

Winter 2016
COMP-250: Introduction
to Computer Science

Lecture 3, January 19, 2016

COMP-250 Weekly Schedule

Omar MC-102	Faizy TR-3110	DavidB-R TR-3110	Thu 10:00 Thu 10:30 Thu 11:00	Chris TR-3110
Mon 11:30	Tue 11:30	Wed 11:30	Thu 11:30	Fri 11:30
Faiz TR-3110	Tue 12:00 Tue 12:30	DoYeon TR-3110	Thu 12:00 Thu 12:30	Claude MC-110N
Mon 13:30	Claude ST-SI/4	DavidB TR-3110	Claude ST-SI/4	
Mon 14:00				
Mon 14:30	Tue 14:30		Thu 14:30	
Mon 15:00	Tue 15:00	Wed 15:00	Hardik TR-3110	Fri 15:00
Mon 15:30	Tue 15:30	Wed 15:30		Fri 15:30
Mon 16:00	Tue 16:00	Wed 16:00		Fri 16:00

MC=MCENG

ST=STBIO

TR=TRENG

Analysis of Algorithms

Analysis of Addition

carry = 0

for $i = 0$ to $N - 1$ **do**

$r[i] \leftarrow (a[i] + b[i] + \textit{carry}) \% 10$

$\textit{carry} \leftarrow (a[i] + b[i] + \textit{carry}) / 10$

end for

$r[N] \leftarrow \textit{carry}$

Analysis of Addition

```
cst { carry = 0
      for  $i = 0$  to  $N - 1$  do
           $r[i] \leftarrow (a[i] + b[i] + \textit{carry}) \% 10$ 
           $\textit{carry} \leftarrow (a[i] + b[i] + \textit{carry}) / 10$ 
      end for
       $r[N] \leftarrow \textit{carry}$ 
```

Analysis of Addition

```
cst { carry = 0
      for  $i = 0$  to  $N - 1$  do
cst {  $r[i] \leftarrow (a[i] + b[i] + \textit{carry}) \% 10$ 
       $\textit{carry} \leftarrow (a[i] + b[i] + \textit{carry}) / 10$ 
      end for
       $r[N] \leftarrow \textit{carry}$ 
```

Analysis of Addition

linear { **cst** { $carry = 0$
for $i = 0$ to $N - 1$ **do**
 cst { $r[i] \leftarrow (a[i] + b[i] + carry) \% 10$
 $carry \leftarrow (a[i] + b[i] + carry) / 10$
 end for
 $r[N] \leftarrow carry$

Analysis of Addition

linear { **cst** { $carry = 0$
for $i = 0$ to $N - 1$ **do**
 cst { $r[i] \leftarrow (a[i] + b[i] + carry) \% 10$
 $carry \leftarrow (a[i] + b[i] + carry) / 10$
 end for
cst { $r[N] \leftarrow carry$

Analysis of Addition

linear { **cst** { *carry* = 0
 for *i* = 0 to *N* - 1 **do**
 cst { *r*[*i*] ← (*a*[*i*] + *b*[*i*] + *carry*) % 10
 carry ← (*a*[*i*] + *b*[*i*] + *carry*) / 10
 end for
 cst { *r*[*N*] ← *carry*

$$\text{Time}(N) = C_1 + C_2 \times N$$

Analysis of Multiplication

```
for  $j = 0$  to  $N - 1$  do  
   $carry \leftarrow 0$   
  for  $i = 0$  to  $N - 1$  do  
     $prod \leftarrow (a[i] * b[j] + carry)$   
     $tmp[j][i + j] \leftarrow prod \% 10$   
     $carry \leftarrow prod / 10$   
  end for  
   $tmp[j][N + j] \leftarrow carry$   
end for
```

Analysis of Multiplication

```
for  $j = 0$  to  $N - 1$  do
  cst {  $carry \leftarrow 0$ 
    for  $i = 0$  to  $N - 1$  do
       $prod \leftarrow (a[i] * b[j] + carry)$ 
       $tmp[j][i + j] \leftarrow prod \% 10$ 
       $carry \leftarrow prod / 10$ 
    end for
     $tmp[j][N + j] \leftarrow carry$ 
  end for
```

Analysis of Multiplication

```
for  $j = 0$  to  $N - 1$  do
  cst {  $carry \leftarrow 0$ 
    for  $i = 0$  to  $N - 1$  do
      cst {
         $prod \leftarrow (a[i] * b[j] + carry)$ 
         $tmp[j][i + j] \leftarrow prod \% 10$ 
         $carry \leftarrow prod / 10$ 
      }
    end for
     $tmp[j][N + j] \leftarrow carry$ 
  }
end for
```

Analysis of Multiplication

```
for  $j = 0$  to  $N - 1$  do
  cst {  $carry \leftarrow 0$ 
  {
    for  $i = 0$  to  $N - 1$  do
      cst {
         $prod \leftarrow (a[i] * b[j] + carry)$ 
         $tmp[j][i + j] \leftarrow prod \% 10$ 
         $carry \leftarrow prod / 10$ 
      }
    end for
     $tmp[j][N + j] \leftarrow carry$ 
  }
end for
```

Linear

Analysis of Multiplication

```
for  $j = 0$  to  $N - 1$  do
  cst { $carry \leftarrow 0$ 
  for  $i = 0$  to  $N - 1$  do
    Linear {
      cst {
         $prod \leftarrow (a[i] * b[j] + carry)$ 
         $tmp[j][i + j] \leftarrow prod \% 10$ 
         $carry \leftarrow prod / 10$ 
      }
    }
  end for
  cst { $tmp[j][N + j] \leftarrow carry$ 
end for
```

Analysis of Multiplication

quadratic

linear

```
for  $j = 0$  to  $N - 1$  do
  cst {  $carry \leftarrow 0$ 
  for  $i = 0$  to  $N - 1$  do
    cst {  $prod \leftarrow (a[i] * b[j] + carry)$ 
     $tmp[j][i + j] \leftarrow prod \% 10$ 
     $carry \leftarrow prod / 10$ 
  }
  end for
  cst {  $tmp[j][N + j] \leftarrow carry$ 
end for
```

Analysis of Multiplication

```
carry ← 0
for  $i = 0$  to  $2 * N - 1$  do
    sum ← carry
    for  $j = 0$  to  $N - 1$  do
        sum ← sum + tmp[ $j$ ][ $i$ ]
    end for
     $r[i]$  ← sum % 10
    carry ← sum / 10
end for
 $r[2 * N]$  ← carry
```


Analysis of Multiplication

```
cst {  
    carry ← 0  
    for  $i = 0$  to  $2 * N - 1$  do  
        sum ← carry  
        for  $j = 0$  to  $N - 1$  do  
            sum ← sum + tmp[ $j$ ][ $i$ ]  
        end for  
         $r[i]$  ← sum%10  
        carry ← sum/10  
    end for  
     $r[2 * N]$  ← carry
```

Analysis of Multiplication

```
cst {  
    carry ← 0  
    for i = 0 to 2 * N - 1 do  
        cst {  
            sum ← carry  
            for j = 0 to N - 1 do  
                sum ← sum + tmp[j][i]  
            end for  
            r[i] ← sum%10  
            carry ← sum/10  
        end for  
    r[2 * N] ← carry
```

Analysis of Multiplication

```
cst {  
    carry ← 0  
    for i = 0 to 2 * N - 1 do  
        cst {  
            sum ← carry  
            for j = 0 to N - 1 do  
                cst { sum ← sum + tmp[j][i]  
            end for  
            r[i] ← sum%10  
            carry ← sum/10  
        end for  
    r[2 * N] ← carry
```

Analysis of Multiplication

```
cst {  
    carry ← 0  
    for i = 0 to 2 * N - 1 do  
        cst {  
            sum ← carry  
            for j = 0 to N - 1 do  
                cst { sum ← sum + tmp[j][i]  
            end for  
            r[i] ← sum%10  
            carry ← sum/10  
        end for  
    r[2 * N] ← carry
```

Linear {

Analysis of Multiplication

```
cst {  
    carry ← 0  
    for i = 0 to 2 * N - 1 do  
        cst {  
            sum ← carry  
            for j = 0 to N - 1 do  
                cst { sum ← sum + tmp[j][i]  
            end for  
        end for  
        cst {  
            r[i] ← sum%10  
            carry ← sum/10  
        end for  
    r[2 * N] ← carry
```

Linear {

Analysis of Multiplication

quadratic {

linear {

cst {

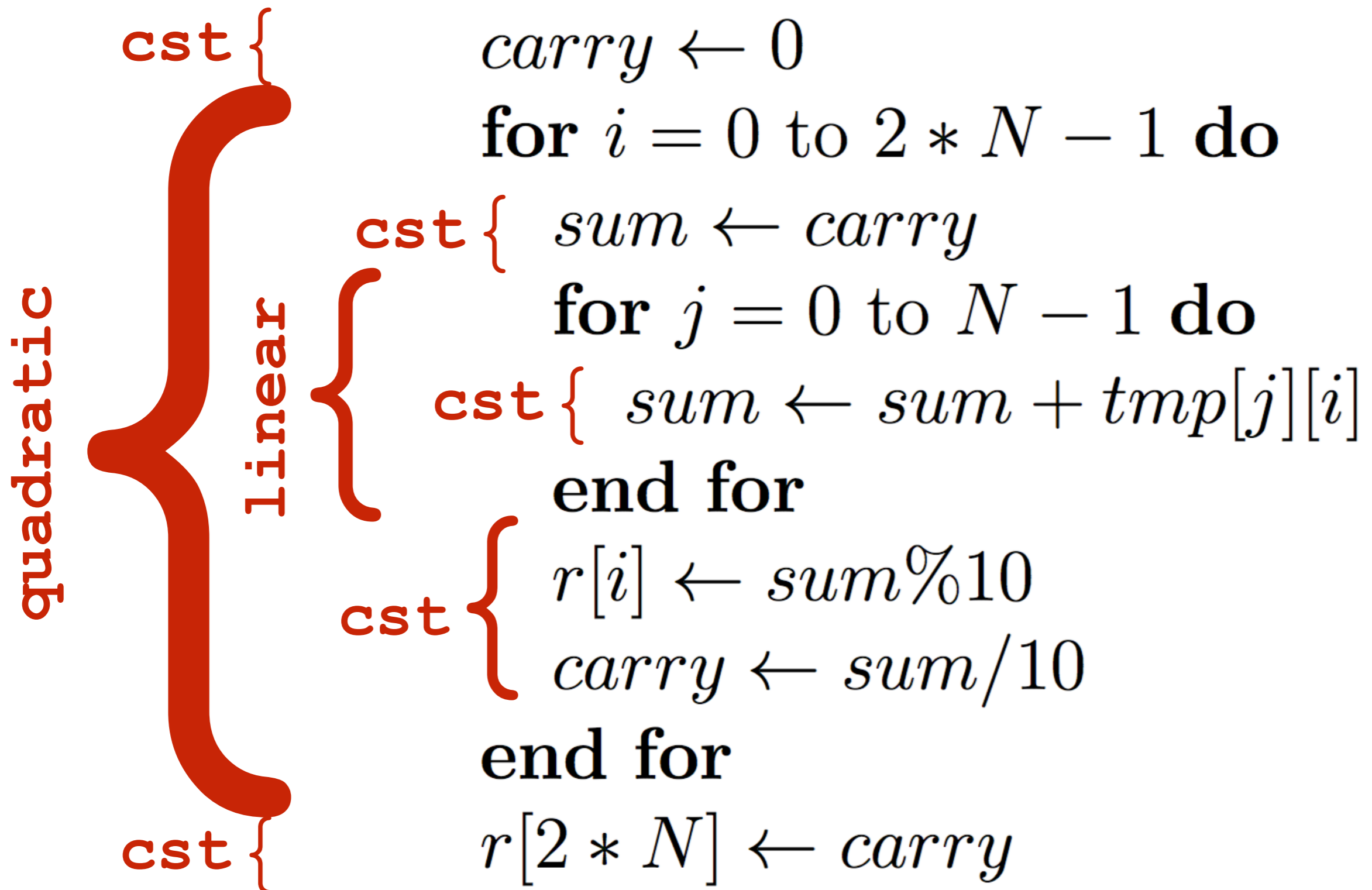
```
carry ← 0
for i = 0 to 2 * N - 1 do
  cst {
    sum ← carry
    for j = 0 to N - 1 do
      cst { sum ← sum + tmp[j][i]
    end for
  }
  cst {
    r[i] ← sum%10
    carry ← sum/10
  }
end for
r[2 * N] ← carry
```

}

}

}

Analysis of Multiplication



Analysis of Algorithms

Algorithm 2 Multiplication (base 10) of two numbers a and b

```
for  $j = 0$  to  $N - 1$  do
   $carry \leftarrow 0$ 
  for  $i = 0$  to  $N - 1$  do
     $prod \leftarrow (a[i] * b[j] + carry)$ 
     $tmp[j][i + j] \leftarrow prod \% 10$ 
     $carry \leftarrow prod / 10$ 
  end for
   $tmp[j][N + j] \leftarrow carry$ 
end for
```

```
 $carry \leftarrow 0$ 
for  $i = 0$  to  $2 * N - 1$  do
   $sum \leftarrow carry$ 
  for  $j = 0$  to  $N - 1$  do
     $sum \leftarrow sum + tmp[j][i]$ 
  end for
   $r[i] \leftarrow sum \% 10$ 
   $carry \leftarrow sum / 10$ 
end for
 $r[2 * N] \leftarrow carry$ 
```

Analysis of Algorithms

Algorithm 2 Multiplication (base 10) of two numbers a and b

```
for  $j = 0$  to  $N - 1$  do
   $carry \leftarrow 0$ 
  for  $i = 0$  to  $N - 1$  do
     $prod \leftarrow (a[i] * b[j] + carry)$ 
     $tmp[j][i + j] \leftarrow prod \% 10$ 
     $carry \leftarrow prod / 10$ 
  end for
   $tmp[j][N + j] \leftarrow carry$ 
end for
```

```
 $carry \leftarrow 0$ 
for  $i = 0$  to  $2 * N - 1$  do
   $sum \leftarrow carry$ 
  for  $j = 0$  to  $N - 1$  do
     $sum \leftarrow sum + tmp[j][i]$ 
  end for
   $r[i] \leftarrow sum \% 10$ 
   $carry \leftarrow sum / 10$ 
end for
 $r[2 * N] \leftarrow carry$ 
```

