Linear Algebra for the Standard C++ Library (A Proposal)

Linear Algebra for the Standard C++ Library (A Proposal)

Sponsored by: The American East Const Association of America®

Bob Steagall C++Now 2019

Overview

Some background

High-level goals

Some important definitions

Design aspects

Scope and requirements

Interface design

How it works

Customizing behavior

Ongoing / future work

Overview

- Discussion of P1385
 - A proposal to add linear algebra support to the C++ standard library
 - http://wg21.link/P1385
- Co-author Guy Davidson
- SG14 Linear Algebra Study Group

Some Background

What is Linear Algebra?

Linear algebra

 The branch of mathematics concerning linear equations and linear functions and their representations through matrices and vector spaces.

- Central to many areas of mathematics
 - For example, modern treatments of geometry
- Useful in science and engineering
 - Allows modeling many phenomena and computing efficiently with such models
 - Used in many domains (computer graphics, machine learning, finance, analytics, medical imaging, signal processing, nuclear simulations, etc.)

User Requirements

- Everyone
 - Ease-of-use
 - Expressiveness
 - Performance

- Super-users
 - Customization
 - Support for non-traditional computing environments

High-Level Goals - General

- Provide a set of linear algebra vocabulary types
- Provide a public interface that is
 - Intuitive
 - Teachable
 - Customizable
 - -- and --
 - Mimics traditional mathematical notation
- Exhibit competitive out-of-box performance

High-Level Goals – Customization

- Provide a set of building blocks for
 - Managing memory (source, ownership, lifetime, layout, access)
 - Managing other resources (e.g., execution context)
 - Possibly representing other interesting math types (e.g., tensors, quaternions)
- Provide straightforward tools for customization
 - Enable users to optimize performance for their specific problem/hardware
- Provide a reasonable level of granularity for customization
 - Users have to implement a minimum set of types/functions

Some Important Definitions

Linear algebra is primarily the study of vector spaces.

Vector space

- A collection of vectors, where vectors are objects that may be added together and multiplied by scalars
- Euclidean vectors are an example of a vector space, typically used to represent displacements, as well as physical quantities such as force or momentum

• **Dimension** of a vector space

The number of coordinates required to specify any point within the space

Matrix

- A rectangular arrangement of numbers, symbols, or expressions organized in rows and columns
- A matrix having R rows and C columns is said to have size R x C
- Matrices provide a useful way of representing linear transformations from one vector space to another

Element

- An individual member of the rectangular arrangement comprising the matrix
- Rows are traditionally indexed from 1 to R, and columns from 1 to C
- In matrix A, element a_{11} appears in the upper left-hand corner, while element a_{RC} appears in the lower right-hand corner.

Row vector

- A matrix containing a single row a matrix of size 1 x C
- The rows of a matrix are sometimes called row vectors

Column vector

- A matrix containing a single column a matrix of size R x 1
- The columns of a matrix are sometimes called column vectors

Rank (of a matrix)

- The dimension of the vector space spanned by its rows/columns
- Also equal to the maximum number of linearly-independent rows/columns

Element transforms

 Non-arithmetic operations that modify the relative positions of elements in a matrix, such as transpose, column exchange, and row exchange

Element arithmetic

 Arithmetical operations that read or modify the values of individual elements independently of other elements

Matrix arithmetic

 Assignment, addition, subtraction, negation, and multiplication operations defined for matrices and vectors as wholes

Decompositions

 Complex sequences of arithmetic operations, element arithmetic, and element transforms performed upon a matrix to determine important mathematical properties of that matrix

Eigen-decompositions

 Sequences of operations performed upon a symmetric matrix in order to compute the eigenvalues and eigenvectors of that matrix

Math object

Generically, one of the C++ types matrix or vector described here

Storage

A synonym for memory

Dense

A math object representation with storage allocated for every element

Sparse

A math object representation with storage allocated only for non-zero elements

- Engines are implementation types that manage the resources associated with a math object
 - Element storage ownership and lifetime
 - Access to individual elements
 - Resizing/reserving, if appropriate
 - Execution context
- In this interface design, an engine object is a private member of a containing math object

 Other than as a template parameter, engines are not part of a math object's public interface

Traits

- A (usually) stateless class or class template whose members provide an interface normalized over some set of types or template parameters
- Often appear as parameters in class/function templates

Row capacity / column capacity

• The maximum number of rows/columns that a math object could possibly have

Row size / column size

- The number of rows/columns that a math object actually has
- Must be less than or equal to corresponding row/column capacities

Fixed-size

An engine type whose row/column sizes are fixed and known at compile time

Fixed-capacity

An engine type whose row/column capacities are fixed and known at compile time

Dynamically re-sizable

An engine type whose row/column sizes/capacities are set at run time

- Matrix is frequently (ab)used by C/C++ programmers to mean a general purpose array with some arbitrary number of indices
- We use matrix to mean the mathematical object
 - And matrix to mean the C++ class template that models a matrix
- We use the term array to mean a
 - Single- or multi-dimensional array in the C++ sense
 - No invariants pertaining to higher-level or mathematical meaning

- Vector is frequently (ab)used by C/C++ programmers to mean a dynamically-resizable one-dimensional array
- We use vector to mean the mathematical object
 - And vector to mean the C++ class template that models a vector
- We use the term linear array to mean a
 - Single-dimensional array in the C++ sense, having
 - No invariants pertaining to a higher-level or mathematical meaning

- In programming, dimension refers to the number of indices required to access an element of an array
- In linear algebra, a vector space V is n-dimensional if there exists n linearly independent vectors that span V
- We use dimension both ways
 - A vector describing a point in an electric field is a one-dimensional data structure implemented as a three-dimensional vector
 - A rotation matrix used by a game engine is two-dimensional data structure composed of three-dimensional row and column vectors

- The rank of a matrix is the dimension of the vector space spanned by its rows/columns
 - In tensor analysis, rank is often used as a synonym for a tensor's order
- The C++ standard uses the term rank as a synonym for dimension
 - [meta.unary.prop.query]: rank is the number of dimensions of T, if T names an array, otherwise it is zero

We avoid using rank

Design Aspects

Design Aspects – Memory

Location

- In an external buffer allocated from the global heap or custom allocator
- In an internal buffer that is a member of the math object itself
- Collectively in a set of buffers distributed across multiple processes/machines

Addressing model

Memory might be addressed via fancy pointer (e.g., shared / distributed /elsewhere)

Ownership

- A math object might own and manage its memory
- A math object might use a const/mutable view to memory managed by another object

Design Aspects – Memory

Capacity and resizability

- In some problem domains, it is useful for a math object to have excess storage capacity, so that resizes do not require reallocations
- In other problem domains (like graphics) math objects are small and never resize

Element layout

- In C/C++, the default is row-major dense rectangular
- In Fortran, the default is column-major dense rectangular
- Upper/lower triangular; banded
- Sparse

Design Aspects – Elements

Element types

- C++ provides only a small set of arithmetic types
- Sometimes other types are desirable
 - Fixed-point, arbitrary precision floating point, elastic precision, complex, etc.
 - Individual elements may allocate memory can't assume trivial element types
- Expressions with mixed element types
 - In general, when multiple primitive types are present in a arithmetic expression, the resulting type is the "largest" of all the types
 - Information should be preserved
 - The process of determining the resulting element type is element promotion

Design Aspects – Arithmetic

- Expressions with mixed engine types
 - Consider fixed-size matrix multiplied by a dynamically-resizable matrix
 - The resulting engine should be at least as "general" as the "most general" of all the engine types participating in the expression
 - Determining the resulting engine type is called engine promotion
- Arithmetic expressions
 - Users may want to optimize specific operations
 - SIMD-based matrix-matrix and matrix-vector multiplication
 - Two operands may be associated with different customizations
 - Determining the customization to employ is operation traits promotion

Scope and Requirements

Scope

- The best approach for standardizing a set of linear algebra components for C++23 will be one that is layered, iterative, and incremental
- This proposal (P1385) is deliberately one for basic linear algebra only
 - Describes the minimum set of components and arithmetic operations necessary to provide a reasonable, basic level of functionality
- Higher-level functionality can be built upon the interfaces described the proposal
 - We encourage succession papers to explore this possibility!

