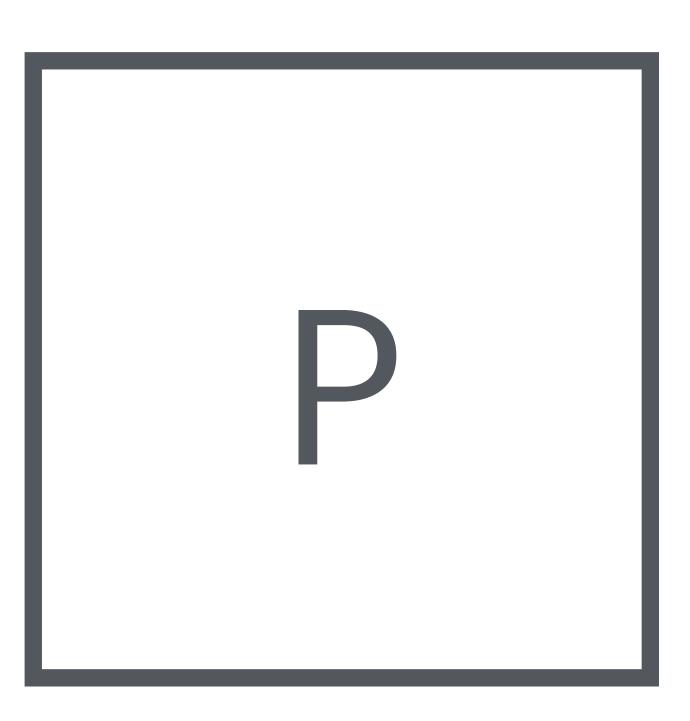
## Quantitative Static Timing Analysis

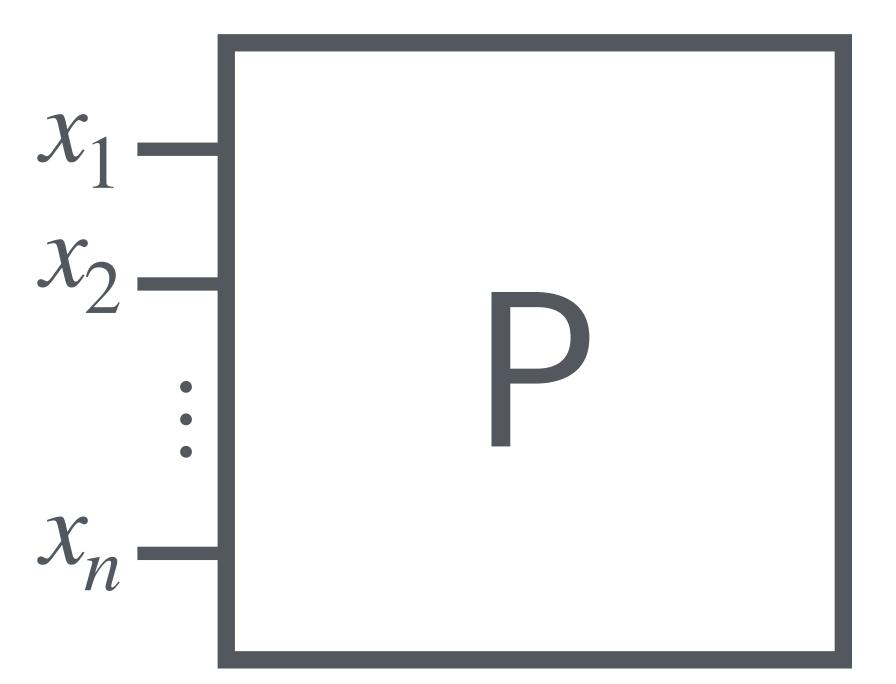
Denis Mazzucato, Marco Campion, and Caterina Urban

