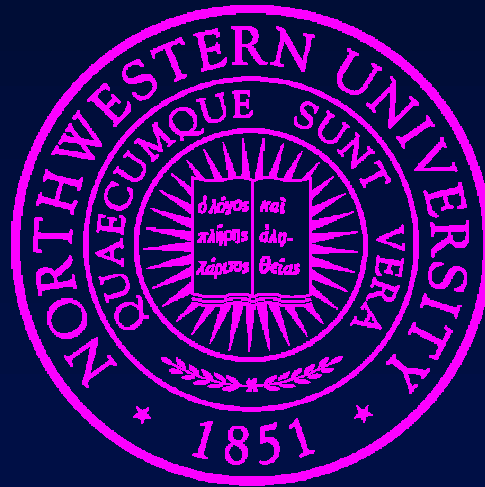


# Automated Compile-Time and Run-Time Techniques to Increase Usable Memory in MMU-Less Embedded Systems



Lan S. Bai, Lei Yang, Robert P. Dick  
Northwestern University  
Dept. of EECS

# Outline

## MEMMU: Memory Expansion on Embedded Systems without MMUs

- The need for MEMMU
- Design of MEMMU
- Optimizing MEMMU for performance
- Automating MEMMU
- Experimental results

# Motivation

- Memory is tightly constrained in many embedded systems
  - MICAz: 4 KB RAM; TelosB: 10 KB RAM
  - Increasing RAM increases cost, power, size
- Many low-power, inexpensive embedded systems do not have MMU
- Memory requirement keeps growing
  - Computation intensive applications (signal processing, routing, encryption...)

# Related work

- Software virtual memory management for MMU-less embedded systems
  - Choudhuri and Givargis, 2005
- Hardware-based code and data compression for embedded systems
  - Lekatsas, Henkel, and Wolf, 2000;
  - Tremaine et al., 2001

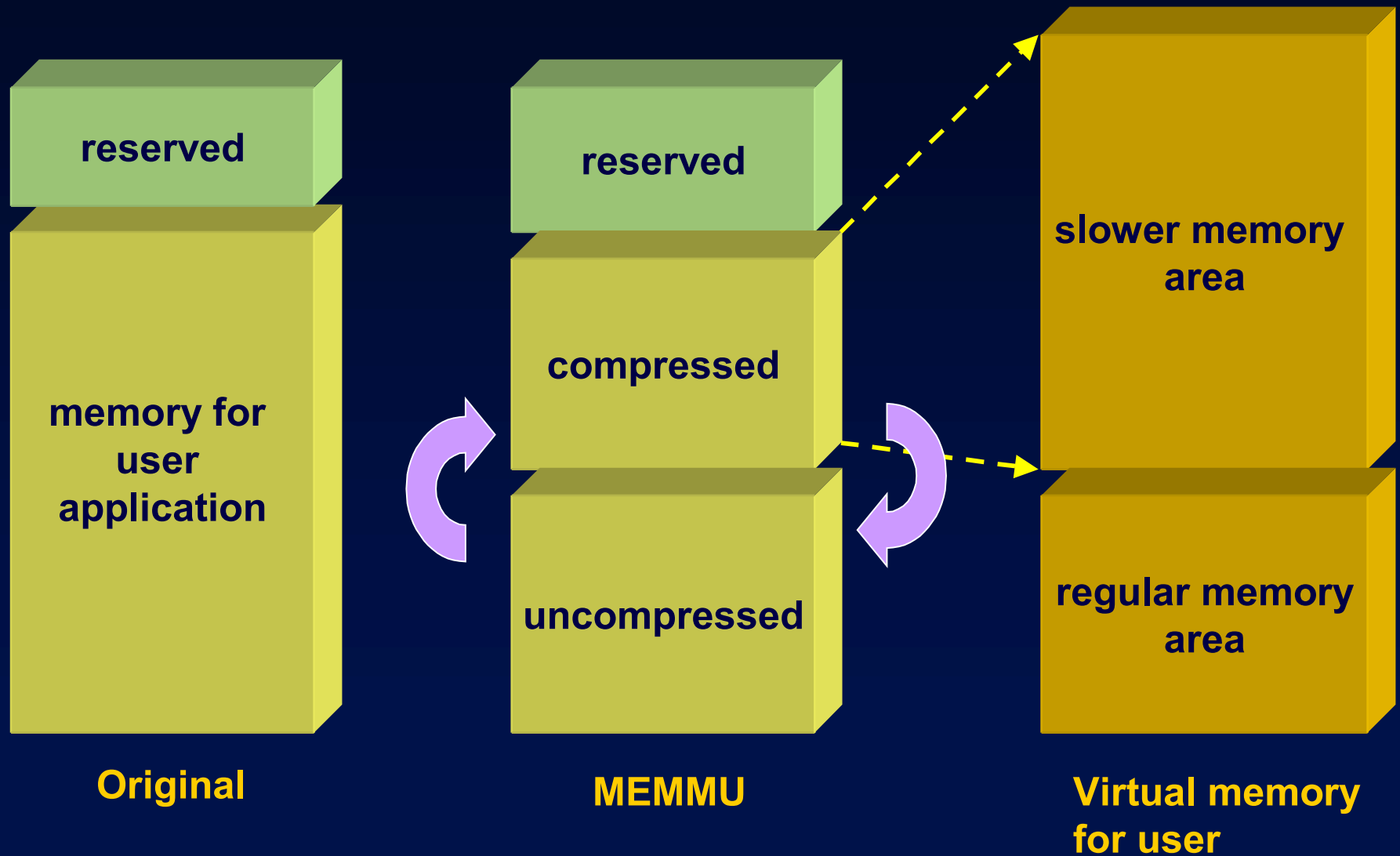
# Related work

- Software-based online memory compression
  - Biswas, Simpson, and Barua, 2004
  - Yang et al., 2005, 2006
- Compression for reducing communication in sensor networks
  - Pradhan, Kusuma, and Ramchandran, 2002
  - Pereira et al., 2003
- Software-based memory compression algorithms
  - LZO, RIZZO, WKdm, PBPM

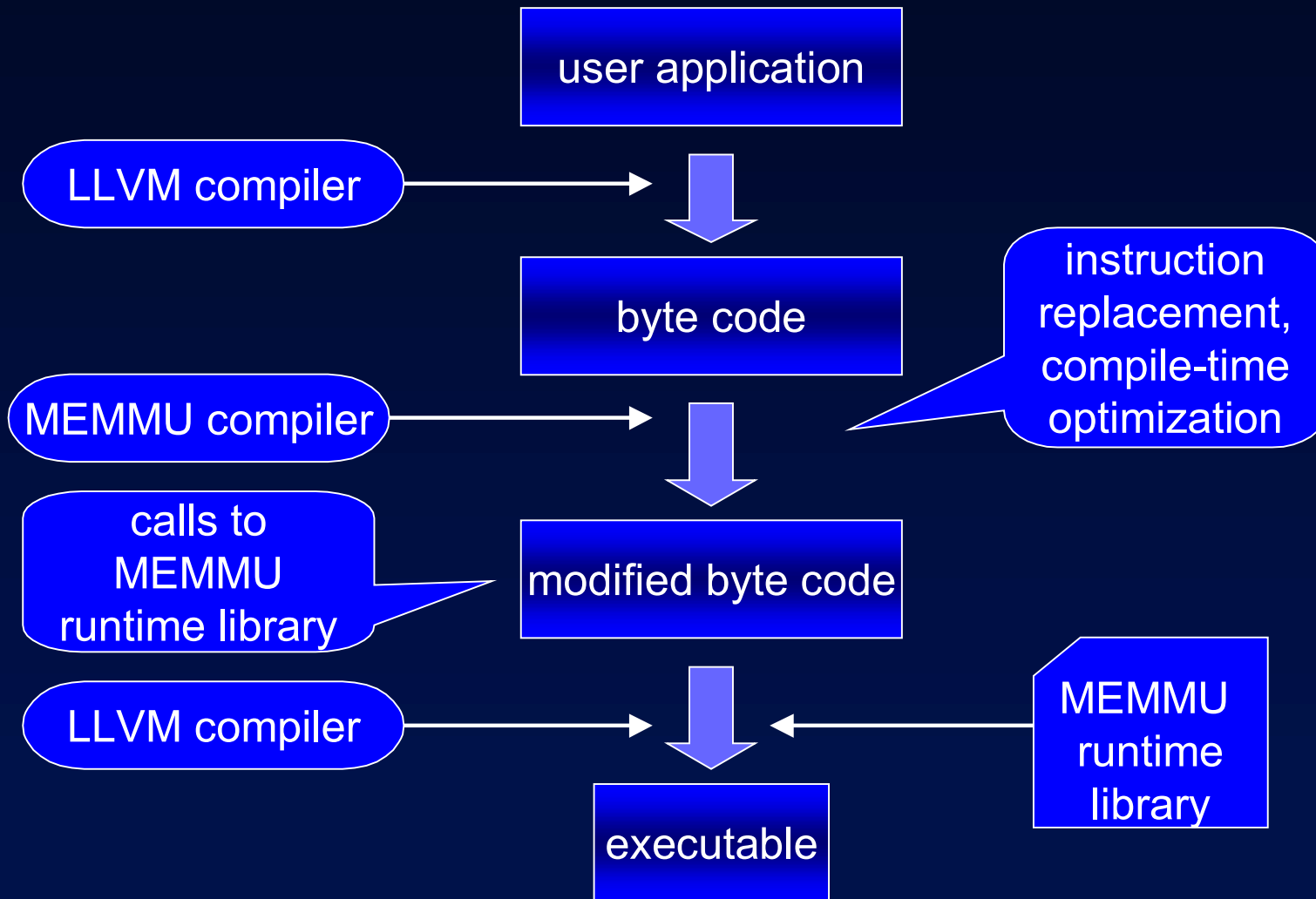
# Features of MEMMU

- No change to hardware
- Requires no MMU support
- Automated technique, few or no change to application code by users
- Optimized to minimize performance overhead