Required Functionality – Abstract

- Provide the minimal set of types and functions required to perform basic matrix arithmetic in finite dimensional spaces
 - Facilities for determining if a type T can be a matrix element
 - Types that that implement engines
 - Types that model matrices, row vectors, and column vectors
 - Support for element transforms
 - Support for element arithmetic
 - Support for (possibly mixed-type) matrix arithmetic

Make it easy-to-use and extensible

Required Functionality - Concrete

- Model the mathematical ideas
 - Traits types to validate element type
 - Class templates that implement engines
 - Class templates that represent matrices and vectors
 - Arithmetic operators for addition, subtraction, and negation of matrices and vectors
 - Arithmetic operators for scalar multiplication of matrices and vectors
 - Arithmetic operators for non-scalar multiplication of matrices and vectors

Required Functionality - Concrete

- Make it flexible
 - Use traits types to ensure mixed-type arithmetic expressions are supported
- Make it extensible, with well-defined, (relatively) easy-to-use
 - Facilities for integrating new element types
 - Facilities for integrating custom engines
 - Facilities for integrating custom implementations of arithmetic operations
- Minimize customization points in/under namespace std
 - This design requires only two

Considered but Excluded

Tensors

- Every rank-2 tensor can be represented by a square matrix, but not every square matrix is a tensor
- The class invariants and public interface are very different from those of a matrix
- Matrices are not Liskov-substitutable for tensors

Quaternions

- Quaternions model math concepts very different from vectors
- Class invariants and public interface are also very different from that of vectors

Vectors are not Liskov-substitutable for quaternions

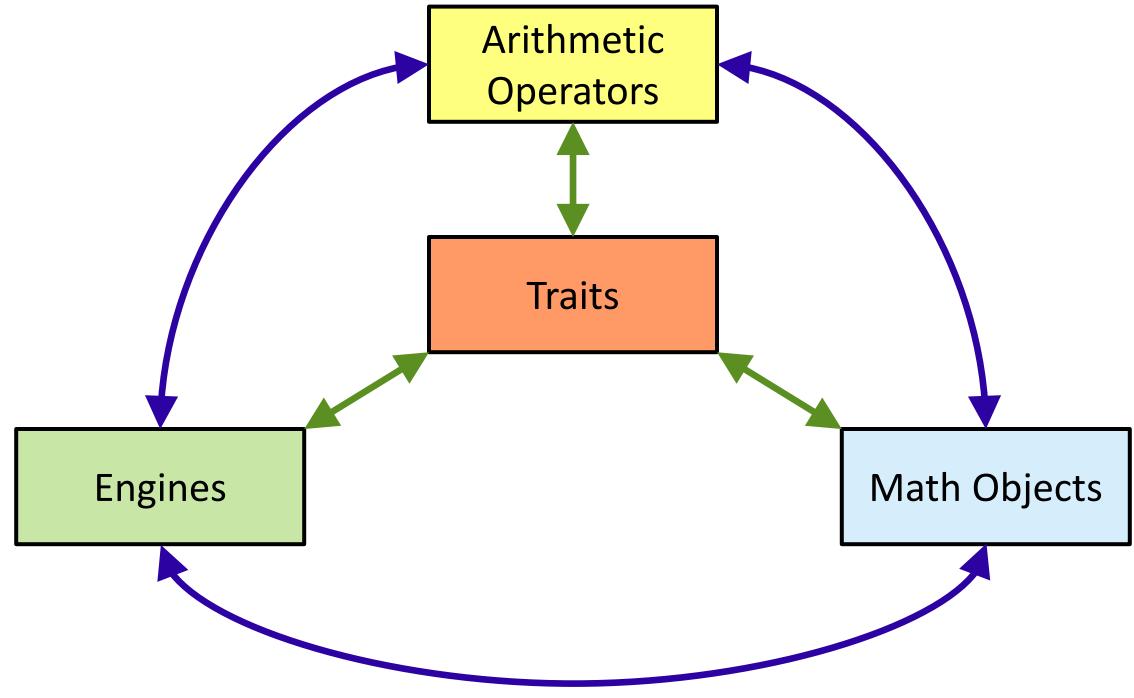
Interface and Components

Interface Overview – Type Categories

- Engines are implementation types that manage resources
 - Memory management, ownership, and lifetime control
 - Element access and update
- Math objects (vector and matrix) model mathematical abstractions
 - Use engines to manage elements
 - Present a consolidated interface to the arithmetic operators
- Operators provide the desired syntax
 - Addition, subtract, multiplication, and negation
- Traits types support the engines, math object, and operators

Perform type and value computations

Interface Overview – Type Categories



Interface Overview – Traits Support

Numeric traits

- Specify and test the properties of numeric types
- Customization point permitting partial/full specialization by the user

Element promotion traits

• Determine the resulting element type of an *element* arithmetic operation

Engine promotion traits

Determine the resulting engine type of a matrix arithmetic operation

Interface Overview – Traits Support

Arithmetic traits

Determine the resulting type and value of an arithmetic operation

Operation traits

- A "container" for element promotion, engine promotion, and arithmetic traits
- Template parameter to matrix and vector

Operation selector traits

- Used by operators to select the result's operation traits type
- Customization point, permitting partial/full specialization by the user

Interface Overview – Traits Support

- Implementation-specific private traits types (many)
- Employ the usual host of fundamental metaprogramming tools
 - Traits types
 - Partial specialization
 - Variable templates
 - Type detection idiom

Code Overview

Type Declarations – Numeric/Element Traits

```
namespace std::math {
//- A traits type that supplies important information about a numerical type. Note that
// this traits class is a customization point.
template < class T> struct number_traits;
//- Predicate traits for matrix element type inquiries.
template < class T> struct is_complex;
template < class T> struct is_field;
template < class T> struct is_ring;
template < class T> struct is _nc _ring;
template < class T> struct is_matrix_element;
```

Type Declarations – Engine Tags

```
namespace std::math {
//- Some type tags for specifying how engines should behave.
using scalar_engine_tag
                                 = integral_constant<int, 0>;
using const_vector_engine_tag
                               = integral_constant<int, 1>;
using mutable_vector_engine_tag = integral_constant<int, 2>;
using resizable_vector_engine_tag = integral_constant<int, 3>;
using const_matrix_engine_tag
                               = integral_constant<int, 4>;
using mutable_matrix_engine_tag = integral_constant<int, 5>;
using resizable_matrix_engine_tag = integral_constant<int, 6>;
```

Type Declarations – Engines

```
namespace std::math {
. . .
//- Owning engines with dynamically-allocated external storage.
template < class T, class AT> class dr_vector_engine;
//- Owning engines with fixed-size internal storage.
template < class T, int32_t R, int32_t C> class fs_matrix_engine;
//- Non-owning view-style engine.
template<class ET>
                class matrix_row_view;
                class matrix_transpose_view;
template<class ET>
```

Type Declarations – Operation Traits and Math Objects

```
namespace std::math {
//- The default element promotion, engine promotion, and arithmetic operation traits for
// the four basic arithmetic operations, rolled up under a consolidated traits type.
struct matrix_operation_traits;
//- Primary mathematical object types.
template < class ET, class OT = matrix_operation_traits > class vector;
template < class ET, class OT = matrix_operation_traits > class matrix;
```

Type Declarations – Element and Engine Promotion Traits

```
namespace std::math {
//- Math object element promotion traits, per arithmetical operation.
template<class T1>
                               struct matrix_negation_element_traits;
template<class T1, class T2>
                               struct matrix_addition_element_traits;
template<class T1, class T2>
                               struct matrix_subtraction_element_traits;
template<class T1, class T2>
                               struct matrix multiplication element traits;
//- Math object engine promotion traits, per arithmetical operation.
template<class OT, class ET1>
                                           struct matrix_negation_engine_traits;
template<class OT, class ET1, class ET2>
                                           struct matrix_addition_engine_traits;
template<class OT, class ET1, class ET2>
                                           struct matrix_subtraction_engine_traits;
                                           struct matrix_multiplication_engine_traits;
template<class OT, class ET1, class ET2>
```

Type Declarations – Arithmetic and Operation Traits

```
namespace std::math {
//- Math object arithmetic traits.
template<class OT, class OP1>
                                            struct matrix_negation_traits;
template<class OT, class OP1, class OP2>
                                            struct matrix_addition_traits;
template<class OT, class OP1, class OP2>
                                            struct matrix_subtraction_traits;
template<class OT, class OP1, class OP2>
                                            struct matrix multiplication traits;
//- A traits type that chooses between two operation traits types in the binary arithmetic
   operators and free functions that act like binary operators (e.g., outer_product()).
   Note that this traits class is a customization point.
template < class T1, class T2> struct matrix_operation_traits_selector;
```

Operators – Addition, Subtraction, Negation

```
namespace std::math {
//- Addition
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator +(vector<ET1, OT1> const& v1, vector<ET2, OT2> const& v2);
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2);
```

Operators – Addition, Subtraction, Negation

```
namespace std::math {
//- Subtraction
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator -(vector<ET1, OT1> const& v1, vector<ET2, OT2> const& v2);
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator -(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2);
```