$$\text{Time}(N) = C_1 + C_2 \times N + C_3 \times N^2$$

Analysis of Algorithms

Addition

$$\text{Time}(N) = c_1 + c_2 \times N$$

Multiplication

$$\text{Time}(N) = c_1 + c_2 \times N + c_3 \times N^2$$

Analysis of Algorithms

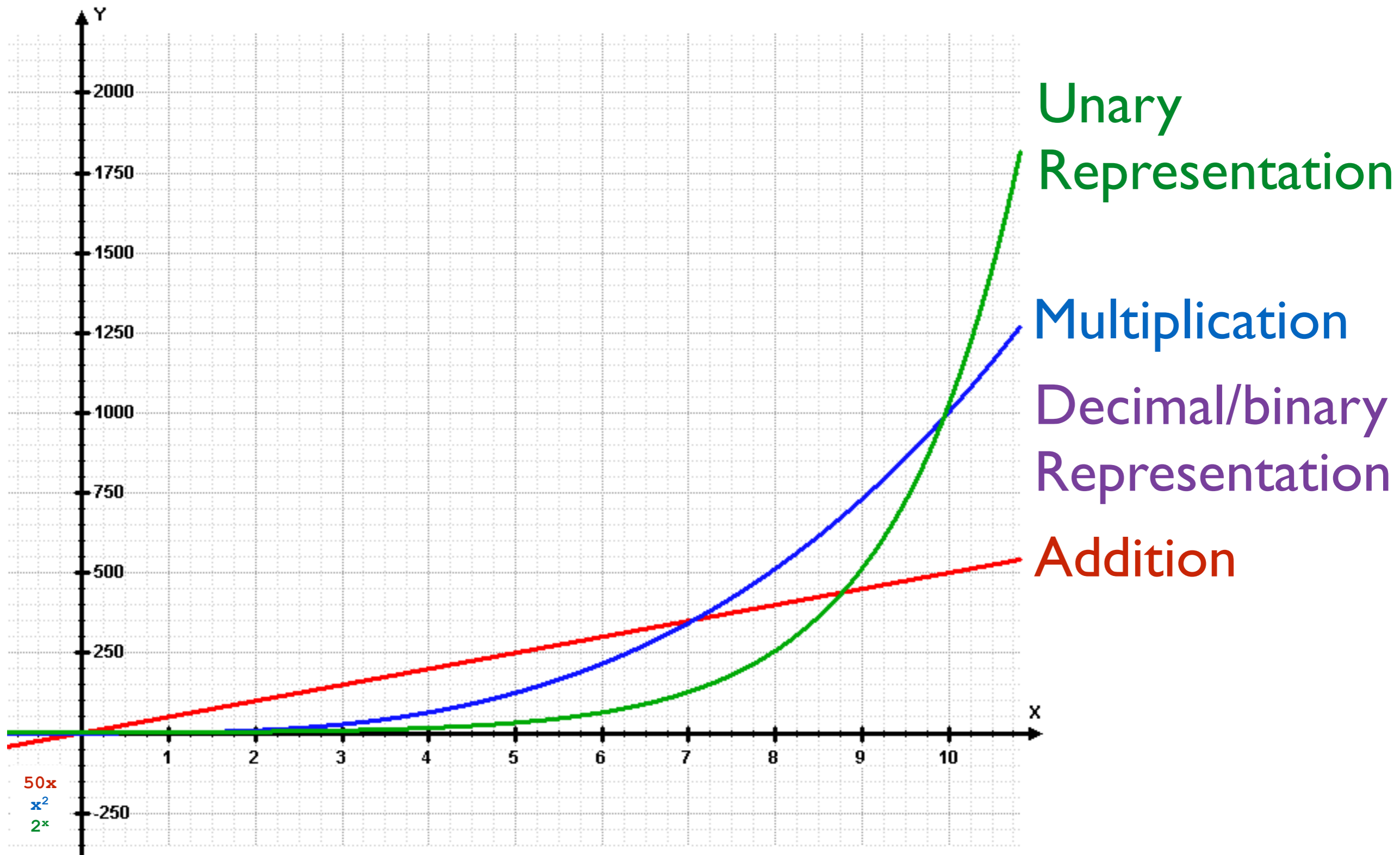
Addition

Time (N) **is** $O(N)$

Multiplication

Time (N) **is** $O(N^2)$

Analysis of Algorithms



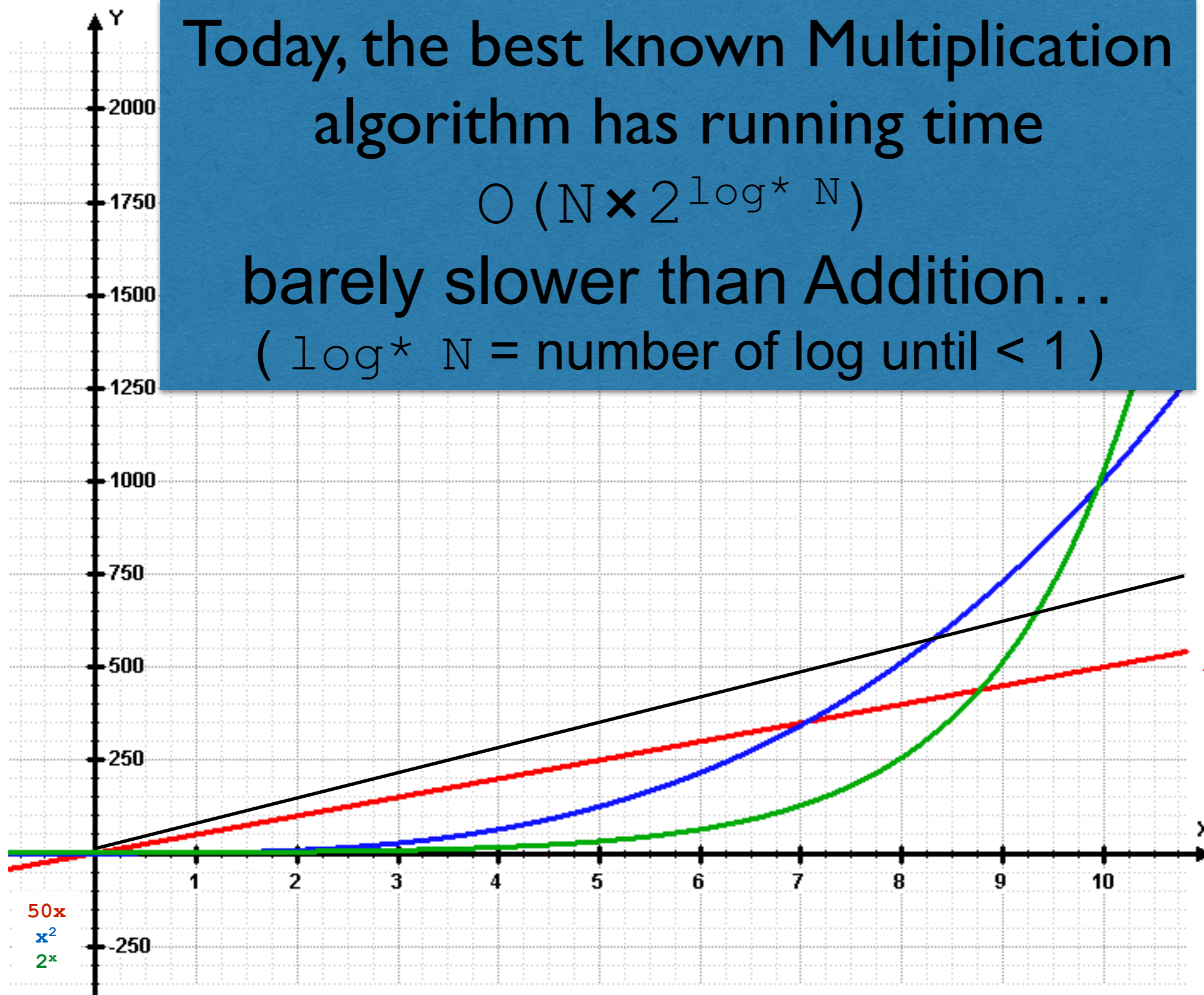
Analysis of Algorithms

Today, the best known Multiplication algorithm has running time

$$O(N \times 2^{\log^* N})$$

barely slower than Addition...

($\log^* N$ = number of log until < 1)



Multiplication
Multiplication
Multiplication
Multiplication
Multiplication
Addition

Bases and Binary Representation

Base 8 vs Base 2

$(2143)_8$

$= (????)_2$

Base 8 vs Base 2

$$\begin{array}{c} (2143)_8 \\ \swarrow \quad \searrow \quad \swarrow \quad \searrow \\ = (010 \ 001 \ 100 \ 101)_2 \\ = (10001100101)_2 \end{array}$$

Base 2 vs Base 8

$$\begin{aligned} & (10010010101010101)_2 \\ = & (10 \ 010 \ 010 \ 101 \ 010 \ 101)_2 \\ & = (2 \ 2 \ 2 \ 5 \ 2 \ 5)_8 \\ & = (222525)_8 \end{aligned}$$

Base 2 vs Base 10

$$\begin{aligned} & (100100101010101)_2 \\ = & (65536 + 8192 + 1024 + 256 + 64 + 16 + 4 + 1)_{10} \\ & = (75093)_{10} \end{aligned}$$

Powers of 2 in Base 10

$$2^0=1$$

$$2^1=2$$

$$2^2=4$$

$$2^3=8$$

$$2^4=16$$

$$2^5=32$$

$$2^6=64$$

$$2^7=128$$

$$2^8=256$$

$$2^9=512$$

$$2^{10}=1024$$

$$2^{11}=2048$$

$$2^{12}=4096$$

$$2^{13}=8192$$

$$2^{14}=16384$$

$$2^{15}=32768$$

$$2^{16}=65536$$

$$2^{32} = 4294967296$$

Powers of 10 in Base 2

$$10^0 = 1$$

$$10^1 = 1010$$

$$10^2 = 1100110$$

$$10^3 = 1111101000 \approx 2^{10}$$

$$10^4 = 10011100010000$$

Base 10 vs Base 2

$$\begin{aligned} & (75093)_{10} \\ = & (111 * 10011100010000 \\ & \quad + 101 * 111101000 \\ & \quad \quad + 1001 * 1010 \\ & \quad \quad \quad + 101)_{2} \\ = & (100100101010101)_{2} \end{aligned}$$

to Base 2

Algorithm 3 Convert integer to binary

INPUT: a number m

OUTPUT: the number m expressed in base 2 using a bit array $b[]$

$i \leftarrow 0$

while $m > 0$ **do**

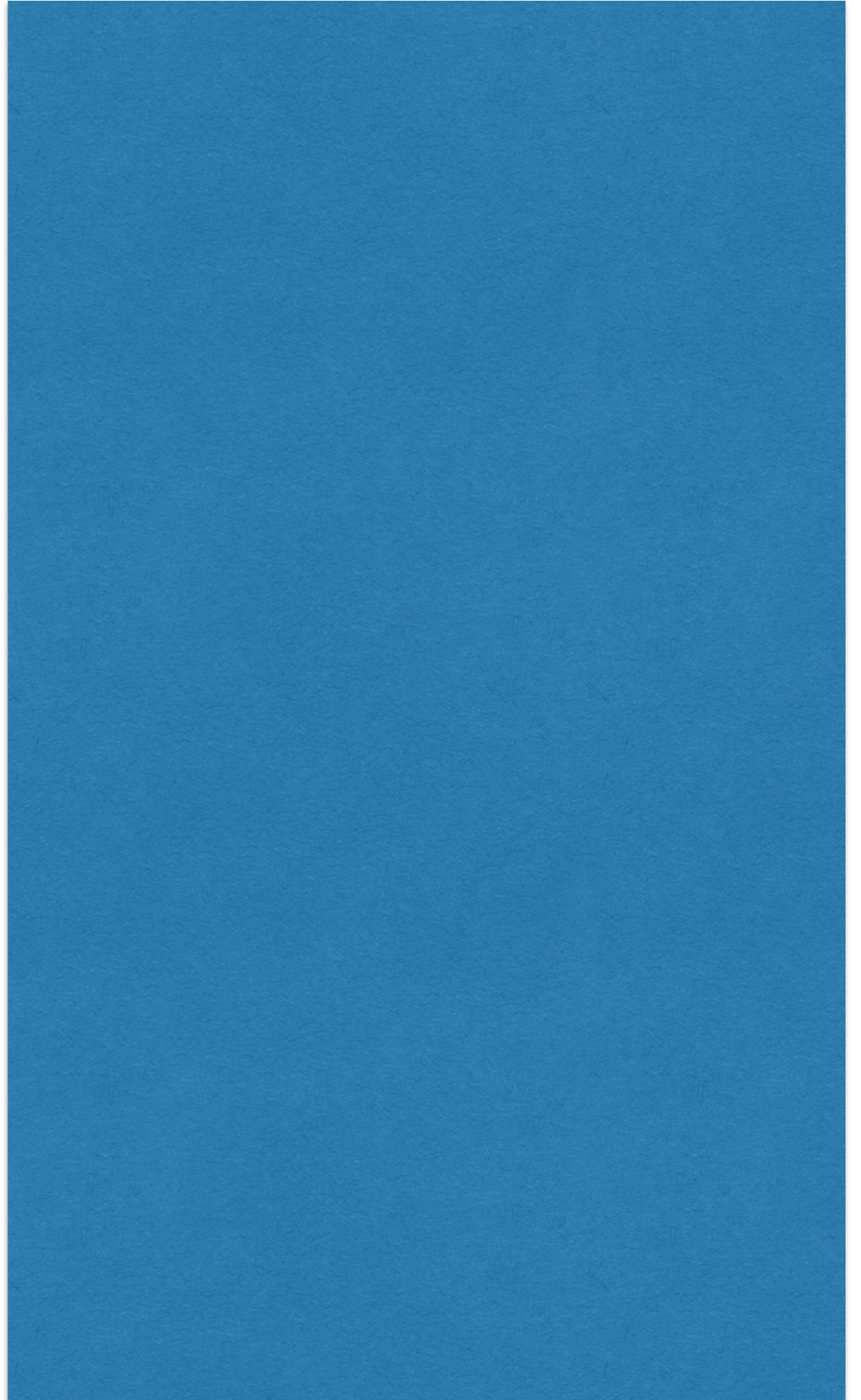
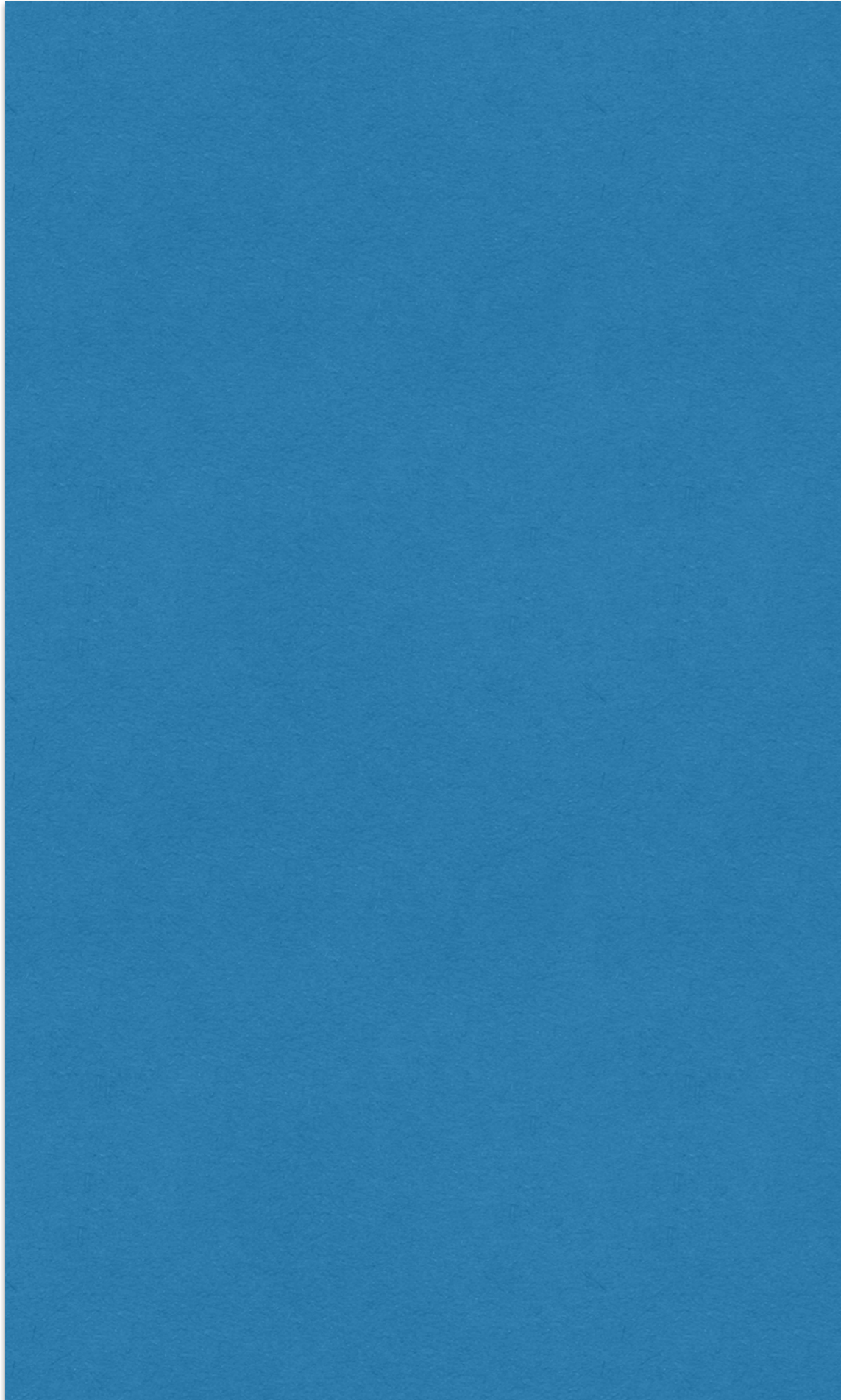
$b[i] \leftarrow m \% 2$