Ínria\_

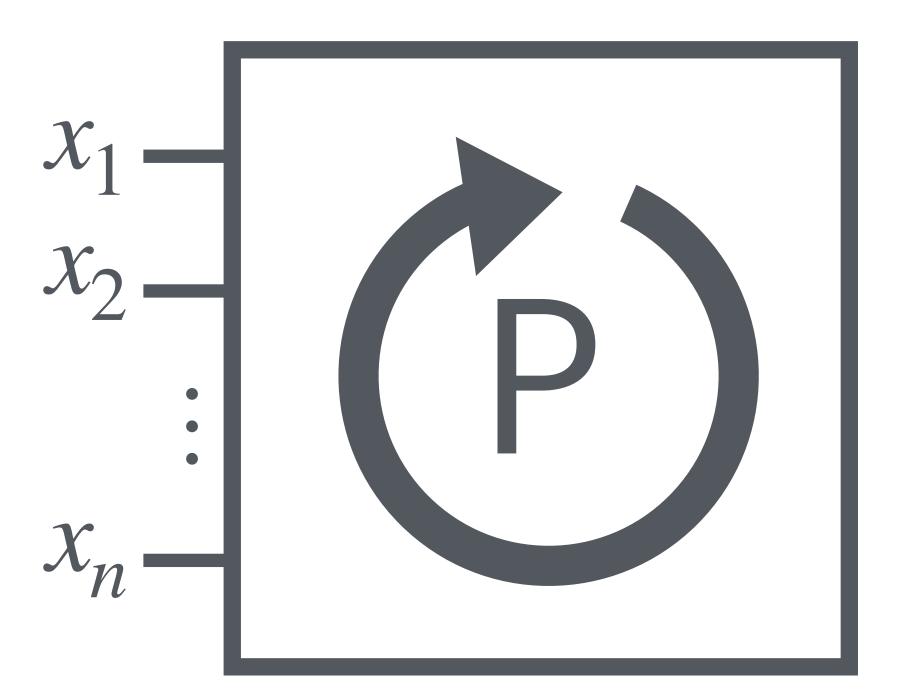




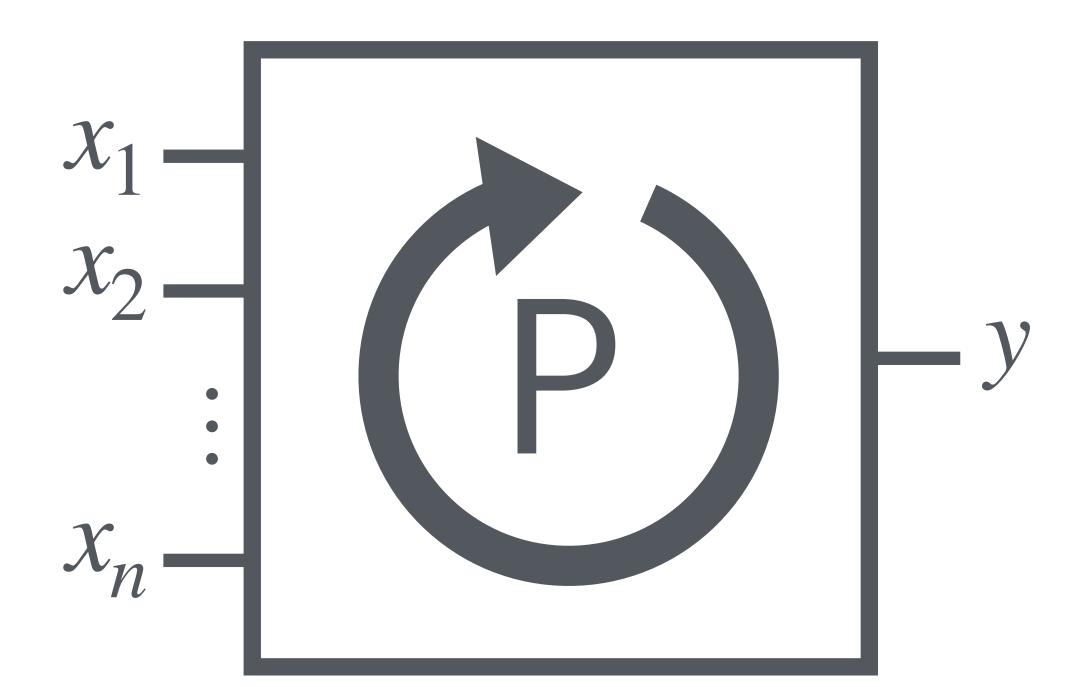
Input variables



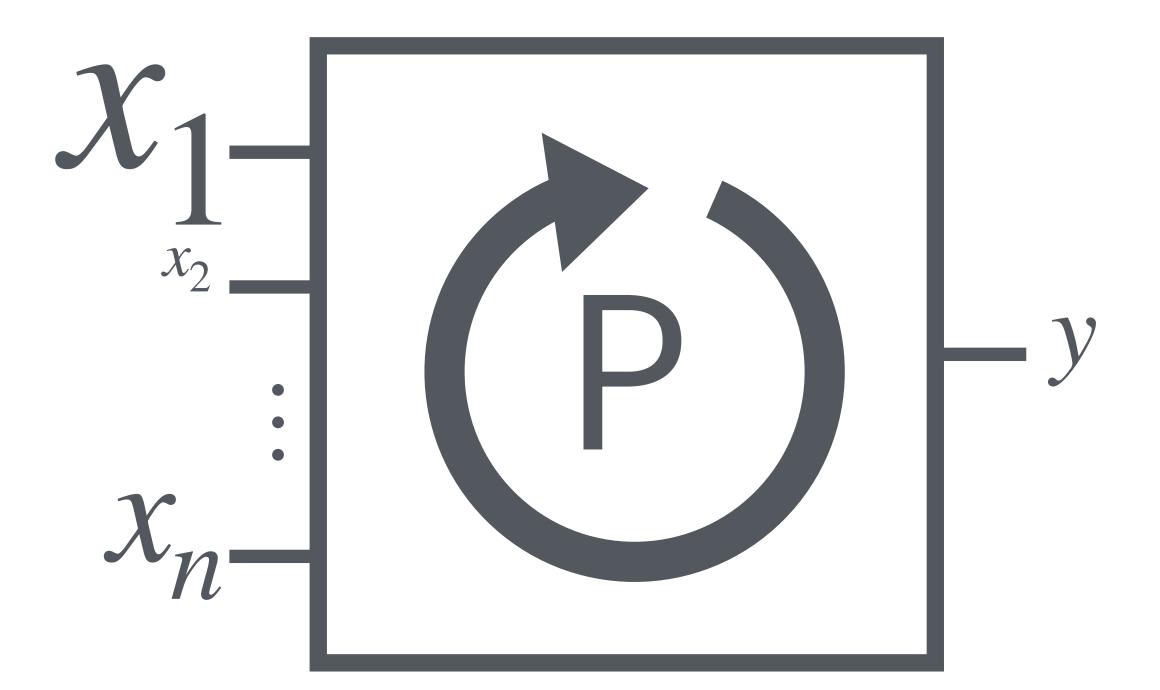
Input variables

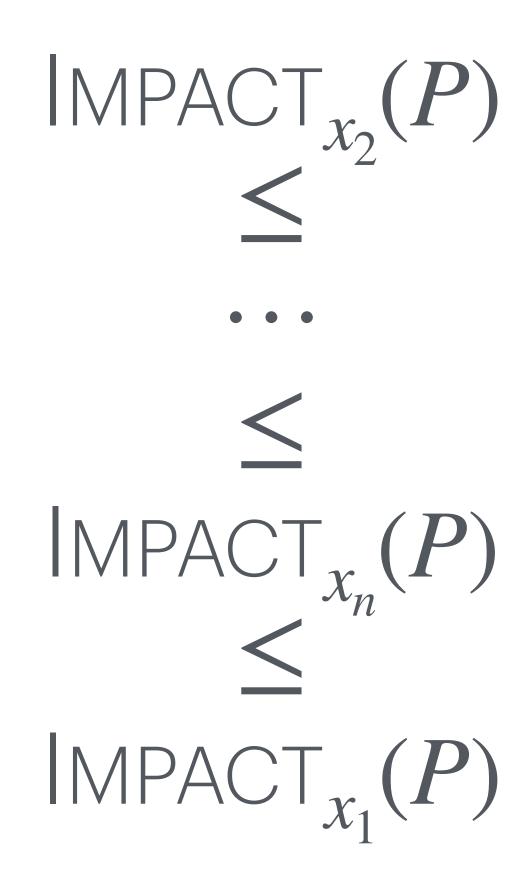


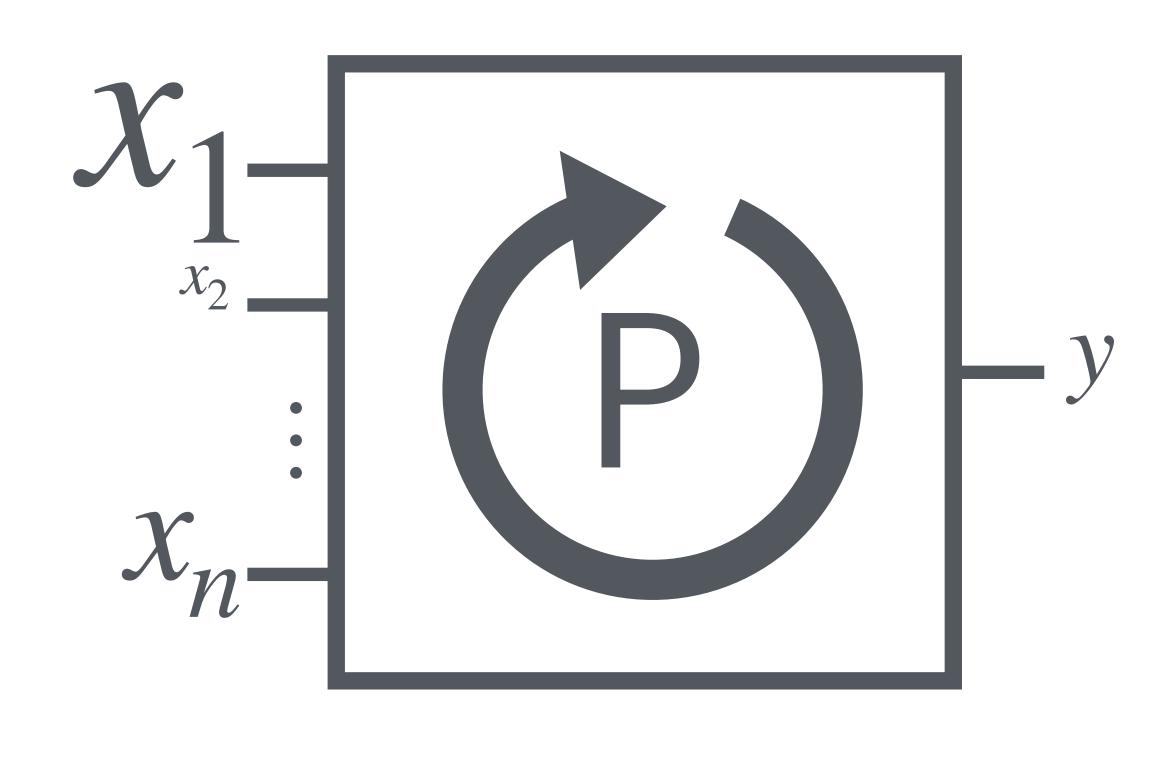
Input variables

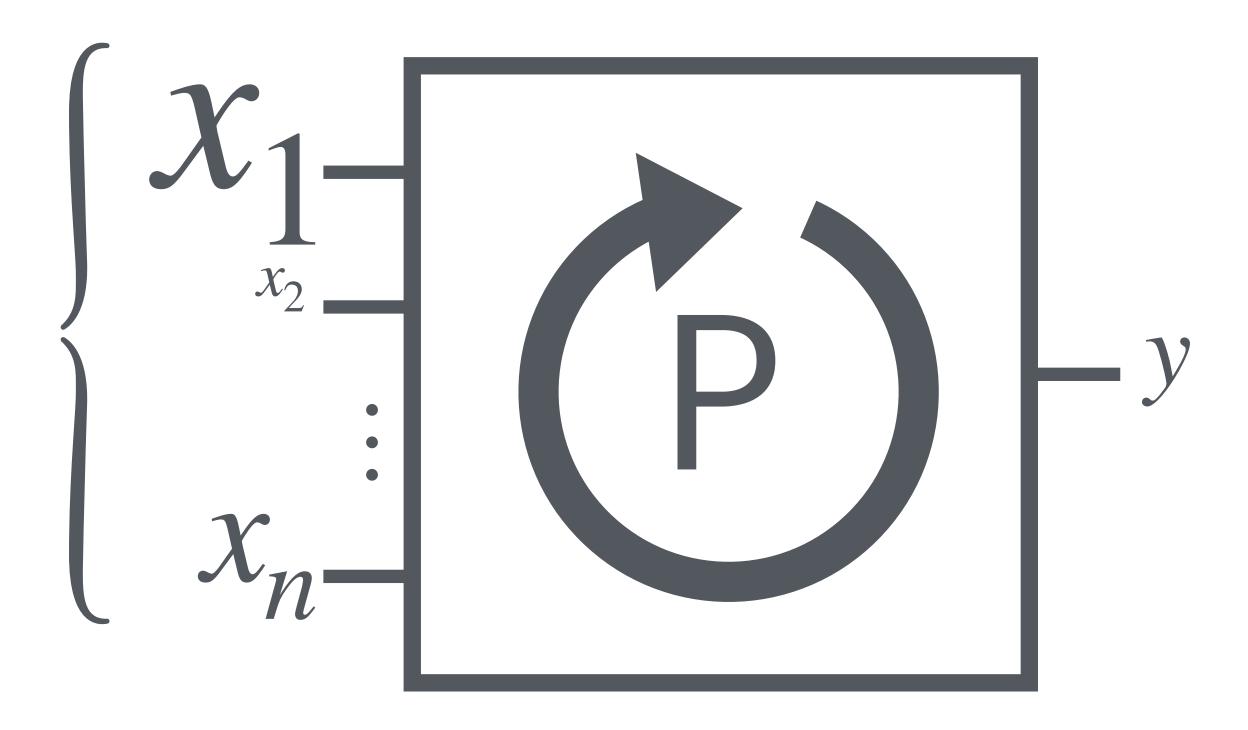


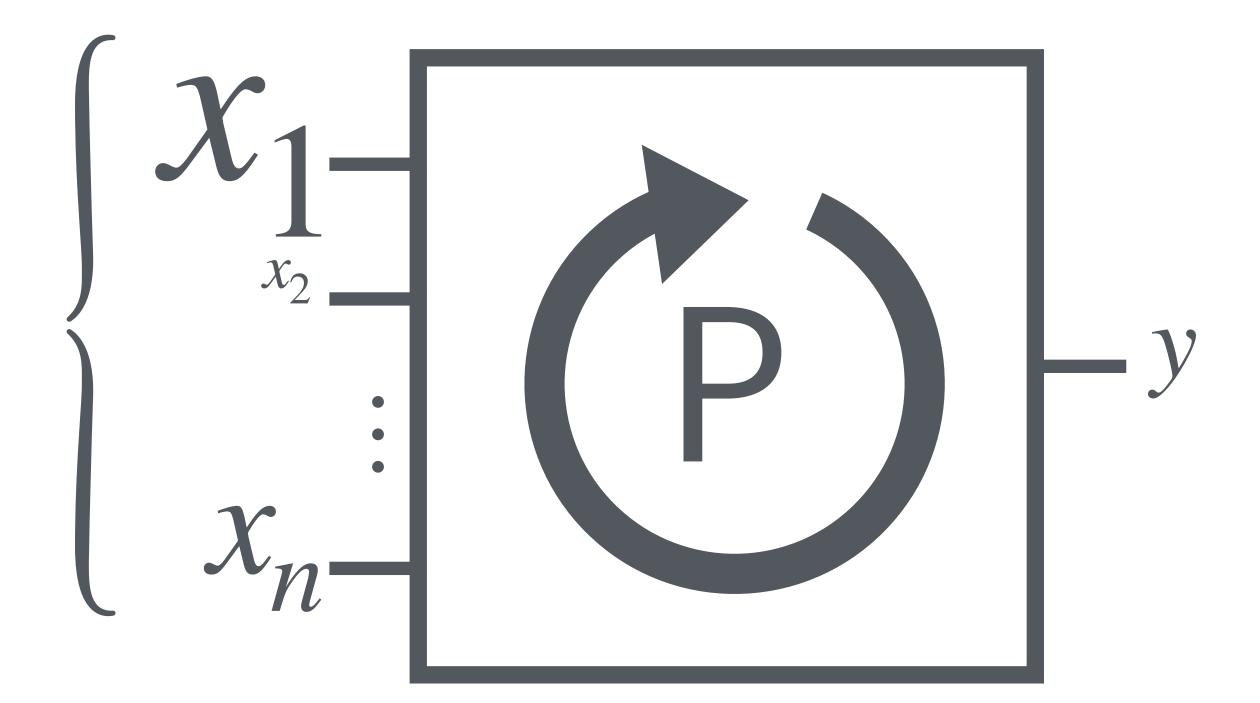
How much impact on iterations?