Operators – Addition, Subtraction, Negation

```
namespace std::math {
//- Negation
template<class ET1, class OT1>
inline auto operator -(vector<ET1, OT1> const& v1);
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator -(matrix<ET1, OT1> const& m1);
```

Operators – Scalar/Math Type Multiplication

```
namespace std::math {
//- Vector*Scalar
template<class ET1, class OT1, class S2>
inline auto operator *(vector<ET1, OT1> const& v1, S2 const& s2);
template<class S1, class ET2, class OT2>
inline auto operator *(S1 const& s1, vector<ET2, OT2> const& v2);
//- Matrix*Scalar
template<class ET1, class OT1, class S2>
inline auto operator *(matrix<ET1, OT1> const& m1, S2 const& s2);
template<class S1, class ET2, class OT2>
inline auto operator *(S1 const& s1, matrix<ET2, OT2> const& m2);
```

Operators – Math Type / Math Type Multiplication

```
namespace std::math {
//- Vector*Matrix
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator *(vector<ET1, OT1> const& v1, matrix<ET2, OT2> const& m2);
//- Matrix*Vector
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator *(matrix<ET1, OT1> const& m1, vector<ET2, OT2> const& v2);
```

Operators – Math Type / Math Type Multiplication

```
namespace std::math {
//- Vector*Vector
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator *(vector<ET1, OT1> const& v1, vector<ET2, OT2> const& v2);
//- Matrix*Matrix
template<class ET1, class OT1, class ET2, class OT2>
inline auto operator *(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2);
```

Convenience Aliases

```
namespace std::math {
//- Aliases for vector and matrix objects based on dynamically-resizable engines.
template<class T, class A = allocator<T>>
using dyn_vector = vector<dr_vector_engine<T, A>, matrix_operation_traits>;
template<class T, class A = allocator<T>>
using dyn_matrix = matrix<dr_matrix_engine<T, A>, matrix_operation_traits>;
//- Aliases for vector and matrix objects based on fixed-size engines.
template<class T, int32_t N>
using fs vector = vector<fs vector engine<T, N>, matrix operation traits>;
template<class T, int32_t R, int32_t C>
using fs_matrix = matrix<fs_matrix_engine<T, R, C>, matrix_operation_traits>;
```

Numeric Traits

Interface Overview – Numeric Traits

Numeric traits

- Specify and test the properties of numeric types
- Customization point intended to be partially/fully specializable by the user

```
//- A traits type that supplies important information about a numerical type. Note that
// this traits class is a customization point.
template < class T> struct number traits;
//- Predicate traits for matrix element type inquiries.
template < class T> struct is_complex;
template < class T > struct is_field;
template < class T> struct is_ring;
template<class T>
                    struct is_nc_ring;
template < class T > struct is matrix element;
```

Numeric Traits - number_traits<T>

```
namespace detail {
//- Support types for a possible implementation.
struct builtin_number_traits
    using is_field = true_type;
    using is_ring = true_type;
    using is_nc_ring = true_type;
};
struct non_number_traits
   using is_field = false_type;
using is_ring = false_type;
    using is_nc_ring = false_type;
};
```

Numeric Traits - number_traits<T>

```
namespace detail {
//- More support for a possible implementation.
template<class T>
using scalar_number_traits_helper_t =
            conditional_t<is_arithmetic_v<T>, builtin_number_traits, non_number_traits>;
//- A traits type that supplies important information about a numerical type.
template<class T>
struct number_traits : public detail::scalar_number_traits_helper_t<T> {};
template<class T>
struct number_traits<complex<T>> : public number_traits<T> {};
```

Number, Traits - is_field<T>, is_matrix_element<T>

```
//- Predicate trait types for fields
template<class T>
struct is_field : public bool_constant<number_traits<T>::is_field::value> {};
template < class T > constexpr bool is_field_v = is_field < T > :: value;
//- Predicate traits type for matrix elements.
template<class T>
struct is_matrix_element : public bool_constant<is_arithmetic_v<T> || is_field_v<T>> {};
template<class T>
constexpr bool is_matrix_element_v = is_matrix_element<T>::value;
```

Engines

Interface Overview – Engines

- Engines are implementation types that manage resources
 - Memory management, ownership, and lifetime control
 - Element access

```
//- Owning engines with dynamically-allocated external storage.
template < class T, class AT> class dr_vector_engine;
//- Owning engines with fixed-size internal storage.
template < class T, int32_t R, int32_t C> class fs matrix engine;
//- Non-owning view-style engine.
template<class ET>
                  class matrix column view;
template<class ET>
                  class matrix_row_view;
template<class ET>
                  class matrix transpose view;
```

DR Matrix Engine – Nested Type Aliases

```
template<class T, class AT>
class dr_matrix_engine
   static_assert(is_matrix_element_v<T>);
 public:
   using engine_category = resizable_matrix_engine_tag;
   using element_type = T;
   using value_type = T;
   using allocator_type = AT;
   using reference = T&;
   using pointer = typename allocator_traits<AT>::pointer;
   using const_reference = T const&;
   using const_pointer = typename allocator_traits<AT>::const_pointer;
   using difference_type = ptrdiff_t;
   using index_type = ptrdiff_t;
   using size_type = ptrdiff_t;
   using size_tuple = tuple<size_type, size_type>;
```

DR Matrix Engine – Nested Type Aliases

```
template<class T, class AT>
class dr_matrix_engine
 public:
    . . .
   using is_fixed_size = false_type;
   using is_resizable = true_type;
   using is_column_major = false_type;
   using is_dense = true_type;
   using is_rectangular = true_type;
   using is_row_major = true_type;
   using column_view_type
                            = matrix_column_view<dr_matrix_engine>;
   using row_view_type
                             = matrix_row_view<dr_matrix_engine>;
   using transpose_view_type = matrix_transpose_view<dr_matrix_engine>;
```

DR Matrix Engine – Special Member Functions and Constructors

```
template<class T, class AT>
class dr_matrix_engine
  public:
    • • •
    ~dr_matrix_engine();
    dr_matrix_engine();
    dr_matrix_engine(dr_matrix_engine&& rhs) noexcept;
    dr_matrix_engine(dr_matrix_engine const& rhs);
    dr_matrix_engine& operator =(dr_matrix_engine&&) noexcept;
    dr_matrix_engine& operator =(dr_matrix_engine const&);
    dr_matrix_engine(size_type rows, size_type cols);
    dr_matrix_engine(size_type rows, size_type cols, size_type rowcap, size_type colcap);
```

DR Matrix Engine – Const Element Access and Properties

```
template<class T, class AT>
class dr_matrix_engine
  public:
    . . .
   const_reference
                       operator ()(index_type i, index_type j) const;
               columns() const noexcept;
   size_type
   size_type rows() const noexcept;
   size_tuple size() const noexcept;
               column_capacity() const noexcept;
   size_type
               row_capacity() const noexcept;
   size_type
    size_tuple capacity() const noexcept;
```

DR Matrix Engine – Mutable Element Access

```
template<class T, class AT>
class dr_matrix_engine
  public:
    • • •
    reference operator ()(index_type i, index_type j);
   void
            assign(dr_matrix_engine const& rhs);
    template<class ET2>
           assign(ET2 const& rhs);
    void
            swap(dr_matrix_engine& other) noexcept;
    void
            swap_columns(index_type c1, index_type c2);
   void
            swap_rows(index_type r1, index_type r2);
   void
```

DR Matrix Engine – Capacity and Size Management

DR Matrix Engine – Possible Private Implementation

```
template<class T, class AT>
class dr_matrix_engine
    . . .
  private:
    pointer
                     mp_elems;
    size_type
                     m_rows;
    size_type
                     m_cols;
    size_type
                    m_rowcap;
    size_type
                    m_colcap;
    allocator_type m_alloc;
    . . .
```

FS Matrix Engine – Nested Type Aliases

```
template<class T, int32_t R, int32_t C>
class fs_matrix_engine
   static_assert(is_matrix_element_v<T>);
   static_assert(R >= 1 && C >= 1);
 public:
   using engine_category = mutable_matrix_engine_tag;
   using element_type = T;
   using value_type = T;
   using reference = T&;
   using pointer = T*;
   using const_reference = T const&;
   using const_pointer = T const*;
   using difference_type = ptrdiff_t;
   using index_type = int_fast32_t;
   using size_type = int_fast32_t;
   using size_tuple = tuple<size_type, size_type>;
```

