optimization Library environment

The IBM Z Artificial Intelligence Optimization Library relies on the IBM Z Deep Neural Network and IBM z/OS OpenBLAS libraries to implement the core numerical and semantic computations. When installed, the required libraries can be found by default in the following locations:

Library	MVS data set	z/OS UNIX file system path
IBM Z Deep Neural Network Library	SYS1.SIEALNKE(AIEZDNNS)	/usr/lpp/IBM/aie/zdnn/lib/libzdnn.so
IBM Z Artificial Intelligence Optimization Library	SYS1.SIEALNKE(AIEZAIOS)	/usr/lpp/IBM/aie/zaio/lib/libzaio.so
IBM z/OS OpenBLAS library	CEE.SCEERUN2(CRTEQOBL)	/usr/lpp/cbclib/lib/libopenblas.dll

The following example shows how to configure your environment for full use of the IBM Z Artificial Intelligence Optimization libraries residing in the z/OS UNIX file system:

```
ZDNN_INSTALL_DIR="/usr/lpp/IBM/aie/zdnn"
ZAIO_INSTALL_DIR="/usr/lpp/IBM/aie/zaio"
OPENBLAS_INSTALL_DIR="/usr/lpp/cbclib"
export LIBPATH=${ZDNN_INSTALL_DIR}/lib:${ZAIO_INSTALL_DIR}/lib:${OPENBLAS_INSTALL_DIR}/lib:${LIBPATH}
```

IBM Z Artificial Intelligence Optimization code development

As a developer, you have access to all the functions in the IBM Z Artificial Intelligence Optimization Library by performing the following steps:

1. Include the zaio.h file.

```
#include "zaio.h"
```

- 2. Compile the .c or .cpp code with the -I/dir_location_zaio option.
- 3. If desired, add to the bind command either the libzaio.x z/OS UNIX file or the AIEZAIOX MVS™ member.

Example:

```
obj/sotest.o: test/sotest.cpp
$(CC) -c $(CFLAGS) test/sotest.cpp -o
$@ >
$@ !st sotest: obj/sotest.o $(CC) -o $@ libzaio.x $(LDFLAGS) $< >
$@.lnk.lst
```

Note that **\$(CC)**, **\$(CFLAGS)**, and **\$(LDFLAGS)** are generic variables to be set with your desired parameters for code compilation and binding.

IBM Z Artificial Intelligence Optimization execution

Follow the guidelines described in <u>"IBM Z Artificial Intelligence Optimization Library environment" on page 80.</u>

The zAIO library attempts to load the z/OS OpenBLAS library and the zDNN library during initialization phase in the following order:

- 1. From the MVS load library (CRTEQOBL and AIEZDNNS)
- 2. From the z/OS UNIX file system (libopenblas.dll and libzdnn.so), only if the host application is not using Preinitialized Language Environment for Authorized Programs

For details about setting up the **LIBPATH** environment variable and the MVS load library search order, see Loading DLLs in *z/OS XL C/C++ Programming Guide*.

The setup of the library paths only guarantees that the algebraic functions to be accelerated by hardware are available. The actual use of a given function depends on user input (as described in Chapter 5, "IBM Z Artificial Intelligence Optimization Library API reference," on page 83) and internal checks performed by the IBM Z Artificial Intelligence Optimization library to determine if other libraries are installed in the execution machine as well as if the execution machine has the required hardware resources.

Acceleration mode

Hardware acceleration also depends on the system on which the code is being executed. Specifically, SIMD acceleration with the z/OS OpenBLAS library requires an IBM z14° or later system. IBM Z Integrated Accelerator for AI acceleration with the zDNN library requires an IBM z16 or later system. No hardware acceleration is possible with zAIO for older systems, such as IBM z13° or EC12. In such systems, the APIs can still run but will use a scalar implementation. The following table describes the zAIO supported hardware accelerations and their hardware and software requirements.

Table 12. zAIO supported hardware accelerations

Hardware acceleration	System requirement	Library requirement
IBM Z Integrated Accelerator for AI	z16 or later	zDNN library
SIMD	z14 or later	OpenBLAS library
Scalar	EC12 or later	None

zAIO API return status

Most of the zAIO functions return a 64-bit *zaio_status_t* unsigned number indicating whether the operation was successful, of which the rightmost 16 bits denote the return code:

```
0xnnnnnnnnnnnrrrr
```

Only the rightmost 16 bits can be used to compare with the mnemonic constants. Exploiters should use the ZAIO_STATUS_RC macro to extract the return code from zaio_status_t upon zAIO function return.

For debugging purposes, zAIO requires the full 64-bit *zaio_status_t* value to be logged by the exploiter, as in the following example:

```
zaio_status = zaio_absolute(input_a, &result, SIZE);
if (ZAIO_STATUS_RC(zaio_status) != ZAIO_OK) {
   // log zaio_status and handle error
}
```

zAIO return code mnemonic constants

Table 13 on page 81 lists the zAIO return code mnemonic constants and meanings.

Table 13. zAIO return code mnemonic constants

Mnemonic constant	Meaning	
ZAIO_OK	Success.	
ZAIO_ALLOCATION_FAILURE	Cannot allocate storage.	
ZAIO_NO_CONTEXT	Missed passing the context space.	
ZAIO_INVALID_SIZE	Invalid vector size.	
ZAIO_INVALID_PARAMETER	Invalid parameter for selected function.	
ZAIO_MISSING_PARAMETER	Required parameter to selected function is missing.	
ZAIO_INVALID_DIMENSIONS	Matrix or vector dimensions are invalid.	

Table 13. zAIO return code mnemonic constants (continued)		
Mnemonic constant	Meaning	
ZAIO_NO_OPT	Caller did not pass a valid function.	
ZAIO_UNKNOWN_FUNCTION	Selected function is unknown.	
ZAIO_ERR_ACCEL_SPECIFIC	Accelerator specific; more information in reserved fields.	

Chapter 5. IBM Z Artificial Intelligence Optimization Library API reference

The IBM Z Artificial Intelligence Optimization Library includes the following application programming interfaces (APIs):

- "zAIO initialization (zaio_Init)" on page 83
- "Check availability of the IBM Z Integrated Accelerator for AI (zaio_zaiuReady)" on page 84
- "Check CBLAS availability (zaio_cblasReady)" on page 84
- "Get library version (zaio_getVersion)" on page 84
- "Copy vector to new location (zaio_vectorCopy)" on page 85
- "Average vector (zaio_averageVector)" on page 85
- "Semantic average (zaio_semanticAverage)" on page 86
- "Dot product (zaio_dotProduct)" on page 87
- "Cosine distance (zaio_cosineDistance)" on page 88
- "Vector normalization (zaio_normalize)" on page 88
- "Vector denormalization (zaio_denormalize)" on page 89
- "Vector absolute (zaio_absolute)" on page 90
- "Vector scale (zaio_vectorScale)" on page 90
- "Matrix-vector multiplication (zaio_matrixVector)" on page 91
- "Matrix-matrix multiplication (zaio_matrixMatrix)" on page 92
- "Matrix transpose (zaio_transpose)" on page 92
- "Semantic similarity (zaio_semanticSimilarity)" on page 93
- "Semantic clustering (zaio_semanticClustering)" on page 94
- "Semantic analogy (zaio_semanticAnalogy)" on page 94
- "Prefetching initialize (zaio_preFetching_Initialize)" on page 95
- "Prefetching execute (zaio_preFetching_Execute)" on page 97
- "Prefetching clear (zaio preFetching Clear)" on page 98

zAIO initialization (zaio_Init)

Description

This function is automatically run when the library is loaded by an application. It automatically detects the following features and sets the correct execution mode for hardware acceleration:

- The IBM Z machine on which the application is running
- The installed support libraries

Format

void zaio_Init();

Parameters

None.

Returns

None.

Check availability of the IBM Z Integrated Accelerator for AI (zaio_zaiuReady)

Description

This function determines if the hardware environment contains the IBM Z Integrated Accelerator for AI. This capability is only available on IBM z16 (and later) systems.

Format

```
bool zaio_zaiuReady();
```

Parameters

None.

Returns

Returns true if IBM Z Integrated Accelerator for AI hardware and support is available; otherwise, returns false.

