

TypeCheck.jl

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What is TypeCheck?

- Static analysis to check for problems
- No code changes required to use
- Checks are based on real examples from the mailing list

Implementing Static Analysis

- Decide what to check for
- Decide exactly what to check for
- Implementation details

Implementing Static Analysis

- Decide what to check for
- **Decide exactly what to check for**
- Implementation details

Design Choices

- Only warn when we know something is wrong
- Use Julia's built-in type inference

Three Checks

- Loop Variable Types
- NoMethodErrors
- Spell Check

Check Loop Variables

- Want variables in loops to have stable types
- Makes a difference in runtime and memory allocation
- Examine the types of variables used in loop to see if they're stable

NoMethodError

- Runtime error
- Julia's equivalent of a type error

We'd like to predict them statically.

This lets you find problems in little-used code.

Looking for Misspelled Variables

- Sometimes you mistype a variable
- If it's an assignment, no error will be raised
- We can statically find variables:
 - that are only used once
 - that are only assigned
 - that are only read

Check Loop Variables

Check Loop Variables

```
function a()  
    sum = 0  
    for i=1:100  
        sum += i/2  
    end  
    return sum
```

```
end
```

```
a()
```

```
@time a()
```

```
function b()  
    sum = 0.0  
    for i=1:100  
        sum += i/2  
    end  
    return sum
```

```
end
```

```
b()
```

```
@time b()
```

Check Loop Variables

```
julia> @time a()
```

```
elapsed time: 9.517e-6 seconds (3248 bytes  
allocated)
```

```
2525.0
```

```
julia> @time b()
```

```
elapsed time: 2.285e-6 seconds (64 bytes  
allocated)
```

```
2525.0
```

Check Loop Variables

```
julia> @time a()
```

```
elapsed time: 9.517e-6 seconds (3248 bytes  
allocated)
```

```
2525.0
```

```
julia> @time b()
```

```
elapsed time: 2.285e-6 seconds (64 bytes  
allocated)
```

```
2525.0
```

Check Loop Variables

```
function a()  
    sum = 0  
    for i=1:10000  
        sum += i/2  
    end  
    return sum  
end
```

```
julia> a()  
2.50025e7
```

```
julia> @time a()  
elapsed time:  
0.000667613 seconds  
(320048 bytes  
allocated)  
2.50025e7
```

julia> code_typed(a,())

1-element Array{Any,1}:

```
:(Expr(:lambda, {}, {{:sum,:#s53,:#s52,:#s51,:i,:_var0,:_var1},{:sum,Any,2},{:#s53,UnitRange{Int64},18},{:#s52,Int64,2},{:#s51,Int64,Int64},18},{:i,Int64,18},{:_var0,Int64,18},{:_var1,Int64,18}},{}), :(begin # none, line 2:
```

```
    sum = 0 # line 3:
```

```
    #s53 = $(Expr(:new, UnitRange{Int64}, 1, :(top(getfield)(Intrinsics,:select_value)(top(sle_int)(1,10000)::Bool,10000,top(box)(Int64,top(sub_int)(1,1))::Int64)::Int64)))::UnitRange{Int64}
```

```
    #s52 = top(getfield)(#s53::UnitRange{Int64},:start)::Int64
```

```
    unless top(box)(Bool,top(not_int)(#s52::Int64 === top(box)(Int64,top(add_int)(top(getfield)(#s53::UnitRange{Int64},:stop)::Int64,1))::Int64::Bool))::Bool goto 1
```

```
    2:
```

```
    _var0 = #s52::Int64
```

```
    _var1 = top(box)(Int64,top(add_int)(#s52::Int64,1))::Int64
```

```
    i = _var0::Int64
```

```
    #s52 = _var1::Int64 # line 4:
```

```
    sum = sum::Union{Int64,Float64} + top(box)(Float64,top(div_float)(top(box)(Float64,top(sitofp)(Float64,i::Int64))::Float64,top(box)(Float64,top(sitofp)(Float64,2))::Float64))::Float64::Float64
```

```
    3:
```

```
    unless top(box)(Bool,top(not_int)(top(box)(Bool,top(not_int)(#s52::Int64 === top(box)(Int64,top(add_int)(top(getfield)(#s53::UnitRange{Int64},:stop)::Int64,1))::Int64::Bool))::Bool))::Bool goto 2
```

```
    1:
```

```
    0: # line 6:
```

```
    return sum::Union{Int64,Float64}
```

```
end::Union{Int64,Float64}}))
```

```
julia> code_typed(a,())[1].args[2][2]  
7-element Array{Any,1}:  
{:sum,Any,2}  
{:#s53,UnitRange{Int64},18}  
.....
```

```
julia> code_typed(b,())[1].args[2][2]  
7-element Array{Any,1}:  
{:sum,Float64,2}  
{:#s53,UnitRange{Int64},18}  
.....
```