FS Matrix Engine – Nested Type Aliases

```
template<class T, int32_t R, int32_t C>
class fs_matrix_engine
 public:
    . . .
   using is_fixed_size = true_type;
   using is_resizable = false_type;
   using is_column_major = false_type;
   using is_dense = true_type;
   using is_rectangular = true_type;
   using is_row_major = true_type;
   using column_view_type
                            = matrix_column_view<fs_matrix_engine>;
   using row_view_type
                             = matrix_row_view<fs_matrix_engine>;
   using transpose_view_type = matrix_transpose_view<fs_matrix_engine>;
```

FS Matrix Engine – Special Member Functions

```
template<class T, int32_t R, int32_t C>
class fs_matrix_engine
  public:
    . . .
    constexpr fs_matrix_engine();
    constexpr fs_matrix_engine(fs_matrix_engine&&) noexcept = default;
    constexpr fs_matrix_engine(fs_matrix_engine const&) = default;
                                    operator =(fs_matrix_engine&&) noexcept = default;
    constexpr fs_matrix_engine&
                                     operator =(fs_matrix_engine const&) = default;
    constexpr fs_matrix_engine&
    • • •
```

FS Matrix Engine – Const Element Access and Properties

```
template<class T, int32_t R, int32_t C>
class fs_matrix_engine
  public:
    . . .
    constexpr const_reference operator ()(index_type i, index_type j) const;
    constexpr index_type
                            columns() const noexcept;
    constexpr index_type
                            rows() const noexcept;
    constexpr size_tuple
                            size() const noexcept;
    constexpr size_type
                            column_capacity() const noexcept;
    constexpr size_type
                            row_capacity() const noexcept;
    constexpr size_tuple
                            capacity() const noexcept;
```

FS Matrix Engine – Mutable Element Access

```
template<class T, int32_t R, int32_t C>
class fs_matrix_engine
  public:
    . . .
    constexpr reference operator ()(index_type i, index_type j);
    constexpr void
                        assign(fs_matrix_engine const& rhs);
    template<class ET2>
    constexpr void
                        assign(ET2 const& rhs);
                        swap(fs_matrix_engine& rhs) noexcept;
    constexpr void
                        swap_columns(index_type j1, index_type j2) noexcept;
    constexpr void
    constexpr void
                        swap_rows(index_type i1, index_type i2) noexcept;
```

FS Matrix Engine – Possible Private Implementation

```
template < class T, int32_t R, int32_t C>
class fs_matrix_engine
{
    ...
    private:
        T ma_elems[R*C];
};
```

Matrix Transpose View – Nested Type Aliases

```
template<class ET>
class matrix_transpose_view
   static_assert(detail::is_matrix_engine_v<ET>);
  public:
   using engine_type
                      = ET;
   using engine_category = const_matrix_engine_tag;
   using element_type
                       = typename engine_type::element_type;
                         = typename engine_type::value_type;
   using value_type
                         = typename engine_type::const_reference;
   using reference
   using pointer
                         = typename engine_type::const_pointer;
   using const_reference = typename engine_type::const_reference;
   using const_pointer = typename engine_type::const_pointer;
   using difference_type = typename engine_type::difference_type;
   using index_type
                         = typename engine_type::index_type;
   using size_type
                         = typename engine_type::size_type;
   using size_tuple
                         = typename engine_type::size_tuple;
```

Matrix Transpose View – Nested Type Aliases

```
template<class ET>
class matrix_transpose_view
  public:
    . . .
   using is_fixed_size = typename engine_type::is_fixed_size;
   using is resizable = false type;
   using is_column_major = typename engine_type::is_row_major;
   using is_dense = typename engine_type::is_dense;
   using is_rectangular = typename engine_type::is_rectangular;
    using is_row_major
                       = typename engine_type::is_column_major;
   using column_view_type
                             = matrix_column_view<matrix_transpose_view>;
                             = matrix_row_view<matrix_transpose_view>;
   using row_view_type
    using transpose_view_type = matrix_transpose_view<matrix_transpose_view>;
```

Matrix Transpose View – Const Element Access and Properties

```
template<class ET>
class matrix_transpose_view
  public:
    . . .
    constexpr const_reference operator ()(index_type i, index_type j) const;
                            columns() const noexcept;
    constexpr size_type
    constexpr size_type
                            rows() const noexcept;
    constexpr size_tuple
                            size() const noexcept;
    constexpr size_type
                            column_capacity() const noexcept;
    constexpr size_type
                            row_capacity() const noexcept;
    constexpr size_tuple
                            capacity() const noexcept;
```

Matrix Transpose View – Possible Private Implementation

matrix_operation_traits

Interface Overview – Math Objects

- Math objects (vector and matrix) model mathematical abstractions
 - Use engines to manage elements
 - Use operation traits to suggest arithmetic implementation
 - Present a consolidated interface to the arithmetic operators

```
//- The default element promotion, engine promotion, and arithmetic operation traits for
// the four basic arithmetic operations.
//
struct matrix_operation_traits;

//- Primary mathematical object types.
//
template<class ET, class OT=matrix_operation_traits> class vector;
template<class ET, class OT=matrix_operation_traits> class matrix;
```

Matrix Operation Traits – Element Promotion

```
struct matrix_operation_traits
    //- Default element promotion traits.
   template<class T1>
    using element_negation_traits = matrix_negation_element_traits<T1>;
    template<class T1, class T2>
    using element_addition_traits = matrix_addition_element_traits<T1, T2>;
    template<class T1, class T2>
    using element_subtraction_traits = matrix_subtraction_element_traits<T1, T2>;
   template<class T1, class T2>
    using element_multiplication_traits = matrix_multiplication_element_traits<T1, T2>;
```

Matrix Operation Traits – Engine Promotion

```
struct matrix operation traits
    • • •
   //- Default engine promotion traits.
    template<class OTR, class ET1>
    using engine_negation_traits = matrix_negation_engine_traits<OTR, ET1>;
    template<class OTR, class ET1, class ET2>
    using engine_addition_traits = matrix_addition_engine_traits<OTR, ET1, ET2>;
    template<class OTR, class ET1, class ET2>
    using engine_subtraction_traits = matrix_subtraction_engine_traits<OTR, ET1, ET2>;
    template<class OTR, class ET1, class ET2>
    using engine_multiplication_traits = matrix_multiplication_engine_traits<OTR, ET1, ET2>;
```

Matrix Operation Traits – Arithmetic

```
struct matrix_operation_traits
    • • •
    //- Default arithmetic operation traits.
    template<class OP1, class OTR>
    using negation_traits = matrix_negation_traits<OP1, OTR>;
    template<class OTR, class OP1, class OP2>
    using addition_traits = matrix_addition_traits<OTR, OP1, OP2>;
    template<class OTR, class OP1, class OP2>
    using subtraction_traits = matrix_subtraction_traits<OTR, OP1, OP2>;
    template<class OTR, class OP1, class OP2>
    using multiplication_traits = matrix_multiplication_traits<OTR, OP1, OP2>;
};
```

vector

Vector – Nested Type Aliases

```
template<class ET, class OT>
class vector
    static_assert(detail::is_vector_engine_v<ET>);
  public:
   using engine_type
                       = ET;
   using element_type = typename engine_type::element_type;
   using reference
                         = typename engine_type::reference;
   using const_reference = typename engine_type::const_reference;
   using iterator
                         = typename engine_type::iterator;
   using const_iterator = typename engine_type::const_iterator;
   using index_type
                         = typename engine_type::index_type;
   using size_type
                         = typename engine_type::size_type;
    . . .
```

Vector – Nested Type Aliases

```
template<class ET, class OT>
class vector
  public:
    . . .
   using transpose_type = vector const&;
   using hermitian_type = conditional_t<is_complex_v<element_type>, vector, transpose_type>;
   using is_fixed_size = typename engine_type::is_fixed_size;
   using is_resizable = typename engine_type::is_resizable;
   using is_column_major = typename engine_type::is_column_major;
   using is_dense = typename engine_type::is_dense;
   using is_rectangular = typename engine_type::is_rectangular;
   using is_row_major = typename engine_type::is_row_major;
```

Vector – Special Member Functions

```
template<class ET, class OT>
class vector
  public:
    . . .
    ~vector() = default;
    constexpr vector() = default;
    constexpr vector(vector&&) noexcept = default;
    constexpr vector(vector const&) = default;
    constexpr vector& operator = (vector&&) noexcept = default;
    constexpr vector& operator =(vector const&) = default;
    . . .
```

Vector – Other Constructors and Assignment Operators

```
template<class ET, class OT>
class vector
  public:
    . . .
   template<class ET2, class OT2>
    constexpr vector(vector<ET2, OT2> const& src);
   template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr vector(size_type elems);
   template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr vector(size_type elems, size_type elemcap);
   template<class ET2, class OT2>
    constexpr vector& operator =(vector<ET2, OT2> const& rhs);
```