$m \leftarrow m / 2$

$i \leftarrow i + 1$

end while

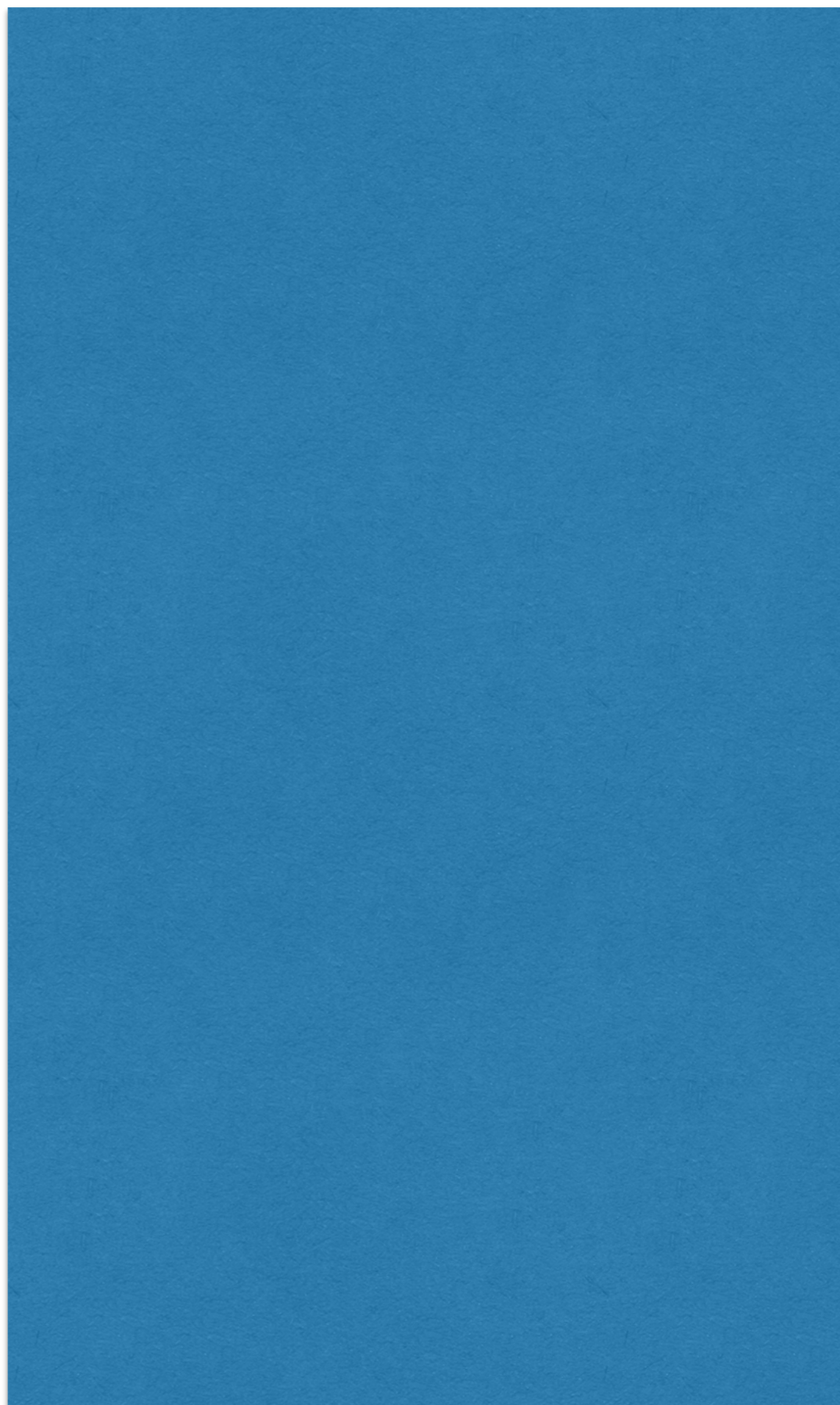
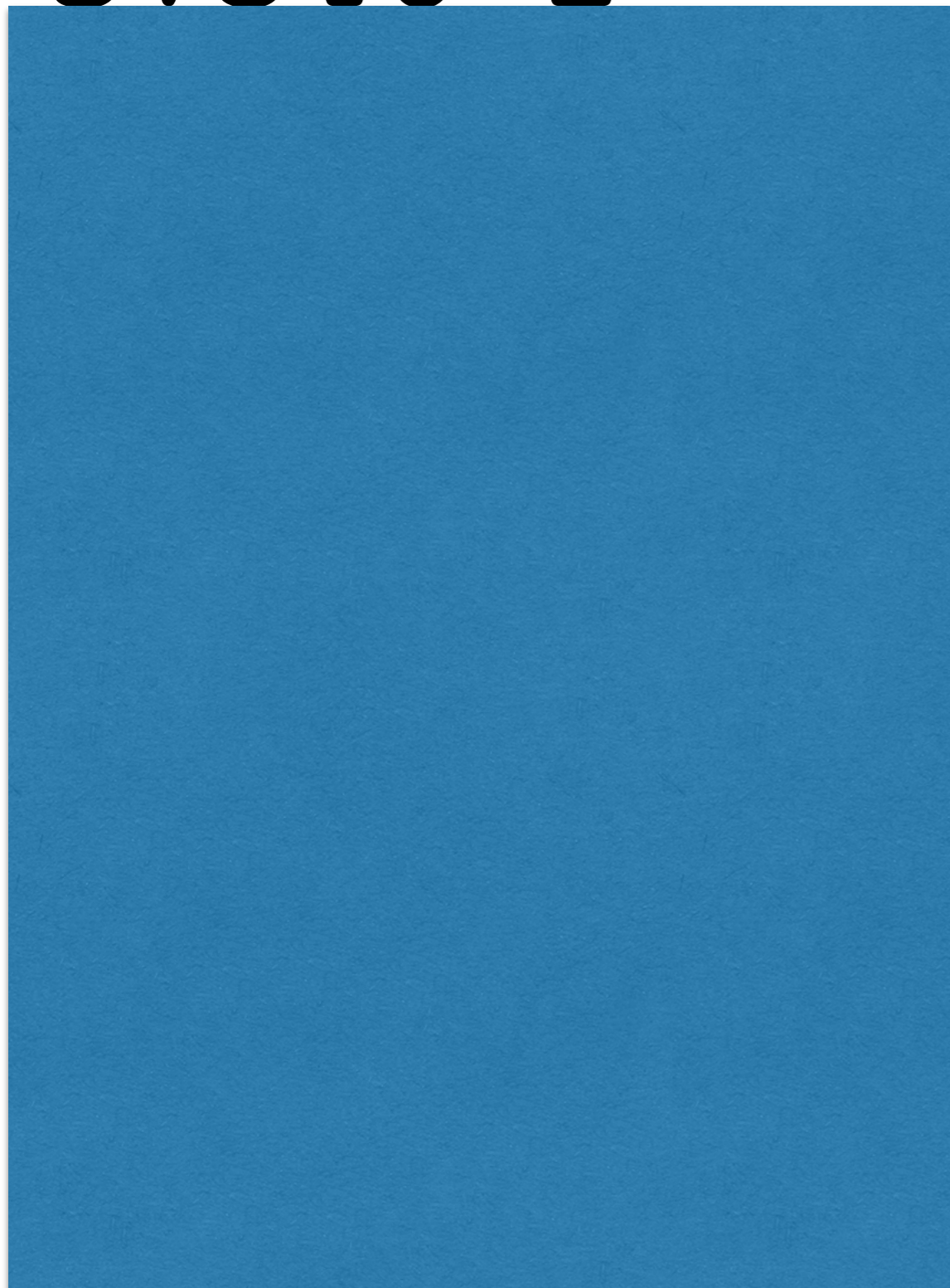
75093



75093

/2 %2

37546 1

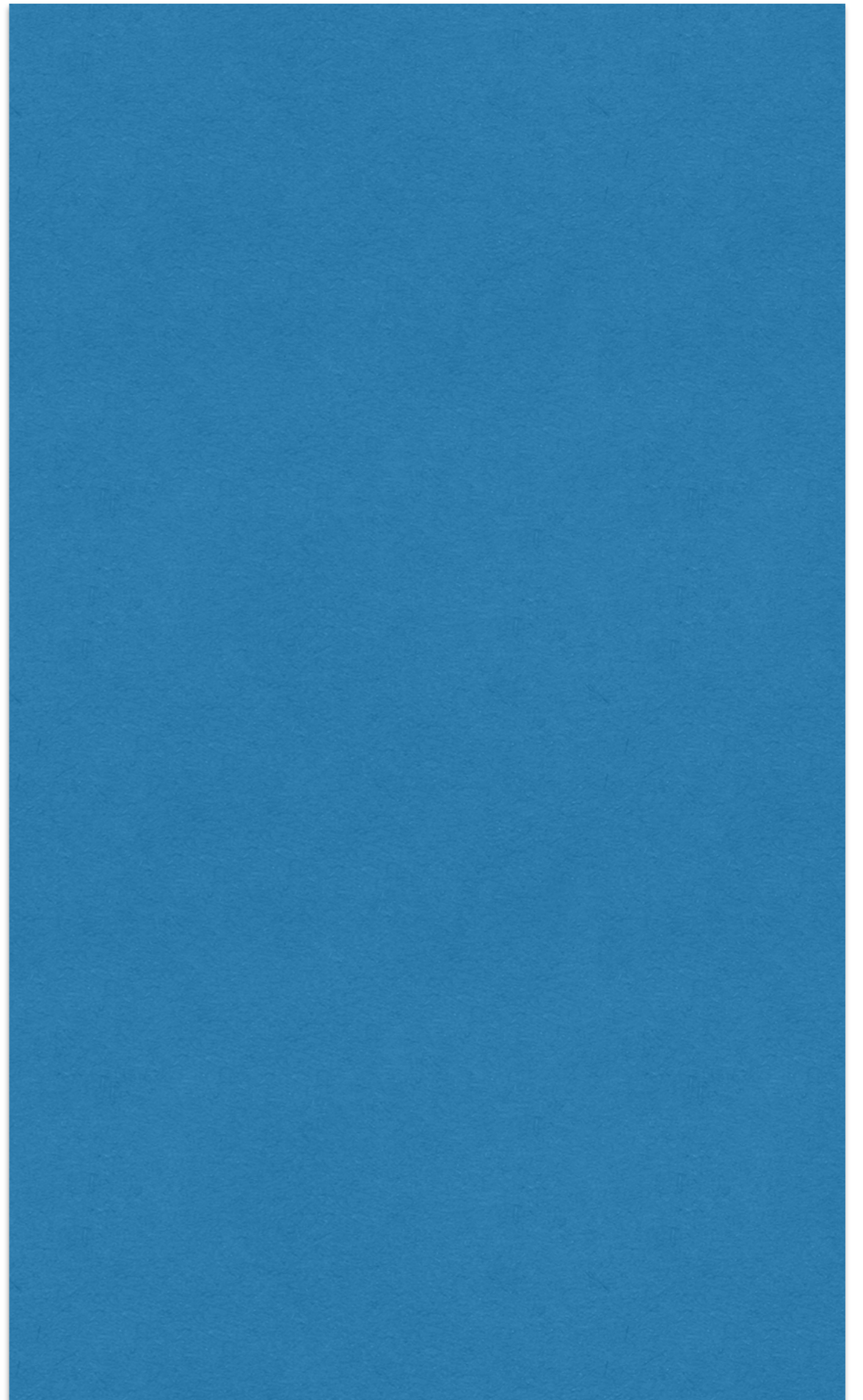
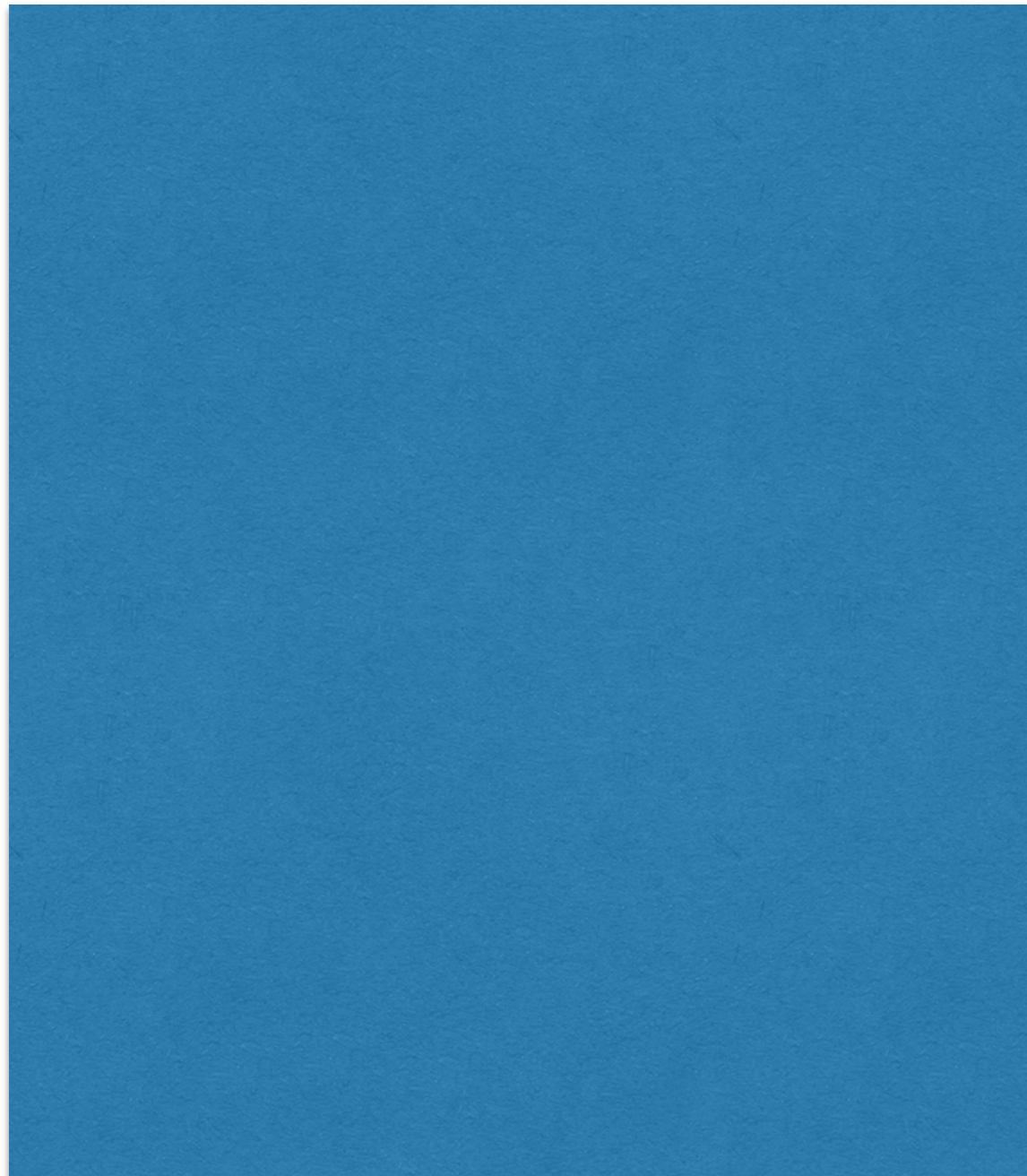


75093

/2 %2

37546 1

18773 0



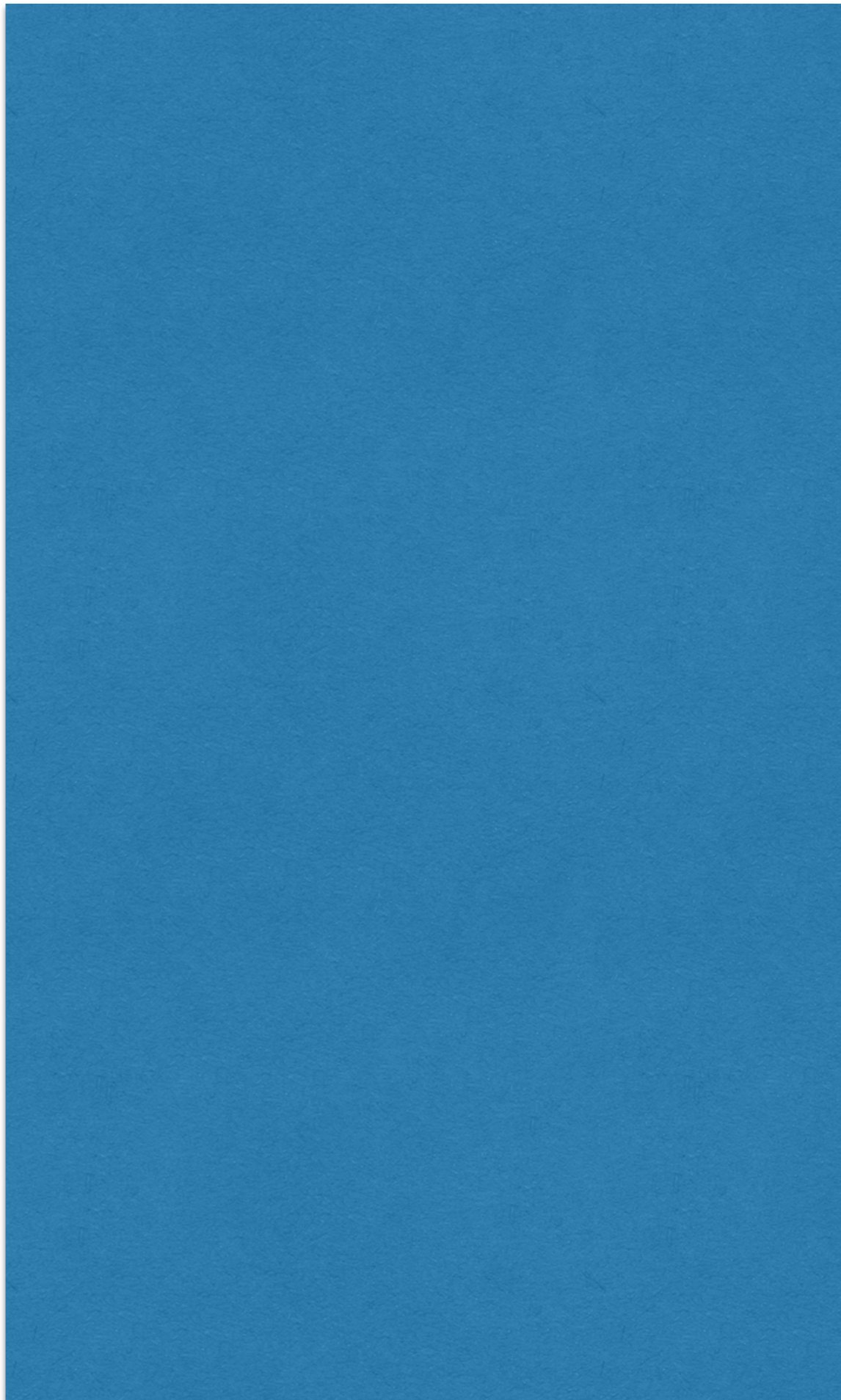
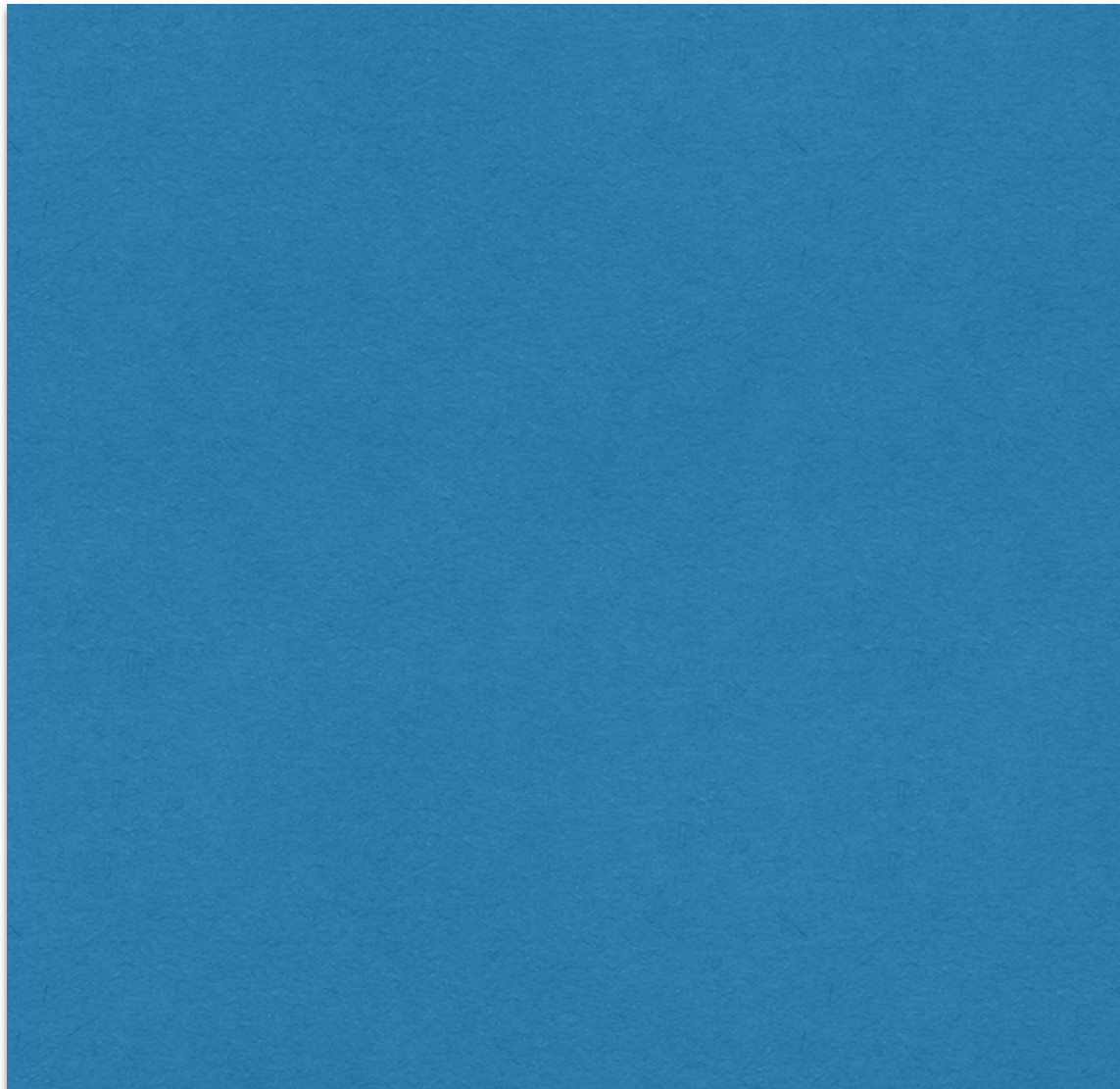
75093