# Overview of MEMMU



# Overview of MEMMU (cont.)





# Challenges and sub-problems

## ● Goal

- Maximize the increase in usable memory
- Minimize performance and energy penalties

## ● Sub-problems

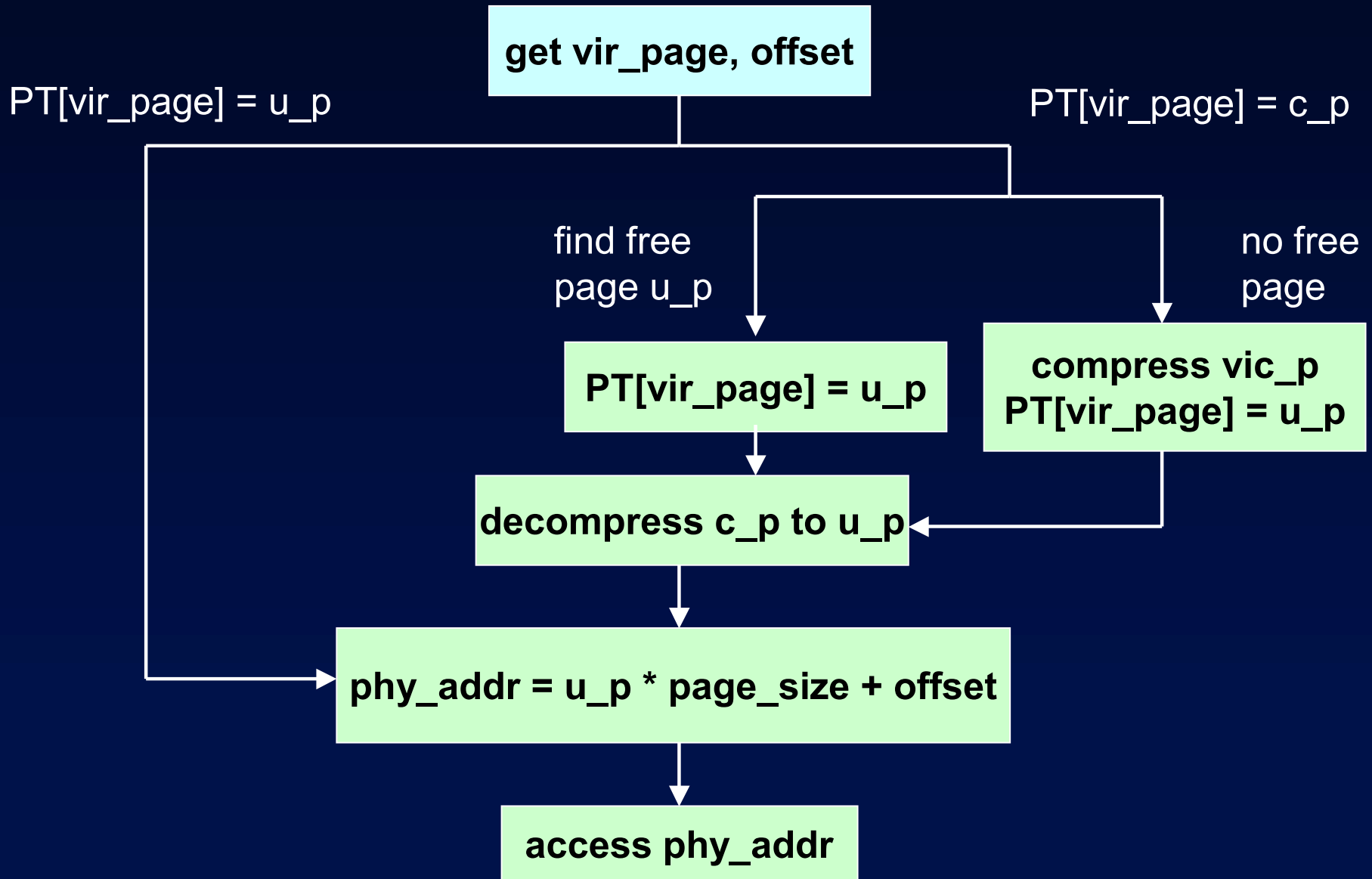
- Select data to compress
- Schedule compression and decompression
- Organize compressed and uncompressed memory regions
- Efficient compression algorithm

# MEMMU design

## Handle-based data access

- Page table maps virtual pages to physical pages in compressed and uncompressed regions
- Compressed pages need to be decompressed and moved to uncompressed region before access
- A victim page in uncompressed region is compressed and moved to compressed region when needed