Vector – Const Element Access and Properties

```
template<class ET, class OT>
class vector
  public:
    . . .
                                operator ()(index_type i) const;
    constexpr const_reference
    constexpr const_iterator
                                begin() const noexcept;
    constexpr const_iterator
                                end() const noexcept;
    constexpr size_type
                                capacity() const noexcept;
    constexpr index_type
                                elements() const noexcept;
    constexpr size_type
                                size() const noexcept;
                             t() const;
    constexpr transpose_type
                             h() const;
    constexpr hermitian_type
    . . .
```

Vector – Mutable Element Operations

```
template<class ET, class OT>
class vector
  public:
    . . .
    constexpr reference operator ()(index_type i);
    constexpr iterator begin() noexcept;
    constexpr iterator end() noexcept;
    constexpr void
                        assign(vector const& rhs);
    template<class ET2, class OT2>
    constexpr void
                        assign(vector<ET2, OT2> const& rhs);
    constexpr void
                        swap(vector& rhs) noexcept;
    constexpr void
                        swap_elements(index_type i, index_type j) noexcept;
    . . .
```

Vector - Size and Capacity Management

```
template<class ET, class OT>
class vector
  public:
    . . .
   template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
   constexpr void
                       reserve(size_type elemcap);
   template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
   constexpr void resize(size_type elems);
   template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr void resize(size_type elems, size_type elemcap);
    • • •
```

Vector – Private Implementation

matrix

Matrix – Nested Type Aliases

```
template<class ET, class OT>
class matrix
    static_assert(detail::is_matrix_engine_v<ET>);
  public:
   using engine_type
                       = ET;
   using element_type = typename engine_type::element_type;
   using reference
                         = typename engine_type::reference;
   using const_reference = typename engine_type::const_reference;
   using index_type
                         = typename engine_type::index_type;
   using size_type
                         = typename engine_type::size_type;
   using size_tuple
                         = typename engine_type::size_tuple;
```

Matrix – Nested Type Aliases

```
template<class ET, class OT>
class matrix
  public:
    . . .
    using column_type
                         = vector<matrix_column_view<engine_type>, OT>;
   using row_type
                         = vector<matrix_row_view<engine_type>, OT>;
    using transpose_type
                         = matrix<matrix_transpose_view<engine_type>, OT>;
    using hermitian type
                         = conditional_t<is_complex_v<element_type>, matrix, transpose_type>;
    using is_fixed_size
                         = typename engine_type::is_fixed_size;
    using is_resizable
                         = typename engine_type::is_resizable;
    using is_column_major = typename engine_type::is_column_major;
   using is_dense = typename engine_type::is_dense;
    using is_rectangular = typename engine_type::is_rectangular;
                         = typename engine_type::is_row_major;
    using is_row_major
```

Matrix – Special Member Functions

```
template<class ET, class OT>
class matrix
  public:
    . . .
   ~matrix() = default;
    constexpr matrix() = default;
    constexpr matrix(matrix&&) noexcept = default;
    constexpr matrix(matrix const&) = default;
                        operator =(matrix&&) noexcept = default;
    constexpr matrix&
    constexpr matrix&
                        operator =(matrix const&) = default;
```

Matrix – Other Constructors and Assignment

```
template<class ET, class OT>
class matrix
    template<class ET2, class OT2>
    matrix(matrix<ET2, OT2> const& src);
    template<class ET2, class OT2>
    constexpr matrix& operator =(matrix<ET2, OT2> const& rhs);
    template < class ET2 = ET, detail::enable_if_resizable < ET, ET2> = true>
    constexpr matrix(size tuple size);
    template < class ET2 = ET, detail::enable_if_resizable < ET, ET2> = true>
    constexpr matrix(size_type rows, size_type cols);
    template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr matrix(size_tuple size, size_tuple cap);
    template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr matrix(size_type rows, size_type cols, size_type rowcap, size_type colcap);
```

Matrix – Const Element Access and Properties

```
template<class ET, class OT>
class matrix
  public:
    constexpr const_reference
                                operator ()(index_type i, index_type j) const;
    constexpr index_type
                                columns() const noexcept;
    constexpr index_type
                                rows() const noexcept;
    constexpr size_tuple
                                size() const noexcept;
                                column_capacity() const noexcept;
    constexpr size_type
    constexpr size_type
                                row_capacity() const noexcept;
                                capacity() const noexcept;
    constexpr size tuple
                                column(index_type j) const noexcept;
    constexpr column_type
                                row(index_type i) const noexcept;
    constexpr row type
    constexpr transpose_type
                                t() const;
                                h() const;
    constexpr hermitian_type
```

Matrix – Mutable Element Operations

```
template<class ET, class OT>
class matrix
 public:
   constexpr reference operator ()(index_type i, index_type j);
   constexpr void assign(matrix const& rhs);
   template<class ET2, class OT2>
   constexpr void
                     assign(matrix<ET2, OT2> const& rhs);
   template < class ET2 = ET, detail::enable_if_mutable < ET, ET2> = true>
   constexpr void
                     swap(matrix& rhs) noexcept;
   template < class ET2 = ET, detail::enable_if_mutable < ET, ET2> = true>
   constexpr void
                     swap_columns(index_type i, index_type j) noexcept;
   template < class ET2 = ET, detail::enable_if_mutable < ET, ET2> = true>
```

Matrix - Capacity Management

```
template<class ET, class OT>
class matrix
  public:
    . . .
    template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr void reserve(size_tuple cap);
    template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr void reserve(size_type rowcap, size_type colcap);
    . . .
```

Matrix – Size Management

```
template<class ET, class OT>
class matrix
  public:
    • • •
    template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr void resize(size_tuple size);
    template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr void resize(size_type rows, size_type cols);
    . . .
```

Matrix – Size and Capacity Management

```
template<class ET, class OT>
class matrix
  public:
    . . .
    template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr void resize(size_tuple size, size_tuple cap);
    template<class ET2 = ET, detail::enable_if_resizable<ET, ET2> = true>
    constexpr void resize(size_type rows, size_type cols, size_type rowcap, size_type colcap);
    . . .
```

Matrix – Private Implementation

How Does it Work?

```
//- Create a couple of 4x4 matrices
//
matrix<dr_matrix_engine<float, allocator<double>>, matrix_operation_traits> m1(4, 4);
matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits> m2;
```

```
//- Create a couple of 4x4 matrices
//
matrix<dr_matrix_engine<float, allocator<double>>, matrix_operation_traits> m1(4, 4);
matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits> m2;

//- Set the values of their elements
//
f(m1);
f(m2);
```

```
//- Create a couple of 4x4 matrices
matrix<dr_matrix_engine<float, allocator<double>>, matrix_operation_traits>
                                                                            m1(4, 4);
matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>
                                                                            m2;
//- Set the values of their elements
//
f(m1);
f(m2);
//- Add them together. What is the type of mr? Specifically,
     What is the element type of mr?
//
     What is the engine type of mr?
//
     What is the operation traits type of mr?
//
auto
     mr = m1 + m2;
```

Let's Add Two Matrices

```
//- Create a couple of 4x4 matrices
matrix<dr_matrix_engine<float, allocator<double>>, matrix_operation_traits>
                                                                              m1(4, 4);
matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>
                                                                              m2;
//- Set the values of their elements
//
f(m1);
f(m2);
//- Add them together. What is the type of mr? Specifically,
      What is the element type of mr?
//
     What is the engine type of mr?
//
      What is the operation traits type of mr?
//
       mr = \frac{m1 + m2}{;}
auto
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
//
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
{
    using op_traits = matrix_operation_traits_selector_t<OT1, OT2>;
    using op1_type = matrix<ET1, OT1>;
    using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
    return add_traits::add(m1, m2);
}
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
    using op_traits = matrix_operation_traits_selector_t<0T1, OT2>;
    using op1_type
                    = matrix<ET1, OT1>;
    using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
    return add_traits::add(m1, m2);
   op_traits = ?
```

Operation Traits Selector

```
//- Alias template interface to selector trait.
template<class T1, class T2>
using matrix_operation_traits_selector_t =
                                 typename matrix_operation_traits_selector<T1,T2>::traits_type;
//- Selector trait primary template
template<class T1, class T2>
struct matrix_operation_traits_selector;
//- Partial specialization for equal operation traits types
template<class T1>
struct matrix_operation_traits_selector<T1, T1>
    using traits_type = T1;
```