/2 %2

37546 1

18773 0

9386 1



75093

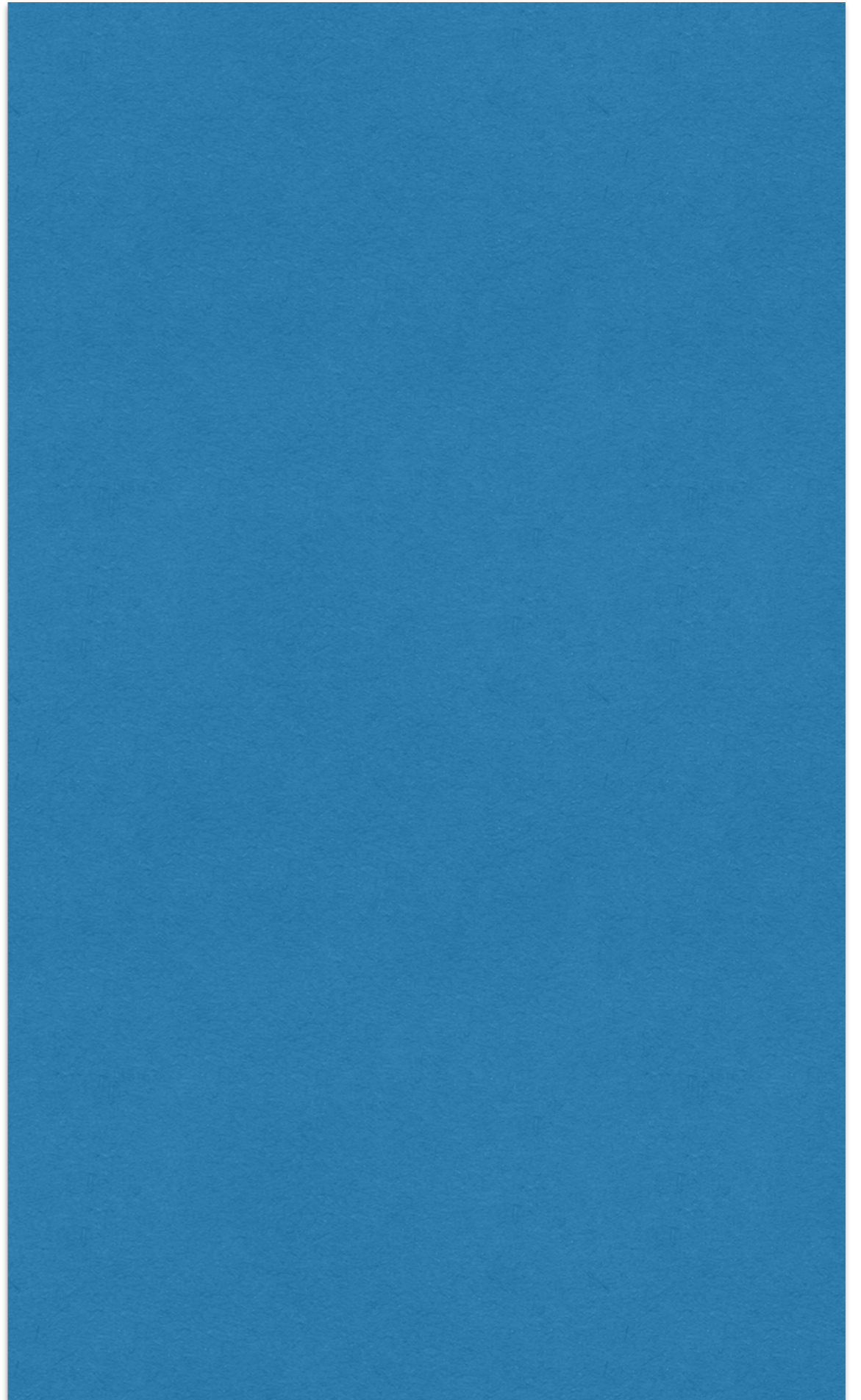
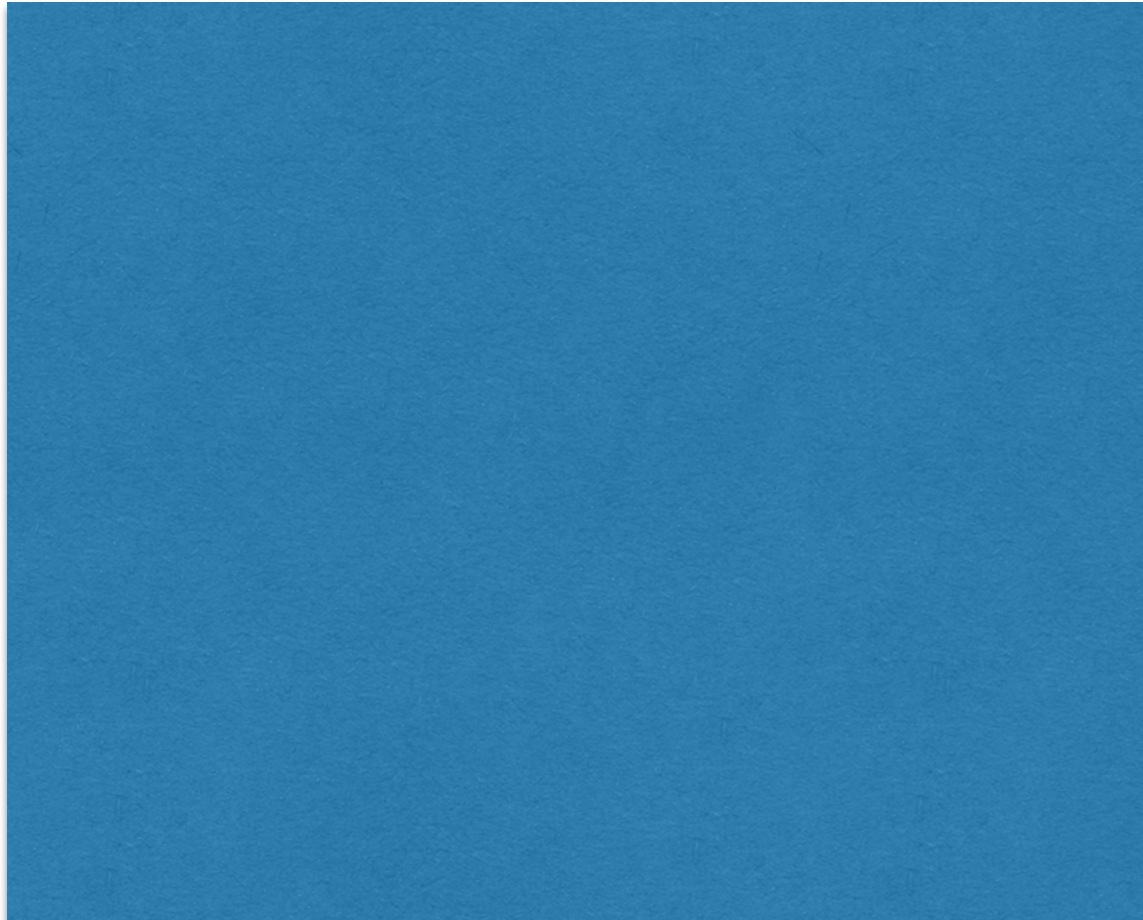
/2 %2

37546 1

18773 0

9386 1

4693 0



75093

/2 %2

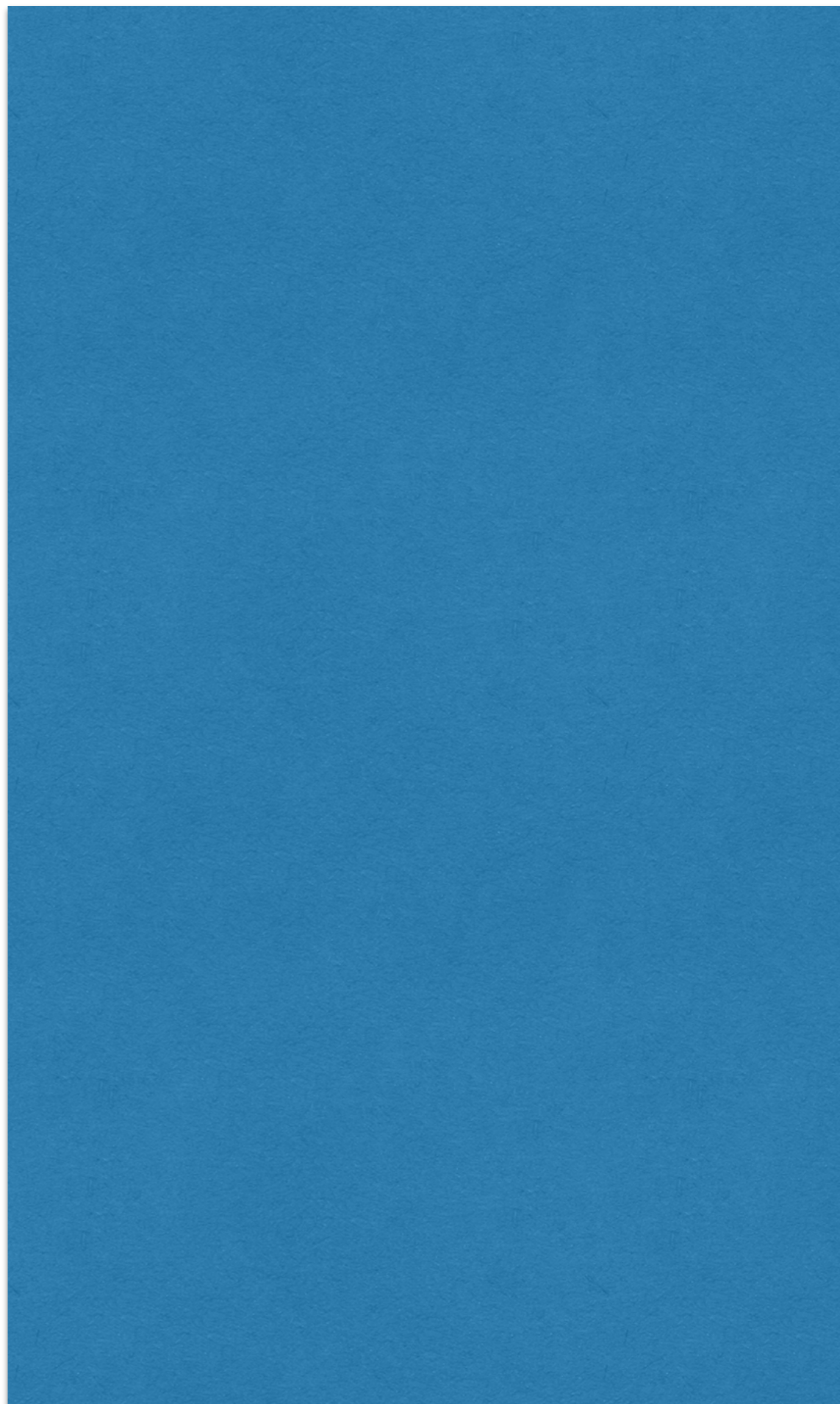
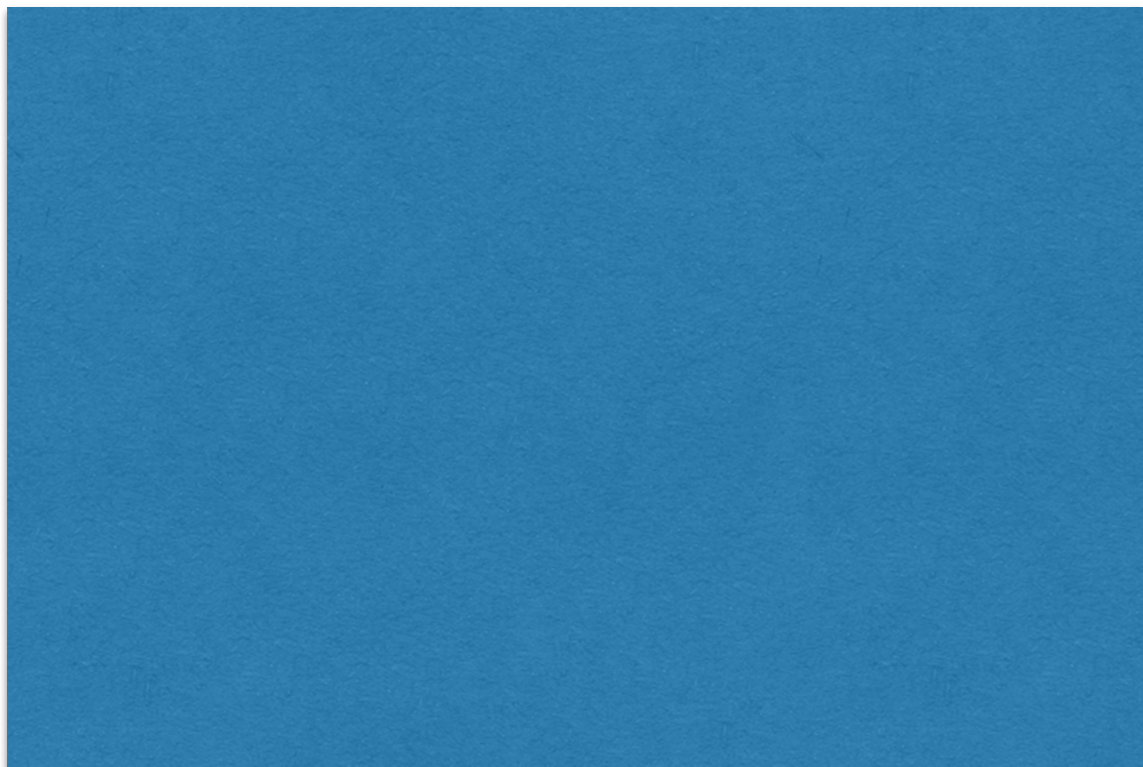
37546 1