Check CBLAS availability (zaio_cblasReady)

Description

This function determines if the hardware environment contains the OpenBLAS library and if the hardware on which the code is running is suitable for that library.

Format

```
bool zaio_cblasReady();
```

Parameters

None.

Returns

Returns true if SIMD hardware and software is available; otherwise, returns false.

Get library version (zaio_getVersion)

Description

Retrieve the library version number and build information as a string.

Format

```
char *zaio_getVersion();
```

Parameters

None.

Returns

Returns the library version number and build information as a string.

Copy vector to new location (zaio_vectorCopy)

Description

This function copies a given vector to a provided new location as to preserve the data in the original vector.

Note: This function is enabled with directive _ZAIO_SOURCE 2 prior to the inclusion of the library header.

```
#define _ZAIO_SOURCE 2
#include <zaio.h>
```

Format

```
zaio_status_t zaio_vectorCopy(float *\nu, float *\nu tmp, int \nu_size);
```

Parameters

float *v

A pointer to a vector of size v_size that will be copied.

float *vtmr

A pointer to a vector of size v_size to which v will be copied.

int v_size

The dimension of both vectors.

Returns

The result of the operation is stored in *vtmp* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Average vector (zaio_averageVector)

Description

This function returns the average of two vectors. The average is the sum of the individual positions of each vector divided by K, where K is equal to 2 for this function. The caller must allocate space for the return vector of size v_size .

The following figure illustrates this equation:

Average
$$(V_1, V_2, \dots, V_k) = \frac{(V_{1_i} + V_{2_i} + \dots + V_{k_i})}{k} \{i: 1 \to v_size\}$$

Note: This function is enabled with directive _ZAIO_SOURCE 2 prior to the inclusion of the library header.

```
#define _ZAIO_SOURCE 2
#include <zaio.h>
```

Format

```
zaio_status_t zaio_averageVector(float *ν1, float *ν2, float *ανg, int ν_size);
```

Parameters

float *v1

A pointer to the first vector of size *v_size*.

float *v2

A pointer to the second vector of size *v_size*.

float *avg

A pointer to the output vector of size *v_size*.

int v size

The dimension of the vectors.

Returns

The result of the operation is stored in *avg* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Semantic average (zaio_semanticAverage)

Description

This function returns the average of three vectors. The average is the sum of the individual positions of each vector divided by K, where K is equal to 3 for this function. This function is a convenience function for semantic clustering where the similarity between one vector is compared to the average of multiple vectors.

The following figure illustrates this equation:

Average
$$(V_1, V_2, \dots, V_k) = \frac{(V_{1_i} + V_{2_i} + \dots + V_{k_i})}{k} \{i: 1 \rightarrow v_size\}$$

Note: This function is enabled with directive _ZAIO_SOURCE 2 prior to the inclusion of the library header.

```
#define _ZAIO_SOURCE 2
#include <zaio.h>
```

Format

```
zaio_status_t zaio_semanticAverage(float *v1, float *v2, float *v3, float *avg, int v_size);
```

Parameters

float *v1

A pointer to the first vector of size *v_size*.

float *v2

A pointer to the second vector of size *v_size*.

float *v3

A pointer to the third vector of size *v_size*.

float *avg

A pointer to the output vector of size *v_size*.

int v_size

The dimension of the vectors.

Returns

The result of the operation is stored in *avg* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Dot product (zaio_dotProduct)

Description

This function performs the dot product operation between two vectors of the same size, as shown by the following equation.

Dot Product
$$V_1V_2 = \sum_{i=1}^{v_size} V_{1_i}V_{2_i}$$

Note: This function is enabled with directive _ZAIO_SOURCE 2 prior to the inclusion of the library header.

#define _ZAIO_SOURCE 2
#include <zaio.h>

Format

zaio_status_t zaio_dotProduct(float * ν 1, float * ν 2, float *result, int ν _size);

Parameters

float *v1

A pointer to the first vector of size *v_size*.

float *v2

A pointer to the second vector of size *v_size*.

float *result

The location where the dot product is stored. The caller passes the address to this location.

int v size

The dimension of both vectors.

Returns

The result of the operation is stored in *result* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Cosine distance (zaio_cosineDistance)

Description

This function returns the cosine distance between two vectors. The cosine distance is defined as the dot product between two vectors, divided by the product of the length of each vector, as shown by the following equation. If both vectors are normalized beforehand, the cosine distance can be obtained by a single dot product operation making it much faster to calculate. The output of the operation is a value between -1.0 and 1.0. The maximum is 1.0 when both vectors point in the same direction. It is -1.0 when both vectors point in opposite directions, and it is 0 when the vectors are perpendicular to each other.

Cosine Similarity
$$cos(V_1, V_2) = \frac{V_1 V_2}{\|V_1\| \|V_2\|} = \frac{\sum_{i=1}^{v_s size} V_1 V_2}{2 \int_{\sum_{i=1}^{v_s size} V_1^2} \int_{\sum_{i=1}^{v_s size} V_2^2} V_1 V_2}$$

Note: This function is enabled with directive _ZAIO_SOURCE 2 prior to the inclusion of the library header.

```
#define _ZAIO_SOURCE 2
#include <zaio.h>
```

Format

zaio_status_t zaio_cosineDistance(float *v1, float *v2, float *distance, int v_size);

Parameters

float *v1

A pointer to the first vector of size *v_size*.

float *v2

A pointer to the second vector of size *v_size*.

float *distance

The location where the cosine distance is stored. The caller passes the address to this location.

int v size

The dimension of both vectors.

Returns

The result of the operation is stored in *distance* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Vector normalization (zaio_normalize)

Description

Vector normalization is defined as making the length of a vector to be 1. This is accomplished by dividing each element of the vector by its norm or L2-norm, which is the square root of the sum of the squares of each element in the vector, as shown in the following equation:

Vector Normalization
$$||V|| = \frac{V_i}{\sqrt[2]{\sum_{i=1}^{v_size} V_i^2}} \{i: 1 \rightarrow v_size\}$$

Note: This function is enabled with directive _ZAIO_SOURCE 2 prior to the inclusion of the library header.

```
#define _ZAIO_SOURCE 2
#include <zaio.h>
```

Format

```
zaio_status_t zaio_normalize(float *v1, int v_size);
```

Parameters

float *v1

A pointer to a vector of size *v_size*.

int v size

The dimension of the vector.

Returns

The result of the operation is the updated vector *v1* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Notes

This is a *destructive* operation. The v1 vector will return containing the normalized version of the v1 vector. If the v1 vector needs to be preserved, use the zaio_vectorCopy function to create a copy prior to calling this function.

Vector denormalization (zaio_denormalize)

Description

Vector denormalization is a helper function that you can run to get a new vector. It implies two things: that the vector being passed is a normalized vector, and that the scale passed to the function has been obtained by running zaio absolute on a given vector.

Format

```
zaio_status_t zaio_denormalization(float *\nu1, float scale, int \nu_size);
```

Parameters

float *v1

A pointer to the first vector of size *v_size*.

float scale

Value to change the passing vector.

int v size

The dimension of the vector.

Returns

The function returns a status of zaio_status_t, of which the rightmost 16 bits denote the return code.

Notes

This is a *destructive* operation. The *v1* vector will return containing the normalized version of the *v1* vector. If the *v1* vector needs to be preserved, use the zaio_vectorCopy function to create a copy prior to calling this function.

Vector absolute (zaio_absolute)

Description

The absolute value of a vector, also known as the length of a vector, is also known as the L2-norm of a vector and is defined as the square root of the sum of each vector element squared. This value is needed to denormalize a given vector.

Format

```
zaio_status_t zaio_absolute(float *ν1, float *result, int ν_size);
```

Parameters

float *v1

A pointer to the first vector of size v_size.

float *result

The location where the L2-norm is stored. The caller passes the address to this location.

int v_size

The dimension of the vector.

Returns

The result of the operation is stored in *result* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Vector scale (zaio vectorScale)

Description

This function scales an input vector, x, by a constant, alpha, and adds the result to another vector, y. If scaling is desired, you can initialize vector y with zeros. Both vectors must be of the same size.