Operation Traits Selector

```
//- Specializations involving matrix_operation_traits.
template<class T1>
struct matrix_operation_traits_selector<T1, matrix_operation_traits>
    using traits_type = T1;
};
template<class T1>
struct matrix_operation_traits_selector<matrix_operation_traits, T1>
    using traits_type = T1;
};
template<>
struct matrix_operation_traits_selector<matrix_operation_traits, matrix_operation_traits>
    using traits_type = matrix_operation_traits;
};
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
    using op_traits = matrix_operation_traits_selector_t<0T1, 0T2>;
    using op1_type
                    = matrix<ET1, OT1>;
    using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
    return add_traits::add(m1, m2);
   op_traits = matrix_operation_traits
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
    using op_traits = matrix_operation_traits_selector_t<OT1, OT2>;
   using op1_type = matrix<ET1, OT1>;
    using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
    return add_traits::add(m1, m2);
   op traits = matrix operation traits
   op1_type = matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
   using op_traits = matrix_operation_traits_selector_t<OT1, OT2>;
   using op1_type = matrix<ET1, OT1>;
   using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
   return add_traits::add(m1, m2);
   op_traits = matrix_operation_traits
// op1_type = matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>
              = matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>
// op2_type
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
    using op_traits = matrix_operation_traits_selector_t<OT1, OT2>;
    using op1_type
                    = matrix<ET1, OT1>;
    using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
    return add_traits::add(m1, m2);
   op_traits = matrix_operation_traits
// op1_type = matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>
              = matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>
// op2_type
//
    add_traits = matrix_addition_traits<matrix_operation_traits,</pre>
//
                     matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>,
                     matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>>
```

```
//- The matrix_addition_traits type is an arithmetic traits type that provides the default
// mechanism for determining the resulting type, and computing the result, of a matrix/matric
// or vector/vector addition.
//
template<class OT, class ET1, class OT1, class ET2, class OT2>
struct matrix_addition_traits<OT, matrix<ET1, OT1>, matrix<ET2, OT2>>
{
    using engine_type = matrix_addition_engine_t<OT, ET1, ET2>;
    using op_traits = OT;
    using result_type = matrix<engine_type, op_traits>;

    static result_type add(matrix<ET1, OT1> const& v1, matrix<ET2, OT2> const& v2);
};
```

```
//- The matrix_addition_traits type is an arithmetic traits type that provides the default
   mechanism for determining the resulting type, and computing the result, of a matrix/matric
   or vector/vector addition.
template<class OT, class ET1, class OT1, class ET2, class OT2>
struct matrix_addition_traits<OT, matrix<ET1, OT1>, matrix<ET2, OT2>>
    using engine_type = matrix_addition_engine_t<OT, ET1, ET2>;
    using op traits = OT;
    using result_type = matrix<engine_type, op_traits>;
    static result_type add(matrix<ET1, OT1> const& v1, matrix<ET2, OT2> const& v2);
};
   engine_type = ?
```

```
//- The matrix_addition_engine_traits type provides the default mechanism for determining the
// correct engine type for a matrix/matrix addition. This is the primary template.
template<class OT, class ET1, class ET2>
struct matrix_addition_engine_traits
    static_assert(detail::engines_match_v<ET1, ET2>);
    using element_type_1 = typename ET1::element_type;
    using element_type_2 = typename ET2::element type;
    using element_type = matrix_addition_element_t<OT, element_type_1, element_type_2>;
    using engine_type
                        = conditional_t<detail::is_matrix_engine_v<ET1>,
                                      dr_matrix_engine<element_type, allocator<element_type>>,
                                      dr_vector_engine<element_type, allocator<element_type>>>;
```

```
//- Traits type matrix_addition_engine_traits partially specialized for the case of
//
      dr_matrix_engine + fs_matrix_engine.
template<class OT, class T1, class A1, class T2, int32_t R2, int32_t C2>
struct matrix_addition_engine_traits<OT,</pre>
                                     dr_matrix_engine<T1, A1>,
                                     fs_matrix_engine<T2, R2, C2>>
    using element_type = matrix_addition_element_t<OT, T1, T2>;
    using alloc_type = detail::rebind_alloc_t<A1, element_type>;
    using engine_type = dr_matrix_engine<element_type, alloc_type>;
};
    element_type = ?
```

Matrix Element Addition Traits

```
//- The matrix_addition_elment_traits type provides the default mechanism for determining
// the result of adding two elements of (possibly) different types.
//
template<class T1, class T2>
struct matrix_addition_element_traits
{
    using element_type = decltype(declval<T1>() + declval<T2>());
};
```

Matrix Element Addition Traits

```
//- Traits type matrix_addition_engine_traits partially specialized for the case of
//
      dr_matrix_engine + fs_matrix_engine.
template<class OT, class T1, class A1, class T2, int32_t R2, int32_t C2>
struct matrix_addition_engine_traits<OT,</pre>
                                     dr_matrix_engine<T1, A1>,
                                     fs_matrix_engine<T2, R2, C2>>
    using element_type = matrix_addition_element_t<OT, T1, T2>;
    using alloc_type = detail::rebind_alloc_t<A1, element_type>;
    using engine_type = dr_matrix_engine<element_type, alloc_type>;
};
//- In this example,
    element_type = double
```

```
//- Traits type matrix_addition_engine_traits partially specialized for the case of
//
      dr_matrix_engine + fs_matrix_engine.
template<class OT, class T1, class A1, class T2, int32_t R2, int32_t C2>
struct matrix_addition_engine_traits<OT,</pre>
                                     dr_matrix_engine<T1, A1>,
                                     fs_matrix_engine<T2, R2, C2>>
    using element_type = matrix_addition_element_t<OT, T1, T2>;
    using alloc_type = detail::rebind_alloc_t<A1, element_type>;
    using engine_type = dr_matrix_engine<element_type, alloc_type>;
};
   element_type = double
    alloc_type = allocator<double>
```

```
//- Traits type matrix_addition_engine_traits partially specialized for the case of
//
      dr_matrix_engine + fs_matrix_engine.
template<class OT, class T1, class A1, class T2, int32_t R2, int32_t C2>
struct matrix_addition_engine_traits<OT,</pre>
                                     dr_matrix_engine<T1, A1>,
                                     fs_matrix_engine<T2, R2, C2>>
    using element_type = matrix_addition_element_t<OT, T1, T2>;
    using alloc_type = detail::rebind_alloc_t<A1, element_type>;
    using engine_type = dr_matrix_engine<element_type, alloc_type>;
};
   element_type = double
    alloc_type = allocator<double>
   engine_type = dr_matrix_engine<double, allocator<double>>
```

```
//- The standard addition traits type provides the default mechanism for computing the result
// of a matrix/matrix or vector/vector addition.
template<class OT, class ET1, class OT1, class ET2, class OT2>
struct matrix_addition_traits<OT, matrix<ET1, OT1>, matrix<ET2, OT2>>
    using engine_type = matrix_addition_engine_t<OT, ET1, ET2>;
    using op_traits = OT;
    using result_type = matrix<engine_type, op_traits>;
    static result_type add(matrix<ET1, OT1> const& v1, matrix<ET2, OT2> const& v2);
};
    engine_type = dr_matrix_engine<double, allocator<double>>
```

```
//- The standard addition traits type provides the default mechanism for computing the result
// of a matrix/matrix or vector/vector addition.
template<class OT, class ET1, class OT1, class ET2, class OT2>
struct matrix_addition_traits<OT, matrix<ET1, OT1>, matrix<ET2, OT2>>
    using engine_type = matrix_addition_engine_t<OT, ET1, ET2>;
    using op_traits = OT;
    using result_type = matrix<engine_type, op_traits>;
    static result_type add(matrix<ET1, OT1> const& v1, matrix<ET2, OT2> const& v2);
};
    engine_type = dr_matrix_engine<double, allocator<double>>
   op_traits = matrix_operation_traits
```

```
//- The standard addition traits type provides the default mechanism for computing the result
// of a matrix/matrix or vector/vector addition.
template<class OT, class ET1, class OT1, class ET2, class OT2>
struct matrix_addition_traits<OT, matrix<ET1, OT1>, matrix<ET2, OT2>>
    using engine_type = matrix_addition_engine_t<OT, ET1, ET2>;
    using op_traits = OT;
    using result_type = matrix<engine_type, op_traits>;
    static result_type add(matrix<ET1, OT1> const& v1, matrix<ET2, OT2> const& v2);
};
    engine_type = dr_matrix_engine<double, allocator<double>>
   op_traits = matrix_operation_traits
   result_type = matrix<dr_matrix_engine<double, allocator<double>>, matrix_operation_traits>
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
    using op_traits = matrix_operation_traits_selector_t<OT1, OT2>;
    using op1_type
                    = matrix<ET1, OT1>;
    using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
    return add_traits::add(m1, m2);
   op_traits = matrix_operation_traits
// op1_type = matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>
              = matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>
// op2_type
//
    add_traits = matrix_addition_traits<matrix_operation_traits,</pre>
//
                     matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>,
                     matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>>
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
    using op_traits = matrix_operation_traits_selector_t<OT1, OT2>;
    using op1_type = matrix<ET1, OT1>;
    using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
    return add_traits::add(m1, m2);
// op_traits = matrix_operation_traits
// op1_type = matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>
              = matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>
// op2_type
//
    add_traits = matrix_addition_traits<matrix_operation_traits,</pre>
//
                     matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>,
                     matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>>
```

```
//- The standard addition traits type provides the default mechanism for computing the result
// of a matrix/matrix or vector/vector addition.
template<class OT, class ET1, class OT1, class ET2, class OT2>
struct matrix_addition_traits<OT, matrix<ET1, OT1>, matrix<ET2, OT2>>
    using engine_type = matrix_addition_engine_t<OT, ET1, ET2>;
    using op_traits = OT;
    using result_type = matrix<engine_type, op_traits>;
    static result_type add(matrix<ET1, OT1> const& v1, matrix<ET2, OT2> const& v2);
};
    engine_type = dr_matrix_engine<double, allocator<double>>
   op_traits = matrix_operation_traits
   result_type = matrix<dr_matrix_engine<double, allocator<double>>, matrix_operation_traits>
```