julia> code_typed(a,())[1].args[3]

```
:(begin # none, line 2:
```

```
    sum = 0 # line 3:
```

```
    #s53 = $(Expr(:new, UnitRange{Int64}, 1, :(top(getfield)(Intrinsics, :select_value)(top(sle_int)(1, 10000)::Bool, 10000,
top(box)(Int64, top(sub_int)(1, 1))::Int64)::Int64)))::UnitRange{Int64}
```

```
    #s52 = top(getfield)(#s53::UnitRange{Int64}, :start)::Int64
```

```
    unless top(box)(Bool, top(not_int)(#s52::Int64 == top(box)(Int64, top(add_int)(top(getfield)(#s53::UnitRange
{Int64}, :stop)::Int64, 1))::Int64::Bool))::Bool goto 1
```

```
    2:
```

```
    _var0 = #s52::Int64
```

```
    _var1 = top(box)(Int64, top(add_int)(#s52::Int64, 1))::Int64
```

```
    i = _var0::Int64
```

```
    #s52 = _var1::Int64 # line 4:
```

```
    sum = sum::Union{Int64, Float64} + top(box)(Float64, top(div_float)(top(box)(Float64, top(sitofp)(Float64, i::Int64))::
Float64, top(box)(Float64, top(sitofp)(Float64, 2))::Float64))::Float64::Float64
```

```
    3:
```

```
    unless top(box)(Bool, top(not_int)(top(box)(Bool, top(not_int)(#s52::Int64 == top(box)(Int64, top(add_int)(top
(getfield)(#s53::UnitRange{Int64}, :stop)::Int64, 1))::Int64::Bool))::Bool))::Bool goto 2
```

```
    1:
```

```
    0: # line 6:
```

```
    return sum::Union{Int64, Float64}
```

```
end::Union{Int64, Float64})
```

julia> code_typed(a,())[1].args[3]

```
:(begin # none, line 2:
```

```
    sum = 0 # line 3:
```

```
    #s53 = $(Expr(:new, UnitRange{Int64}, 1, :(top(getfield)(Intrinsics, :select_value)(top(sle_int)(1, 10000)::Bool, 10000,
top(box)(Int64, top(sub_int)(1, 1))::Int64)::Int64)))::UnitRange{Int64}
```

```
    #s52 = top(getfield)(#s53::UnitRange{Int64}, :start)::Int64
```

```
    unless top(box)(Bool, top(not_int)(#s52::Int64 == top(box)(Int64, top(add_int)(top(getfield)(#s53::UnitRange
{Int64}, :stop)::Int64, 1))::Int64::Bool))::Bool goto 1
```

```
    2:
```

```
    _var0 = #s52::Int64
```

```
    _var1 = top(box)(Int64, top(add_int)(#s52::Int64, 1))::Int64
```

```
    i = _var0::Int64
```

```
    #s52 = _var1::Int64 # line 4:
```

```
    sum = sum::Union{Int64, Float64} + top(box)(Float64, top(div_float)(top(box)(Float64, top(sitofp)(Float64, i::Int64))::
Float64, top(box)(Float64, top(sitofp)(Float64, 2))::Float64))::Float64::Float64
```

```
    3:
```

```
    unless top(box)(Bool, top(not_int)(top(box)(Bool, top(not_int)(#s52::Int64 == top(box)(Int64, top(add_int)(top
(getfield)(#s53::UnitRange{Int64}, :stop)::Int64, 1))::Int64::Bool))::Bool))::Bool goto 2
```

```
    1:
```

```
    0: # line 6:
```

```
    return sum::Union{Int64, Float64}
```

```
end::Union{Int64, Float64})
```