Note: This function is enabled with directive _ZAIO_SOURCE 2 prior to the inclusion of the library header.

```
#define _ZAIO_SOURCE 2
#include <zaio.h>
```

Format

```
zaio_status_t zaio_vectorScale(float *x, float *y, float alpha, int v\_size);
```

Parameters

float *x

A pointer to the first vector of size *v_size*.

float *v

A pointer to the second vector of size v_size.

float alpha

The scale constant to apply to x.

int v_size

The dimension of both vectors.

Returns

The function returns a status of zaio_status_t, of which the rightmost 16 bits denote the return code.

Notes

This is a *destructive* operation. The *y* vector will return containing the results of the scalar and addition operations. If the *y* vector needs to be preserved, use the zaio_vectorCopy function to create a copy prior to calling this function.

Matrix-vector multiplication (zaio_matrixVector)

Description

Scales an input vector, X by a constant, $\alpha lph\alpha$, and adds the result to another vector, Y. If scaling is desired, you can initialize vector Y with zeros. Both vectors must be of the same size.

Format

```
zaio_status_t zaio_matrixVector(float *A, float *v, float *v, int m, int n, int v_size);
```

Parameters

float *A

A pointer to the matrix of size [m, v_size].

float *v

A pointer to the vector of size *v_size*.

float *vr

A pointer to the results vector of size m.

int m

The number of rows in the matrix.

int *n*

The number of columns in the matrix. This value must be equal to *v_size*.

int v size

The dimension of the vector.

Returns

The function returns the result of the multiplication of *A* by the vector, and a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Matrix-matrix multiplication (zaio_matrixMatrix)

Description

Scales an input vector, X, by a constant, alpha, and adds the result to another vector, Y. If scaling is desired, you can initialize vector Y with zeros. Both vectors must be of the same size.

Format

Parameters

float *A1

A pointer to the first matrix of size [A1_row, A1_col].

float *A2

A pointer to the second matrix of size [A2_row, A2_col].

float *Mout

A pointer to the results matrix. This matrix must be of size [A1_row, A1_col].

int A1 row

The number of rows in the A1 matrix.

int A1_col

The number of columns in the A1 matrix.

int A2 row

The number of rows in the A2 matrix.

int A2 col

The number of columns in the A2 matrix.

Returns

The function returns the result of the multiplication of A1 by A2, and a status of zaio_status_t, of which the rightmost 16 bits denote the return code.

Matrix transpose (zaio_transpose)

Description

This function implements the transpose of a matrix. If a matrix has a dimension [M, N], where M is the number of rows and N is the number of columns, its transpose will have a dimension of [N, M]. The transpose operation implies getting a row from the original matrix and making it a column in the transposed matrix. The first row becomes the first column, the second row becomes the second column, and so on until all the rows are transposed.

Format

```
zaio_status_t zaio_transpose(float *A, float *A_T, int m, int n);
```

Parameters

float *A

A pointer to the first element of matrix A.

float *A T

A pointer to the first element of the transposed matrix $A_{\perp}T$.

int m

The number of rows in matrix A.

int n

The number of columns in matrix A.

Returns

The function returns the result of the transpose of *A* in *A_T*, and a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Semantic similarity (zaio_semanticSimilarity)

Description

This function calculates the semantic similarity between two vectors. This is equivalent to calculating the cosine similarity between the two vectors. If the vectors are normalized, you can set the boolean variable *normal* to true, and the function will perform a dot product between the vectors instead of cosine distance. The output of the operation is a value between -1.0 and 1.0. The maximum is 1.0 when both vectors point in the same direction. It is -1.0 when both vectors point in opposite directions, and it is 0 when the vectors are perpendicular to each other.

Note: This function is enabled with directive _ZAIO_SOURCE 2 prior to the inclusion of the library header.

```
#define _ZAIO_SOURCE 2
#include <zaio.h>
```

Format

```
zaio_status_t zaio_semanticSimilarity(float *v1, float *v2, float *result, int v\_size, bool normal);
```

Parameters

float *v1

A pointer to the first vector of size *v_size*.

float *v2

A pointer to the second vector of size *v_size*.

float *result

The location where the similarity between vectors is stored. The user passes the address of this location.

int v_size

The dimension of both vectors.

bool normal

True if the vectors are known to be normalized; otherwise, false.

Returns

The result of the operation is stored in *result* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Semantic clustering (zaio_semanticClustering)

Description

This function calculates the semantic similarity between a vector and the average of 3 vectors. The 3 vectors are constant throughout the operation, while the fourth vector changes. Note that the 3 vectors must be denormalized prior to calculating the average using the zaio_semanticAverage function. The average of 3 normalized vectors is different than the average of 3 unnormalized vectors. The 3 vectors can be denormalized by using the zaio_denormalize function provided that the length of the original vectors is known. If the fourth vector is normalized, you can set the boolean variable *normal* to true, and the function will normalize the average and perform a dot product between the average and the fourth vector instead of cosine distance. If the variable is set to false, the average is not normalized and a cosine distance is performed between the average and the fourth vector. The output of the operation is a value between -1.0 and 1.0. The maximum is 1.0 when both vectors point in the same direction. It is -1.0 when both vectors point in opposite directions, and it is 0 when the vectors are perpendicular to each other

Format

```
zaio_status_t zaio_semanticClustering(float *vx, float *vy, float *vq, float *vw, float *vw, float *vw, float *v_size, bool *normal);
```

Parameters

float *vx

A pointer to the first vector of size *v_size*.

float *vy

A pointer to the second vector of size *v* size.

float *vq

A pointer to the third vector of size *v_size*.

float *vu

A pointer to the fourth vector of size *v_size*.

float *result

The location where the result is to be stored. The caller passes the address of this location.

int v size

The dimension of all vectors.

bool normal

True if the vectors are known to be normalized; otherwise, false.

Note: The vx, vy, and vq vectors must be unnormalized. The state of the vw vector determines how the boolean variable is used: If normalized, the variable should be true; otherwise, false.

Returns

The result of the operation is stored in *result* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Semantic analogy (zaio_semanticAnalogy)

Description

Analogy is a concept that refers to the relationship between a pair of entities for the purpose of illustrating a feature they share. This shared feature is then used to determine if two other entities share a similar feature.

An example of analogy query might be Lawyer: Client:: Doctor:? where the expected answer would be Patient. Note that the answer is predicated on the text describing the relationship. In terms of semantics, 3 vectors are constant (Lawyer, Client, and Doctor) and the fourth vector is the one we want to find in the corpus of relevant vectors.

Mathematically, the operation performed is illustrated in the following figure and the similarities between vectors are changed such that the analogy score is non-negative.

$$\begin{array}{c} \cos(\textit{V}_{\textit{w}}, \; \textit{V}_{\textit{q}})\cos(\textit{V}_{\textit{w}}, \; \textit{V}_{\textit{y}}) \\ \cos(\textit{V}_{\textit{w}}, \; \textit{V}_{\textit{x}}) \; + \; \epsilon \end{array}$$

In this equation, vectors Vx, Vy, and Vq are the constant vectors and Vw is the unknown vector that we want to find whose relationship to Vq better matches the relationship between Vx and Vy, that is Vx:Vy::Vq:Vw.

Format

```
zaio_status_t zaio_semanticAnalogy(float *vx, float *vy, float *vq, float *vw, float *result, int v\_size, bool normal);
```

Parameters

float *vx

A pointer to the first constant vector of size *v_size*.

float *vy

A pointer to the second constant vector of size *v_size*.

float *vg

A pointer to the third constant vector of size *v_size*.

float *vw

A pointer to the variable vector of size *v_size*.

float *result

The location where the result is to be stored. The caller passes the address of this location.

int v size

The dimension of all vectors.

bool normal

True if the vectors are known to be normalized; otherwise, false.

Returns

The result of the operation is stored in *result* while the function returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Prefetching initialize (zaio_preFetching_Initialize)

Description

Semantic prefetching allows a user to execute semantic operations in matrix mode instead of vector mode or row-by-row as other operations described here are executed. Semantic similarity (zaio_semanticSimilarity), semantic clustering (zaio_semanticClustering), and semantic analogy (zaio_semanticAnalogy) are functions that work on vectors. However, for a given model used by Db2 SQL DI or any other application that explores semantic operations, the model contents does not change when processing an SQL query. As such, calculating vector (Vx) by vector(Vy), where

Vx comes from a set of possible vectors and Vy is the comparing vector, or matrix (collection of many Vx) by vector (Vy), produces the same results. The advantage of matrix mode is speed calculation and, if the results are temporarily saved, they can be reused. For such purposes, matrix-based APIs are added to the library and a common interface for multi-row operations is also added. This common interface is called prefetching and consists of three steps: initialize (zaio_preFetching_Initialize) described here, execute (zaio_preFetching_Execute) where the semantic operations are executed, and clear (zaio_preFetching_Clear) to deallocate any resources allocated during initialization and used during execution.