Matrix Addition Traits – add()

```
template<class OT, class ET1, class OT1, class ET2, class OT2> inline auto
matrix_addition_traits<OT, matrix<ET1, OT1>, matrix<ET2, OT2>>::add
(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2) -> result_type
   //- Code would go here to ensure that m1.size() == m2.size()...
    result_type
                   mr;
   //- Code would go here to ensure that mr.size() == m1.size()...
   //- Add the elements
    for (auto i = 0; i < m1.rows(); ++i)</pre>
        for (auto j = 0; j < m1.columns(); ++j)
           mr(i, j) = m1(i, j) + m2(i, j);
    return mr;
```

Matrix Addition Traits – add()

```
template<class OT, class ET1, class OT1, class ET2, class OT2> inline auto
matrix_addition_traits<OT, matrix<ET1, OT1>, matrix<ET2, OT2>>::add
(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2) -> result_type
   //- Code would go here to ensure that m1.size() == m2.size()...
    result_type
                   mr;
   //- Code would go here to ensure that mr.size() == m1.size()...
   //- Add the elements
    for (auto i = 0; i < m1.rows(); ++i)</pre>
        for (auto j = 0; j < m1.columns(); ++j)</pre>
            mr(i, j) = m1(i, j) + m2(i, j);
    return mr;
```

```
//- The addition operator, which relies to the addition traits to do the actual work.
template<class ET1, class OT1, class ET2, class OT2>
inline auto
operator +(matrix<ET1, OT1> const& m1, matrix<ET2, OT2> const& m2)
    using op_traits = matrix_operation_traits_selector_t<OT1, OT2>;
    using op1_type = matrix<ET1, OT1>;
    using op2_type = matrix<ET2, OT2>;
    using add_traits = matrix_addition_traits_t<op_traits, op1_type, op2_type>;
    return add_traits::add(m1, m2);
// op_traits = matrix_operation_traits
// op1_type = matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>
              = matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>
// op2_type
//
    add_traits = matrix_addition_traits<matrix_operation_traits,</pre>
//
                     matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits>,
                     matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>>
```

Let's Add Two Matrices

```
//- Create a couple of 4x4 matrices
matrix<dr_matrix_engine<float, allocator<double>>, matrix_operation_traits>
                                                                             m1(4, 4);
matrix<fs_matrix_engine<double, 4, 4>, matrix_operation_traits>
                                                                             m2;
//- Set the values of their elements
//
f(m1);
f(m2);
//- Add them together.
//
       What is the element type of mr?
                                                  double
//
       What is the engine type of mr?
                                                  dr_matrix_engine<double, allocator<double>>
       What is the operation traits type of mr? matrix_operation_traits
//
//
       mr --> matrix<dr_matrix_engine<double, allocator<double>>, matrix_operation_traits>
//
       mr = m1 + m2;
auto
```

Customization

```
class new_num {
  public:
   new_num();
   new_num(new_num&&) = default;
    new_num(new_num const&) = default;
   template < class U>     new_num(U other);
               operator =(new_num&&) = default;
   new_num&
               operator =(new_num const&) = default;
   new num&
   template<class U> new num&
                                  operator =(U rhs);
               operator -() const;
   new num
               operator +() const;
   new num
               operator +=(new_num rhs);
   new num&
               operator -=(new_num rhs);
   new_num&
               operator *=(new_num rhs);
   new_num&
               operator /=(new_num rhs);
   new_num&
   template<class U>
                       new_num&
                                   operator +=(U rhs);
                                  operator -=(U rhs);
    template<class U>
                       new_num&
                                   operator *=(U rhs);
    template<class U>
                       new_num&
    template<class U>
                       new_num&
                                   operator /=(U rhs);
};
```

```
new_num operator +(new_num lhs, new_num rhs);
                  new_num operator +(new_num lhs, U rhs);
template<class U>
template<class U>
                 new_num operator +(U lhs, new num rhs);
                           operator -(new_num lhs, new_num rhs);
                  new num
                  new_num operator -(new_num lhs, U rhs);
template<class U>
template<class U>
                           operator -(U lhs, new num rhs);
                  new num
                           operator *(new_num lhs, new_num rhs);
                  new num
                  new_num operator *(new_num lhs, U rhs);
template<class U>
                           operator *(U lhs, new_num rhs);
template<class U>
                  new num
                  new_num operator /(new_num lhs, new_num rhs);
                  new_num operator /(new_num lhs, U rhs);
template<class U>
template<class U>
                 new_num operator /(U lhs, new_num rhs);
```

```
//- Goal: A matrix with elements of type new_num participates in arithmetic expressions.
//
```

```
//- Goal: A matrix with elements of type new_num participates in arithmetic expressions.
//
template<>
struct std::math::number_traits<new_num>
{
    using is_nc_ring = true_type;
    using is_ring = true_type;
    using is_field = true_type;
};
```

```
//- Goal: A matrix with elements of type new_num participates in arithmetic expressions.
//
template<>
struct std::math::number_traits<new_num>
{
    using is_nc_ring = true_type;
    using is_ring = true_type;
    using is_field = true_type;
};

// template<class U> new_num operator +(new_num lhs, U rhs);
```

Custom Element Type

```
//- Goal: A matrix with elements of type new_num participates in arithmetic expressions.
template<>
struct std::math::number_traits<new_num>
   using is_nc_ring = true_type;
   using is_ring = true_type;
   using is_field = true_type;
};
   template < class U > new_num operator + (new_num lhs, U rhs);
fs_matrix<new_num, 4, 4> m2;
```

Custom Element Type

```
//- Goal: A matrix with elements of type new_num participates in arithmetic expressions.
template<>
struct std::math::number_traits<new_num>
   using is_nc_ring = true_type;
   using is_ring = true_type;
   using is_field = true_type;
};
   template < class U > new_num operator + (new_num lhs, U rhs);
fs_matrix<new_num, 4, 4> m2;
//- mr --> ?
auto mr = m1 + m2;
```

Custom Element Type

```
//- Goal: A matrix with elements of type new_num participates in arithmetic expressions.
template<>
struct std::math::number_traits<new_num>
   using is_nc_ring = true_type;
   using is_ring = true_type;
   using is_field = true_type;
};
   template < class U > new_num operator + (new_num lhs, U rhs);
fs_matrix<new_num, 4, 4> m2;
. . .
//- mr --> matrix<dr_matrix_engine<new_num, allocator<new_num>>, matrix_operation_traits>
auto mr = m1 + m2;
```

```
//- Goal: Promote any float/float addition to double.
//
```

```
//- Goal: Promote any float/float addition to double.
//
template<class T1, class T2>
struct element_add_traits_tst;
```

```
//- Goal: Promote any float/float addition to double.
//
template<class T1, class T2>
struct element_add_traits_tst;

template<>
struct element_add_traits_tst<float, float>
{
    using element_type = double;
};
```

```
//- Goal: Promote any float/float addition to double.
template<class T1, class T2>
struct element_add_traits_tst;
template<>
struct element_add_traits_tst<float, float>
    using element_type = double;
};
//- This is a custom operation traits type!
struct add_op_traits_tst
     template<class T1, class T2>
     using element_addition_traits = element_add_traits_tst<T1, T2>;
};
```

```
matrix<fs_matrix_engine<float, 2, 3>, add_op_traits_tst>
                                                                            m1;
matrix<dr_matrix_engine<float, allocator<float>>, add_op_traits_tst>
                                                                            m2(2, 3);
matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits> m3(2, 3);
//- mr1 --> ?
auto mr1 = m1 + m1;
//- mr2 --> ?
auto mr2 = m1 + m2;
//- mr3 --> ?
auto mr3 = m1 + m3;
```

```
matrix<fs_matrix_engine<float, 2, 3>, add_op_traits_tst>
                                                                            m1;
matrix<dr_matrix_engine<float, allocator<float>>, add_op_traits_tst>
                                                                            m2(2, 3);
matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits> m3(2, 3);
//- mr1 --> matrix<fs_matrix_engine<double, 2, 3>, add_op_traits_tst>
auto mr1 = m1 + m1;
//- mr2 --> matrix<dr_matrix_engine<double, allocator<double>>, add_op_traits_tst>
auto mr2 = m1 + m2;
//- mr3 --> matrix<dr_matrix_engine<double, allocator<double>>, add_op_traits_tst>
//
auto mr3 = m1 + m3;
```