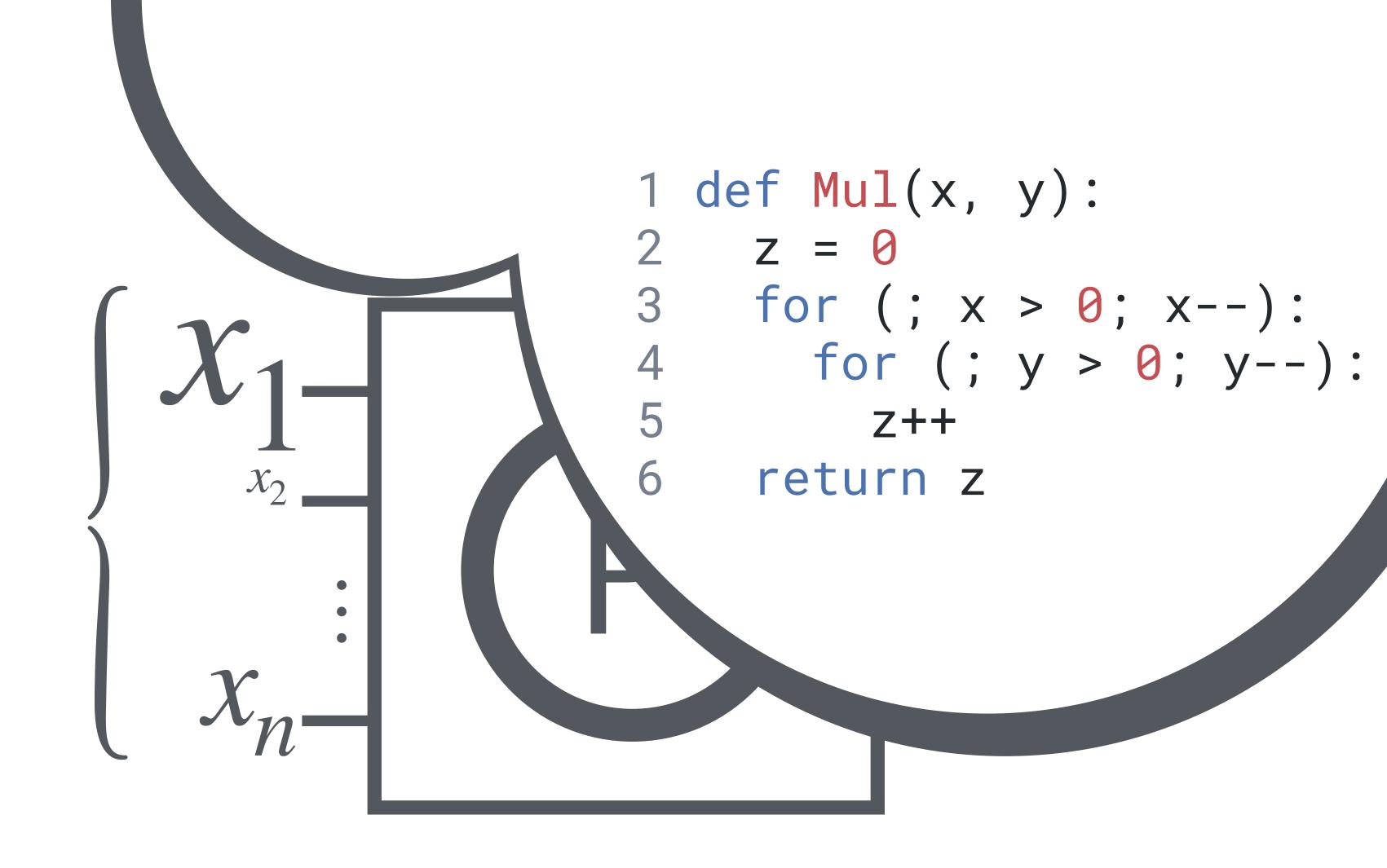




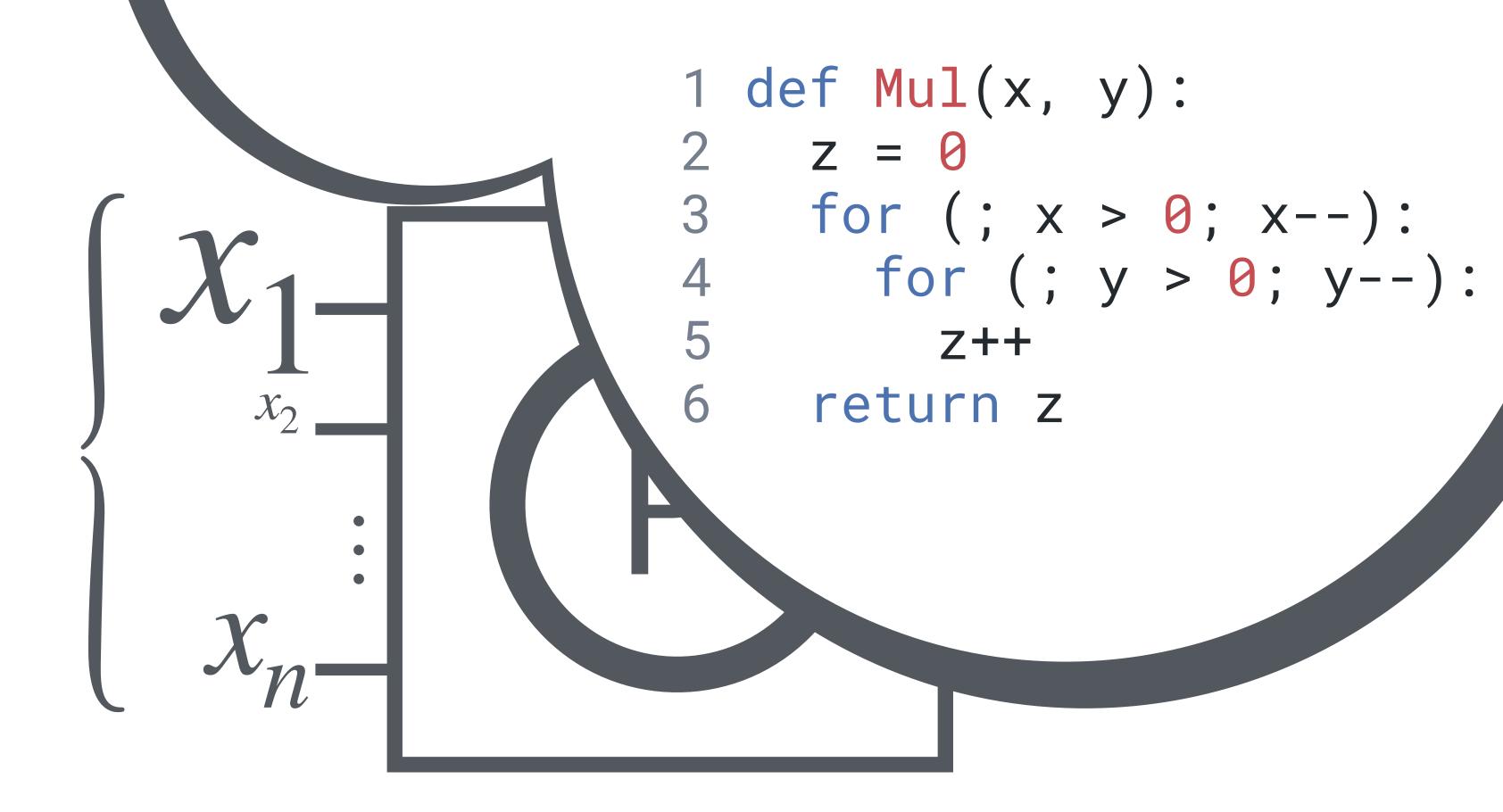




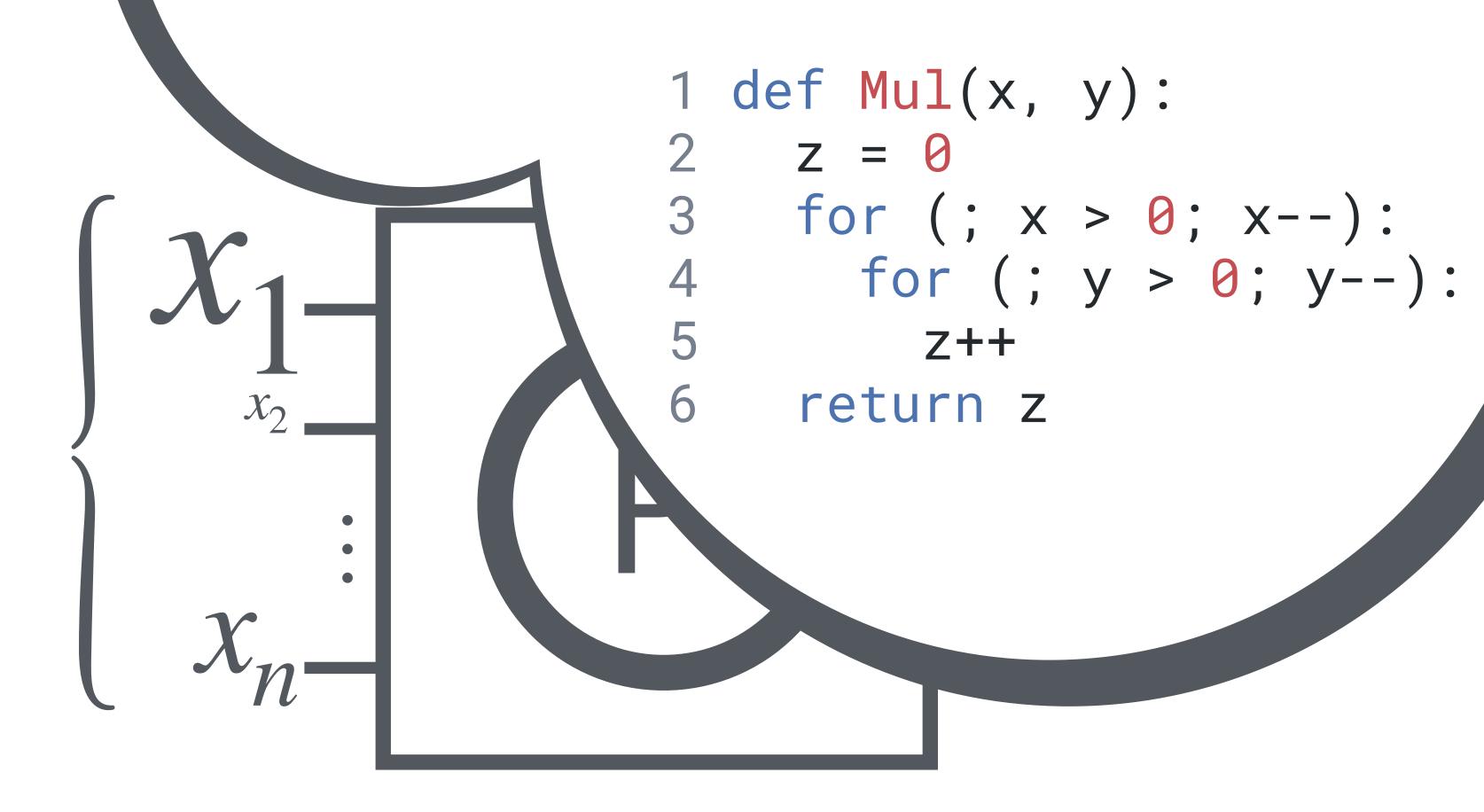


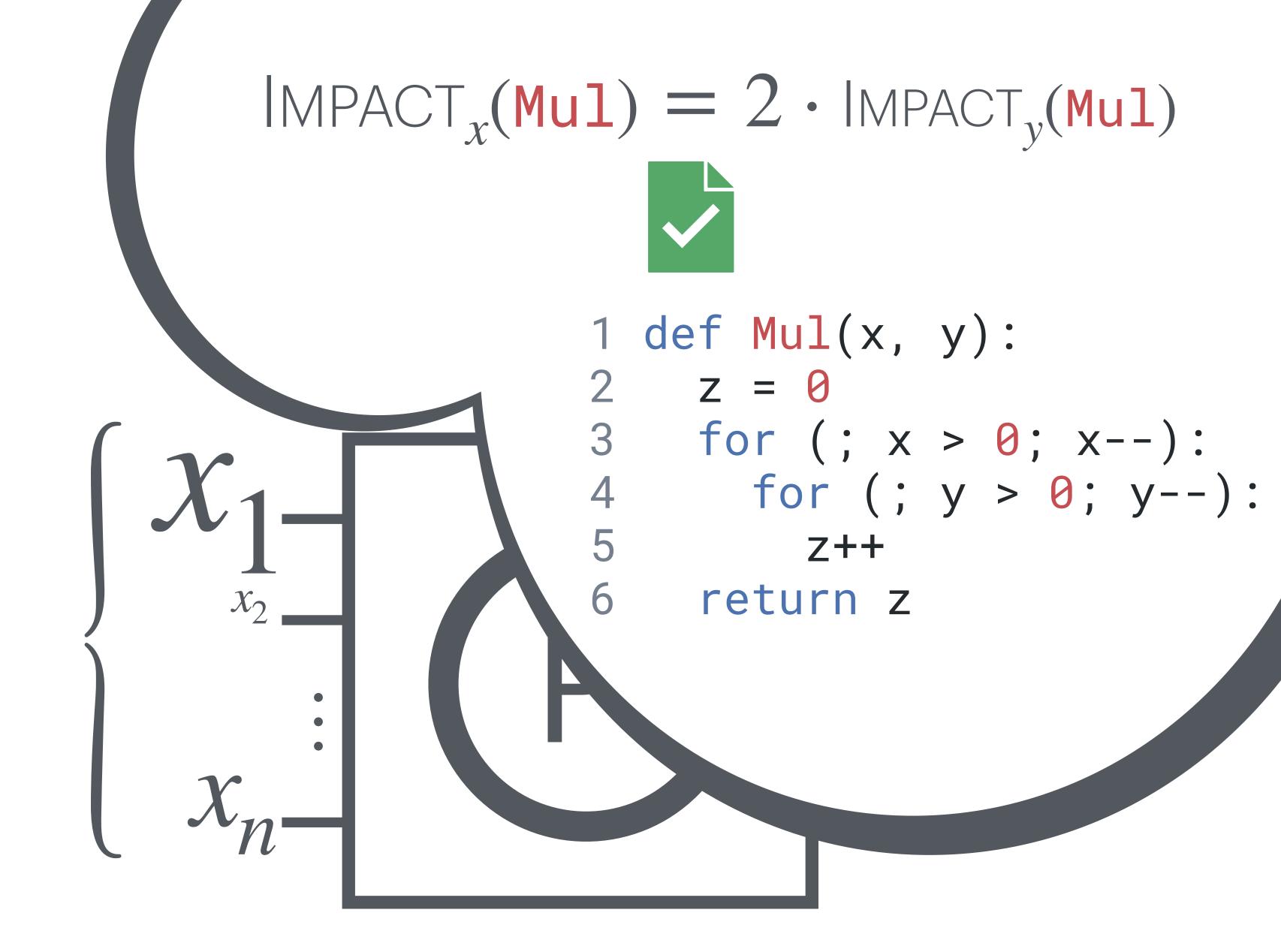


 $IMPACT_x(Mul)$ 

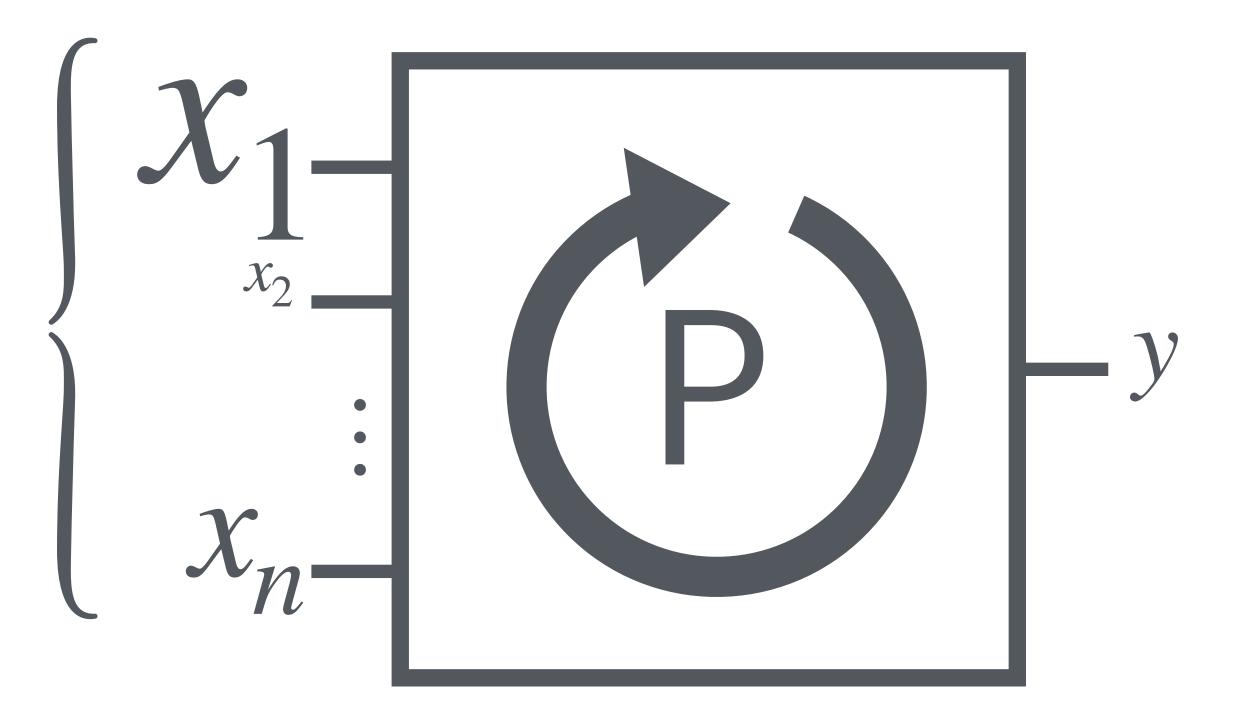


$$IMPACT_x(Mu1) = 2 \cdot IMPACT_y(Mu1)$$

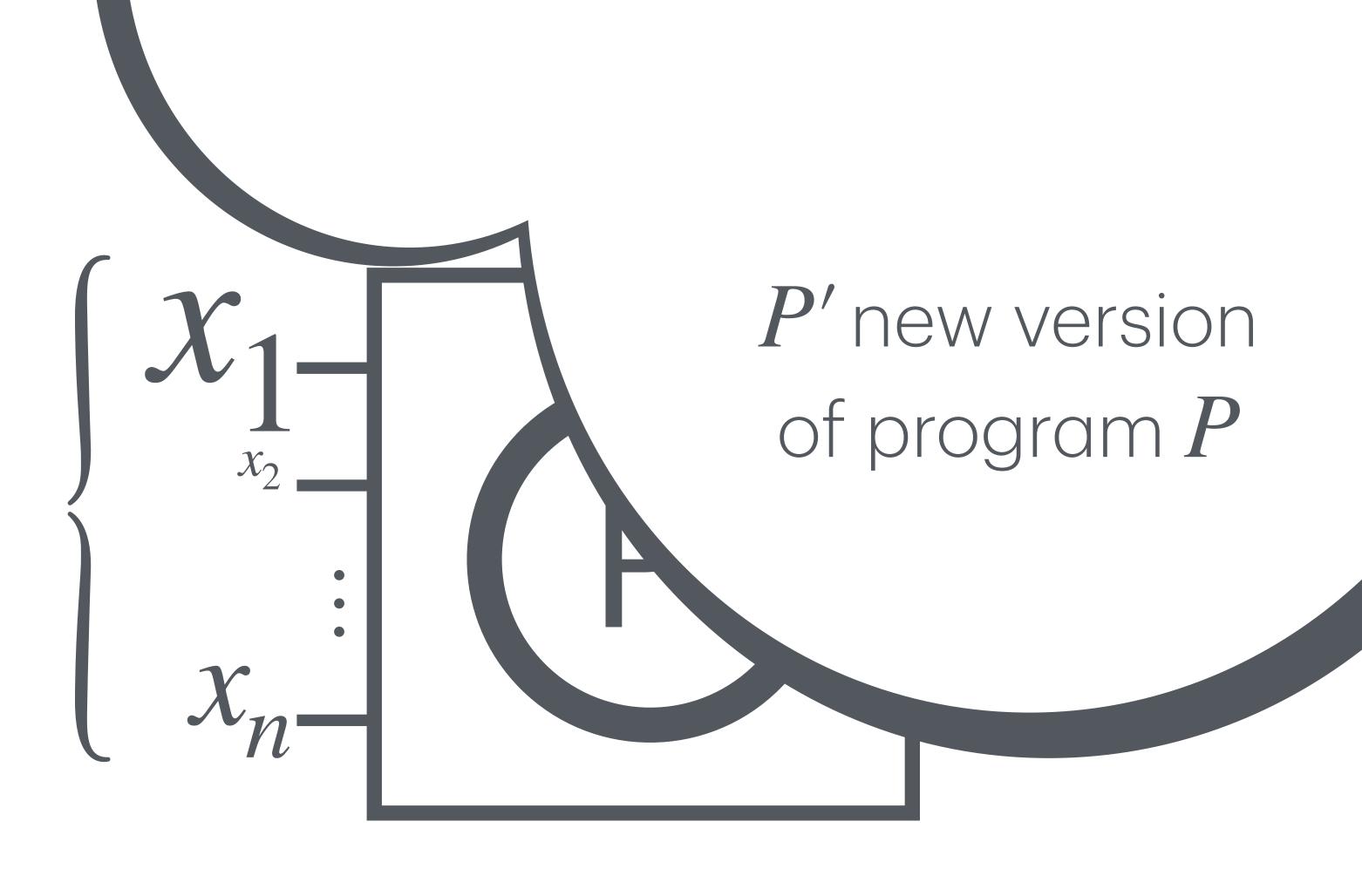




- Correctness
- Performance

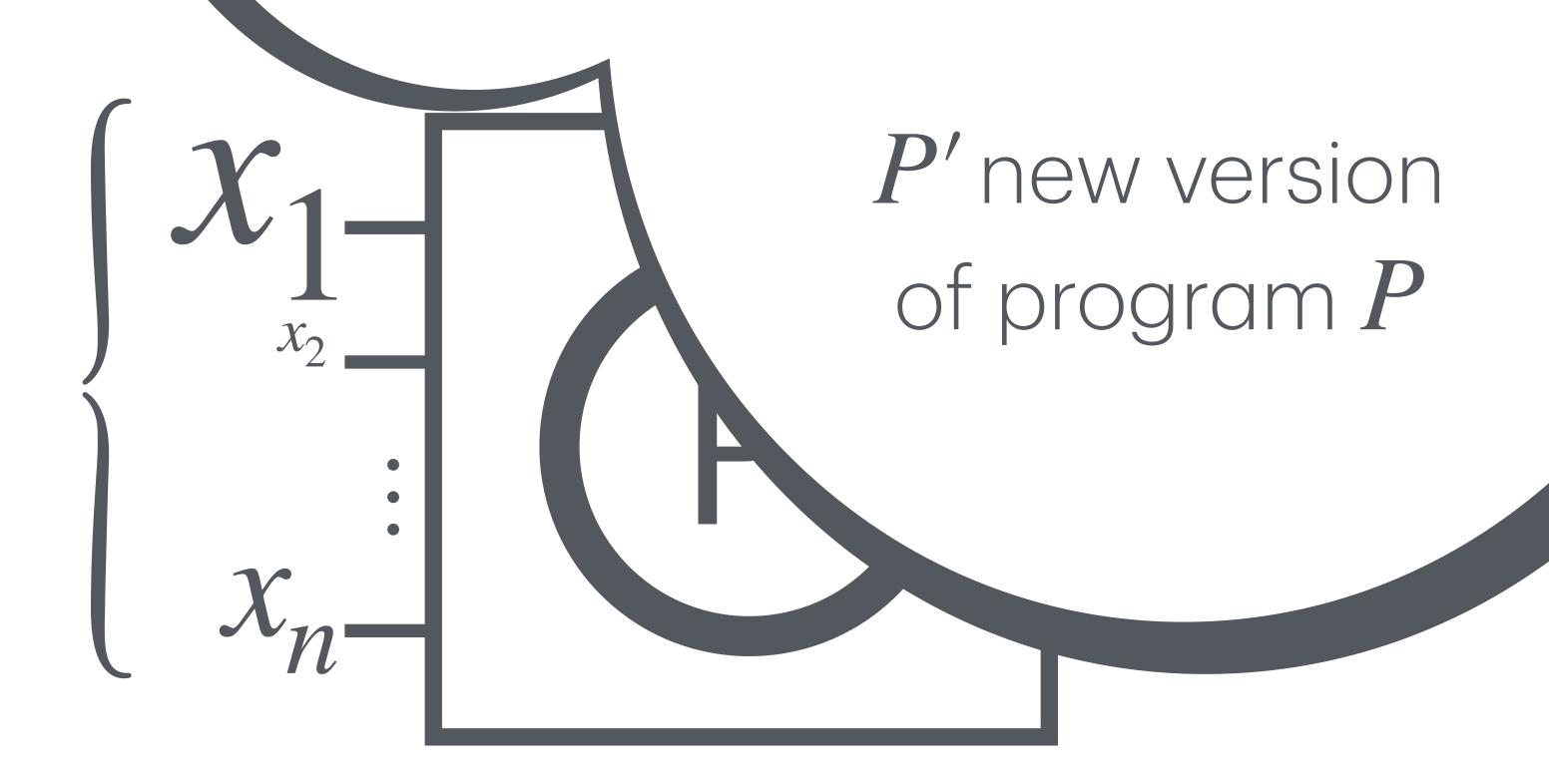


- Correctness
- Performance

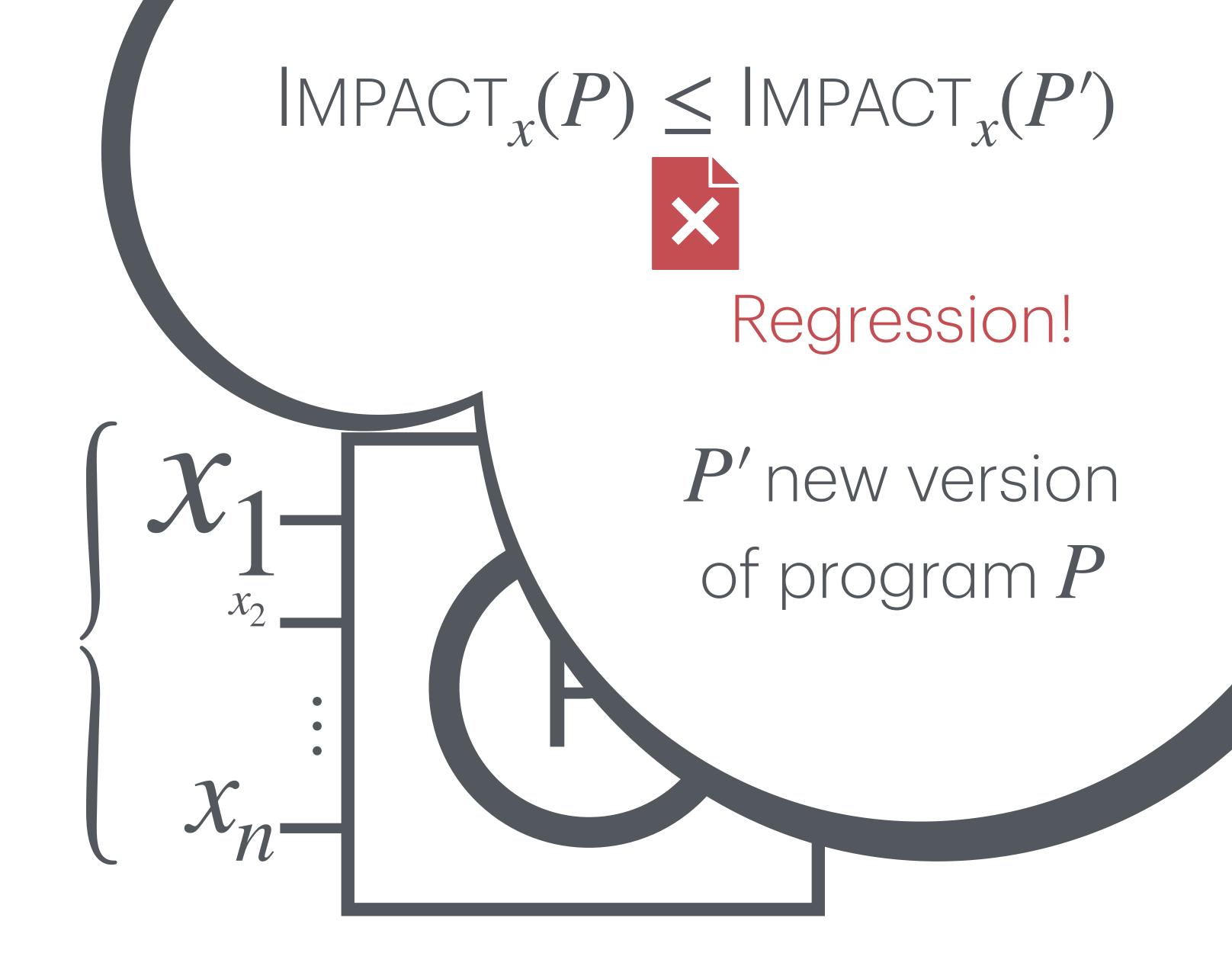


 $\mathsf{IMPACT}_{\mathcal{X}}(P) \leq \mathsf{IMPACT}_{\mathcal{X}}(P')$ 

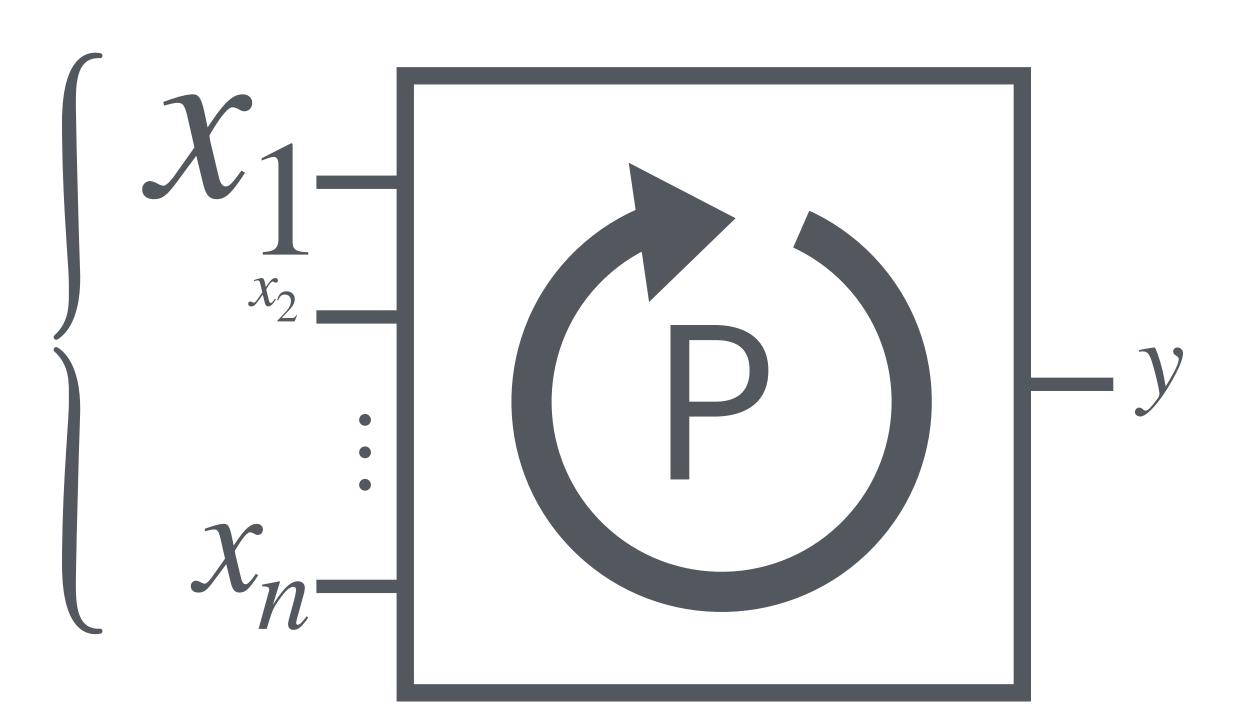
- Correctness
- Performance



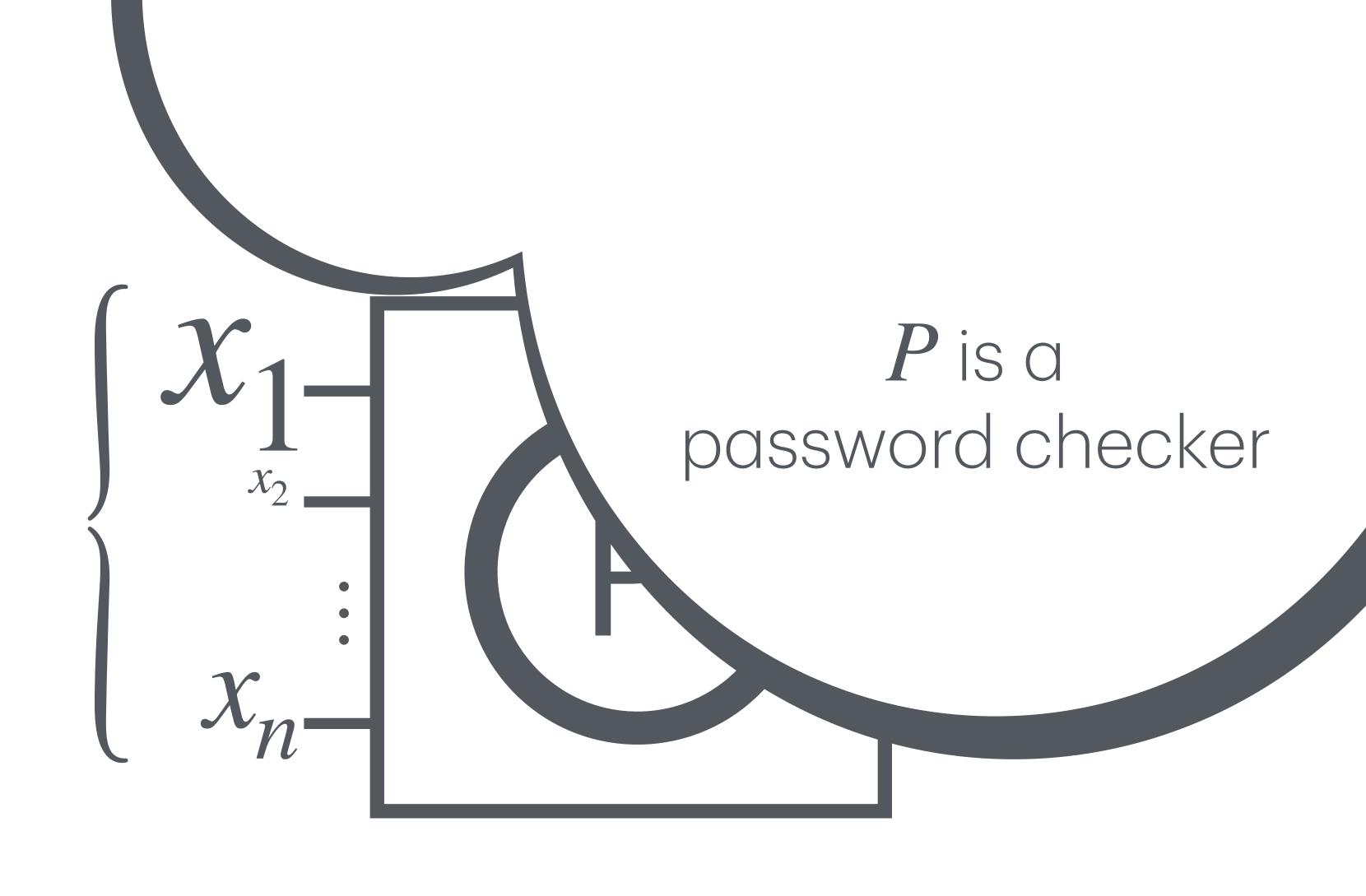
- Correctness
- Performance



- Correctness
- Performance
- Security

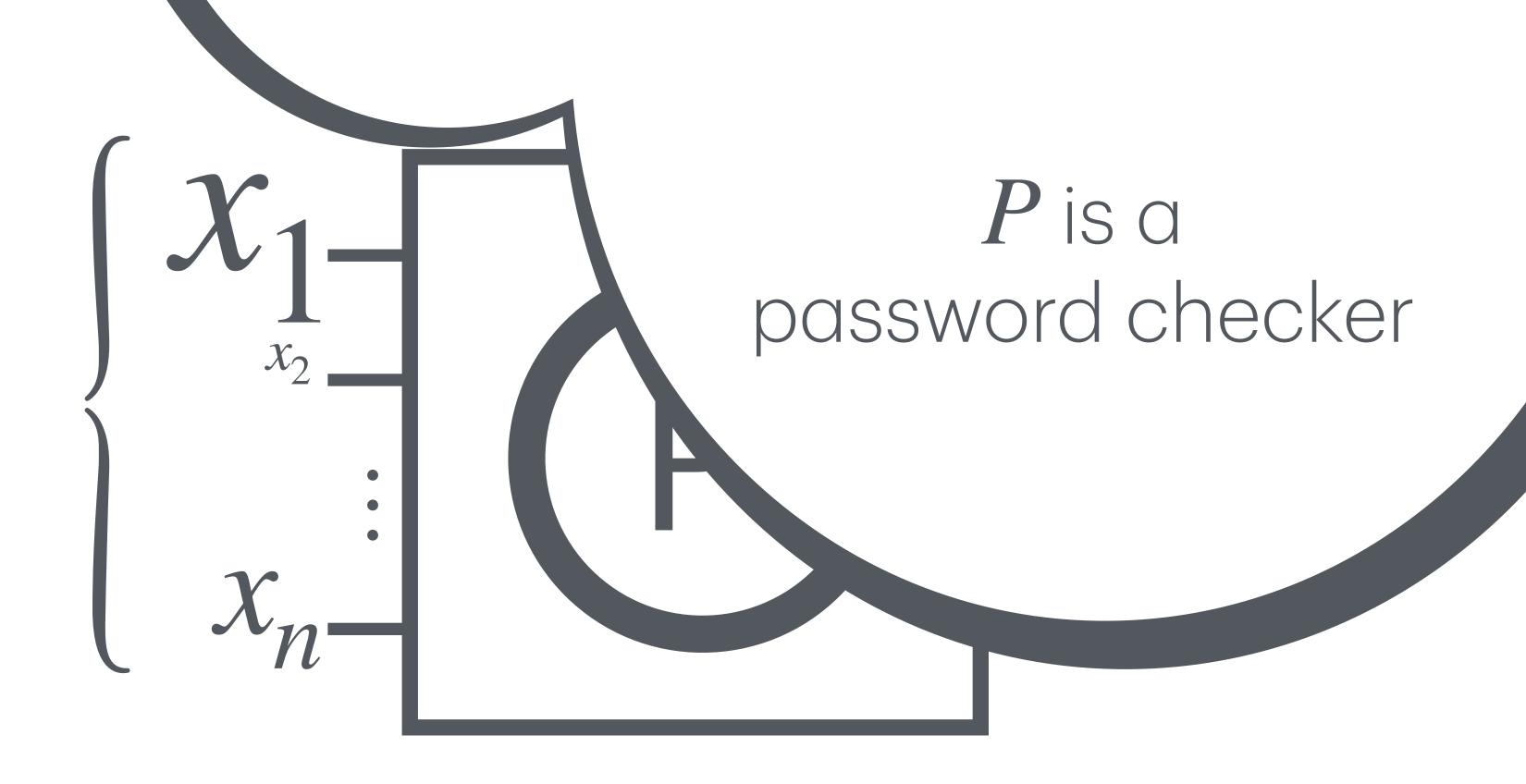


- Correctness
- Performance
- Security

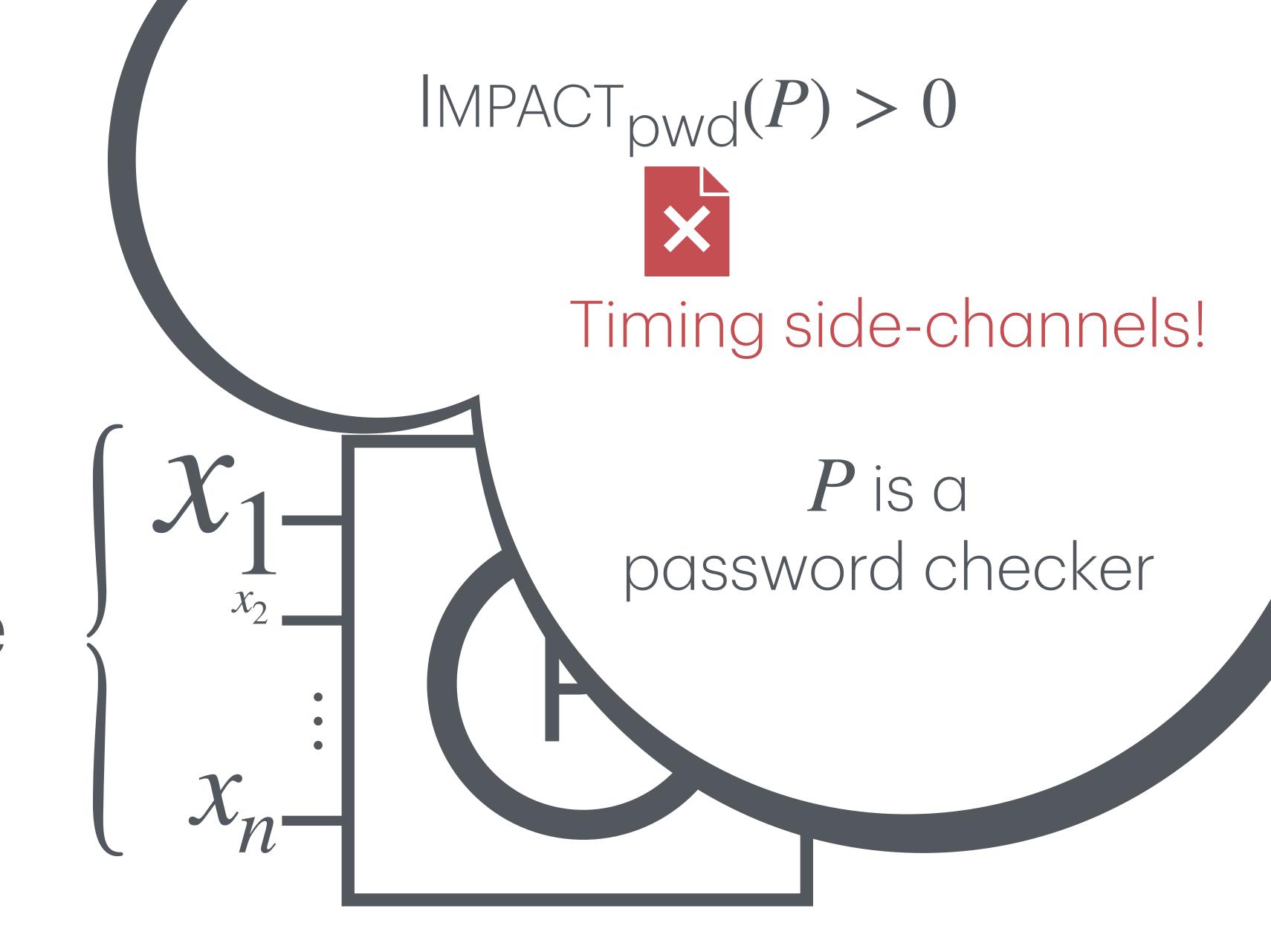


 $\mathsf{IMPACT}_{\mathsf{DWd}}(P) > 0$ 

- Correctness
- Performance
- Security



- Correctness
- Performance
- Security



```
1  def Check(pwd):
2    for (i = 0; i < len; i++):
3       if pwd[i] != secret[i]:
4       return false
5    return true</pre>
```

#### Learning a secret based on observations of the execution time of a program

```
def Check(pwd):
  for (i = 0; i < len; i++):
    if pwd[i] != secret[i]:
      return false
  return true
```

secret=1234

```
1 def Check(pwd):
2    for (i = 0; i < len; i++):
3       if pwd[i] != secret[i]:
4       return false
5    return true</pre>
```

```
1 def Check(pwd):
2    for (i = 0; i < len; i++):
3       if pwd[i] != secret[i]:
4       return false
5    return true</pre>
```

```
1 def Check(pwd):
2    for (i = 0; i < len; i++):
3       if pwd[i] != secret[i]:
4       return false
5    return true</pre>
pwd secret=1234

0000→1 Iter.→ false

1111→1 Iter.→ 2 Iter.→ false
```

```
def Check(pwd):

for (i = 0; i < len; i++):
    if pwd[i] != secret[i]:
    return false

return true

pwd secret=1234

0000 \rightarrow 1 \text{ Iter.} \rightarrow false

1111 \rightarrow 1 \text{ Iter.} \rightarrow 2 \text{ Iter.} \rightarrow false

1222 \rightarrow 1 \text{ Iter.} \rightarrow 2 \text{ Iter.} \rightarrow 3 \text{ Iter.} \rightarrow 4 \text{ Iter.} \rightarrow false

1233 \rightarrow 1 \text{ Iter.} \rightarrow 2 \text{ Iter.} \rightarrow 3 \text{ Iter.} \rightarrow 4 \text{ Iter.} \rightarrow false

1234 \rightarrow 1 \text{ Iter.} \rightarrow 2 \text{ Iter.} \rightarrow 3 \text{ Iter.} \rightarrow 4 \text{ Iter.} \rightarrow true
```

Learning a secret based on observations of the execution time of a program

```
1 def Check(pwd):