By calling this API, you can initialize a context that contains the desired semantic operation from the list of possible operations. Note that the operations listed have individual APIs for vector based operations.

```
typedef enum semantic_functions {
  NO_OPERATION,
  SIMILARITY,
  DISSIMILARITY,
  CLUSTERING,
  ANALOGY
} semanticOpt_t;
```

Further, the context will also have pointers to the data, such as matrices and/or vectors, as well as their respective dimensions. This API checks for several parameter values depending on the chosen semantic operation and returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code. Note that the API checks if the pointers to the data structures are NULL or not but does not check if the allocated space or its contents is valid. The outcome of the API is a pointer to a context with all the relevant members filled up. This data structure for the context follows:

```
struct zaio_preFetching_context {
    semanticOpt_t function;
    int vector_size;
    int inputConstantParameters;
    float *inputConstantArray;
    int numberVectors;
    float *inputVectorMatrix;
    int outputParameters;
    float *outputArray;
    bool clustered;
    char reserved[64];
};
```

The purpose of this strategy is several fold. First, the execution of semantic operations in matrix mode goes through a single interface. As new operations are developed, you only need to specify the operation from the list of available operations and pass it as a parameter to the zaio_preFetching_Initialize API.

Another purpose is that it allows you to execute a context many times before it needs to be cleared. This is needed because matrices can be very large and for memory management purposes it may be desirable to execute an operation on subsets of the original matrix instead of passing the full matrix. Also, you can create multiple contexts for different purposes. Each can be executed with the same zaio_preFetching_Execute API call.

Format

Parameters

zaio_preFetching_context_t *PFContext

A pointer to context the user allocated prior to the call to the API.

semanticOpt_t function

The semantic operation selected from the following list:

NO_OPERATION SIMILARITY DISSIMILARITY CLUSTERING ANALOGY

int size

The dimension of all vectors.

int inputConstantParameters

A value indicating whether one or more vectors are passed as constant.

float *inputConstantArray

A pointer to an array of one or more vectors.

int numberVectors

The number of vectors in the matrix. Matrix size is [numberVectors, size].

float *inputVectorMatrix

A pointer to the input matrix containing *numberVectors* vectors.

int outputParameters

The size of the output array containing the results of the operation.

float *outputArray

An array containing the results. The size of the array is [numberVectors, inputConstantParameters]

Returns

The result of the operation is the context pointer updated with all the fields. The API also returns a status of zaio_status_t, of which the rightmost 16 bits denote the return code.

Prefetching execute (zaio_preFetching_Execute)

Description

This API executes the semantic operation assigned to the input context.

Format

zaio_status_t zaio_preFetching_Execute(zaio_preFetching_context_t *PFContext);

Parameters

zaio_preFetching_context_t *PFContext

A pointer to the context that you allocated prior to the call to this API.

Returns

The result of the operation is updated in the *outputArray* member of the context. The API also returns a status of *zaio_status_t*, of which the rightmost 16 bits denote the return code.

Prefetching clear (zaio_preFetching_Clear)

Description

This API resets all the members of a context to default values and resets the semantic operation to NO_OPERATION. Default values means assigning NULL to pointers and 0 to all the integer members. It does not deallocate the context because this is allocated by the user of prefetching. Note that all active contexts must be cleared by the user prior to completing the application to avoid memory leaks.

Format

zaio_status_t zaio_preFetching_Clear(zaio_preFetching_context_t *PFContext);

Parameters

zaio_preFetching_context_t *PFContext

A pointer to the context that you allocated prior to the call to this API.

Returns

The result of the operation is the context with all the members reset to default values and a status of zaio_status_t, of which the rightmost 16 bits denote the return code.

Chapter 6. Examples of using the IBM Z Artificial Intelligence Optimization Library APIs

The following examples illustrate how to code and use some of the IBM Z Artificial Intelligence Optimization Library APIs to develop applications.

- "C example: Explicit DLL load" on page 99
- "C example: Implicit DLL load" on page 101

C example: Explicit DLL load

```
/* DLL_TEST
     Testcase to validate the call and use of functions in a DLL
     It checks if the library exists. Afterwards, it checks and loads the
     library functions and calls the functions and print the results
#define _UNIX03_SOURCE 1
#include <dlfcn.h>
#include <stdio.h>
#include <stdlib.h>
#include <math.h>
#include <float.h>
#define _ZAIO_SOURCE 2
#include "zaio.h"
int main() {
  char *name="libzaio.so";
   void *mylib;
  int eret;
bool (* ai_zaiu)();
  zaio_status_t (* ai_cp)(float *, float *, int);
zaio_status_t (* ai_dotp)(float *, float *, float *, int);
zaio_status_t (* ai_avg)(float *, float *, float *, int);
  zaio_status_t (* ai_cosDist)(float *, float *, float *, int);
zaio_status_t (* ai_norm)(float *, int);
zaio_status_t (* ai_similar)(float *, float *, float *, int, bool);
   int size = 200;
  // allocate on heap for large allocations
float *v1 = (float *)malloc(size*sizeof(float));
float *v2 = (float *)malloc(size*sizeof(float));
float *v3 = (float *)malloc(size*sizeof(float));
   float *v4 = (float *)malloc(size*sizeof(float));
   float *avg = (float *)malloc(size*sizeof(float));
   float *vnorm1 = (float *)malloc(size*sizeof(float));
float *vnorm2 = (float *)malloc(size*sizeof(float));
   for(int i = 0; i < size; i++) {</pre>
     v1[i] = i + 1;
v2[i] = i + 2;
v3[i] = i + 3;
v4[i] = i + 4;
// Check if library ZAIO is installed in the system // True if it is. False if it is not and the program finishes
   mylib = dlopen(name, RTLD_LOCAL | RTLD_LAZY);
   if (mylib == NULL) {
     printf("Error: %s dll is not available\n", name);
      perror("failed on dllload");
      exit(-1);
   } else {
      printf("Found dll library: %s\n", name);
```

```
if ((ai_zaiu = (bool (*)())dlsym(mylib, "zaio_zaiuReady")) == NULL) {
    printf("Could not find the function zaiuReady in the dll\n");
    exit(-1);
  if ((ai_cp = (zaio_status_t (*)(float *, float *, int))dlsym(mylib, "zaio_vectorCopy")) ==
NULL)
    printf("Could not find the function zaio_vectorCopy in the dll\n");
    exit(-1);
if ((ai_dotp = (zaio_status_t (*)(float *, float *, float *, int))dlsym(mylib,
"zaio_dotProduct")) == NULL) {
    printf("Could not find the function zaio dotProduct in the dll\n");
    exit(-1);
if ((ai_avg = (zaio_status_t (*)(float *, float *, float *, int))dlsym(mylib,
"zaio_averageVector")) == NULL) {
    printf("Could not find the function zaio_averageVector in the dll\n");
    exit(-1);
if ((ai_cosDist = (zaio_status_t (*)(float *, float *, float*, int))dlsym(mylib,
"zaio_cosineDistance")) == NULL) {
    printf("Could not find the function zaio_cosineDistance in the dll\n");
    exit(-1);
  if ((ai_norm = (zaio_status_t (*)(float *, int))dlsym(mylib, "zaio_normalize")) == NULL) {
    printf("Could not find the function in the dll\n");
    exit(-1);
  if ((ai_similar = (zaio_status_t (*)(float *, float *, float *, int, bool))dlsym(mylib,
"zaio_semanticSimilarity")) == NULL) {
    printf("Could not find the function in the dll\n");
    exit(-1);
// Check if machine is ready for IBM Integrated Accelerator for AI acceleration
// A similar check can be performed to determine if the machine is
// ready for openblas by repeating the code below checking for
// zaio_cblasReady()
// ChecK if IBM Integrated Accelerator for AI is present in the machine
 bool xZAIU = ai_zaiu();
  if ( xZAIU )
    printf("machine is ready for IBM Integrated Accelerator for AI acceleration
(ZAIU_ACCELERATION parm)\n");
  else
    printf("No hardware acceleration available, use CBLAS acceleration (CBLAS_ACCELERATION parm)
zaio_status_t zaio_status;
float xResult:
// Execute Dot product between two vectors
  /* call ai_dotproduct *,
   zaio_status = ai_dotp(v1, v2, &xResult, size);
  printf("Dot product of v1 and v2: %f\n", xResult);
// Execute the average between two vectors
  /* call ai_averagevector */
  zaio_status = ai_avg(v1, v2, avg, size);
  printf("Average between v1 and v2: \n");
  for(int i = 0; i < size; i+
  printf("%4.2f ", avg[i]);</pre>
  printf("\n");
// Calculate the cosine distance between two vectors
  /* call ai_cosineDistance */
  zaio_status = ai_cosDist(v1, v2, &xResult, size);
  printf("cosine distance of v1 to v2: %f\n", xResult);
// Calculate the normal of two vectors
  /* Copy vectors */
  zaio_status = ai_cp(v1, vnorm1, size);
  zaio_status = ai_cp(v2, vnorm2, size);
  /* call ai_normalize vector */
  zaio_status = ai_norm(vnorm1, size);
zaio_status = ai_norm(vnorm2, size);
// Calculate the semantic similarity between two vectors
  zaio_status = ai_similar(vnorm1, vnorm2, size, &xResult, true);
printf("similarity between v1 to v2, dot_product: %f\n", xResult);
  free(v1);
```

```
free(v2);
free(v3);
free(v4);
free(avg);
free(vnorm1);
free(vnorm2);
eret = dlclose(mylib);
exit(0);
}
```