# Example of access vir\_addr

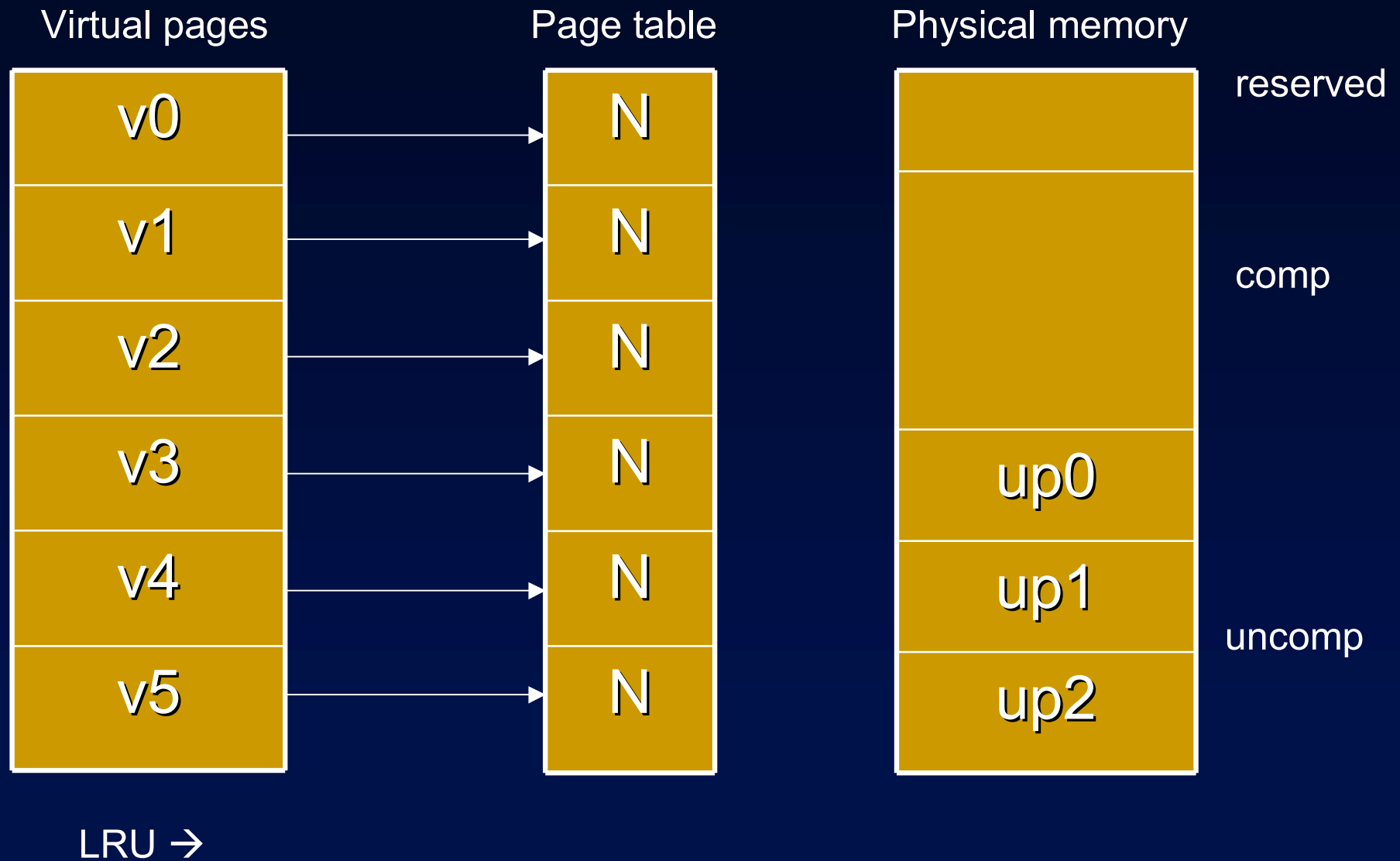


# MEMMU design

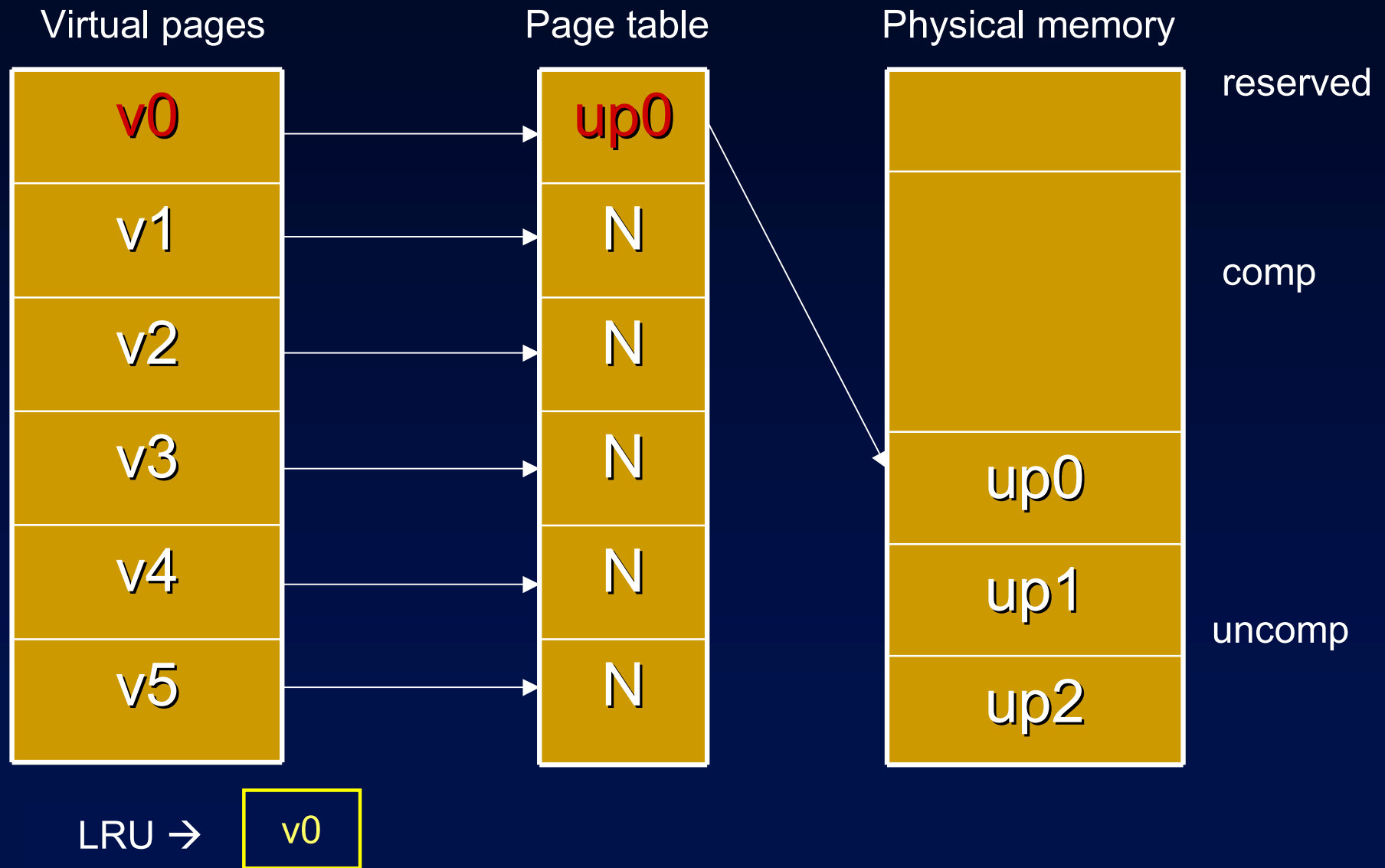
## Page replacement

- LRU page replacement policy
  - Minimize page migration times
  - Compress LRU page when no free page in uncompressed region
  - LRU list maintains page reference history