2   for (i = 0; i < len; i++):
3    if pwd[i] != secret[i]:
4     return false
5   return true</pre>
```

if  $\mathrm{IMPACT}_{pwd}(\mathrm{Check}) > 0$  then an attacker could retrieve the secret!

### S2N-Bignum

Add Function

3 8

$$42 = 38 + 4$$

Add Function

array

$$[0, 4, 2] =$$
 $[3, 8] +$ 
 $[4]$ 

$$3 [0, 4, 2] =$$
 $2 [3, 8] +$ 
 $1 [4]$ 

Add Function

length array

$$3 [0, 4, 2] =$$
 $2 [3, 8] +$ 
 $1 [4]$ 

```
1 \det Add(p, z, m, x, n, y): 26
                                   else:
    r = min(p, m)
                                     t = p - r
                              27
     s = min(p, n)
                              28
                                     q = r - s
     if (r < s):
                              29
                                     i = 0
      t = p - s
                              30
       q = s - r
                              31
                                     for (; s > 0; s--):
                              32
                                       r = x[i]
                              33
                                       w = y[i]
       for (; r > 0; r--):
                                       z[i] = r + w + b
                              34
        s = x[i]
                                       i = i + 1
                              35
         w = y[i]
                              36
                                       b = (w < b) | |
         z[i] = s + w + a
                                        (r + w < r) | |
                              37
         i = i + 1
                              38
                                         (r + w + b < r)
         a = (w < a) | |
                              39
                                     for (; q > 0; q--):
           (s + w < s)
                                       r = x[i]
           (s + w + a < s)
16
                                       z[i] = r + b
       do:
                              42
                                      | i = i + 1
18
                                       b = (r < b) | |
         r = y[i]
                              43
         b = (r < a) | |
19
                                       (r + b < r)
20
          (r + a < r)
                                   if (t > 0):
                              45
         z[i] = r + a
21
                              46
                                     z[i] = b
         i = i + 1
                                     while (t > 0):
23
24
                              49
       while (q > 0)
                                       if (t > 0):