C example: Implicit DLL load

```
/* SO_TEST
    Testcase to validate the call and use of functions in a shared library.
    There is no need to load the library functions since the reference
    is determined at link time
#include <stdio.h>
#include <stdlib.h>
#include <math.h>
#include <float.h>
#include <dll.h>
#define _ZAIO_SOURCE 2
#include "zaio.h"
int main() {
  int size = 200;
  float xResult = 0.0;
  zaio_status_t zaio_status;
   // allocate on heap for large allocations
  float *v1 = (float *)malloc(size*sizeof(float));
  float *v2 = (float *)malloc(size*sizeof(float));
float *v3 = (float *)malloc(size*sizeof(float));
  float *v4 = (float *)malloc(size*sizeof(float));
  float *avg = (float *)malloc(size*sizeof(float));
  float *vnorm1 = (float *)malloc(size*sizeof(float));
  float *vnorm2 = (float *)malloc(size*sizeof(float));
  for(int i = 0; i < size; i++) {
     v1[i] = i + 1;
     v2[i] = i + 2;
     v3[i] = i + 3;
     v4[i] = i + 4;
  zaio_status = zaio_dotProduct(v1, v2, &xResult, size);
printf("Dot product of v1 and v2: %f\n", xResult);
  zaio_status = zaio_averageVector(v1, v2, avg, size);
  printf("Average between v1 and v2: \n");
for(int i = 0; i < size; i++)
  printf("%4.2f ", avg[i]);</pre>
  printf("\n");
  zaio_status = zaio_semanticAverage(v1, v2, v3, avg, size);
printf("Average between three vectors: \n");
for(int i = 0; i < size; i++)
    printf("%4.2f ", avg[i]);</pre>
  printf("\n");
  zaio_status = zaio_cosineDistance(v1, v2, &xResult, size);
printf("cosine distance of v1 to v2: %f\n", xResult);
  /* Copy original vectors to temporary structures to
      preserve the original data */
  zaio_vectorCopy(v1, vnorm1, size);
zaio_vectorCopy(v2, vnorm2, size);
  zaio_status = zaio_normalize(vnorm1, size);
  zaio_status = zaio_normalize(vnorm2, size);
  zaio status = zaio semanticSimilarity(vnorm1, vnorm2, &xResult,
```

Part 3. IBM Z Artificial Intelligence Data Embedding library

Chapter 7. Using the IBM Z Artificial Intelligence Data Embedding Library

The IBM Z Artificial Intelligence Data Embedding Library is a collection of packages designed to build and process vector embedding models on z/OS.

The IBM Z Artificial Intelligence Data Embedding Library provides a user-facing ZADE Java™ class. The library is built as a Java application that integrates native packages that can be invoked using this user-facing ZADE Java class. See Chapter 8, "IBM Z Artificial Intelligence Data Embedding Library API reference," on page 109 for packaging specific invocations. The front-end Java class takes user-provided input parameters as input and passes them to the respective package functions. Internally, the Java class spawns a special manager process, zade_main, that controls the execution of the underlying functions.

The IBM Z Artificial Intelligence Data Embedding Library supports all IBM Z models that are supported by z/OS 2.4 later.

IBM Z Artificial Intelligence Data Embedding Library environment

The IBM Z Artificial Intelligence Data Embedding Library relies on the IBM Z Artificial Intelligence Optimization Library and IBM z/OS OpenBLAS libraries to implement the core numerical computations. When installed, the required libraries can be found by default in the following locations:

- IBM Z Artificial Intelligence Data Embedding Library: /usr/lpp/IBM/aie/zade
- IBM Z Artificial Intelligence Optimization Library: /usr/lpp/IBM/aie/zaio
- IBM z/OS OpenBLAS library: /usr/lpp/cbclib

During runtime, the following environment variables must be set up:

LIBPATH

Specifies the path to search for dynamic link libraries, and must include the path to each of the required libraries, as previously described.

CLASSPATH

Specifies the path to search for user-defined classes and packages, and must include the path to the zade.jar file found under the IBM Z Artificial Intelligence Data Embedding Library directory (that is, /usr/lpp/IBM/aie/zade/lib/zade.jar).

• PATH

Specifies the path to search for executable programs, and must include the path to the zade_main executable (that is, /usr/lpp/IBM/aie/zade/bin) and the path to the Java 8 64-bit executable (for instance /usr/lpp/java/J8.0_64/bin).

In addition, Java 8 64-bit must be used when invoking the available JNI APIs.

The following example shows how to configure your environment for full use of the IBM Z Artificial Intelligence Data Embedding Library:

```
ZADE_INSTALL_DIR="/usr/lpp/IBM/aie/zade"
ZAIO_INSTALL_DIR="/usr/lpp/IBM/aie/zaio"
OPENBLAS_INSTALL_DIR="/usr/lpp/cbclib"
JAVA_HOME="/usr/lpp/java/J8.0_64/bin"

export LIBPATH=${ZADE_INSTALL_DIR}/lib:${ZAIO_INSTALL_DIR}/lib:${OPENBLAS_INSTALL_DIR}/lib:${LIBPATH}}
export CLASSPATH=${ZADE_INSTALL_DIR}/lib/zade.jar:${CLASSPATH}}
export PATH=${ZADE_INSTALL_DIR}/bin:${JAVA_HOME}/bin:${PATH}}
```

Note: If the z/OS OpenBLAS library path is not added, the zAIO library will run in the slower scalar mode.

IBM Z Artificial Intelligence Data Embedding Library permissions

The package functions provided by the IBM Z Artificial Intelligence Data Embedding Library might need to access input and write output files. Therefore, the caller must have proper permissions, as follows:

- · Read access to input files and their parent directories
- · Write access to requested output directories or files
- Write access to the current working directory from which the library is invoked

The IBM Z Artificial Intelligence Data Embedding Library does not change or elevate permissions in any way and retains permissions given by the caller's environment and application.