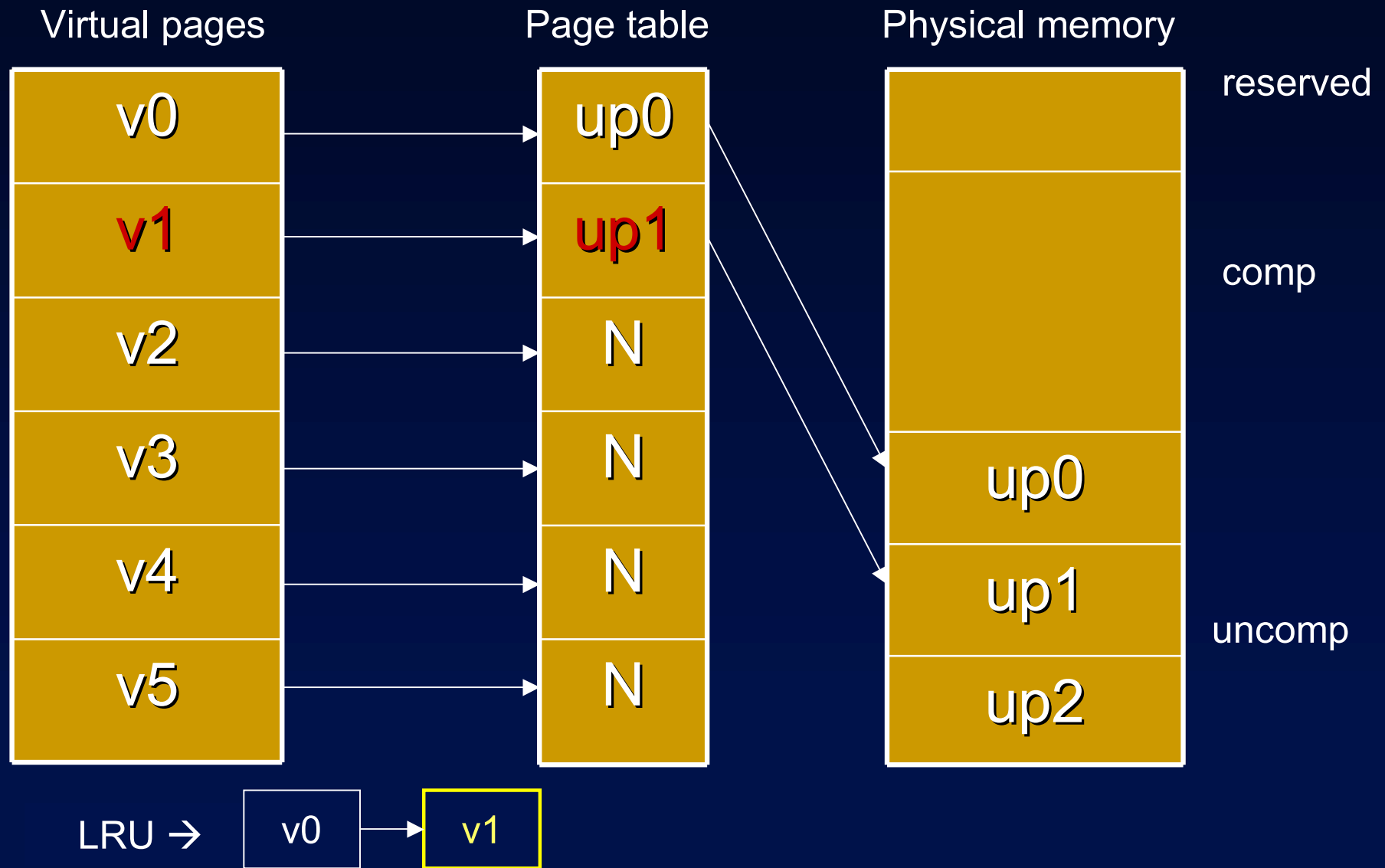
# Initial state



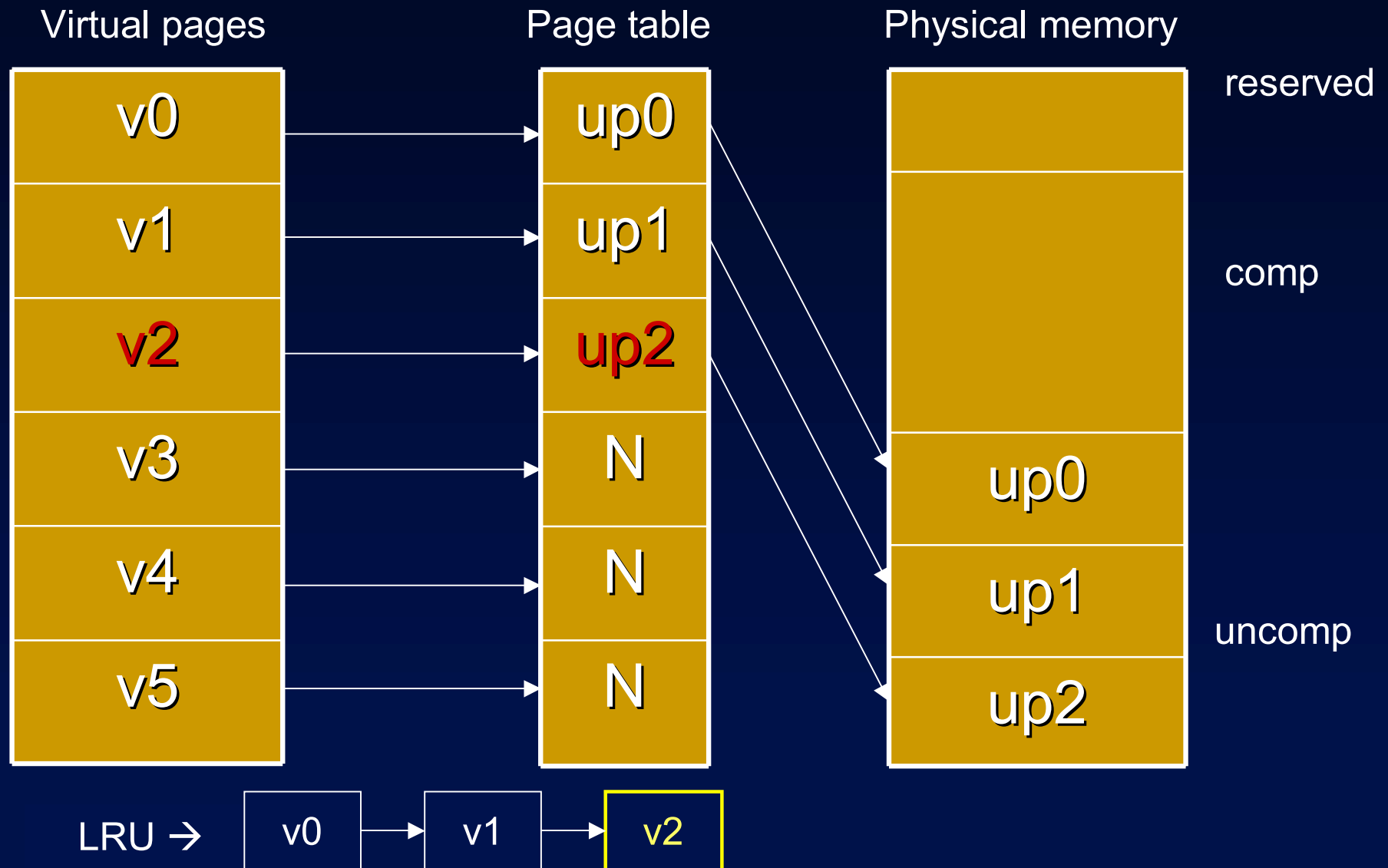
# Write to page v0



# Write to page v1

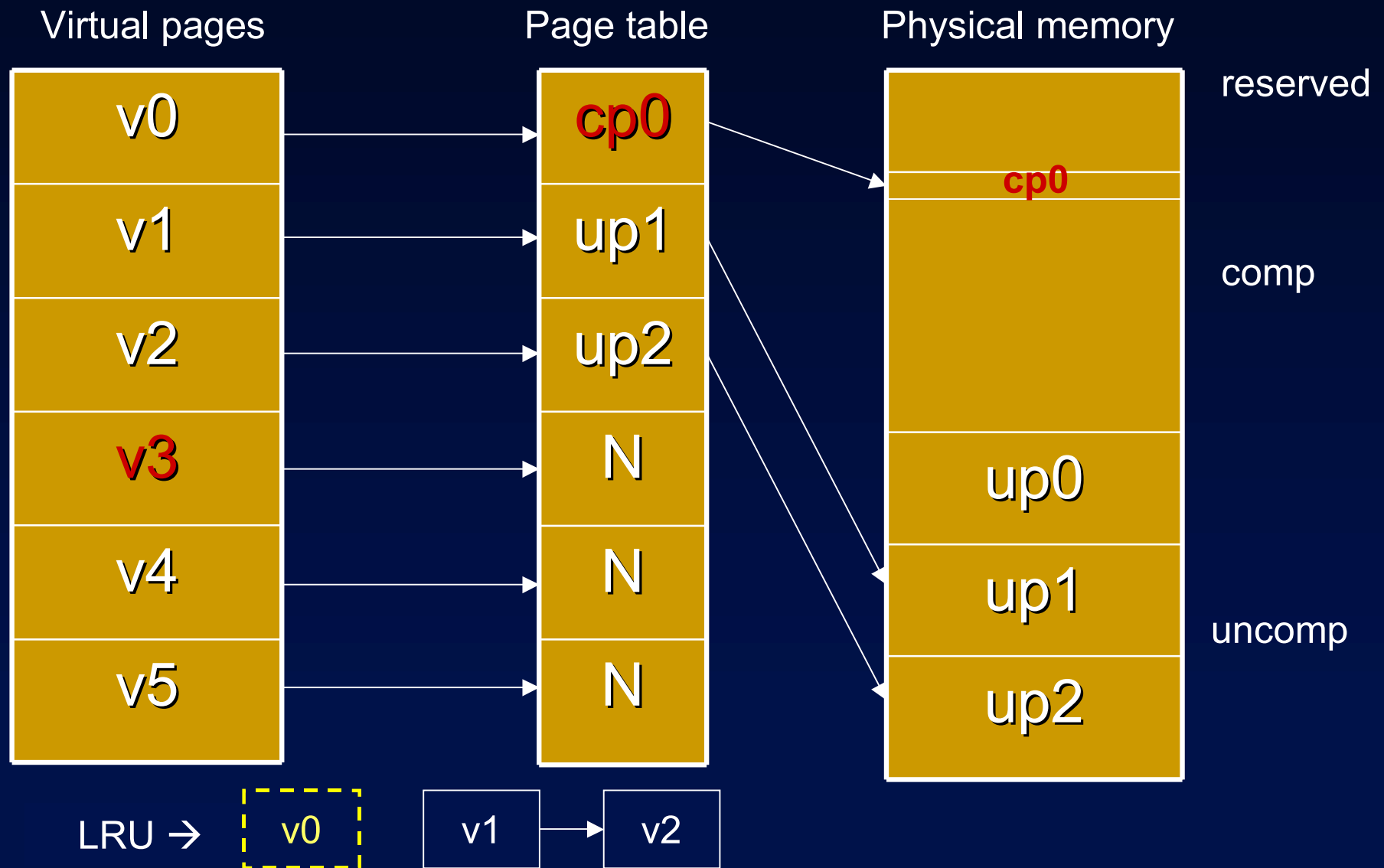


# Write to page v2

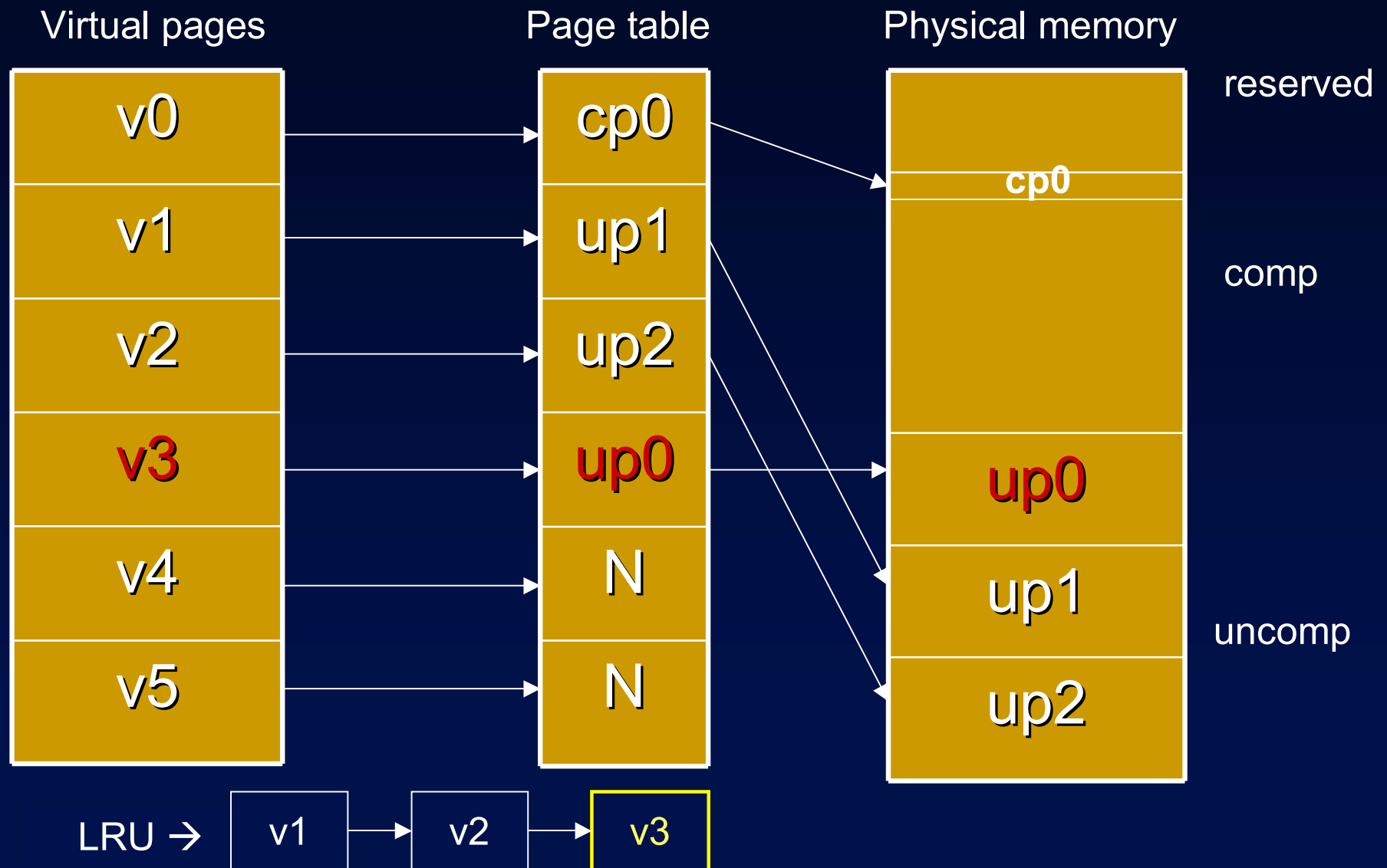




# Write to page v3 – compress up0



# Write to page v3 – map v3 to up0

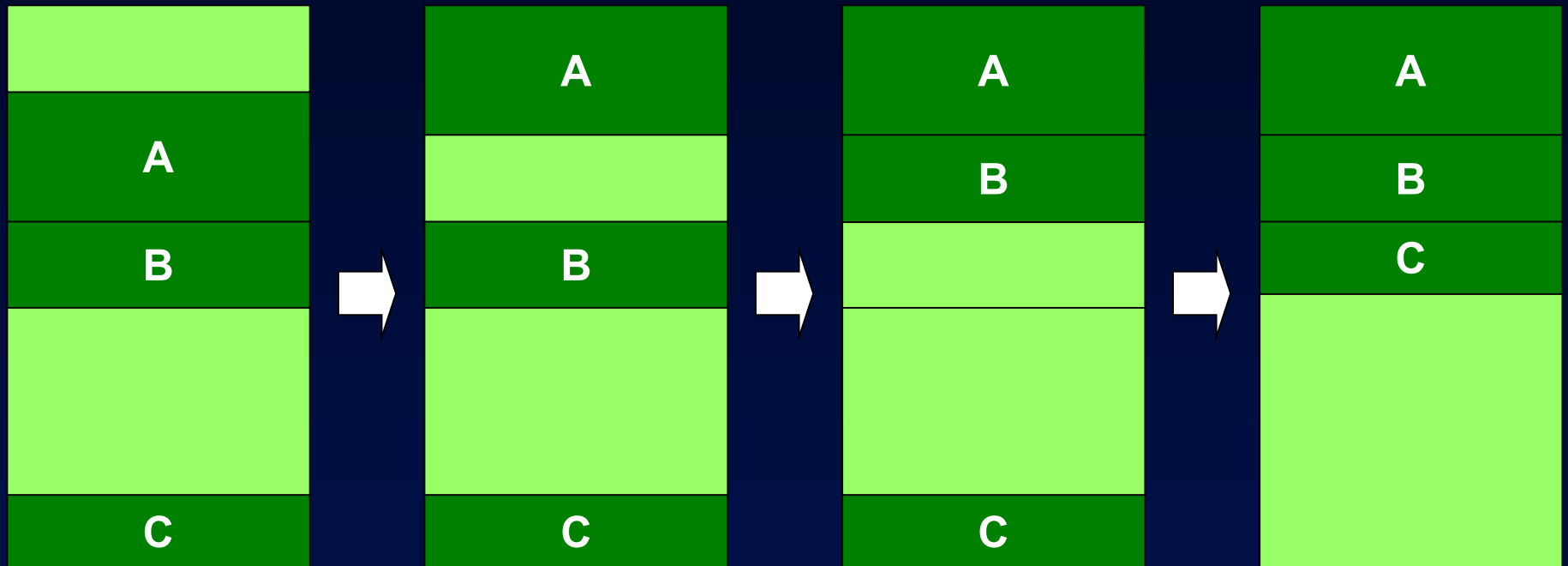


# MEMMU design

## Prevent fragmentation

- Heap memory management for compressed region
- Fragmentation occurs in compressed region
  - Reduce the memory expansion proportion
  - Complicates memory expansion prediction
  - May stop running application
- Adjacent free block merging when free a compressed page
- Coalesce when no remaining blocks large enough

# Memory coalescing example



Free page



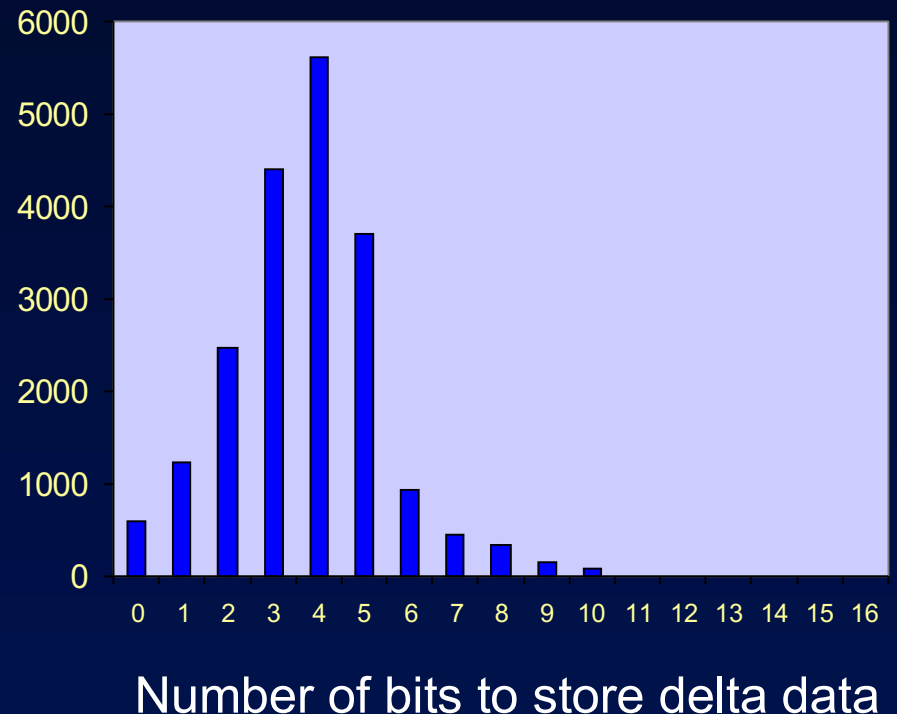
Used page

# Delta compression algorithm

- Compression algorithm affects memory expansion proportion and performance
- Sensor data changes smoothly
- Delta data require fewer bits to store
- Average compression ratio on sensor data: 50%

Amount  
of data

Histogram of delta



# Handle check optimization

- Handle access = handle check + address translation + (data migration) + LRU update
- Performance overhead high, proportional to number of total memory access