julia> code_typed(b,())[1].args[3]

```
:(begin # none, line 2:
    sum = 0.0 # line 3:
    #s53 = $(Expr(:new, UnitRange{Int64}, 1, :(top(getfield)(Intrinsics, :select_value)(top(sle_int)(1, 100)::Bool, 100, top
(box)(Int64, top(sub_int)(1, 1))::Int64)::Int64)))::UnitRange{Int64}
    #s52 = top(getfield)(#s53::UnitRange{Int64}, :start)::Int64
    unless top(box)(Bool, top(not_int)(#s52::Int64 == top(box)(Int64, top(add_int)(top(getfield)(#s53::UnitRange
{Int64}, :stop)::Int64, 1))::Int64::Bool))::Bool goto 1
2:
    _var0 = #s52::Int64
    _var1 = top(box)(Int64, top(add_int)(#s52::Int64, 1))::Int64
    i = _var0::Int64
    #s52 = _var1::Int64 # line 4:
    sum = top(box)(Float64, top(add_float)(sum::Float64, top(box)(Float64, top(div_float)(top(box)(Float64, top(sitofp)
(Float64, i::Int64))::Float64, top(box)(Float64, top(sitofp)(Float64, 2))::Float64))::Float64))::Float64
3:
    unless top(box)(Bool, top(not_int)(top(box)(Bool, top(not_int)(#s52::Int64 == top(box)(Int64, top(add_int)(top
(getfield)(#s53::UnitRange{Int64}, :stop)::Int64, 1))::Int64::Bool))::Bool))::Bool goto 2
1:
0: # line 6:
    return sum::Float64
end::Float64)
```

```
sum = sum::Union(Int64,Float64) + top(box)
(Float64,top(div_float)(top(box)(Float64,top
(sitofp)(Float64,i::Int64))::Float64,top(box)
(Float64,top(sitofp)(Float64,2))::Float64))::
Float64::Float64
```

```
sum = top(box)(Float64,top(add_float)(sum::
Float64,top(box)(Float64,top(div_float)(top(box)
(Float64,top(sitofp)(Float64,i::Int64))::Float64,
top(box)(Float64,top(sitofp)(Float64,2))::
Float64))::Float64)::Float64
```

julia> code_native(a,())

.section __TEXT,__text,regular,pure_instructions

Filename: none

Source line: 2

```
push    RBP
mov     RBP, RSP
push    R15
push    R14
push    R13
push    R12
push    RBX
sub     RSP, 56
mov     QWORD PTR [RBP - 80], 6
```

Source line: 2

```
movabs  RAX, 4308034112
mov     RCX, QWORD PTR [RAX]
mov     QWORD PTR [RBP - 72], RCX
lea     RCX, QWORD PTR [RBP - 80]
mov     QWORD PTR [RAX], RCX
mov     QWORD PTR [RBP - 56], 0
mov     QWORD PTR [RBP - 48], 0
movabs  RAX, 4328810048
```

Source line: 2

```
mov     QWORD PTR [RBP - 64], RAX
mov     EBX, 1
mov     R15D, 10000
```

Source line: 4

```
movabs  R12, 4295395472
movabs  R13, 4328736592
movabs  RCX, 4416084224
movsd   XMM0, QWORD PTR [RCX]
```

```
movsd   QWORD PTR [RBP - 88], XMM0
movabs  R14, 4295030048
mov     QWORD PTR [RBP - 56], RAX
call    R12
mov     QWORD PTR [RAX], R13
xorps   XMM0, XMM0
cvtsi2sd XMM0, RBX
mulsd   XMM0, QWORD PTR [RBP - 88]
movsd   QWORD PTR [RAX + 8], XMM0
mov     QWORD PTR [RBP - 48], RAX
movabs  RDI, 4362376736
lea     RSI, QWORD PTR [RBP - 56]
mov     EDX, 2
call    R14
```

Source line: 3

```
inc     RBX
```

Source line: 4

```
dec     R15
mov     QWORD PTR [RBP - 64], RAX
jne     -70
```

Source line: 6

```
mov     RCX, QWORD PTR [RBP - 72]
movabs  RDX, 4308034112
mov     QWORD PTR [RDX], RCX
add     RSP, 56
pop     RBX
pop     R12
pop     R13
pop     R14
pop     R15
pop     RBP
ret
```

julia> code_native(b,())

```
.section      __TEXT,__text,regular,pure_instructions
```

Filename: none

Source line: 4

```
    push    RBP
    mov     RBP, RSP
    xorps   XMM0, XMM0
    mov     EAX, 1
    mov     ECX, 100
    movabs  RDX, 4416084592
    movsd   XMM1, QWORD PTR [RDX]
```

Source line: 4

```
    xorps   XMM2, XMM2
    cvtsi2sd XMM2, RAX
    mulsd   XMM2, XMM1
    addsd   XMM0, XMM2
```

Source line: 3

```
    inc     RAX
```

Source line: 4

```
    dec     RCX
    jne     -28
```

Source line: 6

```
    pop     RBP
    ret
```

Running checklooptypes

```
function a()  
    sum = 0  
    for i=1:100  
        sum += i/2  
    end  
    return sum  
end
```

```
julia> checklooptypes(a)  
a()::Union{Float64,Int64}  
sum::Union{Float64,Int64}
```

No Method Errors

NoMethodError

- Runtime error
- Julia's equivalent of a type error

We'd like to predict them statically.