Custom Engine Type

```
//- Goal: Create a new fixed-size engine type and use it in arithmetic expressions.
```

```
//- Goal: Create a new fixed-size engine type and use it in arithmetic expressions.
//
template<class T, int32_t R, int32_t C>
class fs_matrix_engine_tst
{...};
```

```
//- Goal: Create a new fixed-size engine type and use it in arithmetic expressions.
//
template<class T, int32_t R, int32_t C>
class fs_matrix_engine_tst
{...};

template<class OT, class ET1, class ET2>
struct engine_add_traits_tst;
```

```
//- Goal: Create a new fixed-size engine type and use it in arithmetic expressions.
template<class T, int32_t R, int32_t C>
class fs_matrix_engine_tst
{...};
template<class OT, class ET1, class ET2>
struct engine_add_traits_tst;
template<class OT, class T1, int32_t R1, int32_t C1, class T2, int32_t R2, int32_t C2>
struct engine_add_traits_tst<OT,</pre>
                             fs_matrix_engine_tst<T1, R1, C1>,
                             fs matrix engine tst<T2, R2, C2>>
    using element_type = std::math::matrix_addition_element_t<OT, T1, T2>;
    using engine_type = fs_matrix_engine_tst<element_type, R1, C1>;
};
```

```
//- Goal: Create a new fixed-size engine type and use it in arithmetic expressions.
template<class OT, class T1, int32_t R1, int32_t C1, class T2, int32_t R2, int32_t C2>
struct engine_add_traits_tst<OT,</pre>
                             fs_matrix_engine_tst<T1, R1, C1>,
                             std::math::fs_matrix_engine<T2, R2, C2>>
    using element_type = std::math::matrix_addition_element_t<OT, T1, T2>;
    using engine_type = fs_matrix_engine_tst<element_type, R1, C1>;
};
template<class OT, class T1, int32_t R1, int32_t C1, class T2, int32_t R2, int32_t C2>
struct engine_add_traits_tst<OT,</pre>
                             std::math::fs_matrix_engine<T1, R1, C1>,
                             fs_matrix_engine_tst<T2, R2, C2>>
    using element_type = std::math::matrix_addition_element_t<OT, T1, T2>;
    using engine_type = fs_matrix_engine_tst<element_type, R1, C1>;
};
```

```
//- Goal: Create a new fixed-size engine type and use it in arithmetic expressions.
//- This is a custom operation traits type!
struct add_op_traits_tst
     template<class T1, class T2>
     using element_addition_traits = element_add_traits_tst<T1, T2>;
     template<class T1, class T2>
     using engine_addition_traits = engine_add_traits_tst<T1, T2>;
```

```
matrix<fs_matrix_engine<float, 2, 3>, matrix_operation_traits>
                                                                            m1;
matrix<fs_matrix_engine_tst<float, 2, 3>, add_op_traits_tst>
                                                                            m2;
matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits> m3(2, 3);
//- mr1 --> ?
auto mr1 = m1 + m1;
//- mr2 --> ?
auto mr2 = m2 + m2;
//- mr3 --> ?
auto mr3 = m1 + m2;
//- mr4 --> ?
auto mr4 = m1 + m3;
```

```
matrix<fs_matrix_engine<float, 2, 3>, matrix_operation_traits>
                                                                            m1;
matrix<fs_matrix_engine_tst<float, 2, 3>, add_op_traits_tst>
                                                                            m2;
matrix<dr_matrix_engine<float, allocator<float>>, matrix_operation_traits> m3(2, 3);
//- mr1 --> matrix<fs_matrix_engine<float, 2, 3>, matrix_operation_traits>
//
auto mr1 = m1 + m1;
//- mr2 --> matrix<fs_matrix_engine_tst<double, 2, 3>, add_op_traits_tst>
auto mr2 = m2 + m2;
//- mr3 --> matrix<fs_matrix_engine_tst<double, 2, 3>, add_op_traits_tst>
auto mr3 = m1 + m2;
//- mr4 --> matrix<dr_matrix_engine<double, allocator<double>>, add_op_traits_tst>
//
auto mr4 = m1 + m3;
```

```
//- Goal: Call a specialized addition function for addition of fixed-size matrix objects
// using the fixed-size test engine and having size 3x4.
```

```
//- Goal: Call a specialized addition function for addition of fixed-size matrix objects
// using the fixed-size test engine and having size 3x4.
//
template<class OTR, class OP1, class OP2>
struct addition_traits_tst;
```

```
//- Goal: Call a specialized addition function for addition of fixed-size matrix objects
// using the fixed-size test engine and having size 3x4.
template<class OTR, class OP1, class OP2>
struct addition_traits_tst;
template<class OTR>
struct addition traits tst<OTR,</pre>
                           matrix<fs_matrix_engine_tst<double, 3, 4>, OTR>,
                           matrix<fs_matrix_engine_tst<double, 3, 4>, OTR>>
    using op_traits = OTR;
    using engine_type = fs_matrix_engine_tst<double, 3, 4>;
    using result_type = matrix<engine_type, op_traits>;
    static result_type add(matrix<fs_matrix_engine_tst<double, 3, 4>, OTR> const& m1,
                            matrix<fs_matrix_engine_tst<double, 3, 4>, OTR> const& m2);
```

```
//- Goal: Call a specialized addition function for addition of fixed-size matrix objects
   using the fixed-size test engine and having size 3x4.
//- This is a custom operation traits type!
struct test_add_op_traits_tst
     template<class T1, class T2>
     using element_addition_traits = element_add_traits_tst<T1, T2>;
     template<class OT, class ET1, class ET2>
     using engine_addition_traits = engine_add_traits_tst<OT, ET1, ET2>;
     template<class OT, class OP1, class OP2>
     using addition_traits = addition_traits_tst<OT, OP1, OP2>;
};
```

```
matrix<fs_matrix_engine_tst<float, 3, 4>, add_op_traits_tst>
                                                            m1;
matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst> m2;
//- mr1 --> ?
auto mr1 = m1 + m1;
//- mr2 --> ?
auto mr2 = m1 + m2;
//- mr3 --> ?
auto mr3 = m2 + m2;
```

```
matrix<fs_matrix_engine_tst<float, 3, 4>, add_op_traits_tst>
                                                              m1;
matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst>
//- mr1 --> matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst>
//
auto mr1 = m1 + m1;
//- mr2 --> matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst>
auto mr2 = m1 + m2;
//- mr3 --> matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst>
auto mr3 = m2 + m2;
```

```
matrix<fs_matrix_engine_tst<float, 3, 4>, add_op_traits_tst>
                                                             m1;
matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst>
                                                             m2;
//- mr1 --> matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst>
//
auto mr1 = m1 + m1; //- Calls matrix addition traits::add()
//- mr2 --> matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst>
auto mr2 = m1 + m2;  //- Calls matrix_addition_traits::add()
//- mr3 --> matrix<fs_matrix_engine_tst<double, 3, 4>, add_op_traits_tst>
auto mr3 = m2 + m2;  //- Calls matrix_addition_traits_tst::add()
```

Ongoing/Future Work

Ongoing Work

- Concept-ification
- Integration with mdspan
- Integration with executors
- Support for concurrency (execution contexts)
- Proof-of-concept sets of engines and arithmetic traits that:
 - Employ expression templates
 - Demonstrate concurrent/distributed arithmetic

Questions?

Thank You for Attending!

Paper: wg21.link/p1385

Talk: github.com/BobSteagall/CppNow2019

Code: github.com/BobSteagall/wg21/linear_algebra/code

Blogs: bobsteagall.com (Bob)

hatcat.com (Guy)