- Reduce overhead by removing unnecessary handle check, address translation and LRU update

# Frequent references optimization

- Some small data structures are referenced frequently
  - E.g., coefficient kernel in image convolution
- Put them in reserved region
  - MEMMU puts all scalars into reserved region
  - Reduce handle check, address translation, LRU update related to small data

# Run-time handle check optimization

- A sequence of data references access the same page, only need to check the page table once
- Use conditional to prevent unnecessary handle checks
- May increase overhead

```
if cur_page != pre_page {  
    check_handle (cur_page);  
    pre_page = cur_page;  
} else {  
}
```



# Loop transformation and compile-time elimination of inner-loop checks

- Transform a loop to nested loop
- Within inner loop, only access one page

```
for i in {0...N} do
  A[i] = x
end for
```

```
for i in {0...N} do
  cur_p = (A + i) / PSZIE
  check_handle(cur_p)
  write_handle(A + i, x)
end for
```

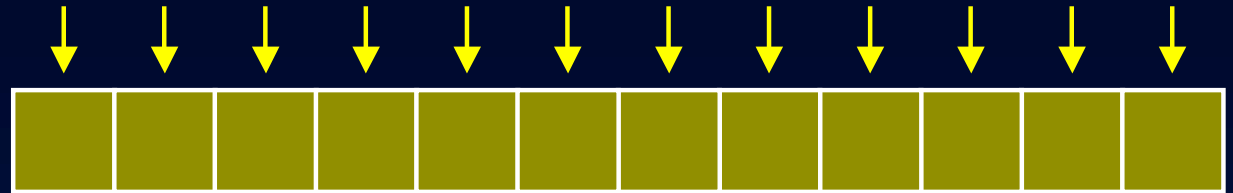
```
pnum = N / PSIZE
for i in {0...pnum} do
  check_handle((A + i) / PSIZE))
  for j in {0...psize} do
    write_handle(A + i × PSIZE + j, x)
  end for
end for
```