This lets you find problems in little-used code.

NoMethodError

```
a(x::Int) = x % 7
```

```
b(x::Int) = a(x/2) #NoMethodError
```

This can be found statically.

1. We know `/(Int,Int)::Float64`
2. We know that `a(Float64)` is a `NoMethodError`

Issue in Base (#5923)

```
qrfact(x::Number) =  
  QR(fill(one(x), 1, 1), fill(x, 1, 1))
```

Issue in Base (#5923)

```
qrfact(x::Number) =  
    QR(fill(one(x), 1, 1), fill(x, 1, 1))  
  
julia> methods(QR)  
# 1 method for generic function "QR":  
QR{T}(factors::Array{T,2},τ::Array{T,  
1})
```

Issue in Base (#5923)

```
qrfact(x::Number) =  
    QR(fill(one(x), 1, 1), fill(x, 1, 1))  
  
julia> qrfact(2)  
ERROR: no method QR{T}(Array{Int64,2},  
Array{Int64,2})  
in qrfact at linalg/factorization.jl:  
300
```

Another Issue in Base (#5927)

```
for op in (:+, :-)
    SpecialMatrices = [:Diagonal, :Bidiagonal, :Tridiagonal, :Triangular, :Matrix]
    for (idx, matrixtype1) in enumerate(SpecialMatrices) #matrixtype1 is the sparser matrix type
        for matrixtype2 in SpecialMatrices[idx+1:end] #matrixtype2 is the denser matrix type
            @eval begin #TODO quite a few of these conversions are NOT defined...
                ($op)(A::($matrixtype1), B::($matrixtype2)) = ($op)(convert(($matrixtype2), A), B)
                ($op)(A::($matrixtype2), B::($matrixtype1)) = ($op)(A, convert(($matrixtype2), B))
            end
        end
    end
end

for matrixtype1 in (:SymTridiagonal,) #matrixtype1 is the sparser matrix type
    for matrixtype2 in (:Tridiagonal, :Triangular, :Matrix) #matrixtype2 is the denser matrix type
        @eval begin
            ($op)(A::($matrixtype1), B::($matrixtype2)) = ($op)(convert(($matrixtype2), A), B)
            ($op)(A::($matrixtype2), B::($matrixtype1)) = ($op)(A, convert(($matrixtype2), B))
        end
    end
end

for matrixtype1 in (:Diagonal, :Bidiagonal) #matrixtype1 is the sparser matrix type
    for matrixtype2 in (:SymTridiagonal,) #matrixtype2 is the denser matrix type
        @eval begin
            ($op)(A::($matrixtype1), B::($matrixtype2)) = ($op)(convert(($matrixtype2), A), B)
            ($op)(A::($matrixtype2), B::($matrixtype1)) = ($op)(A, convert(($matrixtype2), B))
        end
    end
end
end
```

Another Issue in Base (#5927)

```
for op in (:+, :-)
  for (idx, mt1) in enumerate(SpecialMatrices)
    for mt2 in SpecialMatrices[idx+1:end]
      @eval begin
        ($op) (A::$mt1, B::$mt2) =
          ($op) (convert(($mt2), A), B)
        ($op) (A::$mt2, B::$mt1) =
          ($op) (A, convert(($mt2), B))
      end
    end
  end
end
```

Another Issue in Base (#5927)

- (Diagonal{T}, Triangular{T<:Number})
- (Triangular{T<:Number}, Diagonal{T})
- (Bidiagonal{T}, Triangular{T<:Number})
- (Triangular{T<:Number}, Bidiagonal{T})
- (Tridiagonal{T}, Triangular{T<:Number})
- (Triangular{T<:Number}, Tridiagonal{T})
- (SymTridiagonal{T}, Triangular{T<:Number})
- (Triangular{T<:Number}, SymTridiagonal{T})
- +(Diagonal{T}, Triangular{T<:Number})
- +(Triangular{T<:Number}, Diagonal{T})
- +(Bidiagonal{T}, Triangular{T<:Number})
- +(Triangular{T<:Number}, Bidiagonal{T})
- +(Tridiagonal{T}, Triangular{T<:Number})
- +(Triangular{T<:Number}, Tridiagonal{T})
- +(SymTridiagonal{T}, Triangular{T<:Number})
- +(Triangular{T<:Number}, SymTridiagonal{T})