25
                              50
```

```
1 def Add(p, z, m, x, n, y): 26 | else:
   r = min(p, m)
                                  t = p - r
                            27
    s = min(p, n)
                            28
                                   q = r - s
    if (r < s):
                            29
                                   i = 0
     t = p - s
                            30
      q = s - r
                                   for (; s > 0; s--):
                                    r = x[i]
                            33
                                     w = y[i]
      for (; r > 0; r--):
                            34
                                     z[i] = r + w + b
       s = x[i]
                                   i = i + 1
                            35
        w = y[i]
                            36
                                     b = (w < b) | |
       z[i] = s + w + a
                                   (r + w < r)
                            37
       | i = i + 1
                            38
                                      (r + w + b < r)
        a = (w < a) | |
                            39
                                   for (; q > 0; q--):
          (s + w < s)
                                    r = x[i]
                                    z[i] = r + b
           (s + w + a < s)
      do:
                                   | i = i + 1
                            42
                                    b = (r < b) | |
        r = y[i]
                            43
        b = (r < a) | |
                                    (r + b < r)
20
          (r + a < r)
                                 if (t > 0):
                            45
        z[i] = r + a
21
                                   z[i] = b
        i = i + 1
                                   while (t > 0):
24
                            49
      while (q > 0)
                                     if (t > 0):
25
                            50
                                     z[i] = 0
```

Add Function

# Requirement: no timing side-channels on data input variables

Add Function

#### Requirement:

no timing side-channels on data input variables

- $IMPACT_{\{p,m,n\}}(Add) \ge 0$   $IMPACT_{\{Z,X,Y\}}(Add) = 0$

#### How?

$$IMPACT_{\{Z,X,y\}}(Add)$$

How?

abstract

concrete

$$Impact^{\sharp}_{\{Z,X,Y\}}(Add) \ge Impact_{\{Z,X,Y\}}(Add)$$

How?

abstract

concrete

$$\label{eq:local_expansion} \text{Impact}^{\natural}_{\{Z,X,Y\}}(\text{Add}) = 0 \text{ then } \text{IMPACT}_{\{Z,X,Y\}}(\text{Add}) = 0$$