N checks

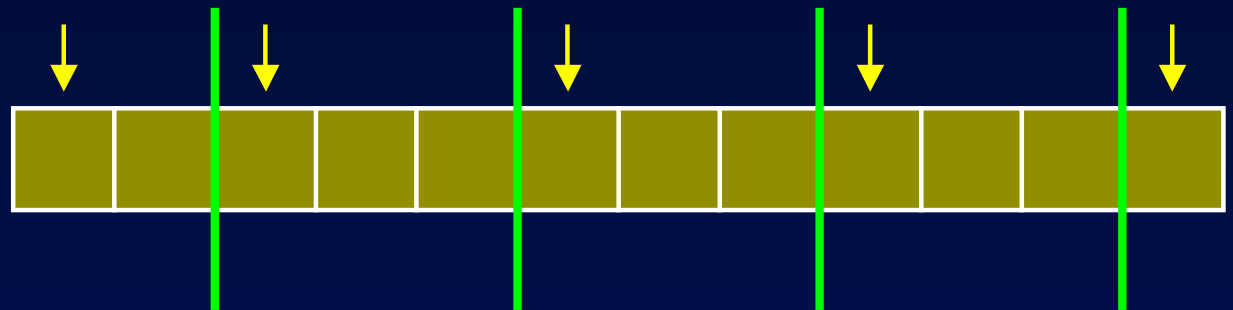
N / PSIZE checks

# Loop transformation and compile-time elimination of inner-loop checks

Unoptimized  
MEMMU



Optimized  
MEMMU



head  
loop

body loop  
(nested)

tail  
loop

# Handle check hoisting

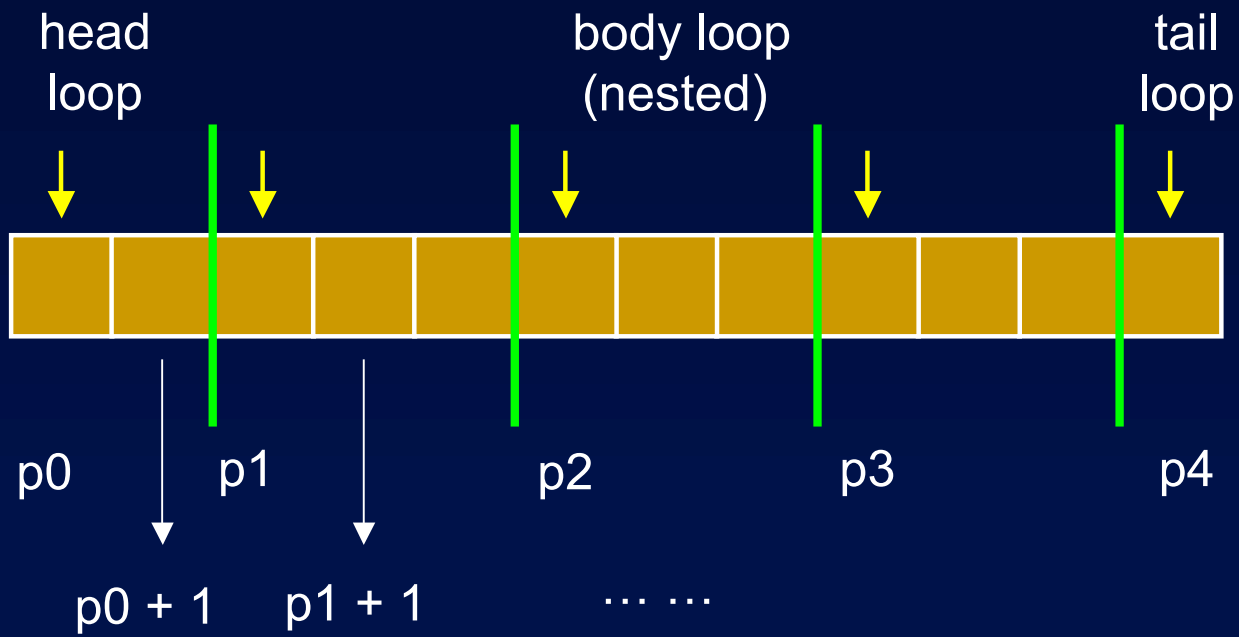
- Pages accessed inside a loop can reside in uncompressed region
- Replace multiple handle checks inside a loop by fewer checks outside the loop

```
for (i = 0; i < M; ++i)
  for (j = 0; j < N; ++j)
    p = (A + N * i + j) / PSIZE
    handle_check(p)
    access A[i][j]
```

```
for (i = 0; i < M; ++i)
  p = N / PSIZE
  pmin = A[i][0] / PSIZE
  handle_check pmin to pmin + p
  for (j = 0; j < N; ++j)
    access A[i][j]
```

# Pointer dereferencing

- Explore dependencies among sequence of addresses
- Eliminate address translation



# MEMMU evaluation

- TelosB wireless sensor node
  - MSP430, 10 KB RAM
- Power measurement
  - National Instrument 6034E data acquisition card
- Original, unopt. MEMMU, opt. MEMMU
- Metrics
  - Memory expansion proportion
  - Power
  - Execution time



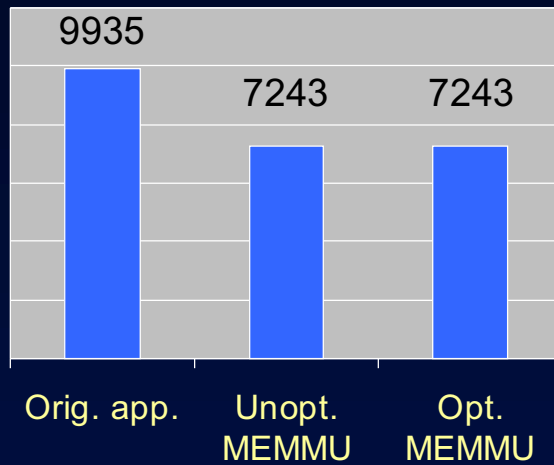
# Benchmarks

- Sound filtering
  - 1-D convolution useful in signal processing
- Image convolution
  - 2-D convolution useful in signal processing
- Light sampling
  - Periodically samples and transmits light level
- Covariance matrix computation
  - Matrix operation useful in PCA, feature extraction
- Audio signal correlation computation
  - Useful in automated location calibration

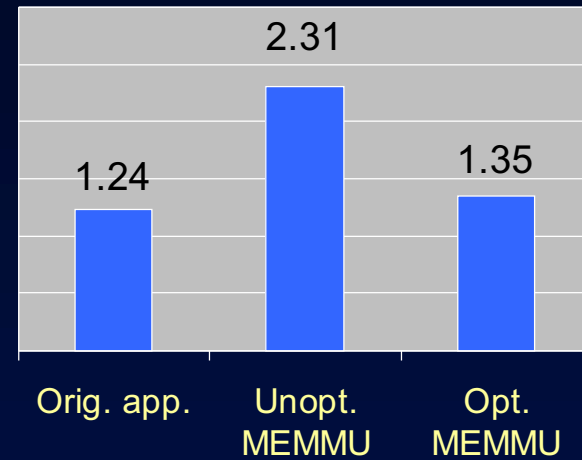
# Experimental Results

## Filtering benchmark

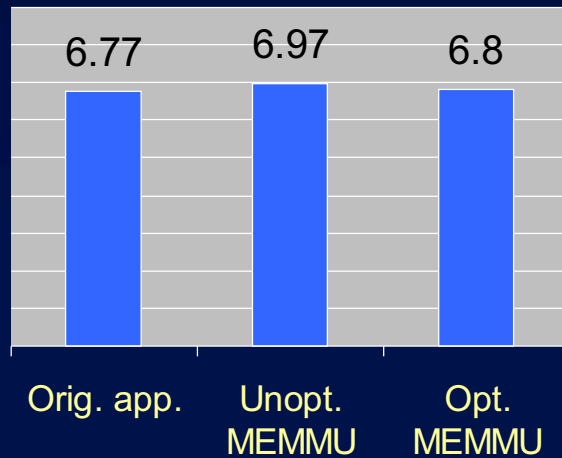
### RAM usage (byte)



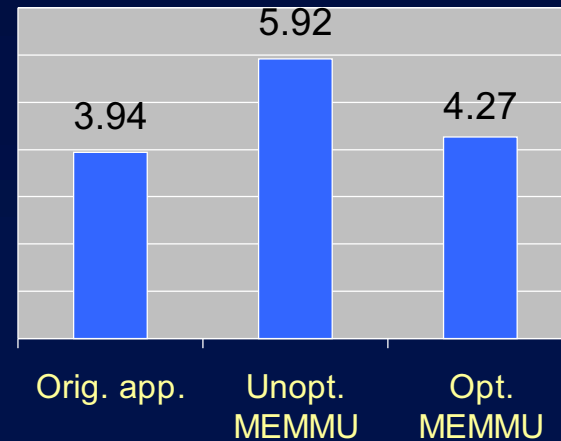
### Processing time (s)



### Active power (mW)



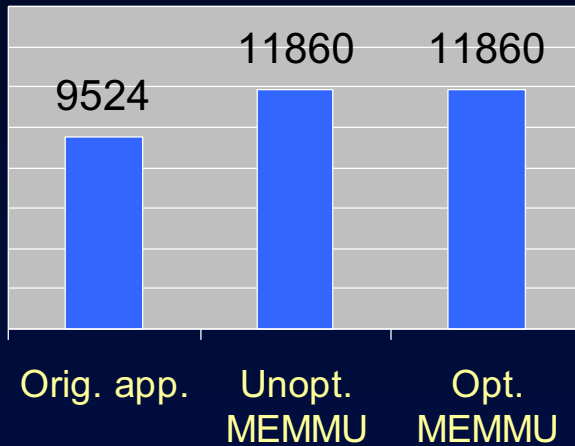
### Average power (mW)