IBM Z Artificial Intelligence Data Embedding Library log files

The IBM Z Artificial Intelligence Data Embedding Library APIs use the following log files:

- · zade-main log
- · base10Cluster log
- ibm-data2vec log

zade-main log

Every IBM Z Artificial Intelligence Data Embedding Library application first invokes the zade_main binary, which, in turn, invokes package-specific functions. The zade_main program emits a series of messages on the stdout stream. The messages in the following example represent a successful invocation and termination of the zade_main child process, after invoking one of the user-specified ZADE functions.

```
Spawned zade_main using process 131801 Parent has done waiting for the termination of child process The pid of terminated child process is 13180
```

base10Cluster log

The base10Cluster function generates a log file, base10cluster-local-timestamp.log, to store the information regarding the clusters generated for every input file. The log file also reports total execution time taken by each thread. For example, the following log file, generated for the example shown in "base10Cluster" on page 109 first reports the version of the base10cluster function. Then, for each participating thread (in this case, only 1 thread), a timestamp is reported, and then for each data set being clustered, their cluster properties are reported, such as cluster min, max, median, average values, occupancy ratios, and if an EMPTY cluster is generated, its details are also reported.

```
IBM base10 clustering v3.4.0 Release Build 19:28:51 Mar 30 2022
PID 131842 | 2022-03-31 00:25:46 base10_cluster() started clustering.
There are 5 clusters with total entries 50 Min value=-7.200000e+75 Max value=3.276700e+04
Cluster EMPTY has 3 entries Min value=-7.200000e+75 occupancy=6.000000 %
Cluster 1 has 16 entries Min value=-3.276800e+04 Max value=-1.212000e+04 Centroid=-2.210338e+04 Median =-2.168100e+04
occupancy=32.000000 %
Cluster 2 has 8 entries Min value=-1.201800e+04 Max value=-4.050000e+03 Centroid=-8.573250e+03 Median= -6.782000e+03
occupancy=16.000000 %
Cluster 3 has 6 entries Min value=1.086000e+03 Max value=8.719000e+03 Centroid=4.911667e+03 Median=7.6 25500e+03
occupancy=12.000000 %
Cluster 4 has 17 entries Min value=1.001000e+04 Max value=3.276700e+04 Centroid=2.053506e+04 Median=2.011800e+04
occupancy=34.000000 %
Using file ./V SINIT output minimums for storing the cluster minimums
PID 131842 | 2022-03-31 00:25:46 base10_cluster() completed clustering in 0.910 seconds.
Base10Clustering is terminated successfully.
```

ibm-data2vec log

The ibm-data2vec function also generates a log file, ibm-data2vec-local-timestamp.log, that provides additional details about the execution of the ibm-data2bvec function. For example, the following log file first reports the version of ibm-data2vec and the name of the training file. Then it reports if the dependent library, libzaio.so, has been found. If the library is detected, it verifies whether the libzaio.so can use the SIMD features for accelerating BLAS computations using a BLAS library.

Important: If the BLAS library is not available, the computations will be done in a substantially slower scalar format.

The log file reports various properties of the input data set, such as total file size, number of words, number of words in the model vocabulary, and so on. It also provides details about the execution times of three main stages of the training process:

- 1. Vocabulary building
- 2. Database model
- 3. Model storage

The log file also provides information about the number of threads used and reports incremental progress at 5% intervals. Finally, the log file reports memory consumption per stage, and whether there is any memory that is being used even after a particular stage has completed.

```
ibm-data2Vec (v1.3.0 Release Build 19:28:56 Mar 30 2022 for zOS) starting execution using file
Textified_Churn_Data.txt
ibm-data2vec found the required library: libzaio.so. Proceeding with the training..
ibm-data2vec using BLAS SIMD acceleration for training: True
Learning vocabulary from the training file: Textified_Churn_Data.txt with size 2899990 bytes
16908848 | 2022-03-30 23:35:25 | Time elapsed learning vocab from train file = 0.773295s
There are 154946 words in the training file. There are 7104 words in the vocabulary: Primary Key words
7043 Internal words 60
Model training code will generate vectors for row-identifier (pk_id) or user-specified primary keys
16908848 | 2022-03-30 23:35:25 | Stage 1 completed. Time elapsed during file reading = 0.775163s
Training the database embedding (db2Vec) model using 8 CPU thread(s)
Learning rate Alpha=0.023796 Training Progress=100.00%
16908848 | 2022-03-30 23:35:58 | Stage 2 completed. Time elapsed training model = 32.547968s
16908848 | 2022-03-30 23:35:58 | Stage 3 completed. Time elapsed writing output = 0.125447s
16908848 | 2022-03-30 23:35:58 | ibm-data2vec execution completed. Total time elapsed = 33.481913s
ibm-data2Vec Total allocated memory 176.51 MB In-use memory 0.00 MB
ibm-data2Vec Per-stage memory usage:

(1) Stage DATA_LOADING_STAGE total-allocated=19.68 MB in-use=0.00 MB;
(2) Stage VOCAB_BUILDING_STAGE total-allocated=424.96 MB in-use=0.00 MB;
(3) Stage MODEL_TRAINING_STAGE total-allocated=31.87 MB in-use=0.00 MB;
(4) Stage MODEL_STORING_STAGE total-allocated=0.00 MB in-use=0.00 MB;
```

Chapter 8. IBM Z Artificial Intelligence Data Embedding Library API reference

The IBM Z Artificial Intelligence Data Embedding Library includes the following application programming interfaces (APIs):

- "base10Cluster" on page 109
- "ibm-data2vec" on page 110

base10Cluster

Description

The base10Cluster package implements a numerical clustering algorithm that aims to cluster together numerically closers items in different buckets, each representing a distinct cluster. The base10Cluster algorithm uses two steps to process the input numerical data set:

- 1. **Binning:** After initial processing, each numerical value is assigned to a bin as determined by its base-10 logarithmic value.
- 2. **Redistribution:** After binning, the bins are redistributed to get a balanced clustering across different buckets.

The base10Cluster clustering has been designed to handle out-of-range, empty, and null values by assigning them to a special bucket, termed EMPTY.

The base10Cluster is a single-pass algorithm and can operate on multiple input data set by using multiple threads. For each input data set, the base10Cluster algorithm generates an output file listing the number of buckets and their corresponding minimum values. This information is used by the preprocessing code to assign a string token identifier to a numeric value.

Format

The base10Cluster component can be invoked using the zade.Base10Cluster instance function:

```
:
ZADE zade = new ZADE();
zade.Base10Cluster(args);
:
```

Parameters

int *num_threads*

The number of threads used for parallelization.

String[] file names

The list of input file names in CSV format. When submitted via the command line, input file names must be separated by a semicolon (;).

String output_dir

The directory where the output file will be stored.

Output files

minimums

A file, stored in *output dir*, that lists the cluster minimum values, sorted in increasing order.

A file, stored in the current working directory, that contains the execution log messages from the function.

ibm-data2vec

Description

The ibm-data2vec function is an implementation of a self-supervised database embedding algorithm. The database embedding takes as input a text file created from a multi-modal relational table, and builds a relationship map between text tokens using the relational data model. The input training document generated from a relational table consists of string tokens representing different relational entities in the original table. The ibm-data2vec function views the training document as a set of sentences, where each sentence represents a relational table row. However, unlike the traditional natural language processing approaches, such as word embedding, database embedding views each sentence as an unordered bag of tokens (words), where each word is related equally to every other word. In addition, ibm-data2vec supports two special tokens: primary key tokens representing a row, and EMPTY tokens for relational NULL values.

After the training is completed, for each token, ibm-data2vec generates a vector of pre-defined length (dimension) that encodes the meaning of that token (the inferred meaning captures the collective contributions of neighboring tokens in all rows in which the input token appears). The core numerical computations of the training process are parallelized using multiple threads, and accelerated using hardware-accelerated numerical computations. The final trained model is stored as a binary file using the Db2 zload format.

Format

The ibm-data2vec component can only be invoked using the ZADE Data2Vec instance function:

```
:
ZADE zade = new ZADE();
zade.Data2Vec(args);
:
```

Parameters

int *num_threads*

The number of threads to use for parallelization.

String input_file

The name of the input file.

String output_file

The name of the output file.

String format

The format for the Db2 storage layout.

String vocab file

An optional parameter that is the name of the vocab file.

If the **vocab_file_fmt** parameter is not specified, format 1 of the vocab file will be generated.

int vocab file fmt

An optional parameter that is the format number of the vocab file. The supported formats are:

1 The first vocab file format.

2

Adds DB2_GENERATED_COLUMNNAME columns.

If omitted, format 1 of the vocab file will be generated.

Note: The **vocab_file** and **vocab_file_fmt** parameters will be deprecated in a future release.