18773 0

9386 1

4693 0

2346 1



75093

/2 %2

37546 1

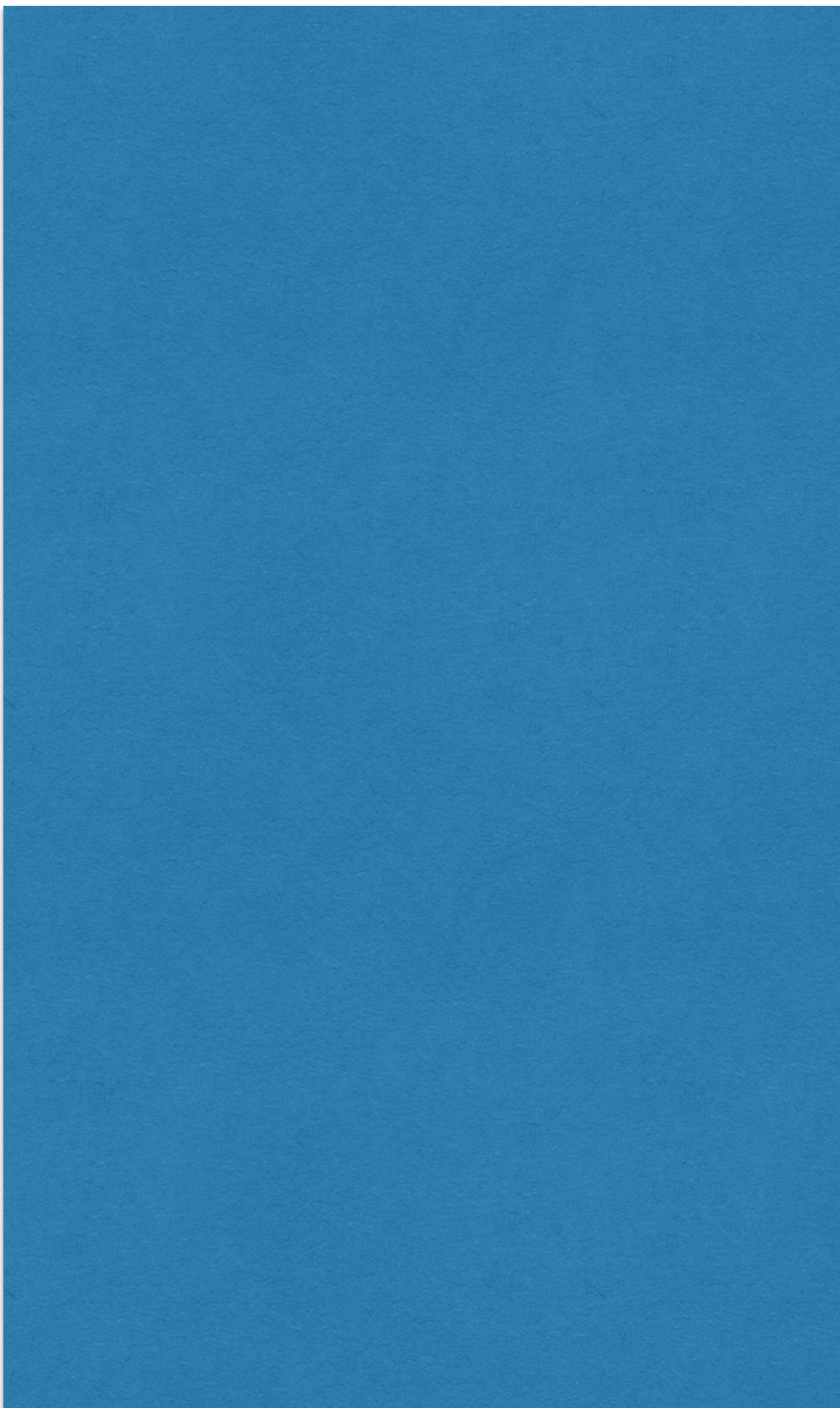
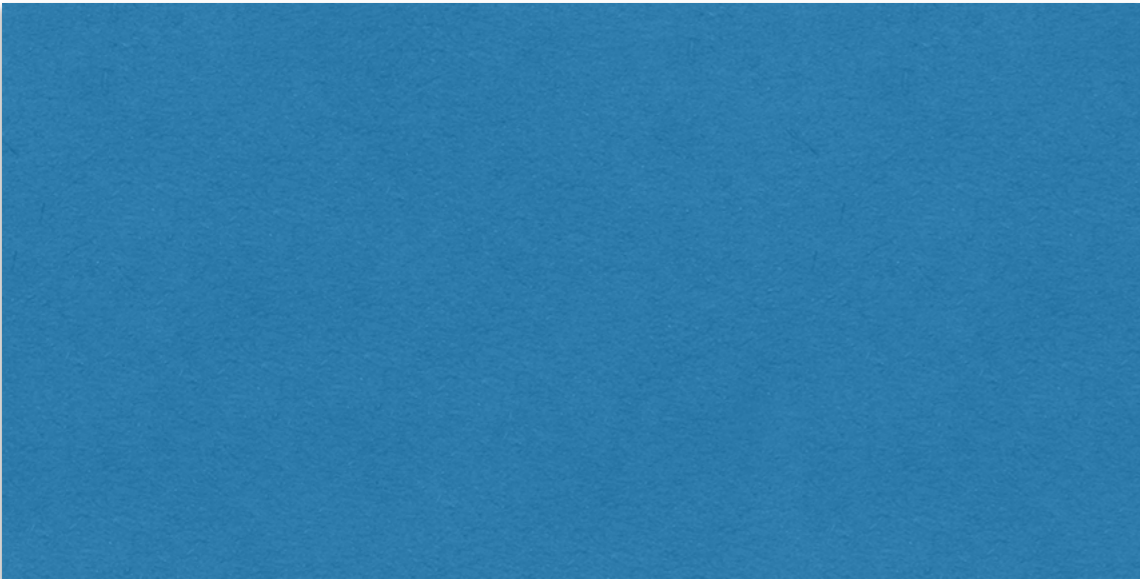
18773 0

9386 1

4693 0

2346 1

1173 0



75093

/2 %2

37546 1

18773 0

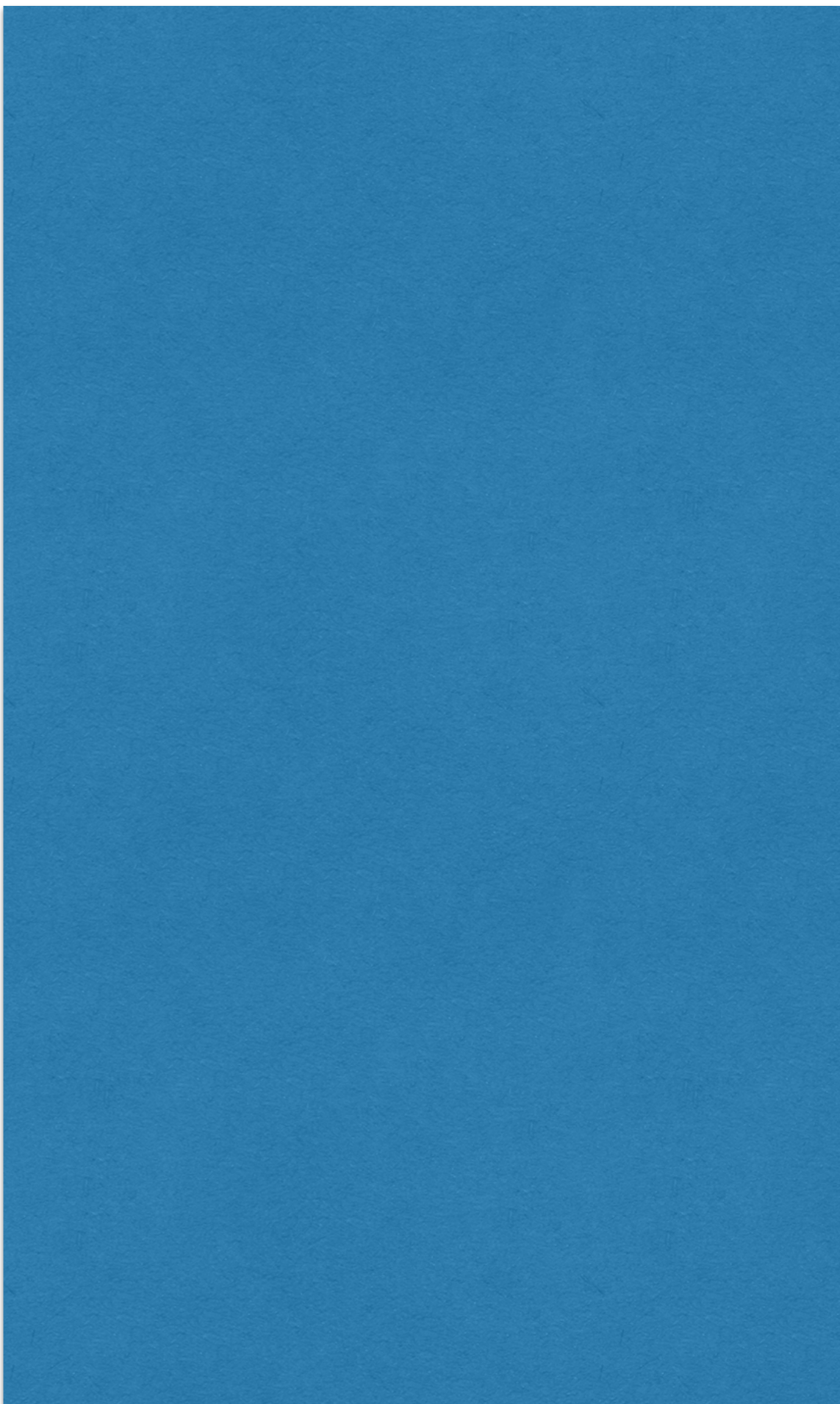
9386 1

4693 0

2346 1

1173 0

586 1



75093

/2 %2

37546 1

18773 0

9386 1

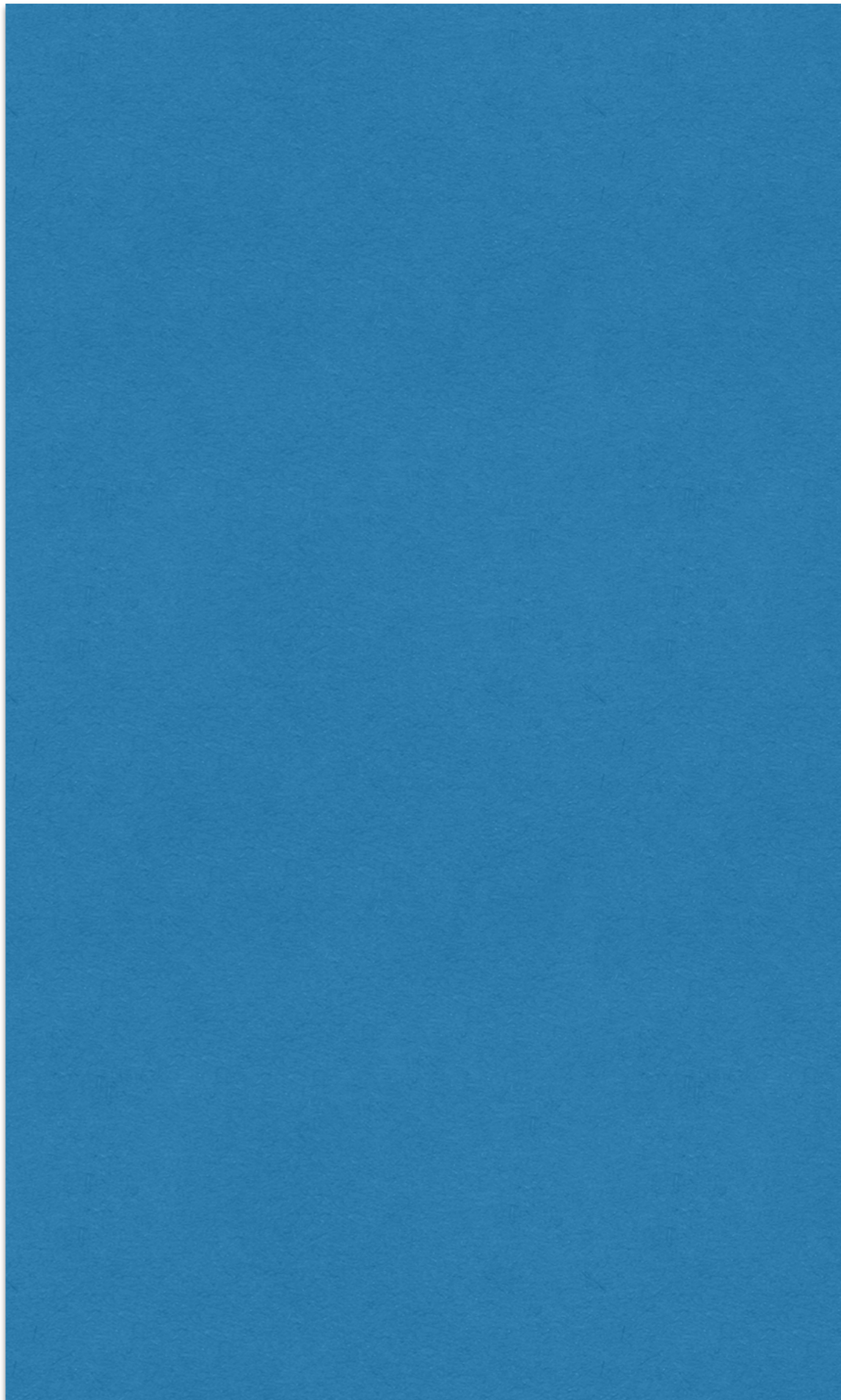
4693 0

2346 1

1173 0

586 1

293 0



75093

/2 %2

37546 1

18773 0

9386 1

4693 0

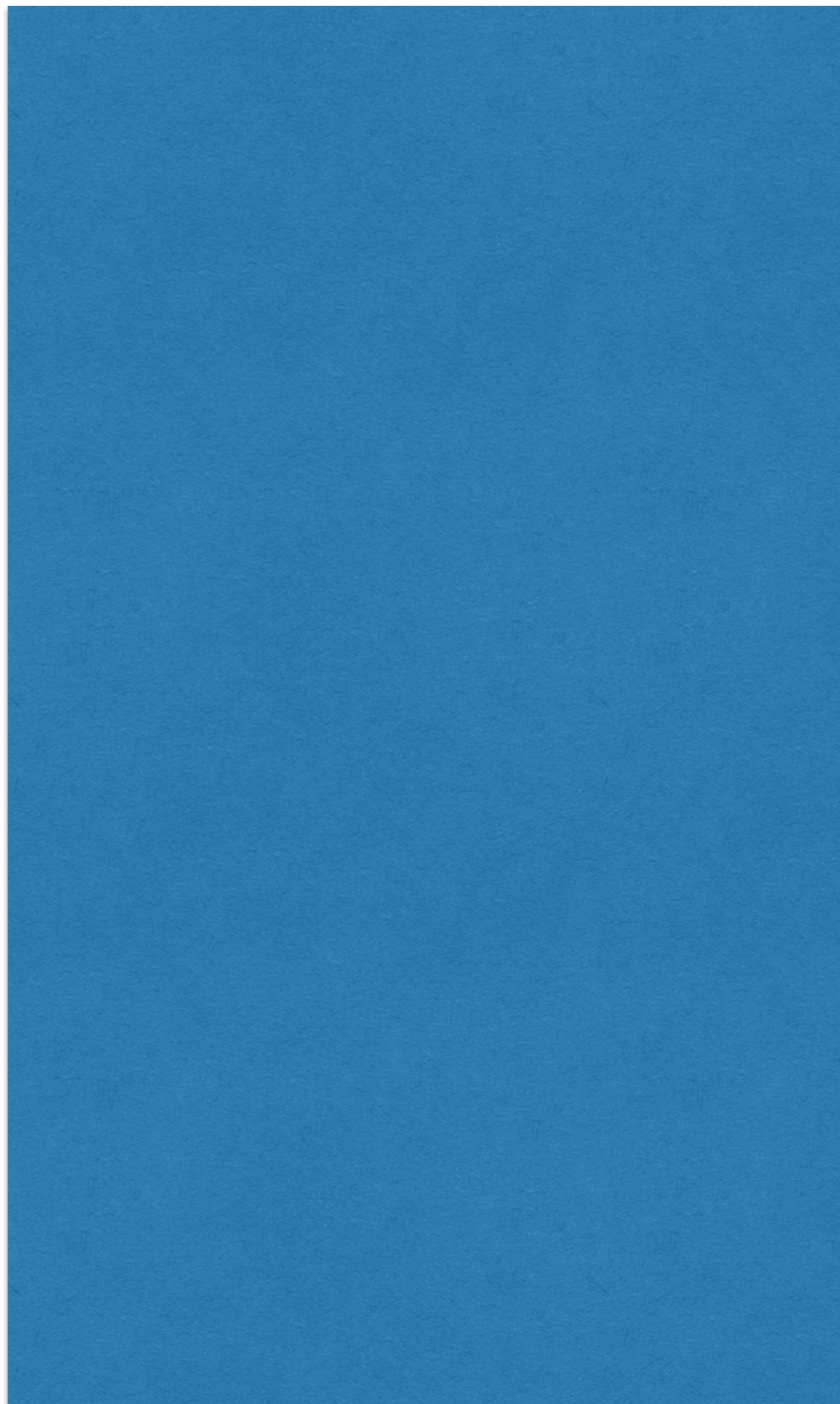
2346 1

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146 1



75093

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37546 1

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9386 1

4693 0

2346 1

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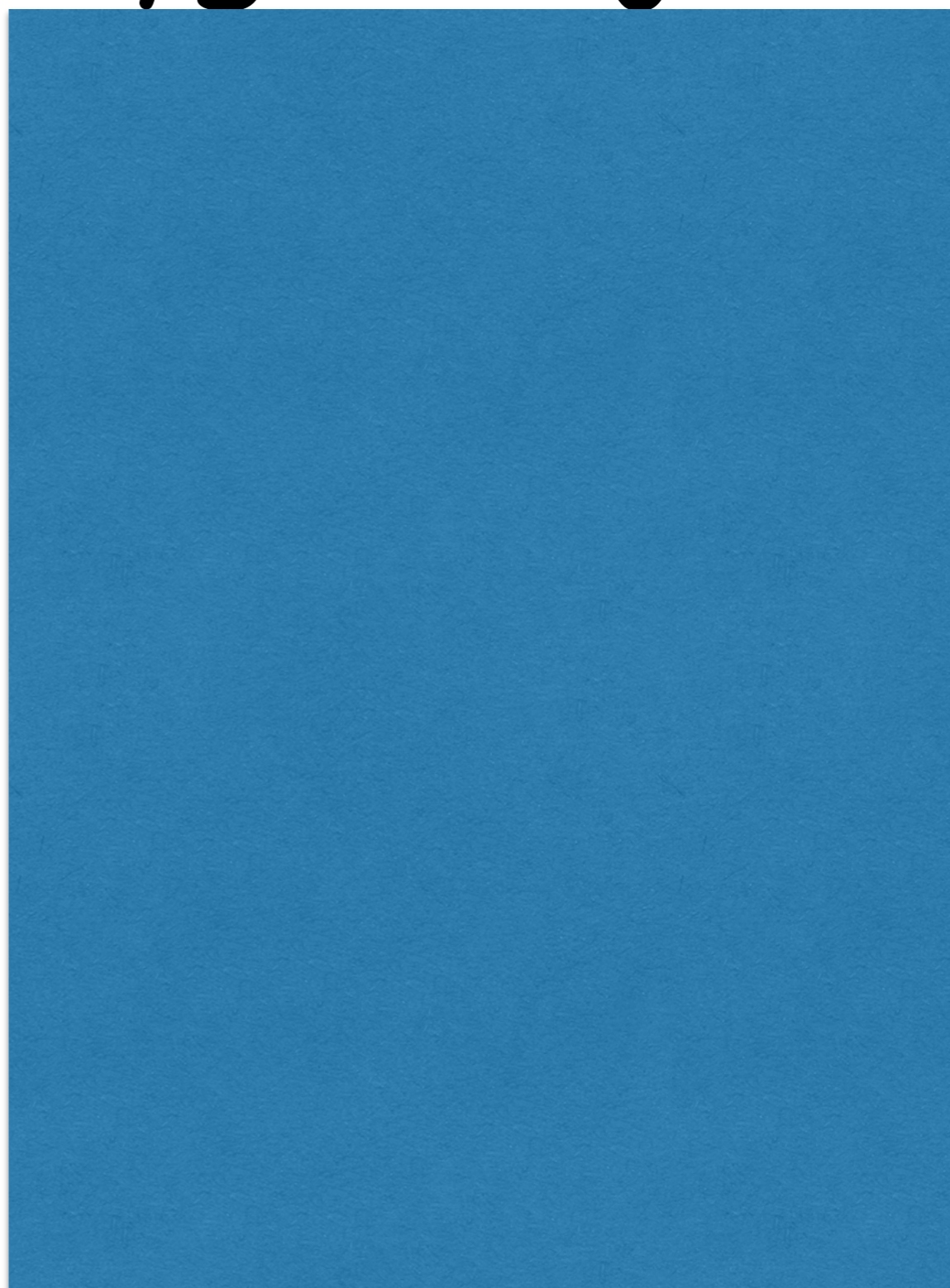
586 1