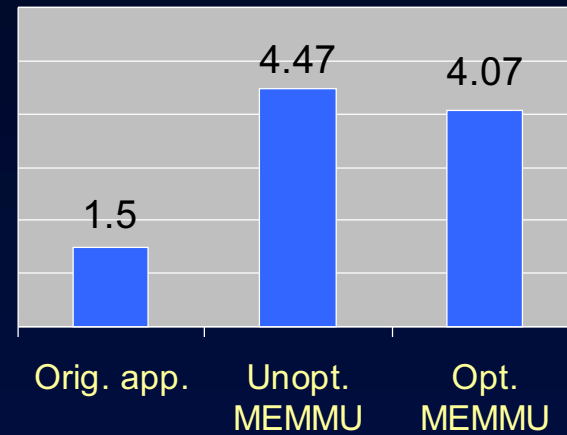
# Experimental Results

## Image convolution benchmark

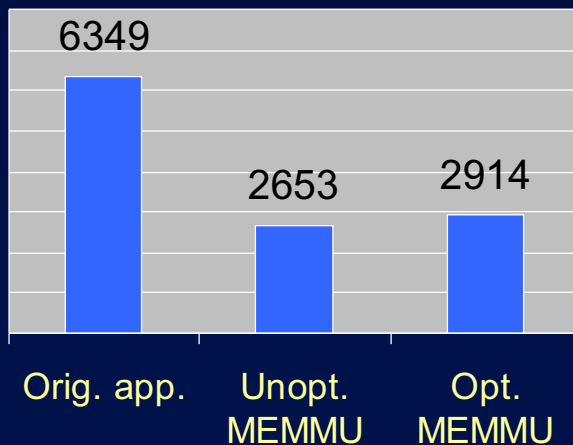
Image size (byte)



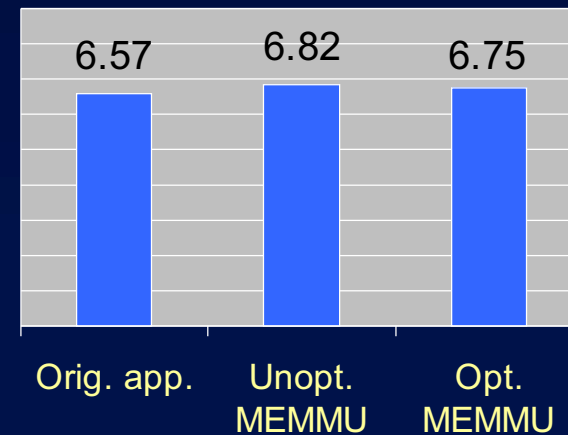
Processing time (s)



Processing rate (byte/s)



Power (mW)

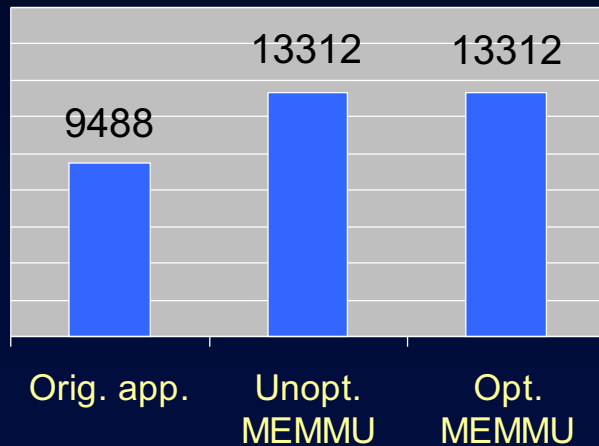




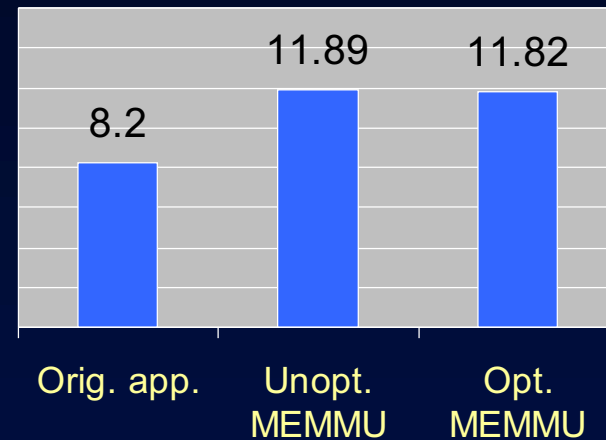
# Experimental Results

## Light sampling benchmark

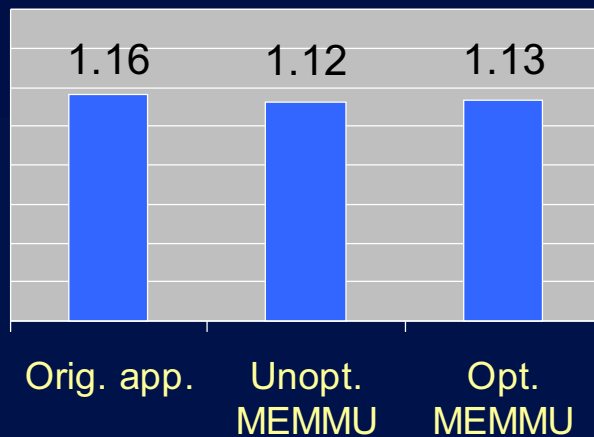
Buffer size (byte)



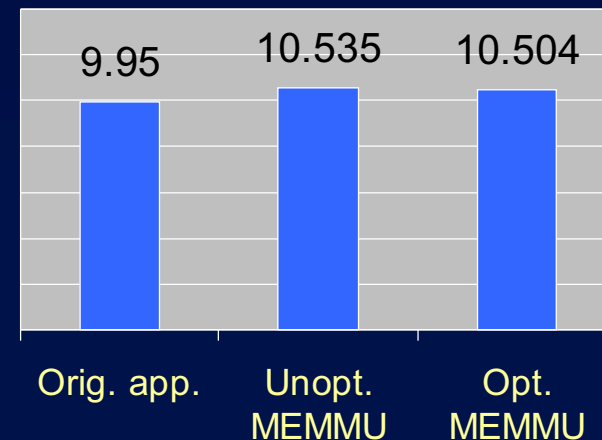
Processing time (s)



Processing rate (byte/s)



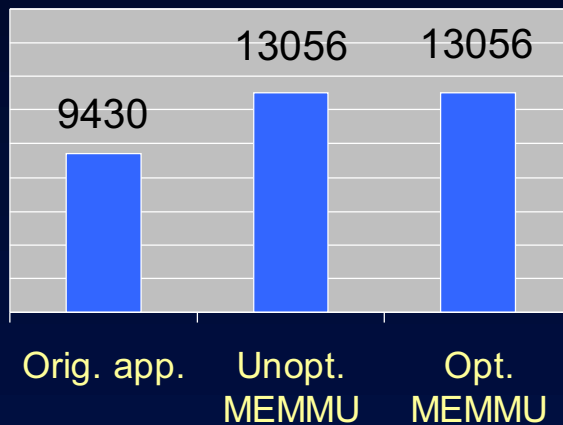
Power (mW)



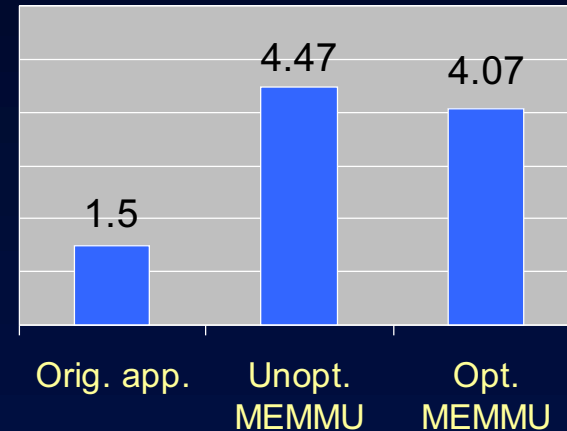
# Experimental Results

## Covariance matrix computation benchmark

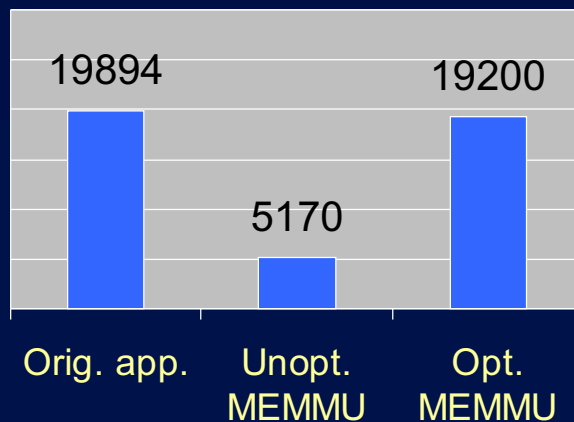
Buffer size (byte)



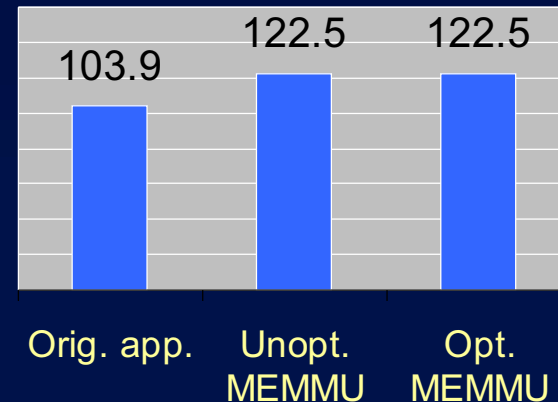
Processing time (s)