 $Impact^{\natural}_{\{Z,X,Y\}}(Add) \ge Impact_{\{Z,X,Y\}}(Add)$ 

```
1 \det Add(p, z, m, x, n, y): 26
                                    else:
    r = min(p, m)
                               27
                                      t = p - r
     s = min(p, n)
                               28
                                      q = r - s
     if (r < s):
                               29
                                      i = 0
      t = p - s
                               30
       q = s - r
                                      for (; s > 0; s--):
                               32
                                        r = x[i]
                               33
                                        w = y[i]
       for (; r > 0; r--):
                               34
                                        z[i] = r + w + b
        s = x[i]
10
                               35
                                        i = i + 1
         w = y[i]
                                        b = (w < b) | |
                               36
         z[i] = s + w + a
                               37
                                          (r + w < r) | |
13
         i = i + 1
                               38
                                           (r + w + b < r)
         a = (w < a) | |
14
                               39
                                      for (; q > 0; q--):
            (s + w < s) | |
                                        r = x[i]
            (s + w + a < s)
16
                                        z[i] = r + b
17
       do:
                               42
                                        i = i + 1
18
         r = y[i]
                                        b = (r < b) | |
                               43
19
         b = (r < a) | |
                                         (r + b < r)
20
           (r + a < r)
                               45
                                    if (t > 0):
21
         z[i] = r + a
                               46
                                      z[i] = b
         i = i + 1
                                      while (t > 0):
23
24
                               49
       while (q > 0)
                                        if (t > 0):
25
                               50
                                        z[i] = 0
```

```
1 \det Add(p, z, m, x, n, y): 26
                                   else:
    r = min(p, m)
                              27
                                      t = p - r
     s = min(p, n)
                              28
                                      q = r - s
     if (r < s):
                              29
                                      i = 0
      t = p - s
                              30
       q = s - r
                              31
                                      for (; s > 0; s--):
                              32
                                        r = x[i]
                              33
                                        w = y[i]
       for (; r > 0; r--):
                              34
                                        z[i] = r + w + b
       S = X[i]
10
                              35
                                        i = i + 1
         w = y[i]
                                        b = (w < b) | |
                              36
         z[i] = s + w + a
                              37
                                         (r + w < r) | |
13
                              38
                                          (r + w + b < r)
14
         a = (w < a)
                              39
                                      for (; q > 0; q--):
           (s + w < s)
                                       r = x[i]
16
           (s + w + a < s)
                                        z[i] = r + b
17
       do:
                              42
                                        i = i + 1
18
         r = y[i]
                                        b = (r < b) | |
                              43
19
         b = (r < a) | |
                                         (r + b < r)
20
           (r + a < r)
                              45
                                    if (t > 0):
21
         z[i] = r + a
                              46
                                      z[i] = b
         i = i + 1
                                      while (t > 0):
23
24
                               49
       while (q > 0)
                                        if (t > 0):
25
                               50
                                        z[i] = 0
```

```
def Add(p, z, m, x, n, y): 26
                                     else:
     r = min(p, m)
                                27
                                        t = p - r
     s = min(p, n)
                                28
     if (r < s):
                                29
       t = p - s
                                30
       q = s - r
                                        for (; s > 0; s--):
                                          r = x[i]
                                33
                                          w = y[i]
                                          z[i] = r + w + b
                                35
                                          i = i + 1
                                36
                                          b = (w < b) | |
         W = V | i
                                            (r + w < r) | |
                 s + w + a
                                37
13
                                38
                                            (r + w + b < r)
14
          a = (w < a)
                                39
                                        for (; q > 0; q--):
                                          r = x[i]
16
            (s + w + a < s)
                                          z[i] = r + b
17
       do:
                                42
                                          i = i + 1
18
                                          b = (r < b) | |
                                43
19
                                            (r + b < r)
20
             (r + a < r)
                                      if (t > 0):
                                45
21
                                46
                                        while (t > 0):
                                        Ti = i + 1
23
24
                                49
       while (q > 0)
                                          if (t > 0):
25
                                50
                                          z[i] = 0
```

```
def Add(p, z, m, x, n, y): 26
                                      else:
     r = min(p, m)
                                27
                                        t = p - r
     s = min(p, n)
                                 28
     if (r < s):
                                 29
       t = p - s
                                 30
       q = s - r
                                        for (; s > 0; s--):
                                          r = x[i]
                                33
                                          w = y[i]
                                          z[i] = r + w + b
                                 35
                                          i = i + 1
                                 36
                                          b = (w < b) | |
          W = V | i
                                            (r + w < r) | |
                 s + w + a
                                 37
13
                                 38
                                             (r + w + b < r)
14
          a = (w < a)
                                 39
                                        for (; q > 0; q--):
                                          r = x[i]
16
            (s + w + a < s)
                                          z[i] = r + b
17
        do:
                                 42
                                          i = i + 1
18
                                          b = (r < b) | |
                                 43
19
                                            (r + b < r)
20
             (r + a < r)
                                      if (t > 0):
                                 45
21
                                 46
                                        while (t > 0):
23
                                 48
24
                                 49
25
                                          if (t > 0):
                                 50
                                 51
```

```
def Add(p, z, m, x, n, y): 26
                                   else:
    r = min(p, m)
                              27
                                     t = p - r
     s = min(p, n)
                              28
                                     q = r - s
     if (r < s):
                              29
                                     i = 0
       t = p - s
                              30
       q = s - r
                              31
                                     for (; s > 0; s--):
                              32
                                       r = x[i]
                              33
                                       w = y[i]
       for (; r > 0; r--):
                              34
                                       z[i] = r + w + b
       s = x[i]
10
                              35
                                       i = i + 1
         W = y[i]
                                       b = (w < b) | |
                              36
         z[i] = s + w + a
                              37
                                         (r + w < r) | |
13
                              38
                                         (r + w + b < r)
14
         a = (w < a) | |
                              39
                                     for (; q > 0; q--):
           (s + w < s)
                                       r = x[i]
           (s + w + a < s)
16
                                       z[i] = r + b
17
       do:
                              42
                                       i = i + 1
18
        r = y[i]
                              43
                                       b = (r < b) | |
19
         b = (r < a) | |
                              44
                                        (r + b < r)
20
          (r + a < r)
                              45
                                   if (t > 0):
21
                              46
                                     z[i] = b
                                     while (t > 0):
                                     Ti = i + 1
23
                              49
       while (q > 0)
                                       if (t > 0):
25
                              50
                                       z[i] = 0
```

```
def Add(p, z, m, x, n, y): 26
                                   else:
    r = min(p, m)
                              27
                                     t = p - r
     s = min(p, n)
                              28
                                     q = r - s
     if (r < s):
                              29
       t = p - s
                              30
                                     for (; s > 0; s--):
       q = s - r
                              31
                              32
                                       | r = x[i]
                              33
                                       w = y[i]
       for (; r > 0; r--):
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                                       z[i] = r + w + b
10
       | s = x[i]
                              35
                                       i = i + 1
         W = y[i]
                              36
                                       b = (w < b) | |
         z[i] = s + w + a
                              37
                                         (r + w < r)
13
                              38
                                         (r + w + b < r)
14
         a = (w < a)
                              39
                                     for (; q > 0; q--):
                                       r = x[i]
           (s + w < s)
16
           (s + w + a < s)
                                       z[i] = r + b
17
       do:
                                       i = i + 1
                              42
18
        r = y[i]
                                       b = (r < b) | |
                              43
         b = (r < a) | |
19
                              44
                                       (r + b < r)
20
          (r + a < r)
                              45
                                   if (t > 0):
21
                              46
                                     while (t > 0):
         i = i + 1
                                     Ti = i + 1
23
                              49
                                       if (t > 0):
       while (q > 0)
                              50
                                       Tz[i] = 0
```

```
def Add(p, z, m, x, n, y): 26
                                    else:
     r = min(p, m)
                              27
                                     t = p - r
     s = min(p, n)
                              28
                                      q = r - s
     if (r < s):
                              29
       t = p - s
                              30
                                      for (; s > 0; s--):
       q = s - r
                              32
                                       | r = x[i]
                              33
                                        w = y[i]
       for (; r > 0; r--):
                              34
                                        z[i] = r + w + b
10
       | s = x[i]
                              35
                                       i = i + 1
         W = y[i]
                              36
                                        b = (w < b) | |
         z[i] = s + w + a
                              37
                                         (r + w < r)
13
                              38
                                          (r + w + b < r)
14
         a = (w < a) | |
                              39
                                      for (; q > 0; q--):
           (s + w < s)
                                       r = x[i]
           (s + w + a < s)
16
                                        z[i] = r + b
17
       do:
                                        i = i + 1
                              42
18
        r = y[i]
                                       b = (r < b) | |
                              43
         b = (r < a) | |
19
                                        (r + b < r)
20
          (r + a < r)
                              45
                                    if (t > 0):
21
                              46
         i = i + 1
                                      while (t > 0):
23
                              48
24
                               49
       while (q > 0)
25
                               50
```

```
def Add(p, z, m, x, n, y): 26
                                   else:
    r = min(p, m)
                              27
                                     t = p - r
     s = min(p, n)
                              28
                                     q = r - s
     if (r < s):
                              29
       t = p - s
                              30
                                     for (; s > 0; s--):
       q = s - r
                              31
                              32
                                      | r = x[i]
                              33
                                       w = y[i]
       for (; r > 0; r--):
                              34
                                       z[i] = r + w + b
10
       | s = x[i]
                              35
                                       i = i + 1
         W = y[i]
                              36
                                       b = (w < b) | |
         z[i] = s + w + a
                              37
                                         (r + w < r)
13
                              38
                                         (r + w + b < r)
14
         a = (w < a)
                              39
                                     for (; q > 0; q--):
                                      r = x[i]
           (s + w < s)
16
           (s + w + a < s)
                                       z[i] = r + b
17
       do:
                                       i = i + 1
                              42
18
        r = y[i]
                                       b = (r < b) | |
                              43
         b = (r < a) | |
19
                                       (r + b < r)
20
          (r + a < r)
                              45
                                   if (t > 0):
21
                              46
                                     while (t > 0):
         i = i + 1
                                     Ti = i + 1
23
      while (q > 0)
                                       if (t > 0):
                              50
                                       |z[i] = 0
```

Add Function

## Syntactic Dependency Analysis

Caterina Urban and Peter Müller, An Abstract Interpretation Framework for Input Data Usage, ESOP 2018

```
def Add(p, z, m, x, n, y): 26
                                     else:
     r = min(p, m)
                               27
                                       t = p - r
     s = min(p, n)
                               28
                                       q = r - s
     if (r < s):
                               29
       t = p - s
                               30
       q = s - r
                                       for (; s > 0; s--):
                                         r = x[i]
                               33
                                         w = y[i]
       for (; r > 0; r--):
                                         z[i] = r + w + b
10
        | s = x[i]
                               35
                                         i = i + 1
         W = y | i |
                               36
                                         b = (w < b) | |
         z[i] = s + w + a
                               37
                                           (r + w < r)
                                           (r + w + b < r)
                               38
         a = (w < a) | |
                               39
                                       for (; q > 0; q--):
            (s + w < s)
                                         r = x[i]
            (s + w + a < s)
                                         z[i] = r + b
       do:
                                         i = i + 1
                               42
         r = y[i]
                                         b = (r < b) | |
                                43
         b = (r < a) | |
19
                                          (r + b < r)
           (r + a < r)
20
                                     if (t > 0):
                               45
21
         z|i| = r + a
                                       while (t > 0):
                                       Ti = i + 1
       while (q > 0)
                                         if (t > 0):
                                50
```

Add Function

# Syntactic Dependency Analysis

Caterina Urban and Peter Müller, An Abstract Interpretation Framework for Input Data Usage, ESOP 2018

```
1 def Add(p, z, m, x, n, y):
    r = min(p, m)
     s = min(p, n)
     if (r < s):
       t = p - s
       q = s - r
       for (; r > 0; r--):
       Tskip
       do:
       q--
       while (q > 0)
     else:
       t = p - r
28
       q = r - s
       for (; s > 0; s--):
       Tskip
       for (; q > 0; q--):
39
       Tskip
     if (t > 0):
       while (t > 0):
```

Add Function

```
1 def Add(p, z, m, x, n, y):
                              Augment each
    r = min(p, m)
    s = min(p, n)
                        loop body with a counter
    if (r < s):
      t = p - s
                               for iterations
      q = s - r
      for (; r > 0; r--):
      T skip; counter--
      do:
      I q--; counter--
      while (q > 0)
26
     else:
     T t = p - r
28
      q = r - s
```

if (t > 0):

39

for (; s > 0; s--):

for (; q > 0; q--):

T skip; counter--

T skip; counter--

while (t > 0):

Tt--; counter--

Add Function

```
1 def Add(p, z, m, x, n, y):
                               Augment each
    r = min(p, m)
     s = min(p, n)
                         loop body with a counter
     if (r < s):
      t = p - s
      q = s - r
                                for iterations
      for (; r > 0; r--):
      T skip; counter--
      do:

    q--; counter--
                            Backwards starting
      while (q > 0)
26
     else:
                                  from zero!
     T t = p - r
28
      q = r - s
      for (; s > 0; s--):
      T skip; counter--
39
      for (; q > 0; q--):
      T skip; counter--
     if (t > 0):
      while (t > 0):
      Tt--; counter--
```

assert counter = 0

Add 
$$\begin{pmatrix} 3, & z, \\ 2, & [3, 8], \\ 1, & [4] \end{pmatrix}$$
 (counter = 3) \quad \tag{counter} = 0\quad \tag{counter} = 1\quad \tag{counter}

Add 
$$\begin{pmatrix} 3, & z, \\ 2, [3, 8], \\ 1, & [4] \end{pmatrix}$$
 (counter = 3)  $\langle$  (counter = 1)  $\rangle$ 

Add  $\begin{pmatrix} 3, & z, \\ 2, [3, 8], \\ 1, & [4] \end{pmatrix}$  (counter = 4)  $\langle$  (counter = 3)  $\rangle$  (counter = 3)  $\langle$  (counter = 2)

```
def Add(p, z, m, x, n, y):
                              Augment each
    r = min(p, m)
     s = min(p, n)
                        loop body with a counter
     if (r < s):
      t = p - s
                               for iterations
      q = s - r
      for (; r > 0; r--):
      T skip; counter--
      do:
      I q--; counter--
23
                            Backwards starting
      while (q > 0)
26
     else:
                                 from zero!
     T t = p - r
28
      q = r - s
31
      for (; s > 0; s--):
      T skip; counter--
39
      for (; q > 0; q--):
                           At the beginning, the
      T skip; counter--
     if (t > 0):
                        counter yields the global
      while (t > 0):
      Tt--; counter--
                           number of iterations
     assert counter = 0
```

Backward abstract

analysis

Add Function

```
def Add(p, z, m, x, n, y):
       = min(p, m)
       = min(p, n)
                           loop body with a counter
 6
           (; r > 0; r--):
        skip; counter--
       do:
             ; counter--
              (p > 0)
     else:
28
       for (; s > 0; s--):
         skip; counter--
39
           (; q > 0; q--):
         skip; counter--
       while (t > 0):

    t--; counter--

49
     assert counter = 0
```

Backwards starting from zero!