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37546 1

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586 1

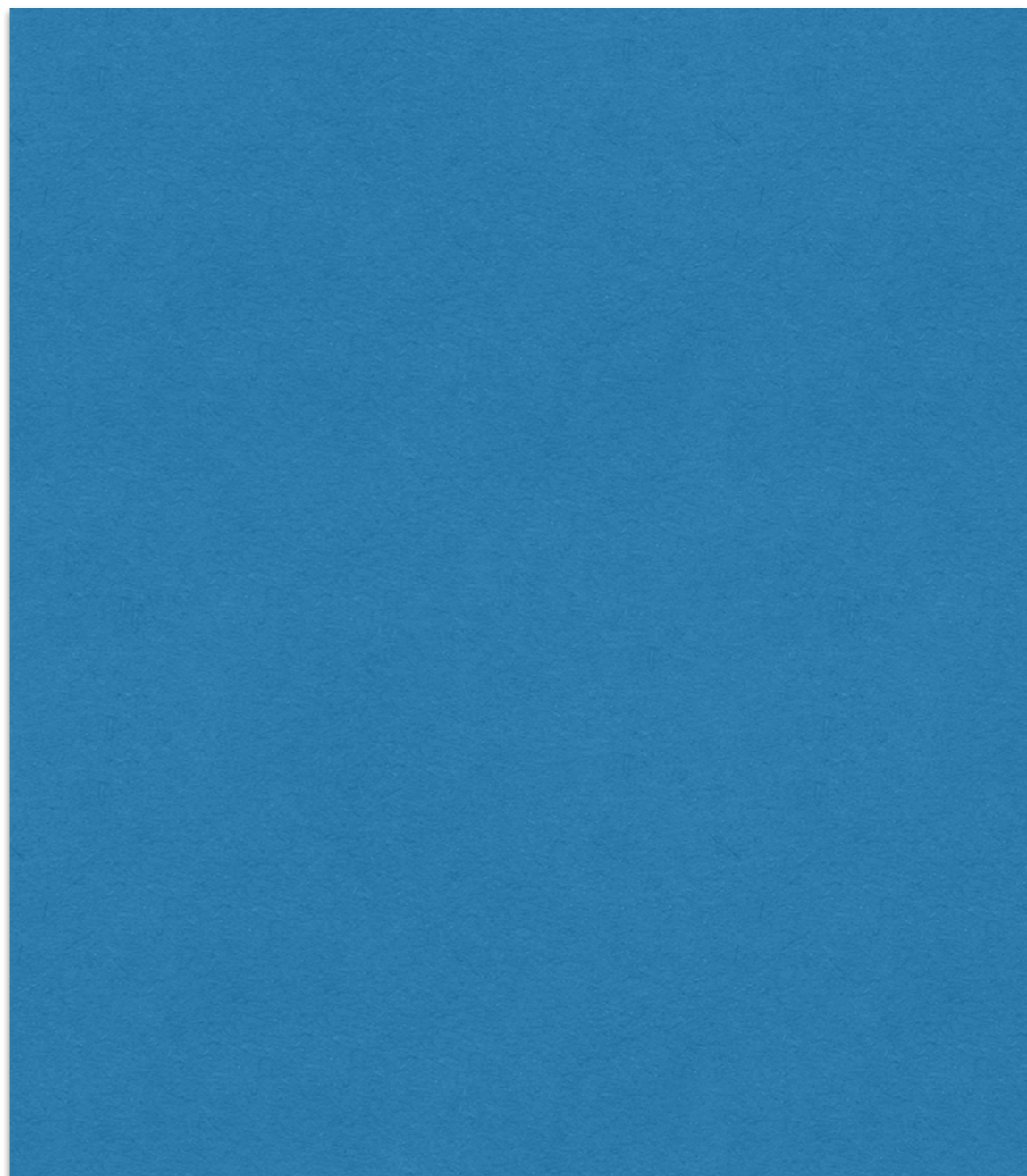
293 0

146 1

/2 %2

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37546 1

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9386 1

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2346 1

1173 0

586 1

293 0

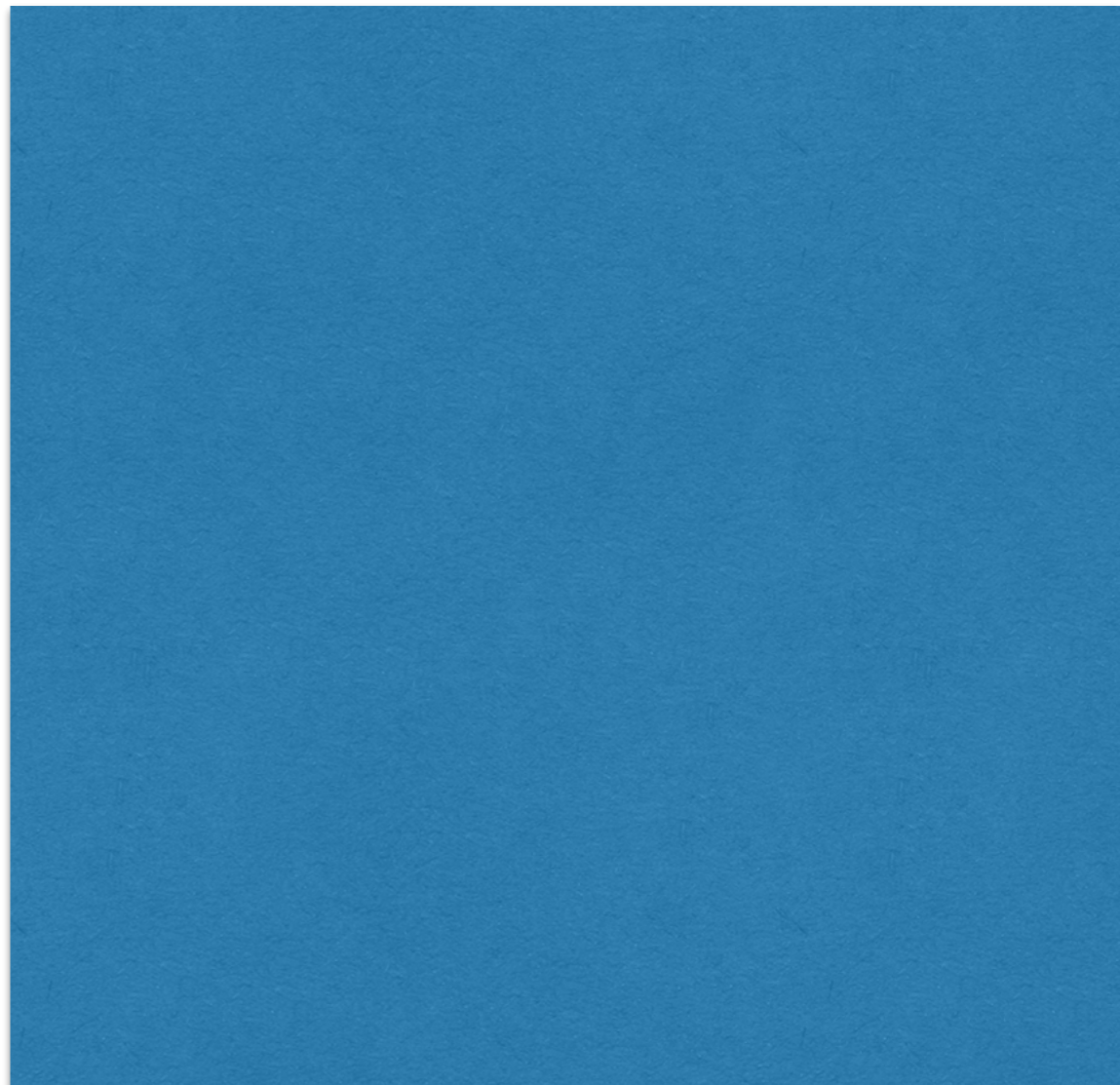
146 1

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37546 1

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9386 1

4693 0

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1173 0

586 1

293 0

146 1

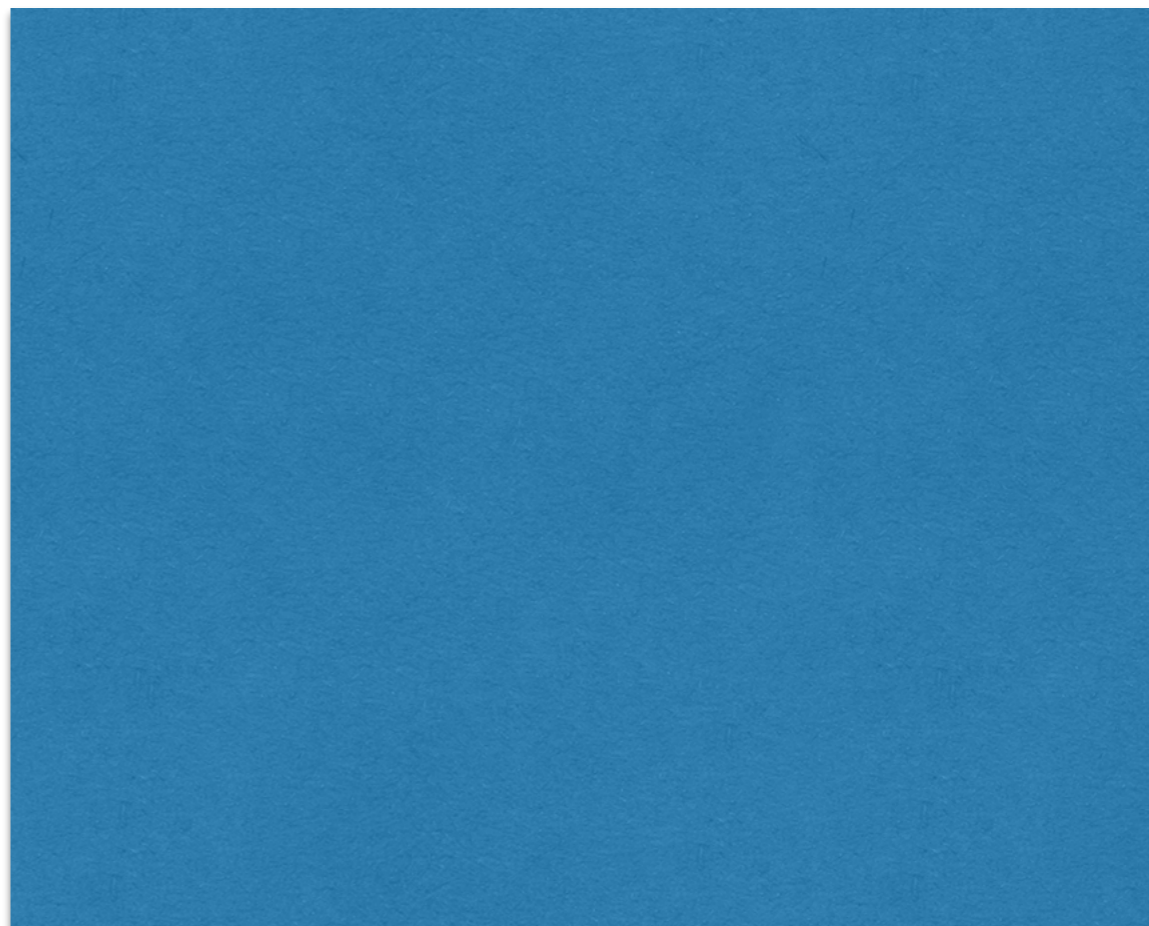
/2 %2

73 0

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18 0

9 0



75093

/2 %2

37546 1

18773 0

9386 1

4693 0

2346 1

1173 0

586 1

293 0

146 1

/2 %2

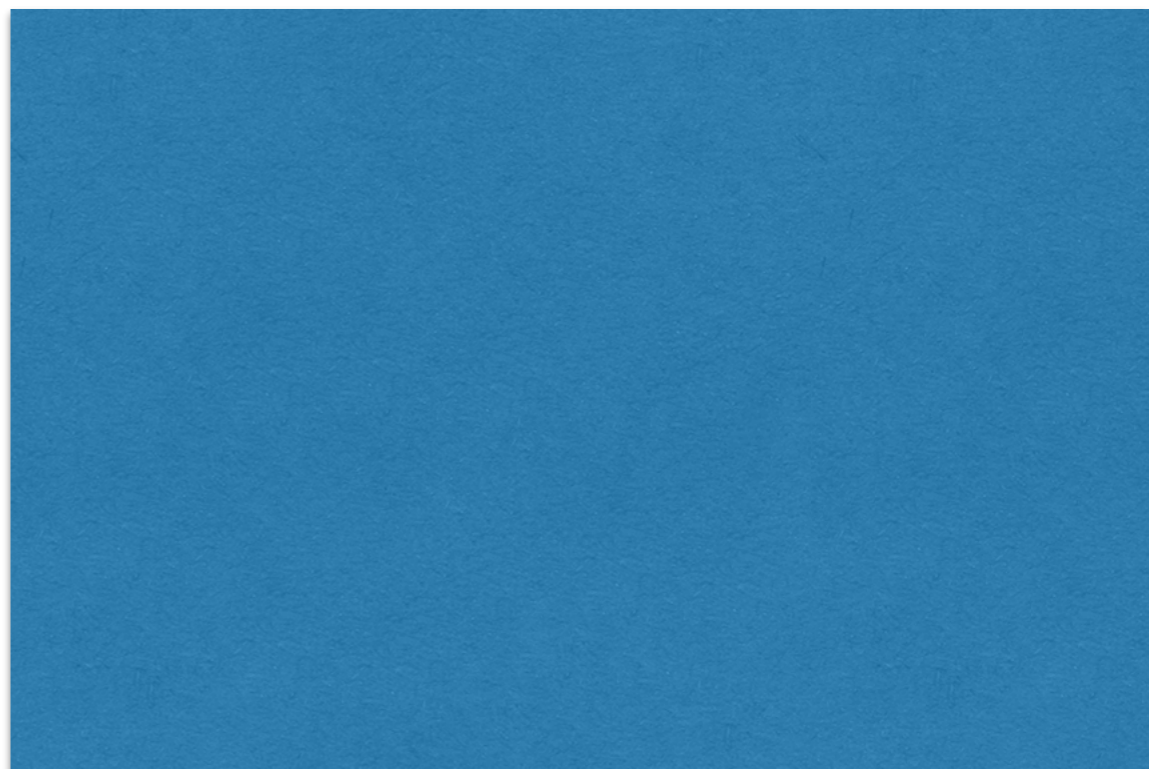
73 0

36 1

18 0

9 0

4 1



75093

/2 %2

37546 1

18773 0

9386 1

4693 0

2346 1

1173 0

586 1

293 0

146 1

/2 %2

73 0

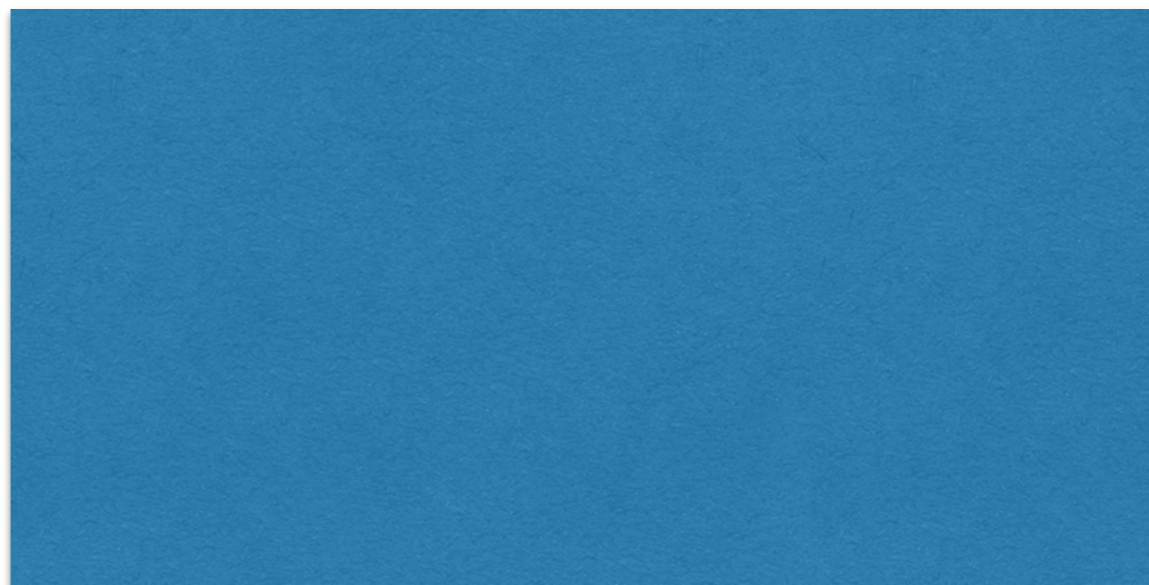
36 1

18 0

9 0

4 1

2 0



75093

/2 %2

37546 1

18773 0

9386 1

4693 0

2346 1

1173 0

586 1

293 0

146 1

/2 %2

73 0

36 1

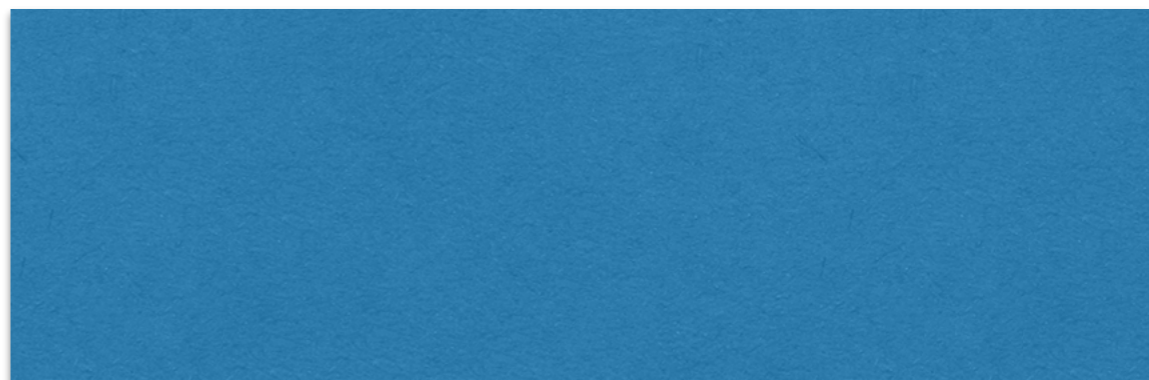
18 0

9 0

4 1

2 0

1 0



75093

/2 %2

37546 1

18773 0

9386 1

4693 0

2346 1

1173 0

586 1

293 0

146 1

/2 %2

73 0

36 1

18 0

9 0

4 1

2 0

1 0

0 1



75093

/2 %2

37546 1

18773 0

9386 1

4693 0

2346 1

1173 0

586 1

293 0

146 1

/2 %2

73 0

36 1

18 0

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4 1

2 0

1 0

0 1

75093

= (100100101010101)₂

/2 %2

37546 1

18773 0

9386 1

4693 0

2346 1

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/2 %2

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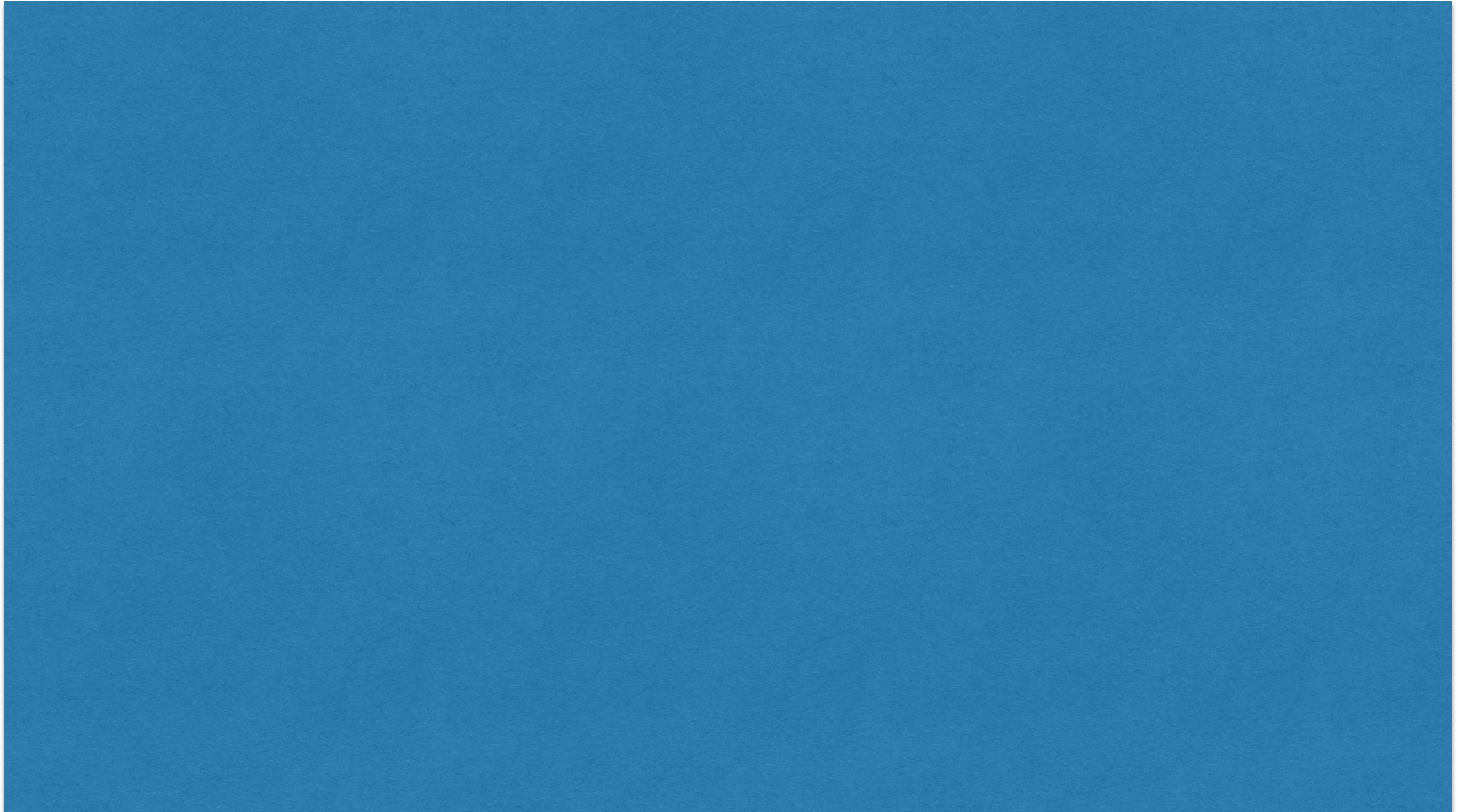
why does it work ?

$$m = 2 * (m/2) + m \% 2$$

$$= 2 * \begin{array}{l} \text{10010010101010101} \\ \text{1001001010101010} \end{array} + \begin{array}{l} \text{1} \\ \text{1} \end{array}$$

$$m = \beta * (m/\beta) + m \% \beta$$

why does it work ?



why does it work ?

$$m = \sum_{i=0}^{n-1} b_i \beta^i$$

why does it work ?

$$\begin{aligned} m &= \sum_{i=0}^{n-1} b_i \beta^i \\ &= (b_{n-1}b_{n-2}\dots b_1b_0) \beta \end{aligned}$$

why does it work ?

$$\begin{aligned} m &= \sum_{i=0}^{n-1} b_i \beta^i \\ &= (b_{n-1}b_{n-2}\dots b_1b_0) \beta \\ &= (b_{n-1}b_{n-2}\dots b_10) \beta + b_0 \end{aligned}$$

why does it work ?

$$\begin{aligned} m &= \sum_{i=0}^{n-1} b_i \beta^i \\ &= (b_{n-1}b_{n-2}\dots b_1b_0) \beta \\ &= (b_{n-1}b_{n-2}\dots b_10) \beta + b_0 \\ &= \beta * (b_{n-1}b_{n-2}\dots b_1) \beta + b_0 \end{aligned}$$

why does it work ?

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why does it work ?

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why does it work ?