Processing rate (byte/s)



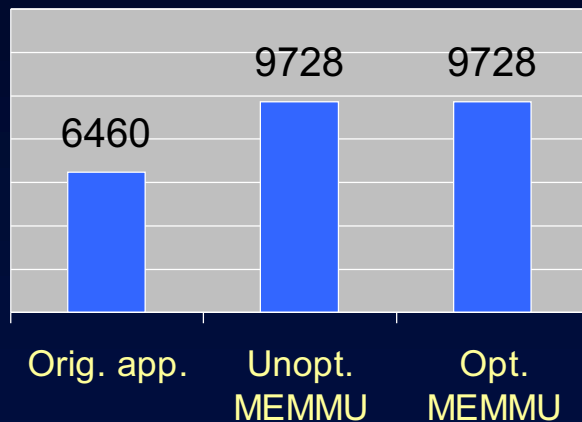
Power (mW)



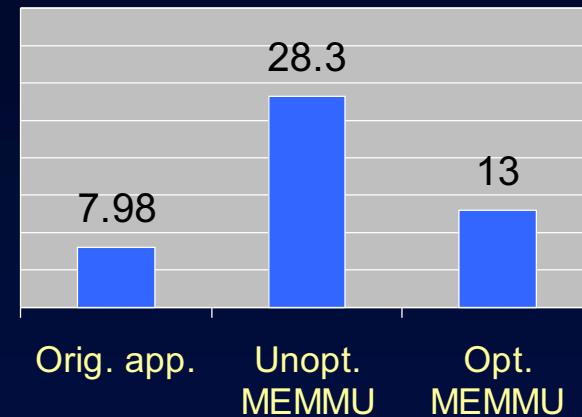
# Experimental Results

## Correlation computation benchmark

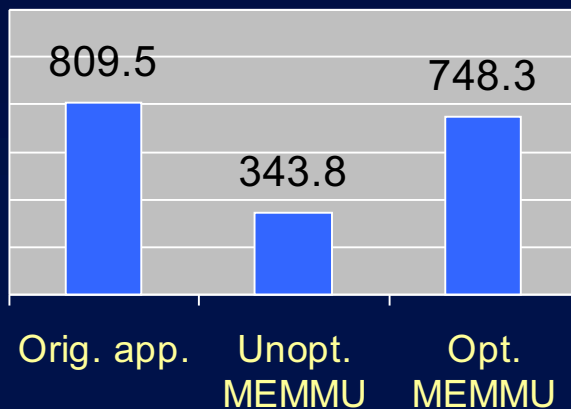
Signal size (byte)



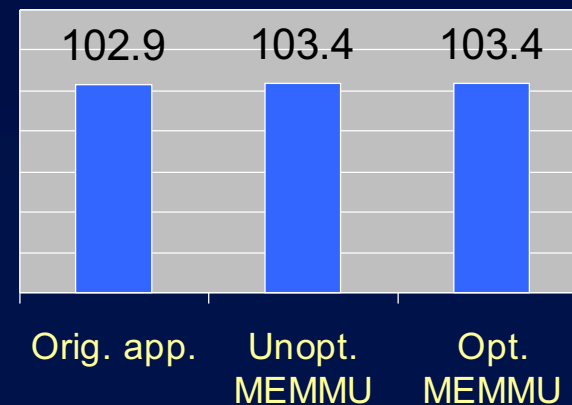
Processing time (s)



Processing rate (byte/s)



Power (mW)



# Conclusions

- MEMMU increases usable memory by 50%, usually with small performance and power penalties
- Optimization techniques largely reduces performance penalty
- One application may benefits more from one optimization method depending on its memory access pattern

*Thank you for attending*

Questions?

# MEMMU run-time library

- Check\_handle (vir\_page)
  - Ensure or bring vir\_page to uncompressed region
- Read\_handle8 (vir\_addr)
- Read\_handle16 (vir\_addr)
- Read\_handle32 (vir\_addr)
- Write\_handle8 (vir\_addr, data)
- Write\_handle16 (vir\_addr, data)
- Write\_handle32 (vir\_addr, data)
  - Translate to physical address in uncompressed region, and then read or write to vir\_addr

# MEMMU design

## Interrupt management

- Interrupt may access user memory
  - ADC interrupt
- Disable interrupt when accessing data in user memory?
  - Missing interrupt
- Allow interrupts at anytime ?
  - Inconsistent data state
  - Page table is updated but not finish data migration

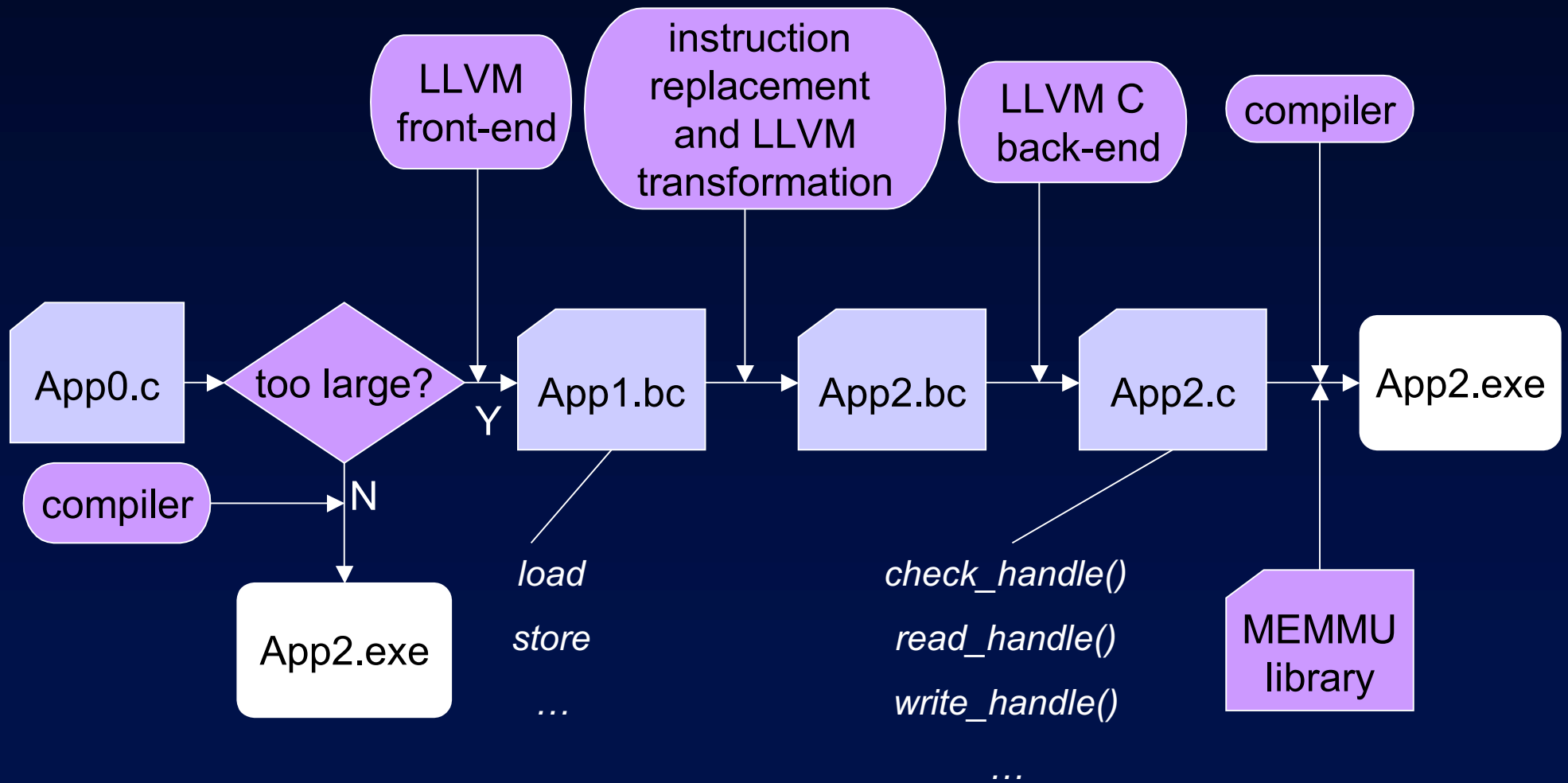
# MEMMU design

## Interrupt management

- Ring buffer in reserved region
  - Data is written to ring buffer when they arrive
  - Allow interrupt at any time
- Worst-case delay: coalesce + compression + decompression
- Ring buffer is needed only when sampling period is shorter than worst-case delay



# Generate executable with MEMMU



- What if add MMU?
- How to predict memory usage?
- How to decide the sizes of each regions?
- How to deal with interrupts?
- How general is the compile-time opt?

# MMU

- DTB (data translation buffer)
  - ITB 0.00131649175 0.00059400296
  - DTB 0.00313065017 0.00073307456
  - FPAdd 0.00217439653 0.00089220157