Augment each

for iterations

At the beginning, the counter yields the global number of iterations

Add Function

Abstract invariant on the

input variables + counter

```
Backward abstract analysis
```

```
def Add(p, z, m, x, n, y):
                              Augment each
      = min(p, m)
      = min(p, n)
                        loop body with a counter
                               for iterations
       (; r > 0; r--):
       T skip; counter--
      do:
       __q--; counter--
                            Backwards starting
            (p > 0)
     else:
                                 from zero!
28
       for (; s > 0; s--):
39
          (; q > 0; q--):
                           At the beginning, the
        skip; counter--
                        counter yields the global
      while (t > 0):

    t--; counter--

49
```

assert counter = 0

number of iterations

Add Function

Abstract invariant on the

input variables + counter

```
Forward +
  Backward abstract
       analysis
```

```
def Add(p, z, m, x, n, y):
                              Augment each
      = min(p, m)
      = min(p, n)
                        loop body with a counter
                               for iterations
       (; r > 0; r--):
       T skip; counter--
      do:
       _ q--; counter--
                           Backwards starting
            (p > 0)
     else:
                                 from zero!
28
       for (; s > 0; s--):
        skip; counter--
39
          (; q > 0; q--):
                          At the beginning, the
        skip; counter--
                        counter yields the global
      while (t > 0):

    t--; counter--

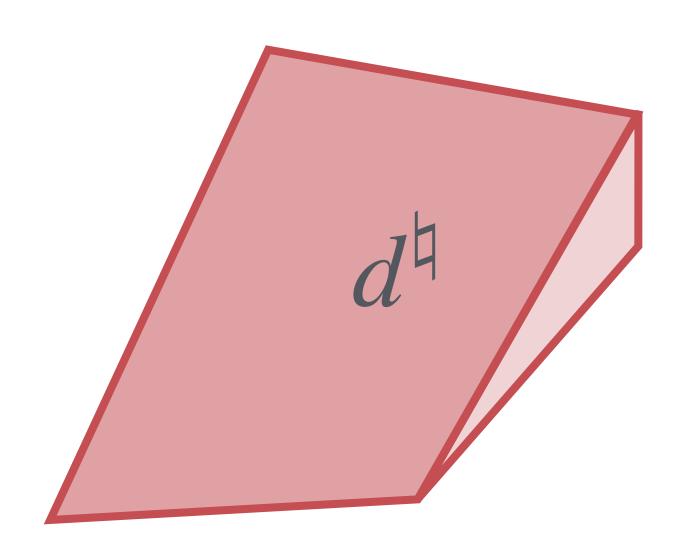
49
                          number of iterations
```

assert counter = 0

Mixed-Integer Linear Programming

Abstract invariant on the

input variables + counter

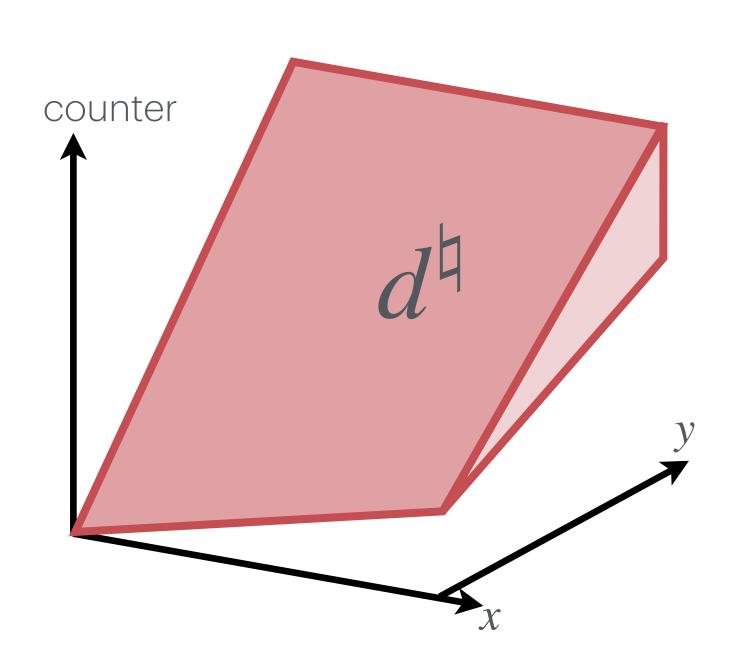


Mixed-Integer Linear Programming

Abstract invariant on the

input variables + counter

(i) Assume input variable of interest x

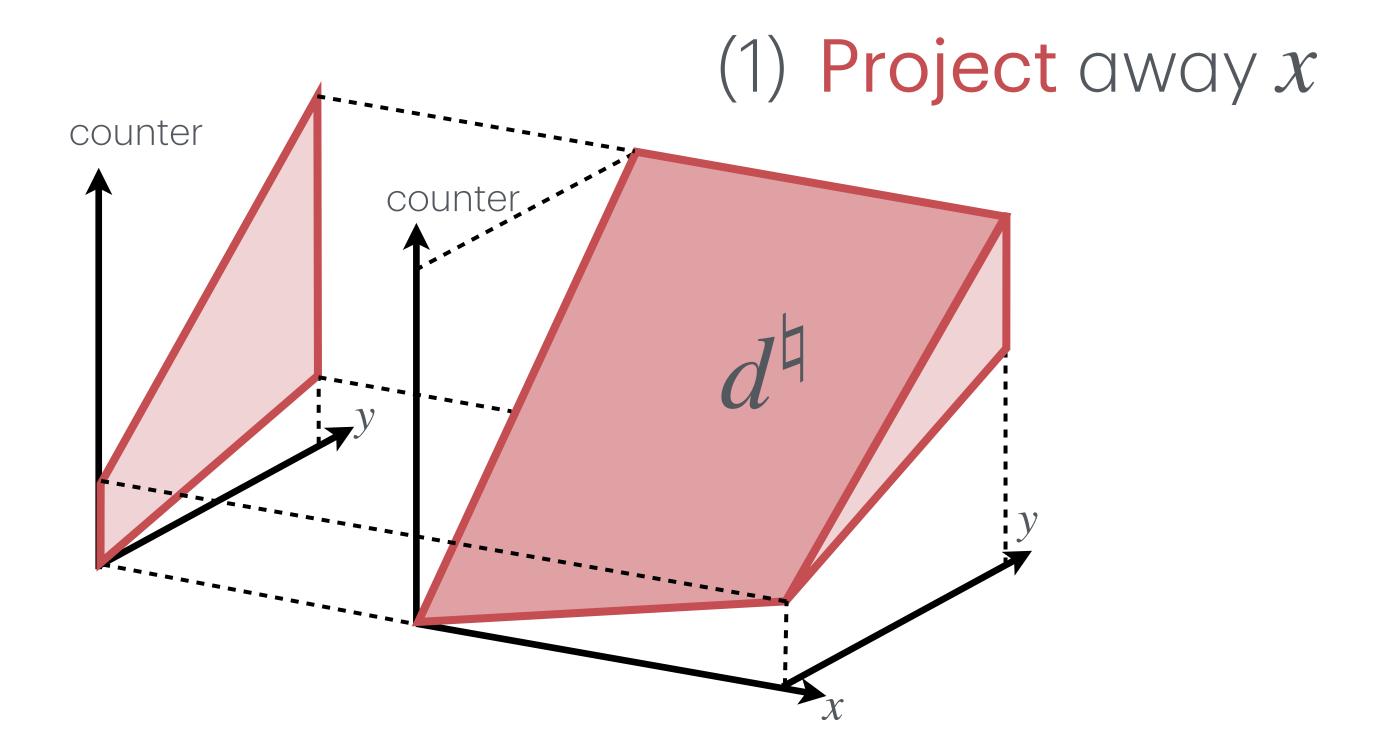


Mixed-Integer Linear Programming

Abstract invariant on the

input variables + counter

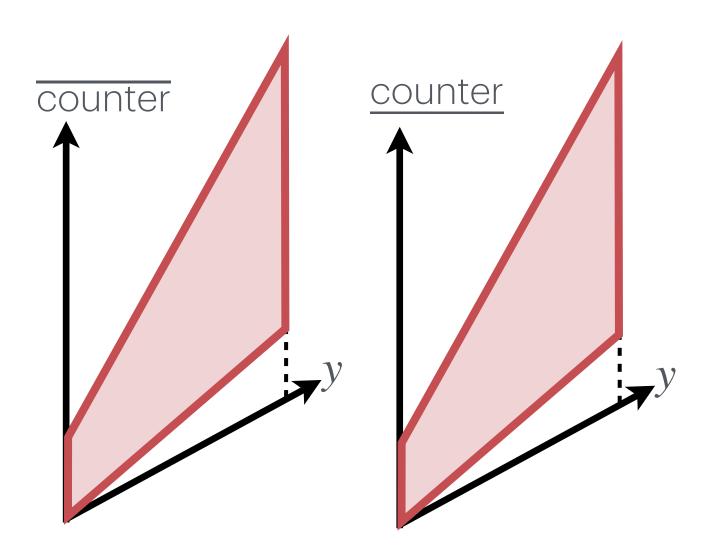
(i) Assume input variable of interest x



Mixed-Integer Linear Programming

Abstract invariant on the

input variables + counter

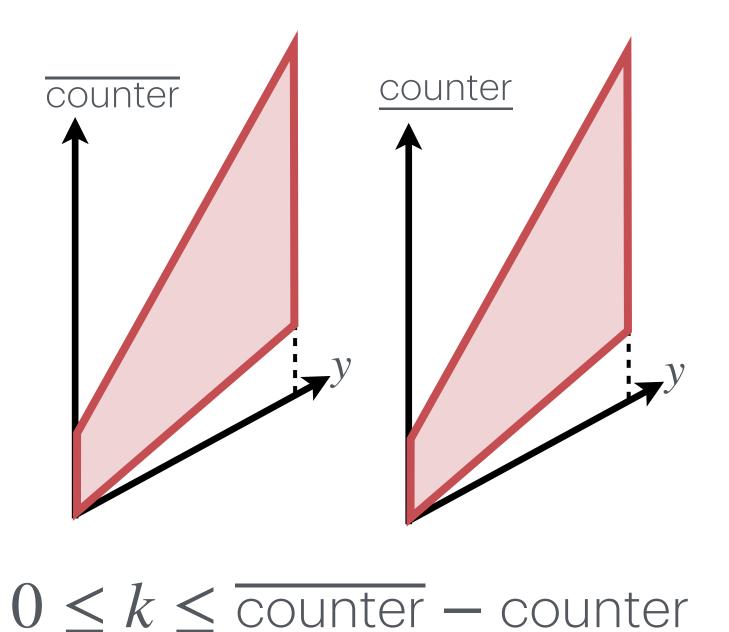


- (i) Assume input variable of interest x
- (1) Project away x
- (2) **Duplicate** the invariant and substitute the counter with counter and counter

Mixed-Integer Linear Programming

Abstract invariant on the

#### input variables + counter

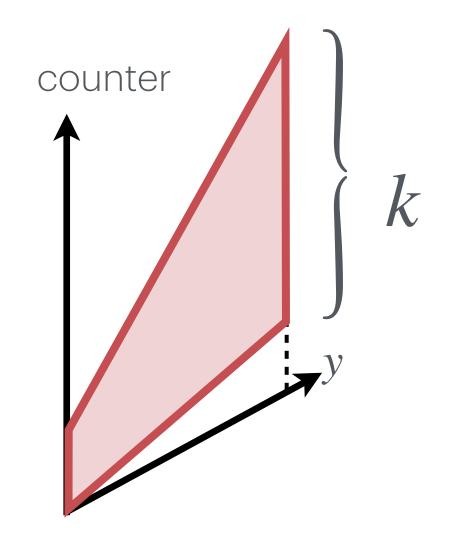


- (i) Assume input variable of interest x
- (1) Project away x
- (2) **Duplicate** the invariant and substitute the counter with counter and counter
- (3) Maximize the distance between the two

Mixed-Integer Linear Programming

Abstract invariant on the

#### input variables + counter



 $0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$ 

- (i) Assume input variable of interest x
- (1) Project away x
- (2) **Duplicate** the invariant and substitute the counter with counter and counter
- (3) Maximize the distance between the two

k is the impact of x

Mixed-Integer Linear Programming

Impact
$$_{x}^{\natural}(d^{\natural})$$

Mixed-Integer Linear Programming

Impact
$$_{x}^{\natural}(d^{\natural}) = \max k \text{ subject to}$$

$$0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$$

Mixed-Integer Linear Programming

Impact
$$_{x}^{\natural}(d^{\natural}) = \max k \text{ subject to}$$

$$Project_{x}(d^{\natural}))$$

$$0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$$

Mixed-Integer Linear Programming

Impact<sub>x</sub><sup>$$\xi$$</sup> $(d^{\xi}) = \max k \text{ subject to}$ 

Substitute[[counter  $\leftarrow$  counter]](Project<sub>x</sub>( $d^{\natural}$ ))  $\land$ 

Substitute[[counter  $\leftarrow$  counter]](Project<sub>x</sub>( $d^{\natural}$ ))  $\land$ 

 $0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$ 

#### abstract

concrete

Theorem 3 (Soundness of Range<sup>4</sup>)

the input variable x has an

$$\operatorname{Impact}_{x}^{\natural}(P) \leq k \implies$$

impact below k on the

iterations of the program P

Lemma 3 Impact
$$_{x}^{\sharp}(P) \ge IMPACT_{x}(P)$$

Add Function

Forward +

Backward abstract

analysis

```
def Add(p, z, m, x, n, y):
     r = min(p, m)
                            p = counter \land 0 \le p \le u
     s = min(p, n)
        for (; r > 0; r--):
        skip; counter--
       do:

    q--;    counter--
             (p > 0)
     else:
28
       for (; s > 0; s--):
         skip; counter--
39
        qr (; q > 0; q--):
         skip; counter--
       while (t > 0):
       Tt--; counter--
49
     assert counter = 0
```

Add Function

$$d^{\natural} \text{ is}$$

$$p = \text{counter} \land 0 \le p \le u$$

Impact
$$_{x}^{\natural}(d^{\natural}) = \max k \text{ subject to}$$

Substitute[[counter  $\leftarrow$  counter]](Project<sub>x</sub>( $d^{\dagger}$ ))  $\land$ 

Substitute[[counter  $\leftarrow$  counter]](Project<sub> $\chi$ </sub>( $d^{\dagger}$ ))  $\land$ 