Output files

binary

A file, stored in *output_dir*, that contains the trained model, written using the Db2 zload format.

log

I

A file, stored in the current working directory, that contains the execution log messages from the function.

Chapter 9. Examples of using the IBM Z Artificial Intelligence Data Embedding Library APIs

The following examples illustrate how to code and use the IBM Z Artificial Intelligence Data Embedding Library APIs to develop applications.

- "Example: Using the base10Cluster function" on page 113
- "Example: Using the ibm-dat2Vec function" on page 113

Example: Using the base10Cluster function

The following two examples demonstrate how to invoke the base10Cluster function on an input CSV file. In these examples, an input file, /path/libzade/test/csvs/V_SMINT.csv, is processed, and the output file containing the cluster minimum values, V_SMINT_output_minimums, is stored in the /path/libzade/test/csv directory.

1. Using the ZADE main function:

```
java com.ibm.zos.zdnn.zade.jni.ZADE Base10Cluster 1 /path/libzade/test/csvs/V_SMINT.csv /path/libzade/test/csv
```

2. Using the ZADE Base10Cluster instance function of the Java ZADE class. The following code fragment shows a file, test_b10c.java.

```
import com.ibm.zos.zdnn.zade.jni.ZADE;
public class test_b10c{
    public static void main(String[] args){
        ZADE zade = new ZADE();
        zade.Base10Cluster(args);
    }
}
```

To run the code:

```
java test_b10c 1 /path/libzade/test/csvs/V_SMINT.csv /path/libzade/test/csv
```

Example: Using the ibm-dat2Vec function

The following two examples demonstrate how to invoke the ibm-data2Vec function on the input training text file. Both examples take as an input a training file, Textified_Churn_Data.txt, use 8 threads for training, and store the model in file with Churn prefix using the binaryDB2 binary storage format (Churn-320-10-5-normal-db2zos_zload.bin). Finally, a list of unique tokens in the trained model (vocabulary) is stored in the file, vocab.

1. Using the ZADE main function:

```
java com.ibm.zos.zdnn.zade.jni.ZADE Data2Vec 8 Textified_Churn_Data.txt Churn binaryDB2 vocab
```

2. Using the ZADE Data2Vec instance function of the Java ZADE class. The following code fragment shows a file, test_d2v.java.

```
import com.ibm.zos.zdnn.zade.jni.ZADE;
public class test_d2v{
   public static void main(String[] args){
```

```
ZADE zade = new ZADE();
zade.Data2Vec(args);
}
```

To run the code:

```
java test_d2v 8 Textified_Churn_Data.txt Churn binaryDB2 vocab
```

Chapter 10. Troubleshooting the IBM Z Artificial Intelligence Data Embedding Library

Use the following information to troubleshoot potential issues you might encounter with the IBM Z Artificial Intelligence Data Embedding Library.

Could not find or load main class com.ibm.zos.zdnn.zade.jni.ZADE

This issue usually occurs when the **CLASSPATH** environment variable is not set properly. Ensure that zade.jar is included in the **CLASSPATH**, as described in "IBM Z Artificial Intelligence Data Embedding Library environment" on page 105.

zade (Not found in java.library.path)

This issue usually occurs for two reasons:

- 1. A 32-bit Java is used when invoking the available JNI APIs.
 - Ensure that a 64-bit Java is either included in the **PATH**, as described in <u>"IBM Z Artificial Intelligence</u> Data Embedding Library environment" on page 105, or explicitly called during invocation.
- 2. The **LIBPATH** environment variable is not setup properly. Ensure that the IBM Z Artificial Intelligence Data Embedding Library path is included in the **LIBPATH**, as described in "IBM Z Artificial Intelligence Data Embedding Library environment" on page 105.

Error on spawning

This issue usually occurs when the **PATH** environment variable is not set properly. Ensure that the zade_main path is included in the **PATH**, as described in "IBM Z Artificial Intelligence Data Embedding Library environment" on page 105.

Unable to open required library: libzaio.so

This issue usually occurs when the **LIBPATH** environment variable is not set properly. Ensure that the IBM Z Artificial Intelligence Optimization Library path is included in the **LIBPATH** as described in "IBM Z Artificial Intelligence Data Embedding Library environment" on page 105.

Using BLAS SIMD acceleration for training: False

This issue usually occurs when the **LIBPATH** environment variable is not set properly. Ensure that the IBM zOS OpenBLAS library path is included in the **LIBPATH**, as described in "IBM Z Artificial Intelligence Data Embedding Library environment" on page 105.

Unable to find function to invoke

This issue occurs when zade_main is directly invoked. Ensure that you are using the proper JNI invocation, as described in Chapter 8, "IBM Z Artificial Intelligence Data Embedding Library API reference," on page 109.

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Index

A	data transformation (continued)
accessibility	to zTensor (continued)
contact IBM 117	zdnn_transform_ztensor <u>25</u> data types 7
activation operations	data types, common 4
hyperbolic tangent 35	deallocate memory for zTensor
rectified linear 34	zdnn_free_ztensor_buffer 22
sigmoid 36	deep neural network library, IBM Z, See IBM Z Deep Neural
softmax 36	Network Library
addition 28	descriptor, zTensor 5
allocate memory for zTensor	development
zdnn_allochelper_ztensor 21	IBM Z Artificial Intelligence Optimization Library 80
API reference	division 30
IBM Z Artificial Intelligence Data Embedding Library 109	dot product 87
IBM Z Artificial Intelligence Optimization Library 83	dot product 87
application environment, zDNN <u>3</u> Artificial Intelligence Data Embedding library, IBM Z, <i>See</i>	E
IBM Z Artificial Intelligence Data Embedding Library	
	element-wise operations
Artificial Intelligence Optimization library, IBM Z, See IBM Z	addition <u>28</u>
Artificial Intelligence Optimization Library	division <u>30</u>
assistive technologies <u>117</u>	exponential <u>33</u>
average pool 2D <u>51</u>	maximum <u>32</u>
average vector <u>85</u>	minimum <u>31</u>
	multiplication <u>30</u>
В	natural logarithm <u>33</u>
	subtraction <u>29</u>
base10Cluster 109	environment
batch norm 39	IBM Z Artificial Intelligence Data Embedding Library 105
bias add <u>39</u>	IBM Z Artificial Intelligence Optimization Library 80
	environment variables, zDNN runtime <u>9</u>
C	environment, zDNN <u>3</u>
	examples, IBM Z Artificial Intelligence Data Embedding
check CBLAS availability 84	Library API usage <u>113</u>
check IBM Z Integrated Accelerator for AI availability 84	examples, IBM Z Artificial Intelligence Optimization Library
check whether version runnable	API usage <u>99</u>
zdnn_is_version_runnable 24	examples, zDNN usage <u>59</u>
codes, status 7, 81	execution
common	IBM Z Artificial Intelligence Optimization Library 80
descriptor 5	exponential 33
zTensor 5	
contact	F
z/OS 117	
convolution 2D 56	feedback xiii
copy vector to new location 85	
cosine distance 88	
_	G
D	Gated Recurrent Unit 47
	generate concatenated transformed tensor descriptor
Data Embedding library, IBM Z Artificial Intelligence, See	zdnn_generate_transformed_desc_concatenated 18
IBM Z Artificial Intelligence Data Embedding Library	generate transformed tensor descriptor
data formats 7	zdnn_generate_transformed_desc 18
data layouts 6	get library version 84
data transformation	get maximum runnable version
to original	zdnn_get_max_runnable_version 25
zdnn_transform_origtensor 27	get size function
to zTensor	zdnn getsize ztensor 17