Another Issue in Base (#5927)

- (Diagonal{T}, Triangular{T<:Number})
- (Triangular{T<:Number}, Diagonal{T})
- (Bidiagonal{T}, Triangular{T<:Number})
- (Triangular{T<:Number}, Bidiagonal{T})
- (Tridiagonal{T}, Triangular{T<:Number})
- (Triangular{T<:Number}, Tridiagonal{T})
- (SymTridiagonal{T}, Triangular{T<:Number})
- (Triangular{T<:Number}, SymTridiagonal{T})
- +(Diagonal{T}, Triangular{T<:Number})
- +(Triangular{T<:Number}, Diagonal{T})
- +(Bidiagonal{T}, Triangular{T<:Number})
- +(Triangular{T<:Number}, Bidiagonal{T})
- +(Tridiagonal{T}, Triangular{T<:Number})
- +(Triangular{T<:Number}, Tridiagonal{T})
- +(SymTridiagonal{T}, Triangular{T<:Number})
- +(Triangular{T<:Number}, SymTridiagonal{T})

Another Issue in Base (#5927)

```
julia> t = Triangular([1 0 ; 1 0],:U)
```

```
2x2 Triangular{Int64}:
```

```
1 0
```

```
0 0
```

```
julia> t + t
```

```
ERROR: no method +{Triangular{Int64},  
Triangular{Int64}}
```

Another Issue in Base (#5927)

```
julia> t = Triangular([1 0 ; 1 0],:U)
```

```
2x2 Triangular{Int64}:
```

```
1 0
```

```
0 0
```

```
julia> d = convert(Diagonal, t)
```

```
2x2 Diagonal{Int64}:
```

```
1 0
```

```
0 0
```

Another Issue in Base (#5927)

```
julia> @which d + t  
+(A::Diagonal{T},B::Triangular{T<:Number}) at  
linalg/special.jl:88
```

```
julia> d + t  
ERROR: no method +{Triangular{Int64},  
Triangular{Int64}}  
in + at linalg/special.jl:88
```

Another Issue in Base (#5927)

Not fixed, but a solution would be to define:

$+(\text{Triangular}, \text{Triangular})$

$-(\text{Triangular}, \text{Triangular})$

Another Issue in Base (#5927)

Comment on my Issue:

Thanks for going through all the linear algebra code, by the way. It's no mean feat. -- jiahao

Running checkmethodcalls

```
a(x::Int) = x % 7
```

```
b(x::Int) = a(x/2)
```

```
julia>checkmethodcalls(b;mod=Main)
```

```
b(Int64)::Any
```

```
    a(Float64)
```

It tells you b has a problem, because of the call to a of that signature.

Misspelled Variables

Looking for Misspelled Variables

```
function foo(x)
    answer = 0
    for i in x
        if i % 5 == 0
            anwser += 1
        end
    end
    return answer
end
```

```
function foo(x)
    answer = 0
    for i in x
        if i % 5 == 0
            answer += 1
        end
    end
    return answer
end
```

Looking for Misspelled Variables

```
function foo(x)
    answer = 0
    for i in x
        if i % 5 == 0
            anwser += 1
        end
    end
    return answer
end
```

```
function foo(x)
    answer = 0
    for i in x
        if i % 5 == 0
            answer += 1
        end
    end
    return answer
end
```

Using Variables

- Left Hand Side (LHS)
 - $x = 5$
- Right Hand Side (RHS)
 - $x + 2$
 - $y = x + 2$
- Both
 - $x += 2$

Checking Usages

- Function that collects a Set of LHS usages
- Function that collects a Set of RHS usages
- Find the difference

Checking Usages

- Function that collects a Set of LHS usages
- Function that collects a Set of RHS usages
- Find the difference

But what about $x = x + 2$?

Checking Usages

- Function that collects a Set of LHS usages
- Function that collects a Set of RHS usages
- $\text{union}(\text{lhs}, \text{rhs}) - \text{intersect}(\text{lhs}, \text{rhs})$

But what about $x = x + 2$?

Look for variable usages, but only allow $x = x + 2$ as one usage of x .

Checking Usages

```
function bar(x::Int)
    y = x + 2 + z
    return x
end
```

```
julia> checklocals(bar)
Set{Symbol}({:y,:z})
```

Conclusion

- You can run `TypeCheck` on your code
- Each function returns a result type, so you can programmatically check that there were no warnings