 $0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$ 

Add Function

$$d^{\natural}$$
 is 
$$p = \operatorname{counter} \wedge 0 \leq p \leq u$$

Impact 
$$p$$
 = counter  $\wedge 0 \le p \le u$  = max  $k$  subject to

$$0 \le \overline{\text{counter}} \le u \land$$

$$0 \le counter \le u \land$$

$$0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$$

Add Function

 $d^{\natural}$  is  $p = \operatorname{counter} \wedge 0 \leq p \leq u$ 

Impact
$$_p^{\natural}(p = \text{counter} \land 0 \le p \le u) = \max k \text{ subject to}$$

$$0 \le \overline{\text{counter}} \le u \land$$

$$0 \le counter \le u \land$$

$$0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$$

U

Add Function

$$d^{\natural}$$
 is 
$$p = \operatorname{counter} \wedge 0 \leq p \leq u$$

Impact 
$$p = \text{counter} \land 0 \le p \le u = max \ k \text{ subject to}$$

$$p = \overline{\text{counter}} \land p = \underline{\text{counter}} \land 0 \le p \le u \land 0 \le$$

 $0 \le k \le \overline{\text{counter}} - \text{counter}$ 

Add Function

$$d^{\natural} \text{ is}$$

$$p = \text{counter} \land 0 \le p \le u$$

Impact 
$$p = \text{counter} \land 0 \le p \le u = 0$$

max  $k \text{ subject to}$ 
 $p = \overline{\text{counter}} \land 0 \le p \le u \land 0 \le p \le u \land 0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$ 

Add Function

 $d^{\natural}$  is  $p = \text{counter} \land 0 \le p \le u$ 

Impact<sub>n</sub><sup>\beta</sup>(p = counter 
$$\wedge$$
 0 \le p \le u) =

max k subject to

$$p = \overline{\text{counter}} \wedge$$

$$p = \underline{\text{counter}} \wedge$$

$$0 \le p \le u \wedge$$

$$0 \le k \le \overline{\text{counter}} - \text{counter}$$

Add Function

 $d^{\natural}$  is  $p = \operatorname{counter} \wedge 0 \leq p \leq u$ 

Impact<sub>n</sub><sup>$$\natural$$</sup>(p = counter  $\land$  0  $\leq$  p  $\leq$  u) = max  $k$  subject to

$$p = \overline{\text{counter}} \land$$

$$p = \underline{\text{counter}} \land$$

$$0 \le p \le u \land$$

$$0 \le k \le \overline{\text{counter}} - \underline{\text{counter}}$$

0

And to all the other input variables

Add Function

Impact
$$_p^{\sharp}(d^{\natural}) = u$$
Impact $_m^{\sharp}(d^{\natural}) = 0$ 
Impact $_n^{\sharp}(d^{\natural}) = 0$ 
Impact $_n^{\sharp}(d^{\natural}) = 0$ 
Impact $_x^{\sharp}(d^{\natural}) = 0$ 
Impact $_x^{\sharp}(d^{\natural}) = 0$ 
Impact $_x^{\sharp}(d^{\natural}) = 0$ 
Impact $_x^{\sharp}(d^{\natural}) = 0$ 

```
1 def Add(p, z, m, x, n, y):
     r = min(p, m)
                          p = counter \land 0 \le p \le u
     s = min(p, n)
     if (r < s):
      t = p - s
       q = s - r
       for (; r > 0; r--):
       T skip; counter--
       do:
       I q--; counter--
       while (q > 0)
     else:
      T t = p - r
28
       q = r - s
       for (; s > 0; s--):
       T skip; counter--
39
       for (; q > 0; q--):
       T skip; counter--
     if (t > 0):
       while (t > 0):
    Tt--; counter--
-- assert counter = 0
```

d<sup>q</sup> is

Add Function

```
\operatorname{Impact}_{p}^{\natural}(d^{\natural}) = u
Impact^{\natural}_m(d^{\natural})
Impact<sup>\beta</sup><sub>n</sub>(d^{\beta}) = 0
Impact^{\natural}_{x}(d^{\natural}) = 0
Impact, (d^{\dagger})
\operatorname{Impact}_{z}^{\natural}(d^{\natural}) = 0
```

```
dis
  def Add(p, z, m, x, n, y):
     r = min(p, m)
                         p = counter \land 0 \le p \le u
     s = min(p, n)
     if (r < s):
       t = p - s
       q = s - r
       for (; r > 0; r--):
       T skip; counter--
       do:
       _ q--; counter--
23
       while (q > 0)
     else:
       t = p - r
       for (; s > 0; s--):
       T skip; counter--
       for (; q > 0; q--):
       T skip; counter--
     if (t > 0):
       while (t > 0):
Tt--; counter--
```

Add Function

```
\operatorname{Impact}_{p}^{\natural}(d^{\natural}) = u
\operatorname{Impact}_{m}^{\sharp}(d^{\sharp}) = 0
\mathrm{Impact}_{n}^{\natural}(d^{\natural}) = 0
\operatorname{Impact}_{r}^{\sharp}(d^{\sharp}) = 0
Impact<sup>‡</sup>(d^{\ddagger}) = 0
Impact<sup>‡</sup>(d^{\ddagger}) = 0
```

```
1 def Add(p, z, m, x, n, y):
     r = min(p, m)
                          p = counter \land 0 \le p \le u
     s = min(p, n)
     if (r < s):
       t = p - s
       q = s - r
       for (; r > 0; r--):
       T skip; counter--
       do:
       I q--; counter--
       while (q > 0)
     else:
       t = p - r
       q = r - s
       for (; s > 0; s--):
       T skip; counter--
39
       for (; q > 0; q--):
       T skip; counter--
     if (t > 0):
       while (t > 0):
    Tt--; counter--
-- assert counter = 0
```

```
The Add function is safe
from timing side-channels
    on input variables
    m, n, x, y, z
```

 $d^{\natural}$  is

Add Function

Impact
$$_p^{\sharp}(d^{\natural}) = u$$
Impact $_m^{\sharp}(d^{\natural}) = 0$ 
Impact $_n^{\sharp}(d^{\natural}) = 0$ 

```
1 def Add(p, z, m, x, n, y):
     r = min(p, m)
     s = min(p, n)
     if (r < s):
       t = p - s
       q = s - r
       for (; r > 0; r--):
       T skip; counter--
       do:
       I q--; counter--
       while (q > 0)
     else:
       t = p - r
28
       q = r - s
       for (; s > 0; s--):
       T skip; counter--
39
       for (; q > 0; q--):
       T skip; counter--
     if (t > 0):
       while (t > 0):
     Tt--; counter--
  assert counter = 0
```

The Add function is safe from timing side-channels on input variables data input

 $d^{\natural}$  is

 $p = counter \land 0 \le p \le u$ 

variables

Table 4: Input composition of the S2N-BIGNUM library. The variables SAFE  $\Delta|_{\rm S}$  are highlighted in green, while the variables NUMERICAL  $\Delta|_{\rm N}$  in red. No numerical variable should be MAYBE DANGEROUS.

Program	SAFE $\Delta _{\rm S}$	Variables $\Delta$ Numerical $\Delta _{ m N}$	Maybe Dangerous	Zero Impact
Add	$s_1, s_3, s_5$	$n_2, n_4, n_6$	$s_1$	$s_3, s_5, n_2, n_4, n_6$
Amontifier	$s_1$	$n_2, n_3, n_4$	$s_1$	$n_2,n_3,n_4$
Amontmul	$s_1$	$n_2, n_3, n_4, n_5$	81	$n_2, n_3, n_4, n_5$
Amontredc	$s_1, s_3, s_6$	$n_2, n_4, n_5$	$s_1, s_3, s_6$	$n_2, n_4, n_5$
Amontsqr Bitfield	81	$n_2, n_3, n_4$	81	$n_2, n_3, n_4$
Bitsize	$s_1$ $s_1$	$n_2, n_3, n_4, n_5$	\$1 81	$n_2, n_3, n_4, n_5$
Cdiv	$s_1, s_3$	$n_2 \atop n_2, n_4, n_5$	$s_1, s_3$	$n_2, n_4, n_5$
Cdiv_exact	81,83	$n_2, n_4, n_5$	81	$n_2, s_3, n_4, n_5$
Cld	81	$n_2$	81	$n_2$
Clz	$s_1$	$n_2$	81	$n_2$
Cmadd	$s_1, s_4$	$n_2, n_3, n_5$	$s_1, s_4$	$n_2, n_3, n_5$
Cmnegadd	$s_1, s_4$	$n_2, n_3, n_5$	$s_1, s_4$	$n_2, n_3, n_5$
Cmod	81	$n_2, n_3$	81	$n_2, n_3$
Cmul	$s_1, s_4$	$n_2, n_3, n_5$	$s_1, s_4$	$n_2,n_3,n_5$
Coprime	$s_1, s_3$	$n_2, n_4, n_5$	$s_1, s_3$	$n_2, n_4, n_5$
Copy	$s_1, s_3$	$n_2, n_4$	$s_1, s_3$	$n_2, n_4$
Copy_row_from_table	$s_3, s_4$	$n_1, n_2, n_5$	$s_3, s_4$	$n_1, n_2, n_5$
Copy_row_from_table_16_neon	83	$n_1, n_2, n_4$	83	$n_1, n_2, n_4$
Copy_row_from_table_32_neon	$s_3$	$n_1, n_2, n_4$	83	$n_1, n_2, n_4$
Copy_row_from_table_8n_neon	83,84	$n_1, n_2, n_5$	83,84	$n_1, n_2, n_5$
Ctd Ctz	81	$n_2$	S <sub>1</sub> S <sub>1</sub>	$n_2$
Demont	$s_1$ $s_1$	$n_2 \\ n_2, n_3, n_4$	81 81	$n_2, n_3, n_4$
Digit	81	$n_2, n_3$	81	$n_2, n_3$
Digitsize	$s_1$	$n_2$	$s_1$	$n_2$
Divmod10	$s_1$	$n_2$	$s_1$	$n_2$
Emontredc	$s_1$	$n_2, n_3, n_4$	$s_1$	$n_2, n_3, n_4$
Eq	$s_1, s_3$	$n_2, n_4$	$s_1, s_3$	$n_2, n_4$
Even	$s_1$	$n_2$		$s_1, n_2$
Ge	$s_1, s_3$	$n_2,n_4$	$s_1, s_3$	$n_2, n_4$
<u>G</u> t	$s_1, s_3$	$n_2,n_4$	$s_1, s_3$	$n_2, n_4$
Iszero	$s_1$	$n_2$	81	$n_2$
Le	$s_1, s_3$	$n_2, n_4$	$s_1, s_3$	$n_2, n_4$
Lt Madd	81,83	$n_2, n_4$	81,83	$n_2, n_4$
Modadd	$s_1, s_3, s_5 \\ s_1$	$n_2, n_4, n_6$	$s_1, s_3, s_5 \\ s_1$	$n_2, n_4, n_6 \ n_2, n_3, n_4, n_5$
Moddouble	$s_1$	$n_2, n_3, n_4, n_5 \ n_2, n_3, n_4$	$s_1$	$n_2, n_3, n_4, n_5$
Modifier	$s_1$	$n_2, n_3, n_4$	$s_1$	$n_2, n_3, n_4$
Modinv	81	$n_2, n_3, n_4, n_5$	81	$n_2, n_3, n_4, n_5$
Modoptneg	$s_1$	$n_2, n_3, n_4, n_5$	81	$n_2, n_3, n_4, n_5$
Modsub	$s_1$	$n_2, n_3, n_4, n_5$	$s_1$	$n_2, n_3, n_4, n_5$
Montifier	$s_1$	$n_2, n_3, n_4$	81	$n_2, n_3, n_4$
Montmul	$s_1$	$n_2, n_3, n_4, n_5$	$s_1$	$n_2, n_3, n_4, n_5$
Montredc	$s_1, s_3, s_6$	$n_2, n_4, n_5$	$s_1, s_3, s_6$	$n_2,n_4,n_5$
Montsqr	$s_1$	$n_2,n_3,n_4$	$s_1$	$n_2, n_3, n_4$
Mul	$s_1, s_3, s_5$	$n_2, n_4, n_6$	$s_1, s_3, s_5$	$n_2, n_4, n_6$
Muladd10 Mux	81	$n_2, n_3$	81	$n_2, n_3$
Mux16	$s_2$ $s_1$	$n_1, n_3, n_4, n_5$	82	$n_1, n_3, n_4, n_5$
Negmodinv	81	$n_2, n_3, n_4$	S <sub>1</sub> S <sub>1</sub>	$n_2, n_3, n_4$
Nonzero	81	$n_2, n_3 \\ n_2$	81	$n_2, n_3$ $n_2$
Normalize	$s_1$	$n_2$	$s_1$	$n_2$
Odd	$s_1$	$n_2$	-1	$s_1, n_2$
Of_word	$s_1$	$n_2, n_3$	$s_1$	$n_2, n_3$
Optadd	$s_1$	$n_2, n_3, n_4, n_5$	81	$n_2, n_3, n_4, n_5$
Optneg	$s_1$	$n_2, n_3, n_4$	$s_1$	$n_2, n_3, n_4$
Optsub	$s_1$	$n_2, n_3, n_4, n_5$	$s_1$	$n_2, n_3, n_4, n_5$
Optsubadd	81	$n_2, n_3, n_4, n_5$	81	$n_2, n_3, n_4, n_5$
Pow2	$s_1$	$n_2, n_3$	81	$n_2, n_3$
Shl_small	$s_1, s_3$	$n_2, n_4, n_5$	$s_1, s_3$	$n_2, n_4, n_5$
Shr_small	81,83	$n_2, n_4, n_5$	81	$s_3, n_2, n_4, n_5$
Sqr Sub	81,83	$n_2, n_4$	$s_1, s_3$	$n_2, n_4$
Word_bytereverse	$s_1, s_3, s_5$	$n_2, n_4, n_6$	$s_1$	$s_3, s_5, n_2, n_4, n_6$
Word_clz		$n_1 \\ n_1$		$n_1 \\ n_1$
Word_ctz		$n_1$		$n_1$
Word_ctz Word_divstep59		$n_1, n_2, n_3, n_4$		$n_1, n_2, n_3, n_4$
Word_max		$n_1, n_2, n_3, n_4$ $n_1, n_2$		$n_1, n_2, n_3, n_4$
Word_min		$n_1, n_2$		$n_1, n_2$
Word_negmodinv		$n_1$		$n_1$
		$n_1$		$n_1$
Word_recip		101		101



# Verified that the S2N-Bignum library is timing side-channel free for data input variables

https://github.com/awslabs/s2n-bignum

#### Conclusion