GRU <u>47</u>	N		
н	natural logarithm <u>33</u>		
	navigation		
hyperbolic tangent <u>35</u>	keyboard <u>117</u> normalization operations		
	batch norma 39		
I	bias add 39		
IBM Z Artificial Intelligence Data Embedding Library	mean reduce 38		
API reference 109			
API usage examples 113	0		
environment 105			
overview 105	operations activation		
permissions 106	hyperbolic tangent 35		
IBM Z Artificial Intelligence Optimization Library API reference 83	rectified linear 34		
API reference <u>os</u> API usage examples 99	sigmoid 36		
development 80	softmax 36		
environment 80	average pool 2D <u>51</u>		
execution 80	convolution 2D <u>56</u>		
overview 79	element-wise addition 28		
IBM Z Deep Neural Network Library	division 30		
overview <u>3</u> ibm-data2vec <u>110</u>	exponential 33		
initialization	maximum 32		
zdnn_init 11	minimum 31		
initialize pre-transformed tensor descriptor	multiplication 30		
zdnn_init_pre_transformed_desc <u>17</u>	natural logarithm <u>33</u> subtraction 29		
initialize zTensor	GRU 47		
zdnn_init_ztensor 19 initialize zTensor with memory allocate	LSTM 43		
zdnn_init_ztensor_with_malloc 20	matmul 39		
2dini_init_2ten30i_witii_inattoe <u>20</u>	matmul with broadcast 39		
V	max pool 2D <u>53</u>		
K	normalization		
keyboard	batch norm <u>39</u> bias add 39		
navigation <u>117</u>	mean reduce 38		
PF keys <u>117</u>	zdnn_matmul_bcast_op 41		
shortcut keys <u>117</u>	zdnn_matmul_op <u>40</u>		
	Optimization library, IBM Z Artificial Intelligence, See IBM Z		
L	Artificial Intelligence Optimization Library		
library, IBM Z deep neural network, See IBM Z Deep Neural			
Network Library	P		
linear, rectified 34	permissions		
logarithm, natural <u>33</u>	IBM Z Artificial Intelligence Data Embedding Library 106		
LSTM <u>43</u>	Prefetching clear 98		
	Prefetching execute 97		
M	Prefetching initialize <u>95</u>		
matmul 39			
matmul with broadcast 39	Q		
matrix transpose 92	query functions		
matrix-matrix multiplication 92	zdnn_get_library_version 16		
matrix-vector multiplication 91	zdnn_get_library_version_str 16		
max pool 2D 53	zdnn_get_nnpa_max_dim_idx_size 12		
maximum 32 mean reduce 38	zdnn_get_nnpa_max_tensor_size 12		
minimum 31	zdnn_is_nnpa_conversion_installed 15		
multiplication 30	zdnn_is_nnpa_datatype_installed 14		
· · · · · · · · · · · · · · · · · · ·	zdnn_is_nnpa_function_installed <u>13</u> zdnn_is_nnpa_installed 13		
	zdnn_is_nnpa_mstatted <u>13</u> zdnn_is_nnpa_layout_fmt_installed 15		

query functions (continued)	support functions (continued)		
zdnn_is_nnpa_parmblk_fmt_installed <u>14</u>	query functions (continued)		
zdnn_refresh_nnpa_query_result 16	zdnn_get_library_version 16		
	zdnn_get_library_version_str 16		
R	zdnn_get_nnpa_max_dim_idx_size 12		
N .	zdnn_get_nnpa_max_tensor_size 12		
rectified linear 34	zdnn_is_nnpa_conversion_installed 15		
reference	zdnn_is_nnpa_datatype_installed 14		
IBM Z Artificial Intelligence Data Embedding Library 109	zdnn_is_nnpa_function_installed 13		
IBM Z Artificial Intelligence Optimization Library 83	zdnn_is_nnpa_installed 13		
reset zTensor	zdnn_is_nnpa_layout_fmt_installed 15		
zdnn_reset_ztensor 21	zdnn_is_nnpa_parmblk_fmt_installed 14		
reshape zTensor	zdnn_refresh_nnpa_query_result 16		
zdnn_reshape_ztensor 23	reset zTensor		
retrieve status message	zdnn_reset_ztensor 21		
zdnn_get_status_message 22	reshape zTensor		
return codes	zdnn_reshape_ztensor 23		
zAIO 81	retrieve status message		
zDNN 7	zdnn_get_status_message 22		
runtime environment variables, zDNN 9			
Tallillo olivilolillolit vallastoo, 251111 2	T		
	· ·		
\$	tangent, hyperbolic 35		
ti	trademarks 122		
semantic analogy 94	transform to original		
semantic average 86	zdnn_transform_origtensor 27		
semantic clustering 94	transform to zTensor		
semantic similarity 93	zdnn_transform_ztensor 25		
sending to IBM	transformation, data, See data transformation		
reader comments <u>xiii</u>	typedefs 4		
shortcut keys <u>117</u>	types, common 4		
sigmoid 36	1,100,0011111011 4		
softmax 36	and the second s		
statuses	U		
zAIO 81	usar interfece		
zDNN 7	user interface		
structures, common $\underline{4}$ subtraction 29	ISPF 117		
	TSO/E <u>117</u>		
summary of changes xv			
support functions	V		
allocate memory for zTensor			
zdnn_allochelper_ztensor <u>21</u>	vector absolute 90		
check whether version runnable	vector denormalization <u>89</u>		
zdnn_is_version_runnable <u>24</u>	vector normalization <u>88</u>		
deallocate memory for zTensor	vector scale <u>90</u>		
zdnn_free_ztensor_buffer 22	version information, zDNN <u>4</u>		
generate concatenated transformed tensor descriptor			
zdnn_generate_transformed_desc_concatenated	Z		
18	_		
generate transformed tensor descriptor	zAIO, See IBM Z Artificial Intelligence Optimization Library		
zdnn_generate_transformed_desc 18	zAIO initialization 83		
get maximum runnable version	zAIO return codes 81		
zdnn_get_max_runnable_version <u>25</u>	zaio_absolute 90		
get size function	zaio_averageVector 85		
zdnn_getsize_ztensor <u>17</u>	zaio_cblasReady 84		
initialization	zaio_cosineDistance 88		
zdnn_init <u>11</u>	zaio_denormalize 89		
initialize pre-transformed tensor descriptor	zaio_dotProduct 87		
zdnn_init_pre_transformed_desc <u>17</u>	zaio_getVersion 84		
initialize zTensor	zaio_Init 83		
zdnn_init_ztensor 19	zaio_matrixMatrix 92		
initialize zTensor with memory allocate	zaio_matrixVector 91		
zdnn_init_ztensor_with_malloc 20	zaio_normalize 88		
query functions	zaio preFetching Clear 98		

```
zaio_preFetching_Execute 97
zaio_prefetching_Initialize 95
zaio_semanticAnalogy 94
zaio_semanticAverage 86
zaio_semanticClustering 94
zaio_semanticSimilarity 93
zaio_transpose 92
zaio_vectorCopy 85
zaio vectorScale 90
zaio zaiuReady 84
zDNN tensor (zTensor) 5
zDNN usage examples 59
zdnn_add 28
zdnn_allochelper_ztensor 21
zdnn_avgpool2d 51
zdnn_batchnorm 39
zdnn_conv2d 56
zdnn_div 30
zdnn_exp 33
zdnn_free_ztensor_buffer 22
zdnn_generate_transformed_desc 18
zdnn_generate_transformed_desc_concatenated 18
zdnn_get_library_version 16
zdnn_get_library_version_str 16
zdnn_get_max_runnable_version 25
zdnn_get_nnpa_max_dim_idx_size 12
zdnn_get_nnpa_max_tensor_size 12
zdnn_get_status_message 22
zdnn_getsize_ztensor 17
zdnn_gru 47
zdnn_init 11
zdnn init pre transformed desc 17
zdnn init ztensor 19
zdnn_init_ztensor_with_malloc 20
zdnn_is_nnpa_conversion_installed 15
zdnn_is_nnpa_datatype_installed 14
zdnn_is_nnpa_function_installed 13
zdnn_is_nnpa_installed 13
zdnn_is_nnpa_layout_fmt_installed 15
zdnn_is_nnpa_parmblk_fmt_installed 14
zdnn_is_version_runnable 24
zdnn_log 33
zdnn_lstm 43
zdnn_matmul_bcast_op 41
zdnn_matmul_op 40
zdnn_max 32
zdnn_maxpool2d 53
zdnn_meanreduce2d 38
zdnn_min 31
zdnn_mul 30
zdnn_refresh_nnpa_query_result 16
zdnn_relu 34
zdnn_reset_ztensor 21
zdnn reshape ztensor 23
zdnn_sigmoid 36
zdnn_softmax 36
zdnn sub 29
zdnn_tanh 35
zdnn_transform_origtensor 27
zdnn_transform_ztensor 25
zTensor 5
zTensor descriptor 5
```

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