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to Base β

Algorithm 3 Convert integer to binary

INPUT: a number m

OUTPUT: the number m expressed in base β using a bit array $b[]$

$i \leftarrow 0$

while $m > 0$ **do**

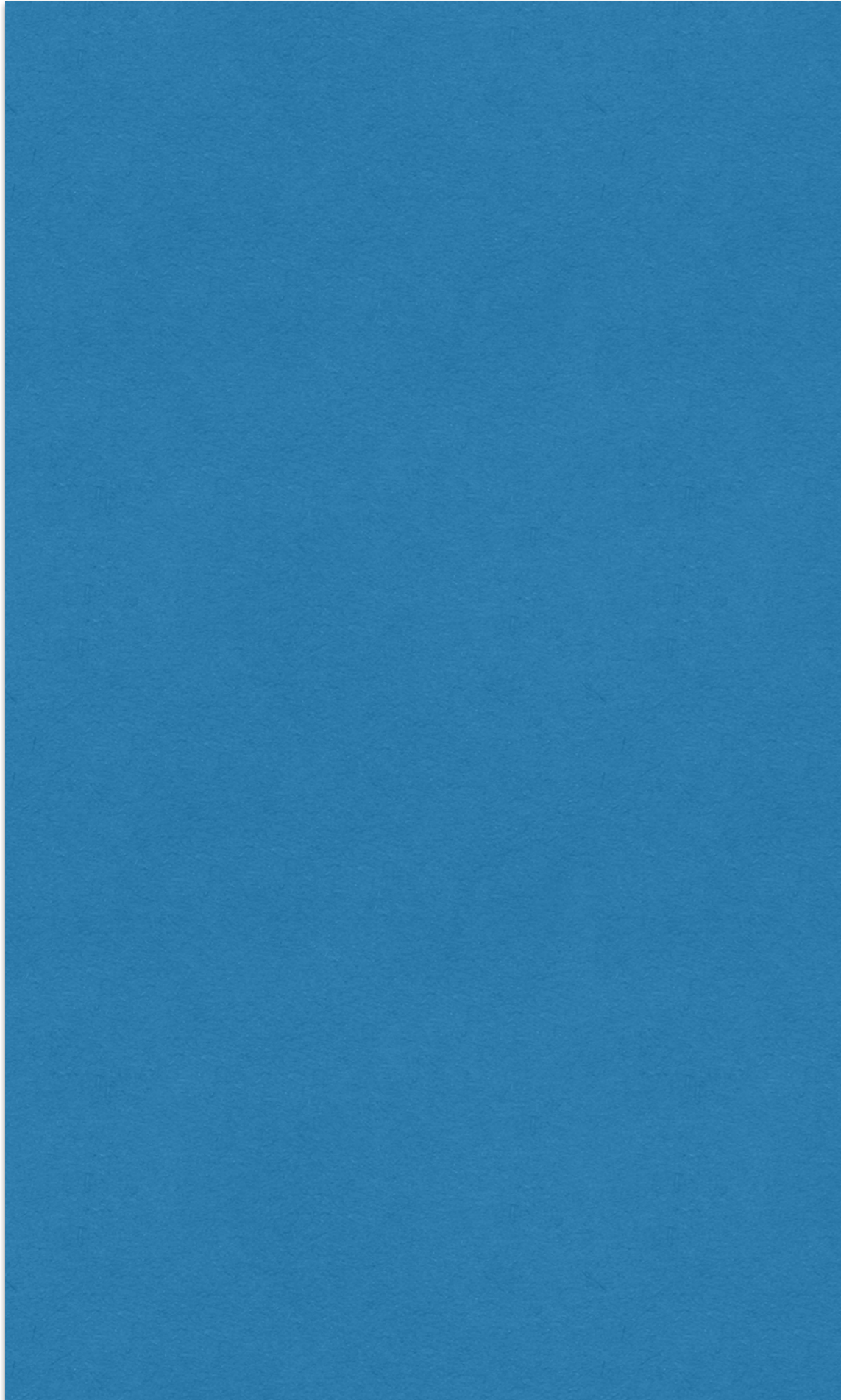
$b[i] \leftarrow m \% \beta$

$m \leftarrow m / \beta$

$i \leftarrow i + 1$

end while

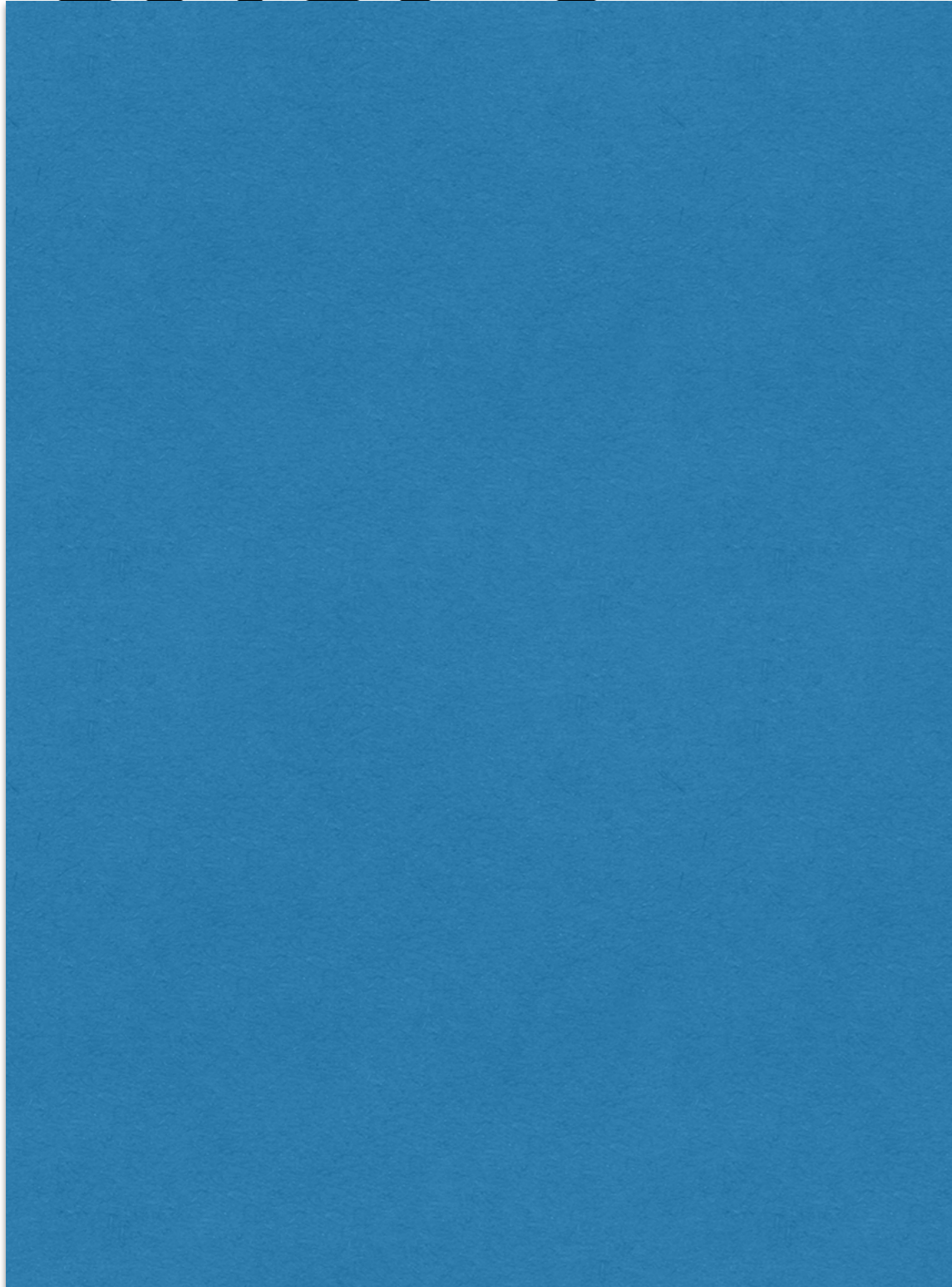
75093



75093

/5 %5

15018 3



75093

/5

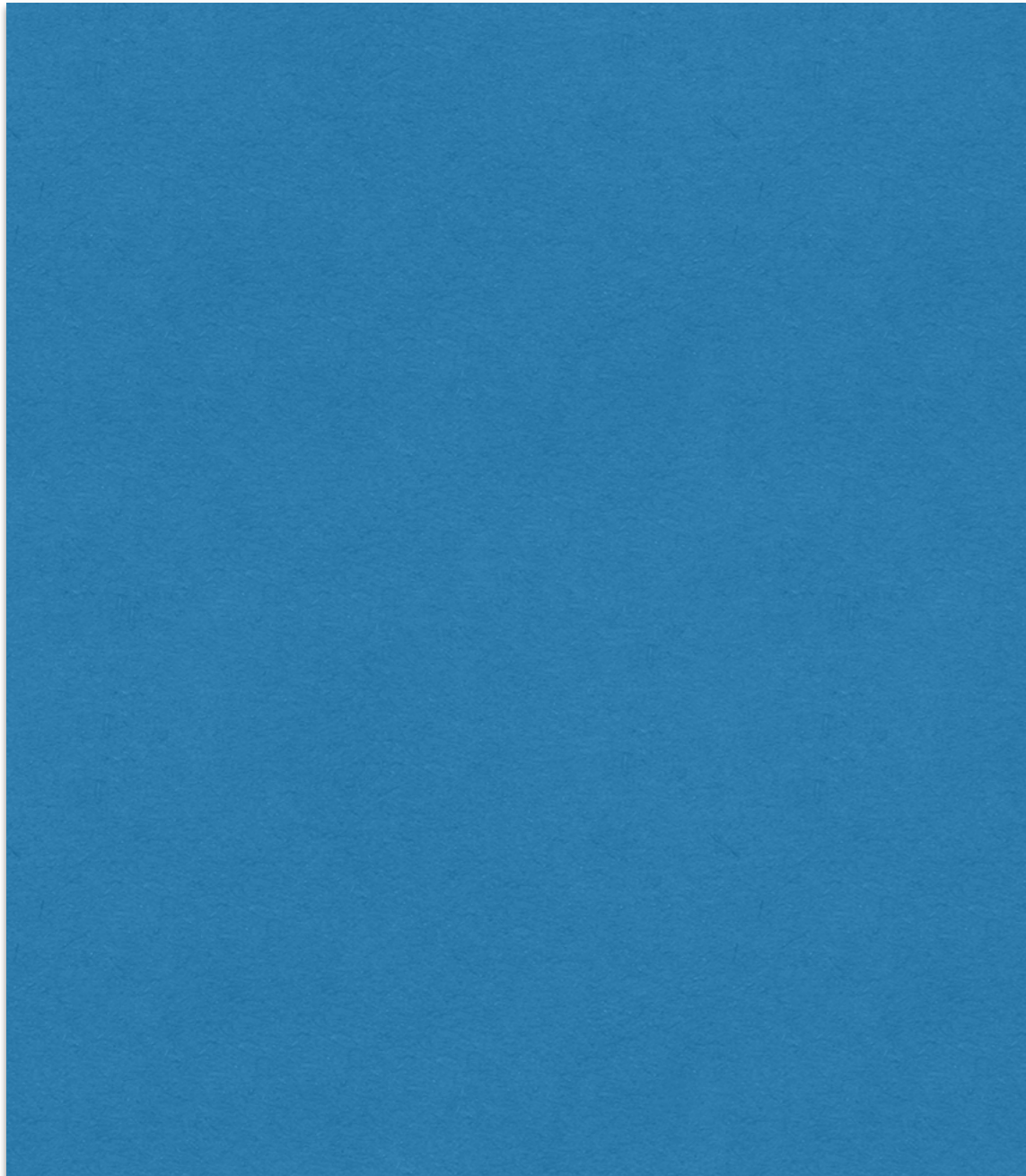
%5

15018

3

3003

3



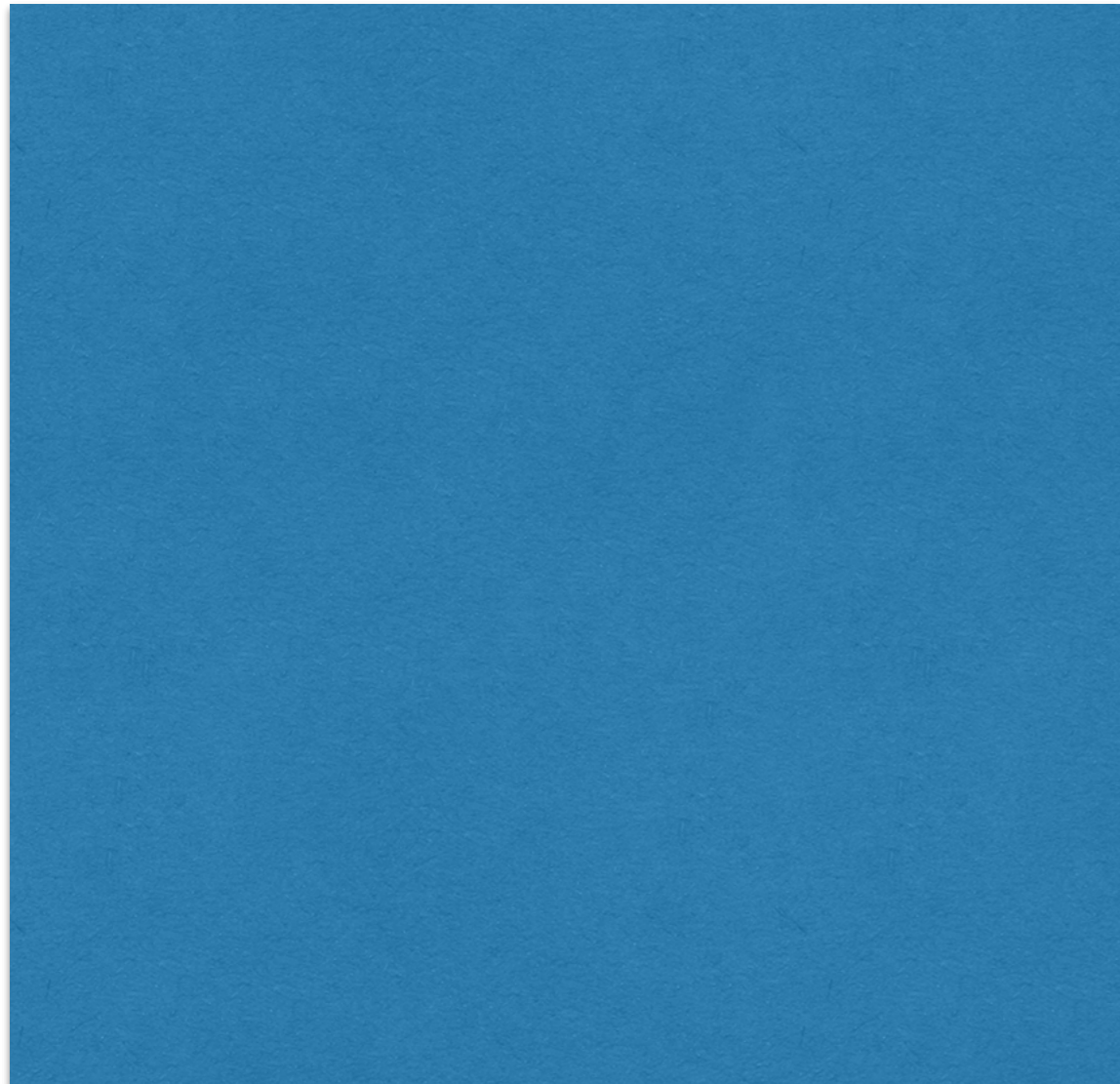
75093

/5 %5

15018 3

3003 3

600 3



75093

/5

%5

15018

3

3003

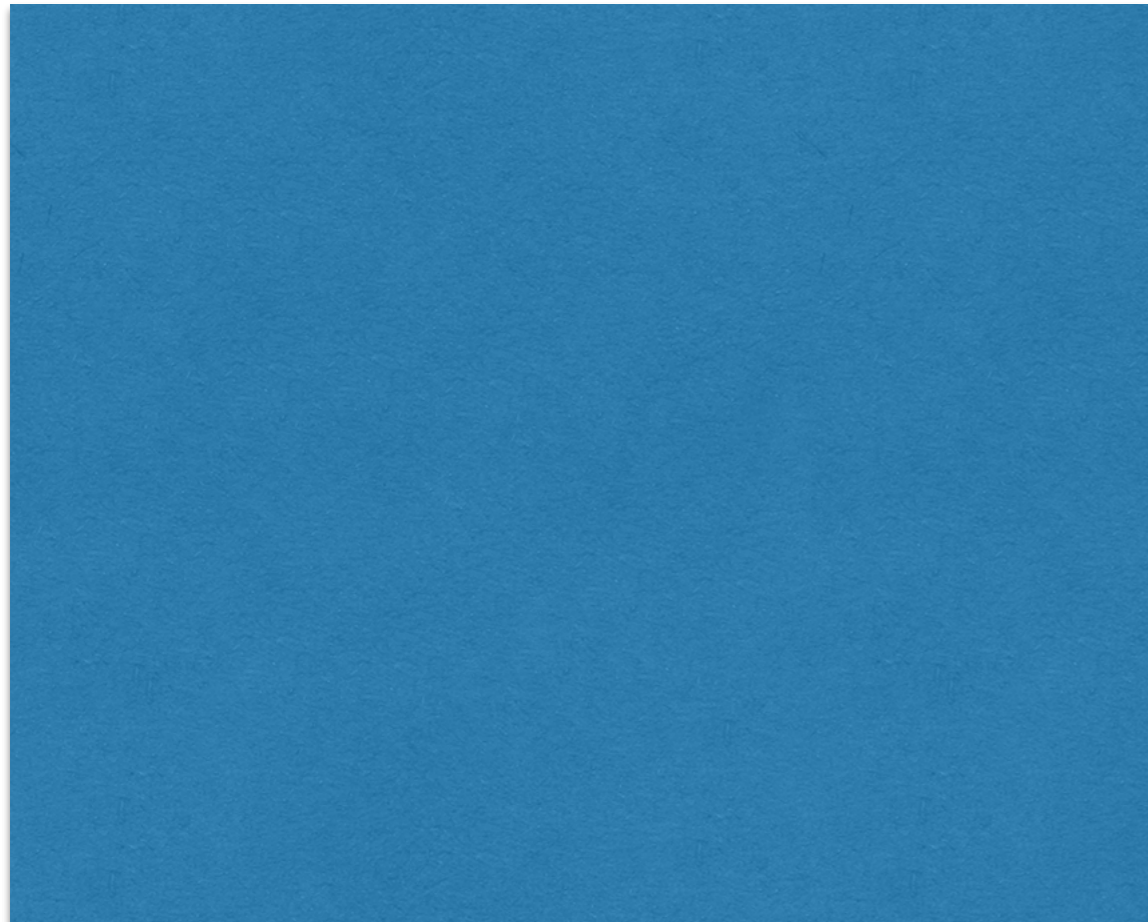
3

600

3

120

0



75093

/5 %5

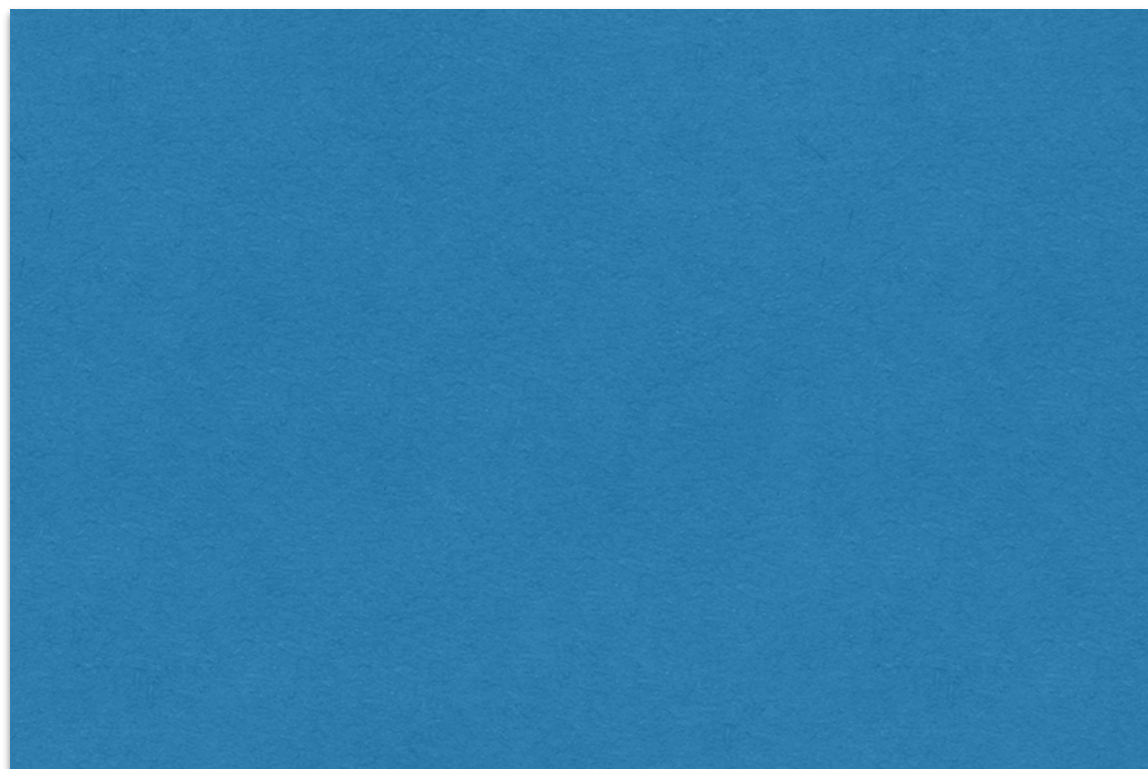
15018 3

3003 3

600 3

120 0

24 0



75093

/5

%5

15018

3

3003

3

600

3

120

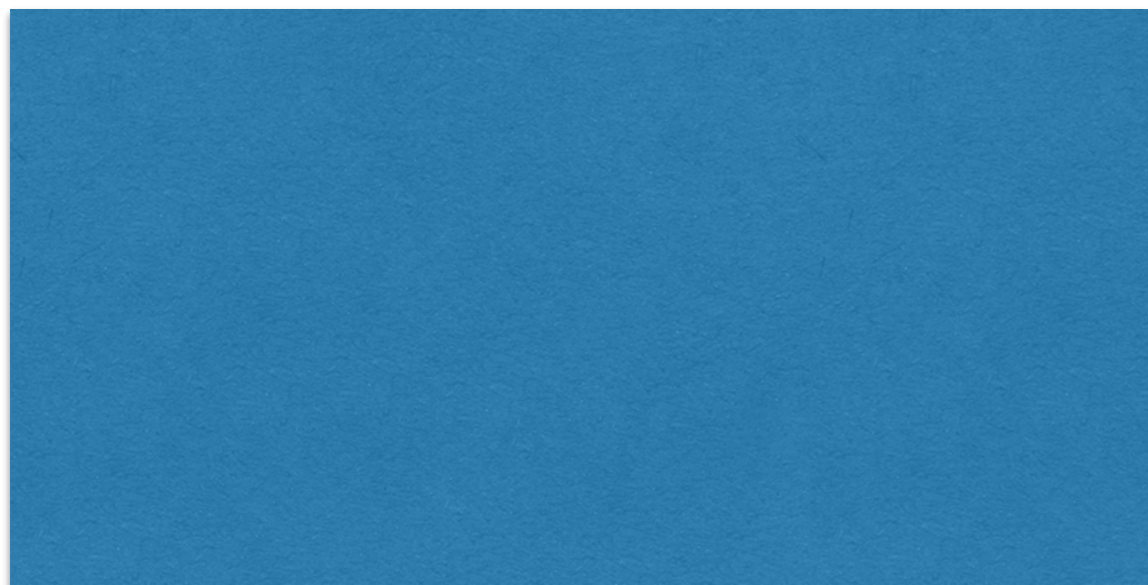
0

24

0

4

4



75093

/5

%5

15018

3

3003

3

600

3

120

0

24

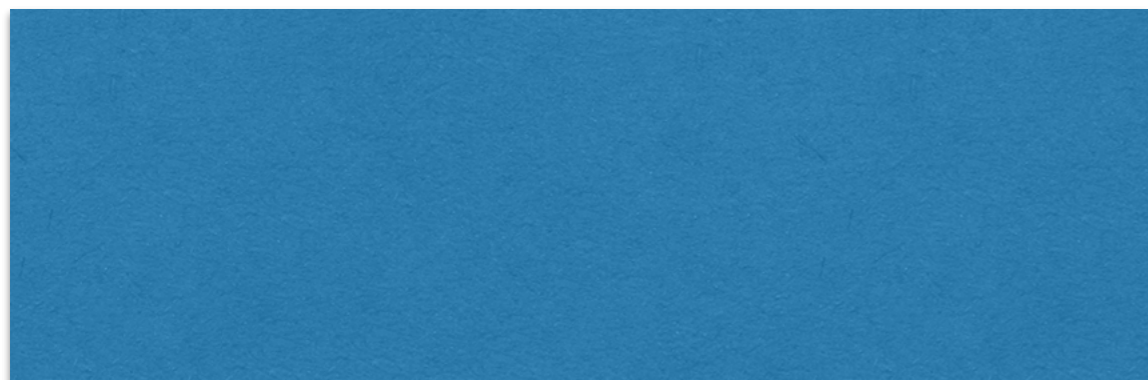
0

4

4

0

4



75093

/5 %5

15018 3

3003 3

600 3

120 0

24 0

4 4

0 4



75093

/5

%5

15018

3

3003

3

600

3

120

0

24

0

4

4

0

4

75093

$= (4400333)_5$

/5 %5

15018 3

3003 3

600 3

120 0

24 0

4 4

0 4

Winter 2016
COMP-250: Introduction
to Computer Science

Lecture 3, January 19, 2016